# Design strategy and simulation of medium-frequency transformers for a three-phase dual active bridge

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Abstract— Transformers are key elements in high power dc/dc converters such as the dual active bridge. Special attention is required because the dc-to-dc technique operates with nonsinusoidal voltages and currents. Therefore, iron and copper losses differ when compared to standard ac (sinusoidal) operation and sinus based design rules are no more suitable. The working principle of a dual active bridge (DAB3) relies on a particular value of leakage inductance to control the power flow. This inductance can be realized by the sole leakage inductance of the transformer or by connecting an additional choke inductance. The present paper shows the results obtained using an evolutionary strategy applied to design a transformer. The algorithm is adjusted to the particular conditions of the converter such as the flux density waveform (DAB3). The integration of the inductance can be performed by the design strategy and the design is compared to the external choke inductance solution. At this stage of work, the overall test bench setup is verified using simulations.

Keywords— transformers, medium-frequency, evolutionary strategy, magnetic measurements, electric circuit simulation, dual active bridge, high power dc/dc converter

# I. INTRODUCTION

Medium-frequency transformers are used in high-power dc/dc converters when galvanic insulation between transformer input and output is required. The design of such transformers is different from the common high-power grid transformers as well as to the ones in small power dc/dc converters. Classical design rules from literature are not applicable, because the conditions inside the converter are away from sinusoidal operation. In a dual active bridge, nonsinusoidal excitation effects on the core and the winding are to be considered. The resulting influences need to be known during the designing process. The main effects depend on the applied materials and the occurring changes in any of them should feedback to a modified converter operating point and an adapted component design. On the one hand, a transformer design is possible by scaling rules [1, 2] or by modification of common designs rules [3]. In this case, the design process strongly depends on the experience of the engineer and optimization concerning a particular application is difficult [4]. On the other hand, numerical search algorithms such as design of experiments, particle swarm or evolutionary strategies can evaluate large regions of design parameter combinations. The high number of design variables such as geometric dimensions, number of turns as well as the used materials can be formulated as an optimization problem to evaluate various regions of possible designs [5-9].

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In this paper, an evolutionary design strategy is discussed to include the non-sinusoidal conditions during the transformer design process. Pareto-optimal designs are chosen with integrated and external inductance. The advantages and disadvantages of increased leakage are evaluated. The contributions of this paper are:

- Draft of the test bench including the requirements on the transformer. (Section 2)
- Transformer model. (Section 3)
- Evolutionary strategy. (Section 4)
- Pareto Front and evidence of the proposed design by simulation of load case. (Section 5)

# II. CONVERTER TEST BENCH DESIGN

The three-phase dual active bridge [10] is capable of large power transfer and it benefits from reduced switching operations and soft-switching capabilities. One experimental transformer design with 200 kVA is in focus to establish a bidirectional power flow between two 600 V dc-links. The specifications are listed in TABLE I. Fig. 1 shows the topology, the transformer and the inductance in a schematic view. In this converter, a six-step voltage waveform is applied to the transformer. The power flow is controlled by a phase shift between primary and secondary side. The switching frequency of the semiconductors equals the fundamental frequency of the transformer. This reduces the switching operations and losses compared to PWM techniques and the converter can work at increased frequencies, allowing much smaller, lighter and cheaper electromagnetic components.

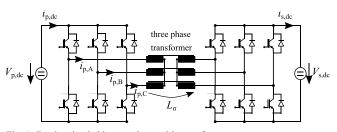


Fig. 1. Dual active bridge topology with transformer.

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TABLE I.SPECIFICATIONS.				
Variable	Value	Description		
	200 kVA	Apparent power		
	150 kW	Active power		

S  $P_{n}$ 

C

 $V_{p,dc}$ 600 V Dc link voltage 600 V  $V_{\rm s,dc}$ Dc link voltage 1 mFDc link capacitances

The switching frequency of the converter is chosen as a degree of freedom in the design and should be determined after studying the efficiency and the resulting transformer designs. The main idea of this paper is to design one transformer for the described test bench setup with respect to optimal working point for the studied core material.

## **III. THREE-PHASE TRANSFORMER MODEL**

A three-limb stacked core layout made of 0.18 mm thick High Permeability Grain Oriented Electrical Steel (GOES) with aluminum foil windings is studied. The increased frequency is meant to achieve volume reduction but the impact on consequent increased specific losses of the core material has to be considered. The choice of dimensions and parameters is a multi-component problem and depends on overall efficiency, frequency and required total active mass.

