

Optimization to Mitigate Voltage Harmonics of Cascaded Multilevel Converters

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ABSTRACT—The use of pulse width modulation with selective harmonic elimination (SHE-PWM) in cascaded H-bridges (CHB) multilevel converters allows the reduction of the output current distortion by the elimination of low order harmonic components. However, voltages produced by CHB modules to synthesize the SHE-PWM pattern is an issue that deserves deeper investigation. CHB systems fed by sources with current source characteristics, as photovoltaic strings operating with MPPT, may feature different source capacities. Thus, it is important that the energy provided by each module is proportional to the available energy, so input voltages remain balanced. This paper presents the development of a genetic algorithm (GA) to determine optimal waveforms to be synthesized by the CHB modules that ensures the equalization of the fundamental components, or even that a specific relationship between them is achieved. Simulation results for five and nine-levels demonstrate the applicability of the technique, allowing the voltage balance of the DC buses to be addressed even in the modulation stage.

Index Terms—Genetic algorithm, modulation, optimization, multilevel inverters, harmonic elimination, THD.

I. INTRODUCTION

Applications involving high levels of power and voltage provide additional constructive challenges to power electronics. The cost and the reduced availability of low-loss semiconductor for these applications still imposes major restrictions on its implementation. In these systems, multilevel converters are shown as ideal candidates for reducing voltage or current efforts imposed to semiconductor [1].

Among available topologies, a commonly employed is the cascaded H-bridge (CHB), which is formed by the series connection of two or more full-bridge converters fed by independent DC buses [2]. Recently these converters have been also employed by systems fed by renewable sources, where each source may be implemented by an array of photovoltaic modules [3]. Under MPPT operation most of PV array exhibit the behavior of a current source, which leads to the CHB system depicted by Fig. 1. In these cases, the DC-bus voltage is a function of circuit currents. For symmetric cases, where the DC-bus voltages are equal, each H-bridge can produce $+V_{dc}$, V_{dc} , and $0V$ on the output. Then, a CHB arrangement of N converter is able to synthesize $2N + 1$ voltage levels. On the other hand, for asymmetric cases the number of levels can reach 3^N , according to the input voltage configuration [4].

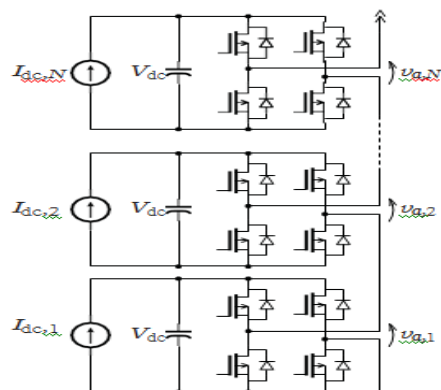


Fig. 1. Basic structure for one phase of a multilevel cascaded H-bridges with N-levels

One of the strategies that may be applied to CHB multilevel converter is the pulse width modulation with selective harmonic elimination (SHE-PWM). Proposed by Patel and Hoft [5], [6], this technique is based on the switching of DC bus voltages at predefined instants [7]. For each switch in the output waveform, one can obtain the desired amplitude to the fundamental component, while eliminating a certain number of harmonics of the output voltage and simplifying the filtering stage. Besides, since the inverter operates at low frequency, the overall system efficiency may be improved. The determination of switching instants for SHE-PWM has been extensively studied and several techniques for this task have been proposed [5]–[11]. However, this is only the first stage in the modulation design. In the sequence it is still necessary to specify the voltages to be produced by each H-bridge so that the SHE-PWM can be synthesized.

Grid-tie systems, with sources that may feature different capacities, require attention in specifying voltages of CHB

modules. If the output voltage pattern extracts the same energy amounts from modules with different capacities (different current values), the DC-bus voltages of one or more modules may collapse. This requires that the voltage generated by each inverter is carefully defined to proportionally extract

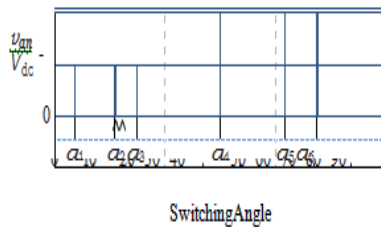


Fig. 2. General waveform for a cascaded multilevel inverter operating with SHE-PWM featuring six transitions per quarter wave.

the available power from each source. This task may easily become too complex without a computational support.

