



# Article Matlab-Based Design Consideration of Series ZVS Single-Ended Resonant DC-DC Converter

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**Abstract:** The paper presents a model-based design consideration of a series single-ended transistor resonant DC-DC converter with zero voltage switching (ZVS). A characteristic of this converter is that it is highly efficient due to the resonant nature of electromagnetic processes in the power circuit and operation with soft commutations. The manuscript proposes that the determination of some of the circuit elements of the device be carried out with optimization procedures based on the application of artificial intelligence techniques. For this purpose, an objective function is used with additional constraints, such as equalities and inequalities, for both the optimization parameters and the state variables. The use of the proposed method is justified in cases where there is no methodology for the design of the specific power electronic device or there is, but it is too complicated to apply. This is usually due to the increasing complexity of power circuits and their possible modes of operation and the inevitable assumptions and limitations in the analysis and the relevant methodologies based on that analysis. In this way, a natural combination, complement and development of classical design methods with innovative ones based on the application of artificial intelligence techniques is carried out.

**Keywords:** modeling and simulation; DC-DC converters; zero voltage switching (ZVS); resonant converter; model-based optimization

MSC: 93B51

## 1. Introduction

Research related to the harvesting, conversion, transmission and storage of electricity from decentralized sources is becoming increasingly relevant in view of the growing standard of living and energy needs of people. At the same time, the development of industrial technologies and society as a whole leads to an increasing amount of electricity, which is not consumed directly but is converted with parameters other than those of the electricity grid. On the other hand, with the continuous growth of the population and the quality of life of the people, the issues and decisions related to the rational use of resources, the protection of the environment and the maintenance of the ecological balance in nature are becoming more important [1,2].

Therefore, the sustainable development of society largely depends on maintaining a balance between the trends associated with increasing electricity consumption and declining primary energy sources. Their combination is possible only with the creation of innovations and the implementation of scientific and applied research in the field of power electronic converters (PEC) [3–5].

Research in the field of using modern methods for the design of PEC is a major factor in the implementation of environmental policies. Improving electricity conversion efficiency by just a few percent at current global consumption volumes will lead to savings



Citation: Hinov, N.; Gilev, B. Matlab-Based Design Consideration of Series ZVS Single-Ended Resonant DC-DC Converter. *Mathematics* **2023**, *11*, 2384. https://doi.org/10.3390/ math11102384

Academic Editor: Senthil Krishnamurthy

Received: 20 April 2023 Revised: 17 May 2023 Accepted: 18 May 2023 Published: 20 May 2023



**Copyright:** © 2023 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). significantly exceeding the total energy production of a number of small countries such as Bulgaria while reducing harmful emissions and resources used.

On the other hand, ensuring the output indicators of the PEC is important for achieving the desired quality of the energy conversion process. Modern methods for the design and prototyping of PEC with guaranteed indicators require the use of a systematic approachfrom formulating the problems to obtaining the final product and are related to the use of information and communication technologies and especially techniques, based on artificial intelligence [6–9]. A very detailed classification of artificial intelligence techniques applied in power electronics is given in [7]. The paper presents an overview of artificial intelligence (AI) applications for power electronic systems depending on the three distinct phases of the product life cycle: design, control and maintenance. These phases are related to one or more tasks to be solved by AI: optimization, classification, regression and data structure exploration. Specific applications of four categories of AI are discussed: expert systems, fuzzy logic, metaheuristics, and machine learning. The generalizations and conclusions are drawn from a survey of over 500 publications on the topic to identify common understandings, practical implementation challenges, and research opportunities in the application of AI to power electronics. In this sense, as a functional layer between AI and the specific applications of power electronic systems, optimization is described as a tool for finding an optimal solution that maximizes or minimizes objective functions from a set of available alternatives, given constraints conditions, equalities, or inequalities to which solutions must conform. For example, in the design task, optimization serves as a tool to explore the optimal set of parameters that maximize or minimize the goals and constraints set in the design.

