

This is a repository copy of Impact of manufacturing tolerances on axial flux permanent magnet machines with ironless rotor core: a statistical approach.

White Rose Research Online URL for this paper: <u>https://eprints.whiterose.ac.uk/200370/</u>

Version: Published Version

Article:

Escobar, A. orcid.org/0000-0003-3622-8421, Sánchez, G., Jara, W. orcid.org/0000-0003-0116-208X et al. (4 more authors) (2023) Impact of manufacturing tolerances on axial flux permanent magnet machines with ironless rotor core: a statistical approach. Machines, 11 (5). 535.

https://doi.org/10.3390/machines11050535

Reuse

This article is distributed under the terms of the Creative Commons Attribution (CC BY) licence. This licence allows you to distribute, remix, tweak, and build upon the work, even commercially, as long as you credit the authors for the original work. More information and the full terms of the licence here: https://creativecommons.org/licenses/

Takedown

If you consider content in White Rose Research Online to be in breach of UK law, please notify us by emailing eprints@whiterose.ac.uk including the URL of the record and the reason for the withdrawal request.



eprints@whiterose.ac.uk https://eprints.whiterose.ac.uk/





Article Impact of Manufacturing Tolerances on Axial Flux Permanent Magnet Machines with Ironless Rotor Core: A Statistical Approach

Andrés Escobar ^{1,*}, Gonzalo Sánchez ¹, Werner Jara ¹, Carlos Madariaga ², Juan A. Tapia ², Javier Riedemann ³ and Eduardo Reyes ⁴

- ¹ School of Electrical Engineering, Pontificia Universidad Católica de Valparaíso, Valparaíso 2362804, Chile
- ² Department of Electrical Engineering, University of Concepción, Concepción 4030000, Chile
- ³ Department of Electronic and Electrical Engineering, The University of Sheffield, Sheffield S10 2TN, UK
- ⁴ Department of Electrical Engineering, Universidad de Magallanes, Punta Arenas 6210427, Chile
- * Correspondence: andres.escobar@pucv.cl

Abstract: Axial Flux Permanent Magnet (AFPM) machines with ironless rotors are an attractive and recently studied solution in low-speed applications, due to their potentially high power/weight ratio, high aspect ratio, and high efficiency. Nevertheless, these machines are prone to be affected by manufacturing tolerance during its fabrication process and consequently, the magnets may move freely inside the rotor structure. This work presents a statistical analysis of manufacturing tolerances of an AFPM machine with an ironless rotor, considering several magnet fault types. A computationally efficient superposition method is developed and implemented to obtain both the cogging torque and rated torque considering several tolerance combinations with acceptable accuracy. The results obtained from a statistical analysis of 10,000 designs of a two-stator one rotor tooth coil winding AFPM (TCW-AFPM) machine allowed us to identify the parameters with the most impact on relevant performance indicators and disclosed a substantial increase in cogging and ripple torque when unavoidable combined tolerances are present.

Keywords: axial-flux permanent magnet machines; cogging torque; manufacturing tolerance; rated torque; superposition method

1. Introduction

Tooth Coil Winding Axial Flux Permanent Magnet (TCW-AFPM) machines are an attractive solution in low-speed applications owing to their high power/weight ratio, high aspect ratio, and high efficiency, being a suitable option in vehicular propulsion, more electric aircraft and direct drive wind power generation [1–6]. These machines are characterized by a disk-shaped structure in which the coils are wound around a single tooth; the flux produced by the magnets crosses the airgap in the same direction as the shaft. Several studies have been published on axial flux machines with other types of windings showing that there are often difficulties in finding suitable space for the long and bulky inner end-windings, presenting a reason why TCW are usually adopted for these machines [7]. AFPM machines can be classified depending on the number of stators and rotors, as exemplified in Figure 1: one-stator one rotor topology (Figure 1a) is characterized by a simple structure and is generally intended for low and medium power, whereas multiple rotors and multiple stators (Figure 1b) are used to increase the output power of the machine and to reduce the mechanical stress on the bearings.



Citation: Escobar, A.; Sánchez, G.; Jara, W.; Madariaga, C.; Tapia, J.A.; Riedemann, J.; Reyes, E. Impact of Manufacturing Tolerances on Axial Flux Permanent Magnet Machines with Ironless Rotor Core: A Statistical Approach. *Machines* **2023**, *11*, 535. https://10.3390/machines11050535

Academic Editors: Pedro M. B. Torres, Volker Lohweg, Géza Husi, Eduardo André Perondi, Katarzyna Antosz, Oleg Zabolotnyi and Jose Machado

Received: 27 March 2023 Revised: 3 May 2023 Accepted: 5 May 2023 Published: 9 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/).