### A. Soft magnetic material

Metrological characterization of GOES was performed with dedicated measurement instruments. A single-sheettester (SST) from Brockhaus Measurement Systems is equipped with a 120 x 120 mm specimen. The magnetic field is applied along the easy magnetization axis (Rolling Direction) of the sample and the magnetic polarization along that same axis is assessed. Measurements with controlled DAB3 conditions were performed based on the principle described by the international standard IEC 60404-3 [11]. The measured permeability values and the iron losses are used in the design process.

#### B. Geometry of core and windings

The magnetic core complexity (geometry and nonlinear magnetic properties) is translated by segmenting the various elements into a reluctance network. Look-up tables provide the magnetic permeability  $\mu$  as a function of frequency f and magnetic flux density B. A rectangular core shape is considered and the cross sectional area is chosen as constant for the total core. An air gap is included in the magnetic resistance of each transformer limb. The structures of the core joints were not modeled in detail. The algorithm adjusts the continuous parameter of length l, width w and depth d of each reluctance  $\mathcal{R}$ :

$$\mathcal{R} = \frac{l}{\mu(f,B) \ A} = \frac{l}{\mu(f,B) \ w \ d} \ . \tag{1}$$

The total reluctance per phase A, B or C results from series and parallel connection of the reluctance network in Fig. 2.

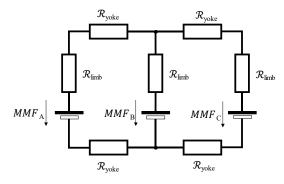


Fig. 2. Three leg transformer equivalent reluctance circuit.

The conductors are aluminum foil windings with elliptic cylinder shapes. Aluminum is chosen to reduce weight and to decrease eddy current winding losses. The width of each coil is calculated by the number of turns N and the insulation layers. The 2D partial view in Fig. 3 shows the geometric variables, which are adjusted by the algorithm. The parameters are listed in TABLE II. The material properties are listed in TABLE III.

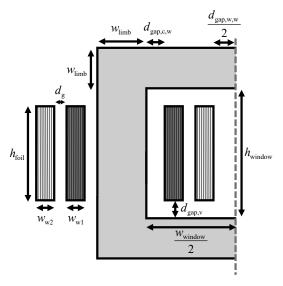


Fig. 3. Core-type transformer. Dimensions and clearances between the components. 2D partial view.

### C. Leakage inductance

Analytical calculation of the leakage inductance (2) includes the Rogowski factor [12] ( $K_R < 1$ ). The geometry of the windings and the gap is considered in the mean diameters  $D_{w1}$ ,  $D_{w2}$  and  $D_{g}$ . The parameters  $w_{w1}$ ,  $w_{w2}$  and  $d_{g}$  are the thicknesses of each component.

$$L_{\sigma} = \frac{\mu_0 N^2 \pi}{h_{\text{foil}} / K_{\text{R}}} \left( \frac{w_{\text{wl}} D_{\text{wl}}}{3} + d_{\text{g}} D_{\text{g}} + \frac{w_{\text{w2}} D_{\text{w2}}}{3} \right)$$
(2)

This formula corrects the presence of a vertical gap between core and windings  $d_{gap,v}$  by adjusting the length of the leakage flux lines [13]. Theoretically, high number of turns N or increased radial winding dimensions yields to higher leakage. This approach will be used to increase the internal leakage inductance in case of high internal leakage designs.

TABLE II.INPUT PARAMETERS AND RANGE OF VALUES.
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set of design parameters		range of values	
$w_{\rm limb}$	limb and yoke width	$10 \text{ mm} < w_{\text{limb}} < 200 \text{ mm}$	
$l_{ m limb}$	limb length	$50 \text{ mm} < l_{\text{limb}} < 1.75 \text{ m}$	
$d_{ m limb}$	$d_{\rm limb}$ limb and yoke depth 15 mm $< d_{\rm limb} < 2$		
$h_{ m foil}$	foil height	$h_{\rm foil}$ < 1.5 m	
$N_1 = N_2$	number of turns	1 < N < 200	
$d_g$	winding gap	$5 \text{ mm} < d_{g}$	
$d_{ m gap,v}$	$d_{\text{gap,v}}$ vertical clearance $5 \text{ mm} < d_{\text{gap,v}}$		
$d_{\rm gap,c,w}$	core clearance	$5 \text{ mm} < d_{\text{gap,c,w}}$	
$d_{\rm gap,w,w}$	clearance between phases	$5 \text{ mm} < d_{\text{gap,w,w}}$	

## D. Core losses

The iron loss formula [14] developed for Non Grain Oriented Electrical Steel is based on semi-physical parameters and was adjusted to fit GOES properties. It is used to evaluate the material characteristics and to describe the measured iron losses. A fitting process, based on quasi static and high frequency measurements, determines the parameters. The parameters correspond to the hysteresis, eddy current, excess and nonlinear loss components of the studied GOES.