In [10], by using expert systems (ES), fuzzy logic (FL) and artificial neural networks (ANN or NNW), the automated design of a modern wind energy system and its health monitoring in operating conditions, identification of smart grid subsystem failure models and smart control based on a real-time simulator. In [11], an optimal design of a Full-Bridge CLLC Converter is given, based on the use of a Particle Swarm Optimization (PSO) algorithm. The goal is to increase device efficiency by reducing switching losses [12] presents a new approach to the design and optimization of power electronic devices, in which the optimal characteristics of the circuit elements of a DC-DC converter are selected considering a certain objective function and various design constraints. Extensive amounts of component data available on commercial distributor sites have been used to train supervised machine-learning regression models. Thus, the use of machine learningbased techniques allows the data-driven optimization task to become amenable to a large design space. The developed tool can be used to compare the performance of a choice of converter topologies or of the specific technologies by which the semiconductor switches are manufactured, and also to predict the performance contribution of individual components. As an example, optimized 48-to-12 V, 5 A DC/DC converter designs based on GaN and Si MOSFETs are compared in terms of loss, size, and cost. In [13] demonstrates a data-driven approach to capture values and characteristics of semiconductor switches and passive components used in power electronic converters. Large volumes of data on electronic components available from commercial distributors' sites have been collected and processed to determine relationships between component characteristics that extend the bases of the description of physical process models. The data are used to train supervised regression machine learning models that can be used to predict component parameters. One practical use of these machine learning-based models is in an optimization tool that advises power electronic device designers on component selection to achieve optimal design under a given objective function. In [14], a new model is proposed that simulates a hybrid power conversion system using a unified evolutionary algorithm (EA). This unified evolutionary algorithm is developed to incorporate the properties of differential evolution (DE) and genetic algorithm (GA). This study describes a modified hybrid power converter that optimizes the zero ripple (DZ) duty cycle through the proposed input ripple minimization algorithm. In [15] presents the implementation of a random forest algorithm applied to

decision-making in the design of power electronic converters. The algorithm is used to help choose the topology of the power circuit. The presented algorithm can be applied to isolated and non-isolated. All steps of the algorithm are described in detail, including training and testing data for designing a specific power electronic device. In [16], a specialized algorithm for an expert system for choosing a power electronic converter topology is presented. The algorithm is aimed at providing optimal topology suggestions for a single-phase power factor correction converter in terms of preferred levels of efficiency, cost, and dimensions. The algorithm was developed using neural networks and a procedurally generated decision training database built using datasets of existing semiconductor and magnetic devices. The results of the verification and evaluation of the accuracy of the algorithm are presented.

From the review and analysis of the existing methods and their implementing algorithms for the optimal design of power electronic devices and systems based on the application of artificial intelligence techniques, it follows that in the prevailing cases, they are based on the collection and processing of data related to with training and implementation of complex procedures. In this regard, due to the specificity of electromagnetic processes (switching of the structure of the power circuit during operation), the design of power electronic devices based on the application of artificial intelligence techniques and data-driven models is practically very difficult to implement. On the other hand, the application of specialized design methods, which are based on analysis in an established mode of operation, without taking into account the transient processes in the power circuits, leads to the realization of devices with poor dynamic indicators and operational characteristics.

The main idea that is being developed is the design methodology to realize the implementation of standard tools and application programs in mathematical software widely used by engineers, such as Matlab, thus, allowing specialists with not very deep knowledge of mathematics and programming to apply state-of-the-art tools for designing and prototyping power electronic devices and systems. On the other hand, the main idea of model-based optimization is to achieve the maximum possible power scheme during its design and to teach a device with the best possible and guaranteed indicators. Of course, this approach does not negate the advantages offered by the optimal control synthesis for the realization of power electronic devices with improved characteristics. A number of studies prove that the optimally designed power scheme supports both control synthesis and controller tuning, as well as the required hardware and software resources for its implementation [6-8]. The motivation for the creation of this manuscript is related to the fact that, at this moment, there is a lack of up-to-date research devoted to the methodological aspect of the design of power electronic devices and systems, as well as to present rational methodologies for their design, giving a possibility to formalize and automate the design process.

In this aspect, the aim of the present work is to offer a rational procedure for the design of power electronic devices and systems, which combines classical methods with modern achievements of modeling, computational mathematics and information and communication technologies. At the heart of this approach is the combination of design methodologies, knowledge derived from the experience of the designer and optimization. In this approach, the description of the building elements, structures and schemes of PEC is conducted with mathematical and information models, and the guarantee of the output indicators is conducted already in the process of designing the devices. The manuscript is organized as follows: the first part describes the main challenges and problems in the design of power electronic devices and systems. Various examples of optimal design are considered; The second part is dedicated to the model-based approach to the design of power electronic devices and systems; In the third part, the principle of operation and the main ratios used to design a resonant DC-DC converter are discussed; In the fourth part, the first optimization problem used to determine the circuit elements of the power circuit is formulated. This task is solved using standard Matlab/Simulink built-in functions; In the fifth chapter, the optimization problem is developed by adding additional conditions regarding the state variables. An algorithm and an author's program are proposed, which

gives the optimal values in the preset working interval; in the sixth chapter and seventh parts, discussion, conclusion and directions for research development are given.