In this context, this main idea of this paper is to propose an automatic method to specify the output voltage waveforms of each module in a cascaded multilevel inverter fed by current sources as in Fig. 1. Based on a genetic algorithm (GA), and for any previously calculated switching pattern, the proposed method provide the optimal waveform to be synthesized by each CHB module such that fundamental components can be balanced, or even that a specific unbalance is achieved. Furthermore, the proposed strategy also keep the number of switching events to a minimum, avoiding efficiency degradation.

II. SELECTIVE HARMONIC ELIMINATION

In Fig. 2 is presented an example of a SHE-PWM waveform. The six transitions per quarter wave allow six degrees of freedom to achieve different objectives [5]. The output voltage u_{an} is defined by the Fourier series

$$u_{an}(t) = \sum_{h=1,3,5,\dots} V_h \sin(h\omega t) \quad (1)$$

where V_h the coefficient of h -th harmonic, defined by

$$V_h = \frac{4V_{dc}}{h\pi} \cos(h\alpha_1) - \cos(h\alpha_2) + \frac{1}{2} \cos(h\alpha_3) + \cos(h\alpha_4) - \cos(h\alpha_5) + \cos(h\alpha_6) \quad (2)$$

where V_{dc} is the DC bus voltage of H-bridges and α are the switching angles. Assuming that the \cos function of a vector returns the cosine of each element in a new vector with the same dimensions, the Fourier coefficients of (2) can be rewritten for any SHE-PWM pattern under the generalized matrix form

$$V_h = \frac{4V_{dc}}{h\pi} \cos(h\alpha) \mathbf{T} \quad (3)$$

where $\alpha = [\alpha_1, \dots, \alpha_6]$ a row vector containing the transition angles and \mathbf{T} a column vector of S elements that describes the transitions which characterize the PWM pattern on the first quarter wave, where 1 represents a level increase and -1 a level decrease on the output voltage. For the waveform depicted by Fig. 2, \mathbf{T} is defined by

$$\mathbf{T} = [1 \ -1 \ 1 \ 1 \ -1 \ 1] \quad (4)$$

freedom as observed in (2), one can define the modulation index m and also eliminate five low order harmonics by the solution of the switching angles $\alpha_1, \alpha_2, \dots, \alpha_6$ from the system of nonlinear equations

$$\begin{aligned} \frac{4V_{dc}}{\pi} \cos(\alpha) \mathbf{T} &= m \\ \frac{4V_{dc}}{h\pi} \cos(h\alpha) \mathbf{T} &= 0, \quad h = 5, 7, 11, 13, 17 \end{aligned} \quad (5)$$

subject to the linear inequalities

$$0 < \alpha_1 < \alpha_2 < \alpha_3 < \alpha_4 < \alpha_5 < \alpha_6 < \frac{\pi}{2} \quad (6)$$

and also to the linear equalities

$$\frac{4V_{dc}}{h\pi} \cos(h\alpha) \mathbf{T} = 0 \quad (7)$$

representing the harmonics to be eliminated, where

$$\mathbf{h} = [5 \ 7 \ 11 \ 13 \ 17] \quad (8)$$

is a vector with the index of the harmonic to be eliminated. This problem can be easily extended to any odd number of levels. It is worth to notice that in this case is assumed that the modulation index is defined as the ratio between the fundamental component of the output voltage by the DC bus voltage ($u_{an,1}/V_{dc}$).