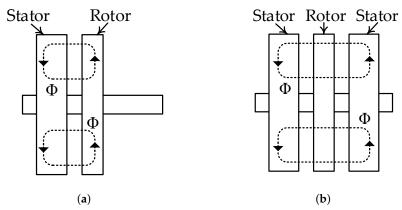


Figure 1. Classification of axial flux machines depending on the rotor/stator count; (**a**) Single-stator single-rotor, (**b**) Double-stator single-rotor.

Two-stator one-rotor AFPM machines are widely studied given their inherent mechanic stability and comparative advantages. Moreover, if the supporting structure of permanent magnets is manufactured with non-conductive and non-ferromagnetic materials, eddy current losses can be eliminated and leakage flux produced by the magnets can be significantly reduced [7–9].

Due to the absence of ferromagnetic material, in AFPMs with ironless rotors, the magnets are free to move in any direction, therefore precise fabrication of the supporting structure is required in order to fix the PMs in the correct position. However, dimensional tolerances and material imperfections which are inherent to the manufacturing process can appear during the machine construction causing the displacement of the magnets and affecting its output performance indices [10].

In the last decade, some papers have approached the influence that manufacturing tolerances and material imperfections have on the performance of state-of-the-art topologies. It has been demonstrated that dimensional tolerances affect the cogging torque of radial-flux PM machines either by increasing the amplitude of the current harmonics or by adding new harmonic components [11,12]. Similar effects are produced by magnetization faults or magnetization imperfections [13]. The analysis of the affected performance indices is often carried out by considering specific faults and cases, although there have been some efforts to generalize the findings through statistical methods [14,15].

In [14], an analysis of manufacturing tolerances affecting a radial flux permanent magnet (RFPM) machine was developed. It was found that positional deviations of PMs in the circumferential direction raise the likelihood of obtaining a high cogging torque magnitude (higher than the faultless design). A similar analysis was carried out in [15], which relied on an analytical model to evaluate several imperfections such as remanence, recoil permeability, magnet dimensions, and magnet and slot displacement deviations. The authors further stated that it is unfeasible to accurately predict the cogging torque solely by analyzing an idealized design.

In this regard, AFPM machines have been also studied, but most of the research articles focus on analyzing the effect of rotor and stator misalignments, static and dynamic eccentricity, and magnet shape selection [16–21]. The analysis of a double-rotor one-stator TCW-AFPM machine for wind power generation was presented in [16]. Tilt and axial offset of the rotor discs were subjected to tolerance analysis, and both analytical and finite element (FE) models were used for this purpose. The authors stated that the studied imperfections produce a bending torque of the stator structure and can increase the ripple torque. A similar analysis is presented in [17] for a double-stator one-rotor TCW-AFPM machine. Using quasi-3D FE simulations, it was found that the tilt of the rotor structure can increase the peak value and modify the wave-form period of cogging torque. A one-stator one-rotor AFPM machine was analyzed in [18] by means of FE simulations, whereas a systematic method to experimentally measure the effect of tilt and axial offset was presented in [19].

Although these papers provide relevant information regarding assembly imperfections of AFPM machines, several constructive parameters have not been further investigated. Moreover, the effect of the combination of several different faults on sensible performance indices of AFPM machines has not been covered in the technical literature so far. Assessing the effect of multiple combinations of faults on AFPM machines is not trivial. In order to have a precise estimation of sensible performance indices of an AFPM machine in the presence of several faults, 3-D FE simulations are required. However, full 3-D simulations are very time-consuming making their use prohibitive in most cases of tolerance analysis, which is critical in the case of axial flux machines which do not have planar symmetry. Analytical estimations may reduce the computation time, but their accuracy depends on the considered assumptions and simplifications. Very accurate analytical models based on Maxwell's equations and conformal mapping can be used to analyze mechanical tolerances in AFPM machines [20], but these approaches are difficult to implement on machines with complex geometries. Another alternative is to use a combination between FE evaluations and the superposition principle [22,23]. This method may provide acceptable computation time and accuracy, as preliminarily assessed in [24].