#### 2. Model-Based Design of Power Electronic Converters

Trends in the design and development of PEC are mainly related to guaranteeing the output indicators; reducing their dimensions, mass, and price; increasing reliability and service life. All this makes the task of optimal design in power electronics very difficult. It is impossible to solve it successfully without using advanced methods in combination with classical approaches. On the other hand, the accelerated development of computational mathematics and the computing power of mass and accessible hardware systems favors the penetration of information and communication technologies in the research of power electronics.

Most of the methods used to design the PEC can be summarized as follows [17–22]:

- 1. Based on generally accepted average estimates of state space after reaching a quasi-static state, not always guaranteeing the validity of their values in different operating modes.
- 2. As a result of the design, values of the building elements are reached, which are physically unrealizable as a consequence, the prototypes are selected as close as possible to the values thus determined. This requires repeated repetition of the calculation procedure until the design assignment is met or until it changes in the direction of loosening the initial requirements.
- 3. It is practically impossible to account for the complex influence of nonlinearities, it is practically impossible to take into account the complex influence of the nonlinearities, the variations of the nominal values of the parameters and their change during operation as a function of external disturbances change of supply voltage, ambient temperature, load and aging of elements.
- 4. If we take into account the relationship between the choice of parameters and the dynamics of the PEC, the amplitude values of currents and voltages on the building elements, it prolongs the process of selecting elements and is not guaranteed to find a solution to the problem.

The manuscript proposes a design approach based on a combination of tools using basic relationships to obtain the initial values of the circuit elements obtained by analyzing the determined processes in the circuit and applying mathematical modeling and optimization to finally find the values of circuit elements. The basis of the second part of this method (finally finding) is the creation, verification and optimization of a model of the power scheme; therefore, it is called model-based design. The advantages of the method will be illustrated based on series single-ended transistor resonant DC-DC converters with soft switching (ZVS). The scheme of this device is shown in Figure 1, being original and having a patent for invention [23]. It is composed of an active-capacitive load ( $C_1$  and R), transistor T, resonant elements—capacitor C and inductance L, diode D, necessary in cases where the transistor does not have a built-in reverse diode, transformer, bridge rectifier, filter capacitance  $C_2$  and inductance  $L_3$ . The analysis is carried out under the assumption of the ideality of all elements in the power circuit and also that the DC power source has zero internal resistance.

These schemes were chosen because no methodologies have been developed for their design due to the complexity of the power scheme, as well as the high order of differential equations that describe electromagnetic processes. In addition, the passage through the various stages of the operation of the power circuit is not determined only by externally controlled switching of the transistor, but directly depends on the operating mode and load parameters.



Figure 1. Single-ended transistor resonant DC-DC converter with ZVS with series resonant circuit.

On the other hand, the creation of such a methodology requires efforts both for its development and for its adaptation for the purposes of power electronics. Thus, these circuits are a good example of illustrating the advantages of using model-based design in power electronics.

#### 3. Description and Modeling of Power Circuit

The power circuits of Figure 1 are series single-ended transistor resonant inverter with the direct establishment of the regime (without a transient start-up process), in which a transformer connected to the resonant circuit provides current in a shape close to the sinusoidal to the rectifier and CLC output filter. Single-ended transistor inverters with no transient process can operate in zero voltage switching mode (ZVS), which further improves the energy performance of the converters. On the other hand, the presence of resonant processes leads to the production of significant voltages on the semiconductor switch T (in the range of 3–6 times the input supply voltage  $U_d$ ). To control these devices, a method of monitoring the resonant current is used [23], turning off the transistor T occurs at a certain preset current value. In this way, both the protection and control of the power circuit are combined.

Since the considered converters have a complex structure and it is difficult to describe the electromagnetic processes in the circuit and the creation of basic relations for design, then the use of model-based design is appropriate for determining the circuit elements.

The considered power circuit is composed of two main parts—a resonant inverter and a rectifier with a CLC filter. In this sense, a combined approach will be used in the design to determine the values of the circuit elements—the inverter elements will be designed based on the analysis of the power circuit and the CLC filter elements—through an optimization procedure.