A. Solution of Nonlinear Equations

The system of equations defined in (5) is nonlinear and transcendental, and for its solution there are several methods available in the literature. Patel and Hoft [5] employed the Newton-Raphson method iterative fast and whose results

of this methods is strongly dependent of the initial guess x_0 , which is not always simple to obtain. In an effort to assist the determination of a good x_0 , Enjeti and Lindsay [8] have proposed an approximation method of the exact solution for the nonlinear equations exploring the symmetries observed in the trajectories of the switching angles.

Alternatively, the sequential quadratic programming (SQP) is a modern method that is capable to solve nonlinear equations subject to restrictions. SQP performs an inline search, approximating to the Newton method for optimizations with restrictions. In this paper SQP is employed together with an active set optimization by means of a numerical program that implements the algorithm of Fletcher [12].

Finally, the function to be minimized is obtained from the equation that determines the magnitude of the fundamental component

$$V_{a1} = \cos(\alpha) T^{-m} \tag{9}$$

Assigning

where the superscript 't' denotes the vector or matrix transpose.

According to Patel and Hoft [5], given S transitions per quarter wave, to control the amplitude of the fundamental component and eliminate S-1 harmonics, S equations are needed. Thus, for the case of Fig. 2, with six degrees of

and solving for the SHE-PWM pattern of Fig. 2 with an initial guess defined by

$$\alpha_{0,1} = [20.1451^\circ \quad 22.0635^\circ \quad 36.2940^\circ \quad 53.7186^\circ \quad 64.0051^\circ \quad 80.8106^\circ] \tag{10}$$

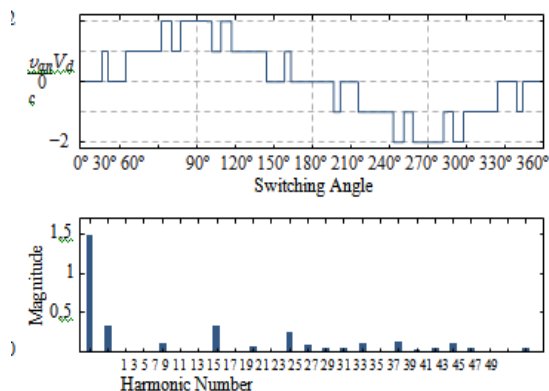


Fig. 3. SHE-PWM pattern and spectrum of the output voltage V_{a1} for a modulation index $m = 1.5$.

leads to the vector of angles

$$\alpha_1 = [16.5745^\circ \quad 21.6692^\circ \quad 35.6092^\circ \quad 62.8303^\circ \quad 70.9616^\circ \quad 78.1385^\circ] \tag{11}$$

whose resultant SHE-PWM pattern, as well as its harmonic components are depicted by Fig. 3.

By the nature of the equation there are multiple possible solutions, which depend on the initial attempt α_0 . Fig. 4 shows the trajectory of switching angles as a function of the variation of the modulation index for the results obtained from (10) and from other initial guesses defined by

$$\alpha_{0,2} = [21.0734^\circ \quad 37.0704^\circ \quad 42.3072^\circ \quad 54.3622^\circ \quad 69.8550^\circ \quad 79.8245^\circ] \tag{12}$$

$$\alpha_{0,3} = [3.6956^\circ \quad 23.3308^\circ \quad 35.1796^\circ \quad 44.9371^\circ \quad 65.6209^\circ \quad 81.7783^\circ] \tag{13}$$

Defined the SHE-PWM pattern and the switching angles, the next step in the design process is to determine the voltage waveform that each individual converter must produce to synthesize the desired pattern. Frequently, these voltages are assigned on the basis of prior knowledge of the designer, seeking to reduce the number of commutations and maintain a balance of DC bus voltages. However, this conventional approach does not guarantee that the designer option is optimal or that voltages produced by the converters are balanced. It is from this problem that this paper proposes an automatic strategy to define the output voltage waveform to be synthesized by each individual converter.