# E. Winding losses

Foil conductor resistances are approximated according to Dowels equations [15]. The classical  $R_{DC}$  resistance is calculated and adjusted with the ac-to-dc resistance increase factor  $F_R$ . Since the geometry of the core is calculated at first, the linear solved magnetizing current is added to the winding losses. The harmonic contents of the load current were simulated in advance [16] and the losses  $P_w$  are calculated for primary and secondary side using fast Fourier transform (FFT):

$$P_{\rm w} = F_r R_{DC} \sum_i I_i^2 \quad . \tag{3}$$

## F. Temperature

The temperatures occur because of resulting losses and the heat dissipation is considered on core and winding surfaces. A heat flux  $\dot{Q}$  is resulting from the generated losses and the rise of temperature  $\Delta T$  must not exceed the insulation limits (4) of each component. Temperature Class 250 as defined in [17] is considered by air-forced convective heat transfer coefficients

*h*. The optimized designs required a sufficient amount of surface for core and windings to dissipate the internal heat. The geometries and corresponding surfaces A are represented using thermal resistances networks [18] for the studied materials and cooling method:

$$\dot{Q} = hA\,\Delta T$$
 . (4)

TABLE III. GENERAL MATERIAL PROPERTIES.

t <sub>GOES</sub>	0.18 mm	GOES nominal thickness
$ ho_{ m fe}$	7650 kg/m <sup>3</sup>	GOES conventional density
$ ho_{ m Al}$	2800 kg/m <sup>3</sup>	Winding material density
$\alpha_{Al}$	0.004308 1/K	Temperature coefficient of winding material

#### IV. EVOLUTIONARY STRATEGY

The design and optimization, subject to weight and losses, is performed for a three-phase transformer by applying a meta-heuristic evolutionary strategy [19] matching the specifications. The resulting designs vary in active mass m or in generated losses P. The resulting mass and losses are used for the multi-objective optimization strategy (8). With this approach a Pareto-Front is generated which consists of different designs. A mixed-integer approach is used to include the continuous parameter solution space such as the length and width of core dimensions as well as integer problems such as the number of primary and secondary turns. Each design represents a vector of input parameters:

$$\mathbf{x}^{i} = \left[ w_{\text{limb}}^{i} l_{\text{limb}}^{i} d_{\text{limb}}^{i} w_{\text{window}}^{i} d_{\text{gap,c,w}}^{i} h_{foil}^{i} N^{i} \dots f_{el} \right]^{T} .$$
(5)

Based on this parameter set of the *i*th member of the population, the objective function is evaluated:

$$\begin{bmatrix} f_1 \\ f_2 \end{bmatrix}^i = \mathbf{f}\left(\mathbf{x}^i\right) \ . \tag{6}$$

### A. Constraints

During the strategy, designs are generated and their geometry and losses is calculated. The implemented constraints C serve as a feedback to the algorithm.

$$\bar{c} = \frac{1}{C} \sum_{i=1}^{C} c_i \tag{7}$$

For example, the winding area cannot exceed half the available window area and the device temperature should not exceed the temperature limit. If an individual does not pass a particular constrain,  $c_i$  (7) will be less than one and the optimization function will return a negative value linear to the number the particular constraint.

TABLE IV. CONSTRAINTS.

design results	limits
Temperature limit	$\Delta T < 250 \ ^{\circ}\mathrm{C}$
Window width	$d_{\text{gap,c,w}} + w_{\text{wl}} + d_{\text{g}} + w_{\text{w2}} + \frac{d_{\text{gap,ww}}}{2} \le \frac{w_{\text{window}}}{2}$
Foil height	$h_{ m foil} + 2 \; d_{ m gap,v} \leq l_{ m limb}$
Flux density	0.1  T < B < 2.0  T
Leakage inductance	$L_{\rm min} < L_{\sigma} < L_{\rm max}$

# B. Optimization function

For the multi-objective problem, the optimization function is:

$$f = \begin{cases} \varepsilon \left( \overline{c} - 1 \right) \begin{bmatrix} 1 & 1 \end{bmatrix}^T, \quad \overline{c} < 1 \\ \left[ \frac{1}{m} & \frac{1}{P} \right]^T, \quad \overline{c} = 1 \end{cases}$$
(8)

This approach allows multiple constraints in the design algorithm and the total mass and total losses of a valid design are minimized in the global process of maximizing the optimization function.