An analysis of the resonant inverter is discussed in [24,25]. By turning off the transistor T, a resonant process begins in the series RLC circuit, composed of the equivalent inductance (the resonant *L* plus the inductance brought to the primary winding of the transformer  $L_1$ ), the resonant capacitor *C* and the resistance brought to the primary winding— $R_R$ . Due to the presence of a series resonant circuit, the current through the resonant inductance



and the capacitor voltage are close to sinusoidal in shape. Figure 2 shows timing diagrams explaining the action of the resonant inverter.

**Figure 2.** Timing diagrams describing the operation of a series resonant inverter. From top to bottom: control pulses, current through the inductance, voltage on the capacitor and the transistor (on the reverse diode).

Solving such a task is related to conducting an analysis of series resonant inverters, which is conducted in detail in the specialized literature [17–21], and therefore, the current through the inductance and the voltage of the capacitor is obtained as follows:

$$i_{LR}(t) = \frac{U_d}{\omega_0 L_R} e^{-\delta t} \sin \omega_0 t - I_0 e^{-\delta t} (\frac{\delta}{\omega_0} \sin \omega_0 t - \cos \omega_0 t),$$
  

$$u_c(t) = U_d - U_d e^{-\delta t} (\frac{\delta}{\omega_0} \sin \omega_0 t + \cos \omega_0 t) + \frac{I_0}{\omega_0 C} e^{-\delta t} \sin \omega_0 t$$
(1)

where  $L_R = L + L_1$ ,  $R_R$ —the total active resistance in the resonant circuit,  $I_0$  is the initial value of the current through the resonant inductance and the initial capacitor voltage  $U_0 = 0$ ;  $\omega_0 = \sqrt{\frac{1}{L_R C} - \delta^2}$  and  $\delta = \frac{R'_1}{2L_R}$ —respectively—the resonant frequency and attenuation of the series resonant RLC circuit,  $k = \frac{1}{1-e^{-\frac{\delta}{\pi}\omega_0}}$ —coefficient of variation, analogous to the quality factor Q [18–20],  $\nu = \frac{\omega}{\omega_0}$  frequency factor (detuning of the resonant circuit),  $\omega = 2\pi f$ —circular control frequency.

The value of the starting current of the resonant inductance  $I_0$  is determined by the expression [24,25]:

$$I(0) = \frac{Ud}{R} \left( 1 - e^{-\frac{\delta\pi}{\omega_0} \frac{4\gamma}{\nu}} \right) = \frac{Ud}{R} \left( 1 - \frac{k-1}{k} \frac{4\gamma}{\nu} \right) = \frac{Ud}{R} A,$$
(2)

4.0.

where  $\gamma$  is the duty cycle, representing the ratio of the time when the transistor is turn-on to the period of the control frequency. After substituting the value of the initial current  $I_0$  in (1), we obtain:

$$i_{LR}(t) = \frac{U_d}{\omega_0 L} e^{-\delta t} \sin \omega_0 t - \frac{U_d}{R} A e^{-\delta t} \left( \frac{\delta}{\omega_0} \sin \omega_0 t - \cos \omega_0 t \right)$$
  
$$u_c(t) = U_d - U_d e^{-\delta t} \left( \frac{\delta}{\omega_0} \sin \omega_0 t + \cos \omega_0 t \right) + \frac{U_d A}{\omega_0 CR} e^{-\delta t} \sin \omega_0 t$$
(3)

To facilitate the further analysis of the scheme, these expressions are presented in a compact form, with the corresponding initial phases:

$$i_{LR}(t) = \frac{U_d}{\omega_0 L_R} B e^{-\delta t} \sin(\omega_0 t + \psi) = \frac{2U_d}{R_R} \frac{\delta}{\omega_0} B e^{-\delta t} \sin(\omega_0 t + \psi),$$

$$u_c(t) = U_d + U_d C e^{-\delta t} \sin(\omega_0 t - \varphi)$$
(4)

where  $B = \sqrt{\left(1 - \frac{A}{2}\right)^2 + \left(\frac{A}{2}\frac{\omega_0}{\delta}\right)^2}$ ,  $\psi = \operatorname{arctg} \frac{\frac{A}{2}\frac{\omega_0}{\delta}}{1 - \frac{A}{2}}$ —initial phase of the current through the resonant circuit,  $C = \sqrt{\left(\frac{A}{2}\left(\frac{\omega_0}{\delta} + \frac{\delta}{\omega_0}\right) - \frac{\delta}{\omega_0}\right)^2 + 1}$ ,  $\varphi = \operatorname{arctg} \frac{1}{\frac{A}{2}\left(\frac{\omega_0}{\delta} + \frac{\delta}{\omega_0}\right) - \frac{\delta}{\omega_0}}$ —initial phase of the voltage on the resonant consister

of the voltage on the resonant capacitor.