This paper aims to provide a statistical analysis of the impact of several dimensional and material uncertainties on the cogging torque and electromagnetic torque developed by AFPM machines. An efficient superposition method (SM) is proposed to estimate the torque waveforms, which is validated through 3-D FE simulations. By using the proposed method, it is possible to evaluate different values of tolerances within a pre-established range, with relatively low computational effort. The proposed research is meant to be useful in the assessment of the sensitivity of AFPM machines when subject to dimensional tolerances. The superposition method described in this paper can be used directly in the design stage of AFPM machines, or to be included in their optimization since it evaluates the sensitiveness of a final design. The remainder of this paper is organized as follows. In Section 2, the topology under study is described, and relevant parameters of the stator and rotor are presented. In Section 3, a set of 3-D FE simulations are performed in order to evaluate dimensional and material tolerances and their effect on cogging torque and the rated torque of the machine. In Section 4, a superposition technique is presented and used to develop a statistical analysis of relevant imperfections considering typical values of dimensional tolerances and magnet properties. Concluding remarks are provided in Section 5.

2. Selected Topology and Studied Faults

A two-stator one-rotor TCW-AFPM machine is considered for the tolerance analysis, which is depicted in Figure 2.

Each stator has 12 slots and is manufactured in a coiled M400-50A magnetic steel band. A TCW double-layer winding with rectangular conductors is considered for the stator coils which has some advantages over round conductors such as better filling factor, power density and lower power losses. The rotor is made of a non-magnetic and non-conducting material (polyamide-6 and fiberglass) with 10 embedded PMs. The magnets of the machine are made of a strong rare-earth samarium cobalt (Sr-Cb) 2:17 grade. Each PM is divided into 10 segments which are arranged into two layers reducing eddy current losses. The main dimensions and prototype data without dimensional or material imperfections are presented in Table 1.

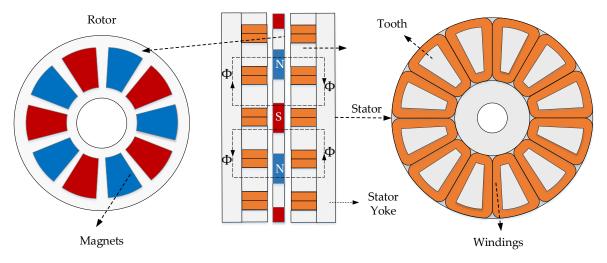


Figure 2. The 12-slot 10-pole two-stator one-rotor TCW-AFPM machine selected for analysis. Magnet arrangement is presented in the rotor sketch on the left, whilst the winding arrangement is depicted on the right side.

Symbol	Variable	Value	Unit
Do	Outer stator diameter	250	mm
D_{i}	Inner stator diameter	152	mm
Q	Number of slots	12	
Р	Number of pole pairs	5	
Ν	Number of turns per phase	528	
δ	Air gap length	2	mm
h_{PM}	PM height	20	mm
$h_{\rm s}$	Slot height	60	mm
$w_{\rm s}$	Slot width	21	mm
J	Current density	3.2	A/mm^2
$B_{\mathbf{r}}$	PM remanence	1.087	Т
$\mu_{ m r}$	Relative recoil permeability	1.06	
ω	Rotational speed	600	RPM
$\alpha_{\rm PM}$	Magnet to pole ratio	0.9	

Table 1. Main machine dimensions without tolerances.

In this work, seven different types of faults can affect the magnets. These are: angular displacement ($\Delta \theta_{PM}$), radial displacement (Δr_{PM}), axial displacement (Δa_{PM}), width variation (Δw_{PM}), length variation (Δl_{PM}), depth variation (Δd_{PM}) and remanence variation (ΔB_r). Figure 3 schematizes each one of these faults.

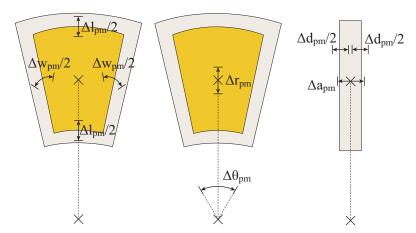


Figure 3. Approached dimensional and positional faults that can affect PMs.