# V. RESULTS

## A. Pareto-Front with minimized leakage

4000

3500

3000

2500

2000

1500

0

20 40 60 80

Losses P in W

The Pareto fronts are shown in Fig. 4 (a) for designs with an excitation frequency of f = 500 Hz, 1000 Hz and 2000 Hz. For each frequency, multiple designs can be considered. The multi-objective Pareto Front lists devices with minimized loss and mass. A comparison of the studied excitation frequencies shows that a frequency of f = 1000 Hz results in the most compacts designs with the lowest losses. Due to the specifications, an excitation of f = 500 Hz as well as f = 2000 Hz results in having designs with larger active mass in case of the same assumed losses or in higher losses in case of the same active mass.

> Mass m in kg (a)

As a result, high excitation frequencies can be used to reduce the active mass and to increase the efficiency. However, the cooling system must be designed and adapted to dissipate the generated losses.

In Fig. 4 (b), the peak flux density of each design is shown. The GOES material has a high permeability (some ten thousands) up to approximately B = 1.9 T. In order to build a compact design and to involve the core material at its best, a high flux density is preferred. This reduces the required cross sectional core area and the active mass. At f = 500 Hz, the range of flux density is up to B = 2.0 T, at f = 1000 Hz up to B = 1.5 T and at f = 2000 Hz up to B = 0.75 T with a state of the art cooling system dissipating the generated losses. These values of flux density can be increased in case of better cooling concepts and by choosing a different power and voltage level. In order to build a compact transformer and to utilize the high permeability soft magnetic material, a frequency of f = 1000 Hz is chosen as a compromise. The combination of frequency and a high flux density of B = 1.5 T will reduce the core weight. A prototype is planned based on this design. The high permeability and low thickness of the used GOES grade will result in low magnetizing currents.

#### B. Pareto-Front with increased leakage inductance

The required inductance (9) depends on the specifications such as voltage level  $V_{p,DC}$ , nominal active power  $P_n$  and the electrical frequency f of the dual active bridge. According to [20], the size of the leakage inductance depends on the nominal phase shift  $\varphi$ . The phase shift is set to  $\varphi = 30^{\circ}$ :

$$L_{\sigma} = 0.27 \cdot \frac{V_{\rm p,DC}^2}{2\pi f P_{\rm p}} \frac{7\pi}{36} .$$
 (9)

The losses of all designs in Fig. 5 (a) are increased compared to Fig. 4 (a). Due to the additional design condition, the evolutionary strategy generates modified designs. The number of turns and the distance between the windings is increased to reach the required leakage, which results in higher conductor losses and increased active mass. The designs have a larger winding-window and increased core

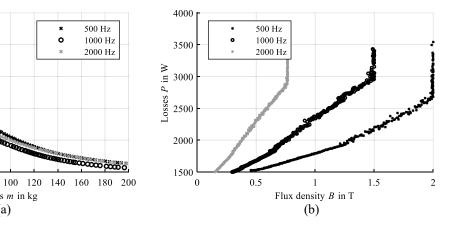


Fig. 4. Transformer design with minimal leakage for different frequencies f. Calculations over 1500 generations with a population of 300. Conductor and iron losses versus active mass (Pareto front) (a) and flux density distribution of the proposed designs (b).

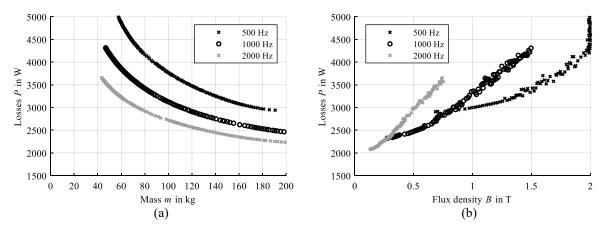


Fig. 5. Transformer design with high leakge  $L_{\sigma}$  for different frequencies *f*. Calculations over 1500 generations with a population of 300. Conductor and iron losses versus active mass (Pareto front) (a) and flux density distribution of the proposed designs (b).

dimensions. The required leakage inductance decreases with increasing frequency (10). Therefore, the f = 500 Hz designs require more leakage flux to operate in a dual active bridge and the target value for the designs is  $L_{\sigma,500 \text{ Hz}} = 249 \text{ }\mu\text{H}$ . The designs at f = 1000 Hz require a leakage inductance of  $L_{\sigma,1000 \text{ Hz}} = 124 \text{ }\mu\text{H}$  and the f = 2000 Hz designs require  $L_{\sigma,2000 \text{ Hz}} = 62 \text{ }\mu\text{H}$ . Compared to the reference designs in Fig. 4 (a), the ones with internal leakage show increased losses as well as increased active mass. This is due to the additional number of turns and the increased coil volumes.