The considered stage of the operation of the scheme ends with the switching on of the diode D. This happens at the moment  $t_1$  (shown in Figure 2) and then for an ideal diode it can be considered that its voltage and, accordingly, the voltage of the capacitor becomes equal to zero. In this way, the condition  $u_C(t_1) = 0$  determines the end of this and the beginning of the second stage of the operation of the scheme. Thus, the following equation is obtained, the solution of which is the required quantity  $t_1$ :

$$u_{C}(t_{1}) = U_{d} + U_{d}Ce^{-\delta t_{1}}(\sin\omega_{0}t_{1} - \varphi) = 0$$
(5)

After conversion, to find the duration of the resonant process in the circuit, the following transcendental equation is solved:

$$e^{-\delta t_1}(\sin\omega_0 t_1 - \varphi) = -\frac{1}{C} \tag{6}$$

During the operation of the diode, a control pulse is supplied to turn on the transistor, and when its current reaches zero, the conditions are created for turning on the transistor, which repeats the processes in the circuit.

The capacitor voltage reaches its maximum value at the time  $t_{max}$  when the current through the resonant inductance becomes zero. From the equation of the expression describing the current in this interval, the determination of this moment becomes:

$$t_{max} = \frac{\pi}{\omega_0} - \frac{1}{\omega_0} \operatorname{arctg} \frac{\frac{A}{2} \frac{\omega_0}{\delta}}{1 - \frac{A}{2}}$$
(7)

Therefore, the maximum value of the voltage of the capacitor and, accordingly, of the transistor is obtained:

$$U_{C_{max}} = u_C(t_{max}) = U_d + U_d C e^{-\delta t_{max}} \sin(\omega_0 t_{max} - \varphi)$$
(8)

Thus, with the help of the derived expressions, all the parameters necessary for the design of the inverter can be determined. In this sense, the following values of the circuit elements of the inverter part of the converter are defined. In this regard, the following values of the circuit elements were obtained:

*Ud* = 25 V—input DC supply voltage;

 $R_1 = 0.01 \Omega$ —resistance of the primary winding of the transformer;

 $L_1 = 10 \mu$ H—inductance of the primary winding of the transformer;

 $R_2 = 0.01 \Omega$ —transformer secondary winding resistance;

 $L_2 = 10 \,\mu\text{H}$ —inductance of the secondary winding of the transformer;

k = 0.9—transformation coefficient, from where we obtain the related parameters:  $L_m = k\sqrt{L_1 L_2} = 9 \ \mu\text{H}$  and  $R_m = k\sqrt{R_1 R_2} = 0.009 \ \Omega$ ;

 $L = 10 \,\mu\text{H}$ —resonant inductance;

 $C = 1 \,\mu\text{F}$ —resonant capacitor;

On the other hand, as a result of the accumulated experience from the research of similar schemes [24,25], it is possible to determine the initial values of the elements of the circuit of the CLC filter:

 $R = 25 \Omega$ —load resistance;

 $L_3 = 0.2$  mH—filter inductance;  $C_1 = C_2 = 300 \mu$ F—filter capacitors.

The power system in Figure 1 has a changing structure. This change is modeled by the control switching function, which simulates the different states of the converter. It is defined for the serial converter in Figure 1 as follows:

$$control(t) = \begin{cases} 1, \ for \ \left| \begin{array}{c} 0 \le i_1 \le I_{off} \\ i_1 - \text{ increase} \end{array} \right| \ u_C \le 0 \\ 0, \ for \ \text{all other cases} \end{cases}$$
(9)

where  $i_1$  is the current in the primary winding of the transformer,  $I_{off} = I_0$ —the braking current of the transistor;  $u_C$ —the voltage of the resonant capacitor.