III. A GENETIC ALGORITHM TO SPECIFY OPTIMAL OUTPUT VOLTAGE WAVEFORMS

The strategy for the optimization of voltages of the converters investigated in this paper is conducted by means of a genetic algorithm whose solution sequence is detailed in this

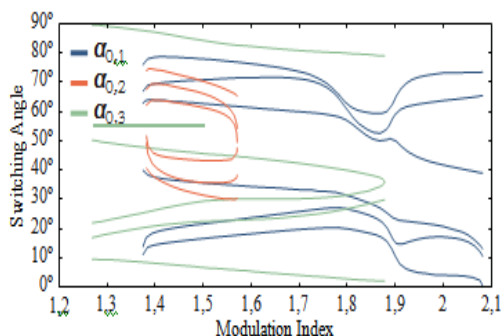


Fig. 4. Trajectories of switching angles for the transition vector defined on (4) and from the different initial guesses α_0 .

- 2) Group genes by type according to voltage they are able to produce;
- section, which can be summarized in the following steps:
- 1) Maps the synthesizable voltages by the CHB and determines the possible genes to be employed in the algorithm;
 - 3) Randomly creates the initial population;
 - 4) Generate voltage waveforms for each H-bridge (v_{an}), evaluate the FFT and solve the objective function;
 - 5) Sort chromosomes based on its costs;
 - 6) Evaluate the stop condition. If it is met, terminates the algorithm;
 - 7) Apply natural selection;
 - 8) Creates the next generation from crossover or from modifications on random genes (mutation);
 - 9) Return to the step 4.

Instead of the quarter-wave symmetry assumed for determination of switching angles, this step assumes the output voltage of the converters has half-wave symmetry. This assumption increases the degree of freedom in the search for optimal solution.

To avoid the GA indefinitely continue searching for an optimal solution, at least one stop criteria should be established by the designer [13]. One of the criteria used in this paper sets the maximum number of generations in three hundred, while the other ends the evolutionary process if the cost of the best chromosome does not significantly evolve in fifteen generations.

A. Initial Population Creation

The first step for the proposed genetic algorithm is the creation of genome, in the identification of genes and in the generation of the initial population, which is created randomly from the available genes. Each gene is associated with the phase voltage level produced by the inverter in the time interval between two switches. Observing again the pattern depicted by Fig. 2, one can observe that for a half cycle of the output voltage v_{an} , there are thirteen time slots and, in turn, thirteen genes will compose each chromosome.

Not all voltage combinations that can be generated by the converter modules may be employed to reproduce the SHE PWM pattern. Thus, during the initialization of GA all possible voltage combinations that can be produced by each phase leg are determined. After the combinations that can be used to synthesize the output voltage required at each interval are identified. For the arrangement of two converters in the pattern illustrated by Fig. 2, and knowing that the normalized voltages each converter is capable to produce are 1, 0, 1, one can map the synthesizable output voltages v_{an} as defined by Table I.

TABLE I
SYNTHESIZABLE OUTPUT VOLTAGES FOR A PHASE LEG OF THE HREE-LEVEL INVERTER AND ITS TYPES OF ASSOCIATED GENES.

V_{dc}	$V_{a,2}$ V_{dc}	$V_{a,1}$ V_{dc}	Gene
-1	-1	-2	—
-1	0	-1	—
-1	1	0	Type0
0	-1	-1	—
0	0	0	Type0
0	1	1	Type1
1	-1	0	Type0
1	1	1	Type1
1	1	2	Type2

TABLE II
GENOME EMPLOYED TO SOLVE THE SHE-PWM PATTERN OF FIG. 3.

Gene	1	2	3	4	5	6	7	8	9	10	11	12	13
Type	0	1	0	1	2	1	2	1	2	1	0	1	0

TABLE III
INDEXERS AND AVAILABLE GROUPS OF GENES

$[V_{s1}; V_{s2}]$			
Index	Type 0	Type 1	Type 2
1	$[0; 0]$	$[-1; 1]$	$[0; 1]$
2	$[1; -1]$	—	$[1; 1]$
3	$[1; -1]$	—	—

In addition to mapping the possible voltage combinations, one need to identify which ones may be used for each gene. Given the half wave symmetry of the output voltage, combinations that results in a negative voltage are not considered and may be discarded, while positive combinations are grouped according the voltage produced by each phase of the inverter. For the group of combinations that produce zero level in the output voltage the genes are named as Type 0, and so on for the other groups of combinations that generate positive voltage levels, as defined by Table I.