In the case of higher frequencies, the required leakage inductance (9) is smaller. Theoretically, the requested leakage could be realized at high frequency designs as internal leakage inductance. As a result, the designs require minimum 20 % more active mass and the losses are increased by approx. 15 %. In Fig. 5 (b), the magnetic flux density of each design is shown for the considered specifications and cooling system. Two designs are compared in TABLE V: One f = 1000 Hz design with minimized leakage Fig. 6 (a) — in this case the necessary leakage inductance is provided by an external air choke inductance — and one design with the required internal leakage Fig. 6 (b). As a result, the design with increased leakage has an increased number of turns to fit the targeted

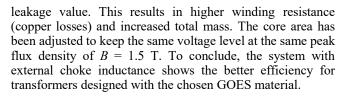
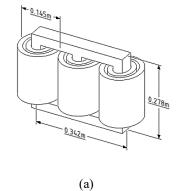


TABLE V. DESIGN SUMMARY.

Design proposals. Minimal and high leakage.				
$L_{\sigma}$	Leakage inductance	30.2 µH	123.4 μH	
f	Electrical frequency	1000 Hz	1000 Hz	
Α	Cross sectional core area	18.4 cm <sup>2</sup>	14.3 cm <sup>2</sup>	
В	Flux density	1.5 T	1.5 T	
Ν	Number of turns	24	32	
$P_{\mathrm{w}}$	Winding losses	1873 W	3154 W	
$P_{\rm fe}$	Core losses	1288 W	1143 W	
$P_{igbt}$	IGBT losses	1870 W	1870 W	
т	Transformer mass	36.4 kg	46.8 kg	



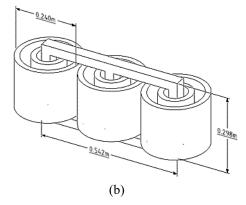


Fig. 6. 3D geometries. Compact 1000 Hz designs. Minimized leakage (a) and increased leakage (b). The design with increased leakage results in more losses and active mass.

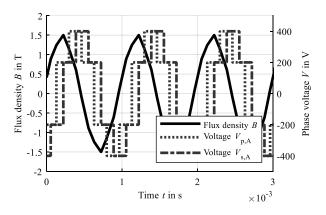


Fig. 7. The core flux density simulation in phase A. To transmit nominal power, the secondary winding voltage  $V_{s,A}$  is applied with a phase shift of  $\varphi = 30^{\circ}$  with respect to the primary winding voltage  $V_{p,A}$ .

In Fig.7 the simulated flux density is shown for the design with external choke inductance on the primary side to fulfil the working principle of the dual active bridge. The choke inductance results in an different phase shift between flux density *B* and primary voltage  $V_{p,A}$  compared to the phase shift between flux density *B* and secondary voltage  $V_{s,A}$ .

# VI. CONCLUSIONS

A multi-objective evolutionary strategy was used to evaluate medium-frequency transformer designs. The increase of frequency has an impact on the occurring specific losses. Therefore, a thermal model was implemented to study the resulting winding and core temperatures. In this study, the high magnetic saturation and high permeability of the material resulted in compact medium frequency transformers with low magnetizing currents. The ability of the used GOES grade to be magnetized at high induction level combined to reduced thickness (0.18 mm) of the studied GOES material resulted in reduced eddy current core losses for the chosen working induction level. The measured properties of the material were employed in an evolutionary strategy to design a transformer to the given specifications. A f = 1000 Hz design with B = 1.5 T was compared between solutions with external or integrated leakage inductance. The higher the frequency the lower is the required leakage. In case of integrated leakage inductance, the number of turns and the distance between the windings are increased to reach the targeted leakage value. This resulted in minimum 15% more losses and minimum 20% more active mass of the device compared to an external leakage inductance. Due to this, we focus on an additional choke inductance solution to benefit from the material performance at high induction levels. In a next step of this study, we will focus on building the transformer based on the discussed f = 1000 Hz and B = 1.5 T design.

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