Using Kirchhoff's laws, the systems of Equation (10) are obtained, which model the electromagnetic processes of the series and parallel converter, respectively.

$$\begin{pmatrix} L_1 + L & L_m \\ L_m & L_2 \end{pmatrix} \begin{pmatrix} \frac{di_1}{dt} \\ \frac{di_2}{dt} \end{pmatrix} + \begin{pmatrix} R_1 & R_m \\ R_m & R_2 \end{pmatrix} \begin{pmatrix} i_1 \\ i_2 \end{pmatrix} = \begin{pmatrix} -u_C not(control(t)) + U_d \\ u_{C_2} sign(i_2) \end{pmatrix}$$

$$L_3 \frac{di_3}{dt} + u_{C_1} - u_{C_2} = 0$$

$$- \left| i_2 \right| - i_3 = C_2 \frac{du_{C_2}}{dt}$$

$$i_3 = \frac{u_{C_1}}{R} + C_1 \frac{du_{C_1}}{dt}$$

$$C \frac{du_C}{dt} = i_1 . not(control(t)),$$

$$(10)$$

where *control*(*t*) is given in (9), and  $i_2$  are the currents in the primary and secondary windings of the transformer,  $i_3$ —current through the filter inductor  $L_3$ ;  $u_{C1}$  and  $u_{C2}$  are the voltages of the filter capacitors  $C_1$  and  $C_2$ .

Based on the above systems of equations in Simulink/MATLAB environment, the model of the studied power electronic device is realized.

## 4. Formulation of an Optimization Task for Design Purposes

In its essence, optimization is an activity to obtain the best result in a certain predefined aspect and with given constraints. In this case, we will strive to realize certain dynamics, which are measured by criterion I(x). This criterion is a number that depends on the choice of some parameter x.

We define the following optimization task—limiting the voltage at the output of the converter  $u_{C1}$  in transient mode and preventing large pulsations of this voltage in set mode. Limiting the voltage at the output of the converter  $u_{C1}$  in transient mode and preventing large pulsations of this voltage in set mode is achieved by optimal selection of the following circuit elements: capacitors  $C_1$  and  $C_2$  and inductor  $L_3$ . For the realization of this task, a suitable reference trajectory  $u_{C1}$  ref is chosen, as the one presented in Figure 3 [26–28].

The analytical equation of the reference curve is:

$$u_{C_1, ref} = 22(1 - e^{-t/T_{0.95}}), \text{ for } t \in [0, 0.012],$$
 (11)

where  $T_{0.95} = 0.0012$  is the time-constant of the transient process (i.e.,  $T_{0.95}$  is the time to reach 95% of the set value of the output voltage of the converter).



Figure 3. Reference curve for the voltage at the output of the converter.

The selected trajectory will be used to search for a suitable value of the elements  $C_1$ ,  $C_2$  and  $L_3$ , so the difference between the reference form  $u_{C_1, ref}$  and the shape of the output voltage  $u_{C_1}$  is minimal, and the functionality is minimized [28–30]:

$$I(C_1, C_2, L_3) = \int_{0}^{t_{end}} \left( u_{C \ 1} - u_{C \ 1}, ref \right)^2 dt \xrightarrow[(C_1, C_2, L_3)]{} \min$$
(12)

This optimization problem is solved for both cases under the following constraints: four constraints of the type of algebraic and differential Equations (9) or (10), which are describing the operation of the converter and six constraints of the type of inequality (13), which define the area of search for the value of the elements  $C_1$ ,  $C_2$  and  $L_3$ :

$$\begin{array}{ccc} C_{1,\min} - C_1 \leq 0 \\ C_1 - C_{1,\max} \leq 0 \end{array} \text{ and } \begin{array}{ccc} C_{2,\min} - C_2 \leq 0 \\ C_2 - C_{2,\max} \leq 0 \end{array} \text{ and } \begin{array}{ccc} L_{\min} - L_3 \leq 0 \\ L_3 - L_{\max} \leq 0 \end{array}$$
(13)

Briefly, the task is recorded as follows [30,31]. This is an optimization problem that can be solved with a built-in procedure in MATLAB/Simulink (the example uses the following software version—MATLAB R2011b). For this purpose, the MATLAB block "Check Against Reference" is added to the mathematical model. The optimization procedure embedded in the "Check Against Reference" block includes the following steps. The reference trajectory of Figure 3 is entered. The limits for the  $C_{1.min} = C_{2,min} = 30 \ \mu\text{F}$ ,  $C_{1.max} = C_{2,max} = 300 \ \mu\text{F}$  and  $L_{3min} = 50 \ \mu\text{H}$  and  $L_{3max} = 1 \ \text{mH}$  elements are set. Finally, the optimization is started. The process of setting up, executing and obtaining the result of the procedure "Check Against Reference" is shown in Figures 4 and 5.