The genome employed in the solution of the SHE-PWM pattern of Fig. 3 is presented by Table II and can be easily redefined for other patterns by simple inspection of the u_{an} waveform.

During the creation of the initial population, the algorithm generates a random value for each gene. This value corresponds to an index of the available genes for each group, as presented by Table III. This ensures that the algorithm uses only the appropriate type of gene, producing feasible combinations whose sum of voltages of the H-bridges correspond exactly to the analyzed SHE-PWM pattern.

B. Chromosome Cost Evaluation

The objective of each chromosome is to determine the output voltage waveform of each CHB module so the fundamental components can be equalized, or even that a specific balance between them is imposed. To provide this feature a positive-defined diagonal weighting matrix is defined as

$$W = \begin{bmatrix} w_1 & & & 0 \\ & \ddots & & \\ & & w_N & \\ 0 & & & \ddots \end{bmatrix} \quad (14)$$

allowing one to establish a specific ratio between each fundamental component of the output voltages, where w_N a positive weight to be given to the components of the N -th converter. Also, it is of practical interest that the total number of switching in the converters α_c by period of the output voltage be minimal so that efficiency is not adversely affected

where α_c the number of switching events per period of the SHE-PWM pattern and \mathbf{H} a row vector containing the magnitude of the fundamental components of each converter.

C. Natural Selection and Crossover

After evaluating the objective function, chromosomes are sorted according to their costs in ascending order. A χ_{nat} rate defines how many chromosomes will survive the natural selection and generate offspring to replace chromosomes with worst cost, previously discarded. For the solution of the proposed problem a rate of $\chi_{nat} = 0.2$ is defined. This value has been chosen after a series of preliminary studies in which it was found that this rate allows a better compromise between convergence time and accuracy of the results. The pair of chromosomes that will generate a pair of offspring is selected by the roulette wheel method, in which the area of the corresponding section to an individual at roulette is proportional to its expectation of selection [13]. In this way, individuals who have a lower cost have a higher probability of selection.

In the GA developed for this paper, offspring generation is carried out by means of scattered crossover. In this method, for each pair of chromosomes selected to generate offspring, a random binary mask with the same number of genes is generated. For the first offspring, all elements that in the mask has a value 0 the offspring receives the genes of the father, and for the other elements that the mask has a value 1, the offspring receive the genes of the mother. For the second offspring the same mask is employed, however in a complimentary way.

by switching losses. To simultaneously achieve both targets, the GA employs an objective function defined by

D. Mutation

Mutation is responsible to include new genes in the population, increasing its diversity. This is carried out by means of random modifications in some genes. A mutation rate χ_{mut} establishes the portion of genes that will suffer mutation.

$$f_{obj} = \frac{\sum_{i=1}^N H_i W_{i,j}}{\alpha_c (1 + N | \max(\mathbf{HW}) - \min(\mathbf{HW}) |)} \quad (15)$$

Here a rate of $\chi_{mut} = 0.1$ is employed by the same reason of χ_{nat} . To perform mutation is first necessary to identify the type of gene to be modified through its position in the genome (as in Table II, for example). After, a random integer value is generated, which need to belong to the range of one to the

number of available genes belonging to the same type of the

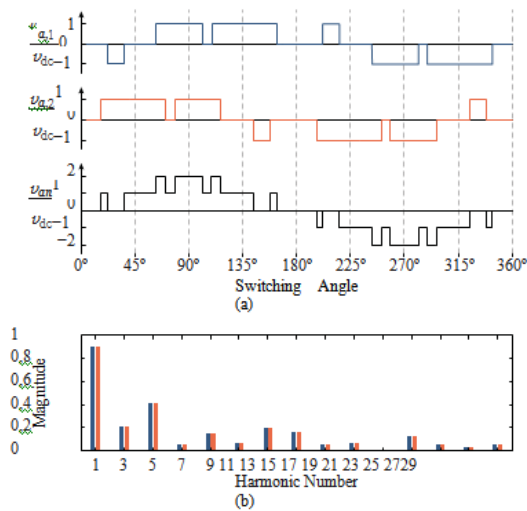


Fig. 5. Results obtained by the proposed GA for the switching pattern of Fig. 3 with balanced fundamental components (a) voltage waveforms produced by each H-bridge; (b) harmonic components of the output voltage for each converter.