The 3-D CAD model used for evaluating the AFPM machine is presented in Figure 4. A dense mesh was considered in the airgap area and magnets, which resulted into precise results. According to the mesh feedback tool, the considered mesh contains 68.9% excellent-quality elements, 29.1% good-quality elements, 2% average-quality elements and no elements of below average or poor quality. Magnetostatic simulations were conducted when evaluating the cogging torque of the machine, and transient magnetic simulations were considered for the assessment of electromagnetic torque. The whole machine was modeled and evaluated since dimensional tolerances break the periodicity of the machine.

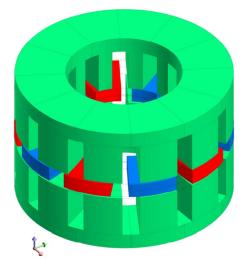


Figure 4. Three-dimensional FE model of the TCW-AFPM used for simulations.

3. Preliminary Sensitivity Analysis

In order to identify the tolerances that have the most significant impact on the performance of AFPMSM, a preliminary analysis is developed. The cogging torque and the rated torque are evaluated by means of 3-D FE simulations when typical and magnified tolerances are assigned to a single PM. The different types of faults are evaluated separately so as to estimate the effect that each fault may produce on the performance indices of the machine.

To standardize the comparison of the impact of each fault type, a single magnet (referred to hereafter as dummy magnet) can have dimensional deviations of ± 0.1 , ± 0.2 or ± 0.5 mm. Since the typical tolerance of laser cutting is 0.1 mm, this means that each magnet can present one, two or five times the typical dimensional deviation value. In turn, the dummy magnet can have remanence deviations of $\pm 1\%$, $\pm 2\%$ and $\pm 5\%$.

Figure 5 presents the impact of each fault type (applied over the dummy magnet only) on the cogging torque of the AFPM machine. The impact of dimensional faults is shown in Figure 5a, whilst the remanence deviations are depicted in Figure 5b.

From Figure 5a, it can be seen that all addressed faults increase the cogging torque magnitude, but each one to a different extent. The most significant effect on cogging torque is produced by the angular displacement followed by the depth of the magnets. The angular displacement directly affects the permeance of the airgap, whilst the depth variation creates the highest volume variation of the magnets among dimensional tolerances. It may be noted that angular position faults have the same impact regardless of whether positive or negative deviations are considered. This can be explained since the counterclockwise or clockwise displacement of a single magnet results in the same overall geometrical distribution of the magnets. Instead, the positive magnet depth deviations cause more impact than negative deviations, which is also true for the other fault types.

From Figure 5b, it can be seen that remanence deviations greatly increase the cogging torque of the machine as well. The cogging increase is critical for positive deviations and less relevant for negative deviations.

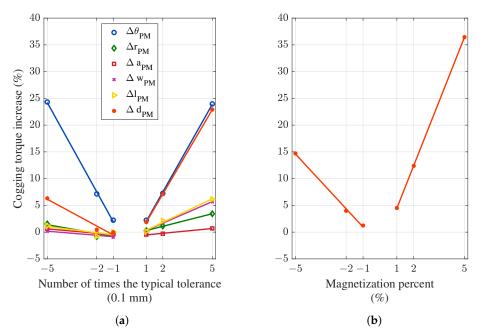
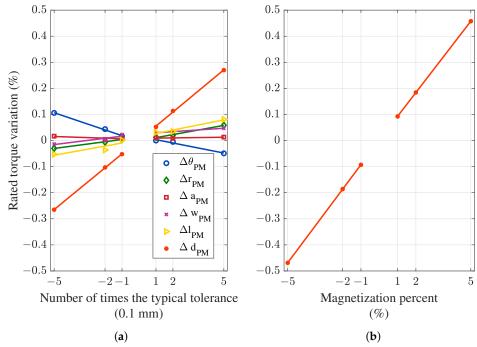


Figure 5. Cogging torque of the machine when a single PM has a specific fault; (**a**) Dimensional and positional faults, (**b**) Remanence deviation.