After solving the optimization problem for the series converter, the following optimal values of the filter elements are obtained:  $C_1 = 165 \ \mu\text{F}$ ,  $C_2 = 165 \ \mu\text{F}$  and  $L_3 = 125 \ \mu\text{H}$ . After the simulation of the model with these optimal data, the time diagrams from Figure 6 are obtained.

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Figure 4. Visual interface of procedure "Check Against Reference".



Figure 5. Visual interface of procedure "Check Against Reference".

Figure 6 shows that the desired goals for the voltage shape  $u_{C1}$  have been achieved, but the current dynamics  $i_{L3}$  is not good, i.e., there is a sevenfold higher value of the filter inductance current in transient mode and a corresponding slow attenuation of the pulsations in steady mode.

This analysis shows that in order to achieve good dynamics in the output (not a large excess of the current values in the transient modes, compared to the steady mode) it is necessary to supplement and modify the optimization task.





## 5. Modification of the Optimization Task

To improve the current dynamics through the filter inductor  $i_{L3}$  will modify the optimization task by adding:

$$0 \le i_{L3}(t) \le i_{L3 \max},$$
 (14)

where  $i_{L3max}$  is the maximum allowable value of the current through the filter inductor. In this case, the following value  $i_{L3max} = 3A$  is selected, this is not fulfilled in Figure 7.



Figure 7. Author's program algorithm.

The modified optimization problem, unlike the previous one, cannot be solved using a built-in procedure in MATLAB, because it is not possible to set constraints of the type (14) in the procedure "Check Against Reference". The reason for this is that in the new optimization problem, a reference trajectory is chosen for one state variable (voltage  $u_{C1}$ ) and constraints (type of inequality) are introduced for another state variable (current  $i_{L3}$ ).

This optimization problem was solved in the MATLAB environment, but for this purpose, an author's program (m-file) was compiled. The author's program algorithm is shown in Figure 7.

In the program, the optimization is performed with the "fmincon" command [31], i.e., [x,Fval] = fmincon(@Opt,x0,[],[],[],xlb,xub,@Con,options).

Integral (11) is replaced by the sum of squares of the form  $\int (\ )^2 dt \approx \sum (\ )^2$ . The constraints (14) are set in "xlb" and "xub" and the initial values are set in "x0"; they are arguments of command "fmincon". In a special subprogram, the differential Equation (10) is solved with the matrix exponent.

After execution of the optimization procedure for the serial scheme, the following result is obtained, Figure 8.

			Max	Line search	Directional	First-order	
Iter	F-count	f(x)	constraint	steplength	derivative	optimality	Procedure
0	3	0.495131	3.349				Infeasible start point
1	6	7.79648	0.02878	1	-1.69e+006	6.84e+006	
2	14	7.78511	0.01642	0.0313	-5.73e+006	1.77e+006	Hessian modified
3	17	7.15308	0	1	-2.18e+005	9.8e+010	
4	20	0.919828	0	1	-1.55e+006	1.96e+006	

**Figure 8.** Iterative procedures for the ZVS series DC-DC converter to obtain optimal values of the circuit elements.

In the end, optimal values for the elements were obtained as follows:  $C_1 = 30 \mu$ F,  $L_3 = 50 \mu$ H and  $C_2 = 500 \mu$ F. With these values, the model of the series DC-DC converter is simulated again and the following time diagrams for current through the filter inductance and the output voltage are obtained, shown in Figure 9.



**Figure 9.** Current through the filter inductance (**above**) and output voltage (**below**) of a serial ZVS DC-DC converter, using the modified optimization procedure.

Comparing the results for the current obtained by the first optimization and, respectively, with the modified one, shown in Figures 6 and 9, it is found that in the modified optimization with good output shape a significant limitation of current deviations through the filter inductance relative to the base case is observed.

Of interest is the study of the behavior of the converter when the load changes. Figure 10 shows the results of numerical experiments carried out with the optimized DC-DC converter at different values of load resistance. From the diagrams, it is found that the circuit behaves stably, with the current ripples being smaller than at the nominal value of the load resistance.



**Figure 10.** Current through the filter inductance and output voltage of a serial ZVS DC-DC converter, at as the load resistance R changes.