IV. CASE STUDIES

The GA-based optimization strategy proposed in the previous section is validated by means of case studies based on simulations. Results for cascaded multilevel inverters with five and nine-levels are presented. In the first case the objective is to achieve the desired modulation index and match the fundamental components of a five level inverter. This is the case, for example, of sources with equal currents $I_{dc,1}$ and $I_{dc,2}$ on Fig. 1. For the second case, the objective is to also reach the modulation index, but in this case for a specific unbalance between fundamental components of the output voltages for a nine level inverter. An example where different power levels need to be extracted from each converter so that voltages of DC buses are maintained balanced. Results and comments for each case are presented below.

A. Five-levels: balanced fundamentals

For this first case the objective is to find the optimal output voltage for the individual CHB converters so that the SHE-PWM pattern described by the transition vector (4) provide equal fundamental components. This may be achieved defining a weighting matrix as

$$W_1 = \text{diag} \begin{matrix} 1 & 1 \end{matrix} \quad (16)$$

that will be employed by the objective function (15), where diag function for diagonal matrices creation. The optimal waveforms obtained by the proposed GA is depicted by Fig. 5(a). Fig. 5(b) detail the harmonic components, where one can verify that both fundamentals of each converter are equalized. Moreover, as it can be seen on Fig. 6, this balance is maintained over the full range of modulation indexes that the SHE-PWM pattern is able to synthesize. The solution found by the GA features 24 switching, which for this case is equal

to the number of switching pattern itself.

B. Nine-levels: unbalanced fundamentals

To evaluate the proposed algorithm in a more complex scenario, it is also presented a case study for a nine-level inverter where it is desirable to impose an unbalance for the fundamental voltages of the converters. This would be the case, for example, of DC sources with different capacities, as batteries with distinct charge levels. Other application of this feature is for CHB fed by capacitors, where a specific unbalance may be desirable to provide resources for the system to reestablish the equilibrium of DC bus voltages.

In this case, assuming that the harmonics 5, 7, 11, 13, 17, 19 and 23 must be eliminated, it is necessary 8 switching events per quarter wave so that the magnitude of fundamental component for the voltage v_{an} can be controlled. Thus, defining a SHE-PWM switching pattern by the transition vector

$$T = \begin{matrix} 1 & 1 & -1 & 1 & 1 & 1 & -1 & 1 \end{matrix}^T \quad (17)$$

with a modulation index of $m = 3, 8$ and using as an initial guess

$$\alpha_{0,g} = \begin{bmatrix} 7.524^\circ & 19.400^\circ & 30.682^\circ & 40.750^\circ \\ 55.047^\circ & 69.999^\circ & 75.063^\circ & 84.203^\circ \end{bmatrix} \quad (18)$$

it is obtained vector of angles

$$\alpha_s = \begin{bmatrix} 7.700^\circ & 25.332^\circ & 28.447^\circ & 30.255^\circ \\ 43.160^\circ & 62.242^\circ & 67.978^\circ & 73.445^\circ \end{bmatrix} \quad (19)$$

For this case, the resulting SHE-PWM pattern and as its harmonic components are illustrated by Fig. 7. It is worth noting that the triplet harmonics has not been eliminated since a final three phase system is assumed.

In order to force an unbalance of fundamentals, the weighting matrix is defined as

$$W_2 = \text{diag} \begin{matrix} 1, 0, 0, 9, 0, 8, 0, 7 \end{matrix} \quad (20)$$

and the GA is run for the SHE-PWM pattern of Fig. 7. The results obtained are depicted by Fig. 8, where one can observe 40 switching events, while the output voltage van features 32 switching events.