In Figure 6, the impact of the studied faults (when present on the dummy magnet) on the rated torque of the machine is shown. From Figure 6a, it can be seen that deviations in the axial length or the angular position of the dummy magnet have the most significant impact on the rated torque of the machine. In the case of the angular displacement of the dummy magnet, it is relevant to determine whether the deviation is counterclockwise or clockwise. Contrary to what happens when analyzing the cogging torque, the direction in which the magnetic field generated by the stator currents rotates, the mechanical sense of rotation, and the relative position of faulty magnets affect the torque generation. Instead, deviations in the axial length of the dummy magnet should have the most significant impact among the dimensional tolerances of the magnet since varying the axial length of the magnet results in the highest variation of the magnet volume. When the dummy magnet is larger, slightly more flux is imprinted on the airgap and thus the electromagnetic torque slightly increases. The opposite effect is observed when decreasing the dummy magnet volume. From Figure 6b, it may be noted that the remanence deviation can cause a torque variation which is positive when the magnet is more magnetized and negative when the magnet is demagnetized. Nevertheless, the impact of all studied faults on the rated torque (0.2-0.5%) is less significant than on the cogging torque of the machine (5-35%).

The deep-seated reason behind the low impact of tolerances on the electromagnetic torque is the obtained low variation in the airgap flux density. This can be noted from Figure 7, which presents the harmonic components of the normal airgap flux density for the most severe cases of Figure 6. Mean torque is strongly related to the main component of the airgap flux density (harmonic order 5 in this case due to the pole count), which is not altered in the presence of dimensional or remanence tolerances.

In Figure 8, the impact of the studied faults (when present on the dummy magnet) on the torque ripple of the machine is shown. From Figure 8a, it can be seen that all the evaluated deviations increase the ripple torque. The angular displacement of magnets has the most significant effect on the ripple torque, followed by the depth variation of magnets. The magnitude variation of the torque ripple when the magnets are deeper or angularly misplaced is similar to that of cogging torque. However, counterclock or clockwise displacement of a single magnet results into different ripple variation, as opposed to cogging case. In addition, positive magnet depth deviations cause more impact than



negative deviations, which translates into larger magnets contributing with more ripple than shorter magnets.

Figure 6. Rated torque of the machine when a single PM has a specific fault; (**a**) Dimensional and positional faults, (**b**) Remanence deviation.

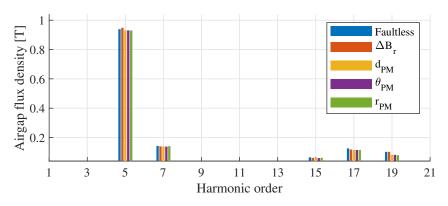


Figure 7. Harmonic components of the airgap flux density for significant dimensional and positional faults.

From Figure 8b, and similar to the cases of cogging torque and rated torque, remanence deviations greatly increase the torque ripple of the machine.

In summary, the angular displacement, magnet depth deviations, and magnet remanance variation may cause the most relevant effects on the machine. However, these preliminary findings only reveal the general response of the performance indices of the machine when a single magnet is faulty. A more detailed evaluation of the faults when present in multiple magnets, as well as when combined, is carried out in the following section to deeply analyze the electromagnetic response of the machine.

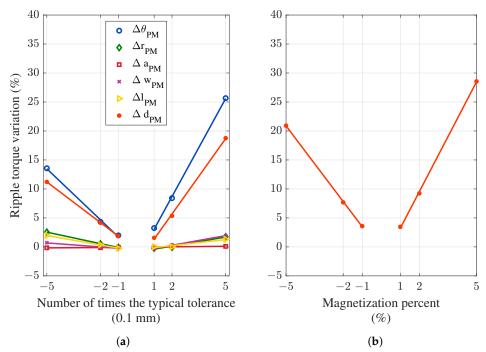


Figure 8. Ripple torque of the machine when a single PM has a specific fault; (**a**) Dimensional and positional faults, (**b**) Remanence deviation.

4. Statistical Analysis

In this section, a statistical analysis of the response of the machine when bearing different dimensional and assembly faults within typical tolerance ranges is presented. This considers the evaluation and analysis of several combinations of faults when present in the magnets of the machine.

4.1. Methodology: Superposition Method

It is well known that one of the main drawbacks of 3-D FE analysis is the high computational burden. In the case of AFPM machines, this is particularly relevant since simulations in most analyses require to be carried out by means of 3-D models. For instance, the evaluation of a single performance index of the selected machine takes up to 4 h to complete using a desktop computer containing an 8-core 16-thread Ryzen 5800x processor, 128 GB of RAM, and PCIE SSD. Considering the aforementioned time in the case of a tolerance analysis which involves the evaluation of several thousands of simulation runs, this translates into the analysis being impracticable. Therefore, a different approach needs to be considered when assessing the tolerance analysis of an axial topology machine.