Figure 11 shows the results of numerical experiments carried out with the optimized DC-DC converter when changing the input voltage  $U_d$ .



**Figure 11.** Current through the filter inductance and output voltage of a serial ZVS DC-DC converter, at changing the input voltage  $U_d$ .

From the graphs, it is found that even with the double increase in the load resistance, the operation of the DC/DC converter is stable, in this case, the current ripples increase, but despite this, the limitation set during the optimization regarding the output current is not violated. On the other hand, despite the drastic change in the load compared to its nominal value, the aperiodic nature of the transient process regarding the load voltage is preserved, which was also the main condition when conducting the optimization procedure.

#### 6. Discussion

An analysis of the presented results shows that with the use of optimization procedures, it becomes possible to design topologies for which it is difficult to obtain analytical expressions and/or to create and apply design methodologies. Thus, optimization as a part of artificial intelligence (AI) techniques [7] is a powerful tool in the design of power electronic devices and systems. In this sense, the formulation of optimization tasks and the corresponding implementation of various optimization procedures significantly support the design process, as the finding of optimal values of the circuit elements is performed automatically. In the specific example, the specified shape and type of the transient processes in the output of the DC-DC converter which is considered is achieved. On the other hand, the analyses of most power circuits are based on established operating modes, and therefore, do not take into account the transient processes and, accordingly, the dynamics of the devices. The combination of a simplified design methodology and an optimization procedure regarding a reference curve gives very good results. In this way, the overloading of the semiconductor elements during transient modes is avoided and the need for complex start-up procedures is, therefore, eliminated. This approach is suitable in the case of complex heats, where several operating modes are characteristic and obtaining analytical dependences is very difficult and associated with many assumptions (which cannot be assumed for all possible operating modes) or impossible.

#### 7. Conclusions

The paper presents a model-based approach for the design of a serial ZVS single-ended transistor DC-DC converter. This method does not deny but complements and develops the classical design methods.

The model-based design method has the following advantages over the classic PEC design methods [32]:

- 1. The designed device can be developed taking into account all possible limitations imposed by the technological process or user requirements.
- 2. Allows automation of the process of selecting building blocks.
- 3. The joint system design of the power part and the control allows for achieving good dynamics and maximum elimination of external disturbances (changes in supply voltages, changes of parameters, change of loads).
- 4. Synthesis, generation and embedding of a control algorithm and collaboration of the converter with other devices.
- 5. In the model-based design method, the solution of the problem is related to finding a solution to a system of inequalities, algebraic, differential and logical equations.
- 6. Ability to read different nonlinearities—magnetic components, capacitors, and semiconductor elements.
- 7. Sufficiently effective accounting of losses and thermal regimes in the active and passive elements.
- 8. Restrictions can be added and excluded during the design process itself.
- 9. The use of the model-based design method allows the study of modes that are difficult to implement and lead to equipment damage (for example, short circuits, and over-voltages).

On the other hand, the use of the model-based design method is associated with the following inconveniences and disadvantages:

- 1. The model-based design method requires highly qualified developers in a wide range of scientific fields, including electrical engineering, electronics, numerical methods, mathematical modeling, control theory, programming, databases, and big data.
- 2. The need to build a database containing models of components, structures/topologies and algorithms for their management and laws for control of the converter.
- 3. It requires a high qualification of users in connection with the effective application of various modifications of the model-based design method.

The manuscript presents a rational approach to the design of power electronic devices, which is based on minimum requirements for both the input data and the hardware and software that implement the optimization procedure. The design approach presented combines classical design methods, complementing them with modern advances in mathematical modeling, computational mathematics and mathematical software. As a development of these studies, it is envisaged to develop open source software to serve as a web-based tool to assist in the design of power electronic devices.

**Author Contributions:** N.H. and B.G. were involved in the full process of producing this paper, including conceptualization, methodology, modeling, validation, visualization and preparing the manuscript. All authors have read and agreed to the published version of the manuscript.

**Funding:** This research was funded by the Bulgarian National Scientific Fund, grant number KII-06-H57/7/16.11.2021, and the APC was funded by KII-06-H57/7/16.11.2021.

Data Availability Statement: Not applicable.

Acknowledgments: This research was carried out within the framework of the projects: "Artificial Intelligence-Based modeling, design, control, and operation of power electronic devices and systems", KII-06-H57/7/16.11.2021, Bulgarian National Scientific Fund.

**Conflicts of Interest:** The authors declare no conflict of interest.

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