The development of the fundamental components of the converter due to the variation of the modulation index for the resulting configuration is illustrated by Fig. 9, where expected unbalance of the fundamental components can be observed. The forced unbalance occurs over the entire range of modulation indexes that the SHE-PWM pattern is able to synthesize, although it need to be highlighted that a fixed ratio cannot be maintained throughout this range

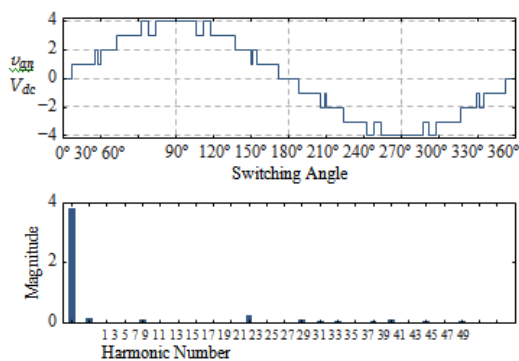


Fig. 7. SHE-PWM pattern defined in (17) and its harmonic components for $m = 3.8$.

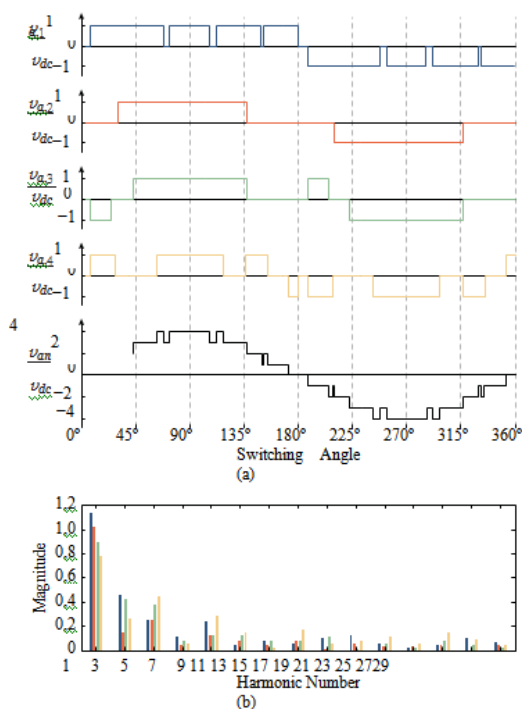


Fig. 8. Optimized converter waveforms for the SHE-PWM pattern of Fig. 7 with forced fundamental unbalance (a) voltages produced by individual converters; (b) harmonic components of output voltages of the converters

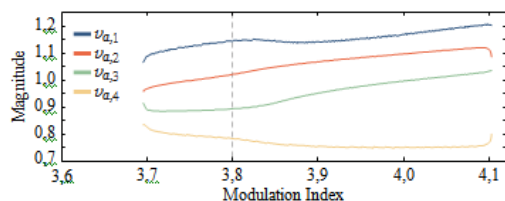


Fig. 9. Trajectories of fundamental components of the individual converters subject to variation of modulation index. (unbalanced case).

V. CONCLUSION

This paper presented an automatic method for specification of voltage waveforms to be

synthesized by cascaded H-bridges multilevel converters employing SHE-PWM. Based on a GA, and for any given SHE-PWM pattern with precomputed switching angles, the proposed method enables a better balance of power processed by each converter. Besides, it also allows to obtain waveforms with unbalanced fundamentals that can be used by control strategies as an additional resource for balancing and equalizing DC buses directly on the modulation stage. This makes the proposed strategy a major candidate for grid-tie systems fed by renewable sources. Case studies for five and nine-level converters requiring balanced or unbalanced fundamental components was presented, and the results corroborates with the applicability of the proposed strategy. It is worth noticing that although it was reported results only for those configurations, the proposed strategy can be easily applied to inverters with higher number of levels, with the elimination of as much harmonics as necessary, and even for asymmetric multilevel converters.

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