In this paper, the issue of a fast evaluation of several combinations of faulty magnets is addressed through the proposal of an adapted semi-analytic superposition method, based on the approach presented in [25]. Harmonic components of torque (HC) (cogging or rated) can be expressed as the sum of native harmonic components (NHC) and additional harmonic components (AHC). NHC is the harmonic content of the torque signal of the faultless machine, while AHC represents the harmonic content that appears when the machine is faulty.

$$HC = NHC + AHC$$
(1)

Taking into account that the torque signal (*T*) is a periodical function that depends on the rotor angular position α , then:

$$T(\alpha) = T_{\rm NHC}(\alpha) + T_{\rm AHC}(\alpha)$$
⁽²⁾

 T_{NHC} is obtained by carrying out a 3-D FE simulation of the faultless machine, whilst *T* is obtained by simulating a machine that has a magnet with a specific fault (e.g., remanence variation). Following Equation (2), T_{AHC} is obtained, which represents the additional content that appears when having that specific fault on a magnet. The torque signal of a machine that have several magnets with that fault can be obtained by considering T_{AHC} as many times as faulty magnets the machine has, and evaluating the spatial displacement of each faulty magnet to obtain the final torque waveform. In Figure 9, the flowchart of the proposed method is depicted, which allows to evaluate the machine performance considering different magnets configurations and manufacturing tolerances with relatively low computational burden.

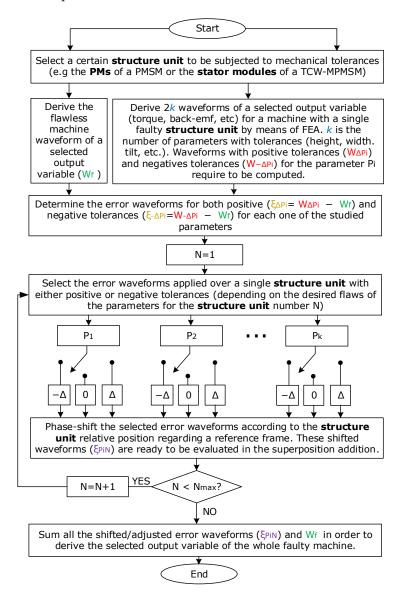


Figure 9. Flowchart of the proposed semi-analytical superposition method to estimate the torque signals of any faulty machine.

In order to validate the proposed superposition method (SM), 10 random machine designs (with random faults distributed in the magnets of the machine) were assessed and compared with the results obtained by full FE simulations. To quantify the accuracy of the estimation obtained from the superposition method, the mean absolute error (MAE) is calculated as:

$$MAE = \frac{\sum_{i=1}^{n} |y_i - x_i|}{n},$$
(3)

where y_i is the curve obtained by means of the superposition method, x_i is the curve given by full FE simulations, and n is the number of samples (points) evaluated in each curve.

In Figure 10, the comparison of the obtained cogging torque between FE-only and the proposed superposition method (SM) is presented. From Figure 10, it can be noted that the proposed SM has a good agreement with the only-FE evaluation, and the former can predict the deviations inserted in the torque signals with good accuracy. The MAE calculated for the cogging torque signals of Figure 10 is lower than 7% in all cases. Furthermore, the peak-to-peak value of the cogging torque obtained through the semi-analytical method was at most deviated in 3% when compared with the full FE results. Furthermore, it can be noted that there are cases in which the cogging torque is significantly different from the faultless machines (upper left graph of Figure 10), and the SM is able to predict these variations.

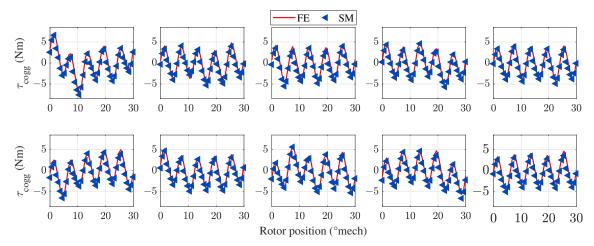


Figure 10. Comparison of the cogging torque obtained with the SM (markers) and FE simulations (continuous line).

In Figure 11, the comparison of the calculated electromagnetic torque between FEonly and the SM is presented. From Figure 11, it may be seen that the proposed SM is concordant with the only-FE evaluation. This is quantified by means of a low MAE: in all 10 random tests, the MAE is lower than 1%. This confirms the feasibility of evaluating the cogging torque and rated torque of faulty machines through the superposition method with acceptable accuracy.

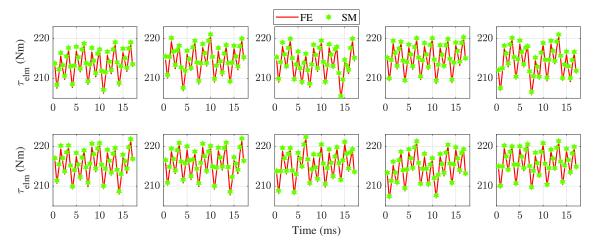


Figure 11. Comparison of the electromagnetic torque obtained with the SM (markers) and FE simulations (continuous line).

4.2. Probabilistic Approach

By means of the superposition method, multiple faulty machines can be assessed considering a probabilistic approach. In the literature, the occurrence probability of the different manufacturing tolerances that can affect a machine may follow a uniform distribution or a normal distribution. The uniform distribution is usually adopted for carrying out worst-case analyses, whilst the normal distribution is used to better represent the outcome of a real manufacturing process. In this paper, a normal distribution is adopted, and the occurrence of deviations is modelled through two statistical indicators: the mean value (μ) and the standard deviation (σ). The mean value is equal to zero, which relates to the parameters of the machine being the nominal values in the absence of deviations or faults. This is the ideal case and the center of the probability distribution since manufacturing procedures intend to obtain this value as the outcome of the process. Instead, the value of the standard deviation is defined considering the maximum tolerance that can be present in the manufacturing process. In the normal distribution, and as depicted in Figure 12, around 99.7% of the data is found within $\pm 3\sigma$, and thus sigma can be approximated as:

$$\sigma = \frac{\text{USL} - \text{LSL}}{6},\tag{4}$$

where LSL and USL are the lower and upper specification limits, respectively, which are derived from the tolerance requirements. In this work, LSL and USL comprise deviations from two times the typical negative deviation to two times the typical positive deviation, i.e, LSL = -0.2 mm and USL = 0.2 mm in the cases of dimensional parameters subject to tolerance. This aims to support a statistical analysis beyond typical tolerances found in a standardized manufacturing process but also considering these typical tolerance ranges. The probability distribution of the seven types of tolerance (e.g., angular displacement, axial length, etc.) are considered independent from each other, and the different types of tolerances have the same chance to be present in the machine. Therefore, from these seven probability distributions, a set of representative machines (with faulty magnets) can be devised, evaluated and compared.

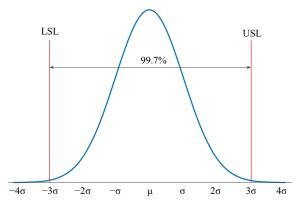


Figure 12. Restrained normal probability distribution from -3σ to 3σ . This distribution is suitable for representing the probability occurrence of tolerances in a real-world manufacturing process.

4.3. Results

A total of 10,000 designs with several magnet faults was created following a normal distribution of tolerances, and the cogging torque and the rated torque of these designs is obtained through the superposition method. In addition, the observed difference between the performance indices of the *i*-th design (T_i) belonging to the set and the indices of a faultless design (T_{nom}) is determined through the following variation factor (VAR):

$$VAR = \frac{|T_i - T_{nom}|}{T_{nom}},$$
(5)

In order to better visualize the outcome of this assessment, relevant statistical indicators are calculated and grouped into a boxplot, which shows the observed variation of the cogging torque and rated torque of the set of assessed designs. Figure 13 presents the boxplot when evaluating the cogging torque, which groups the data into deciles represented by rectangles of different width, and also shows the median (highlighted as a thicker horizontal line) and extreme values.

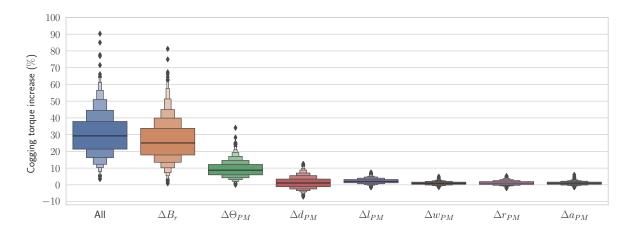


Figure 13. Cogging torque increase of the set of representative designs subject to tolerance with respect to the faultless design. The results were obtained using the SM.

From Figure 13, it is observed that magnet remanence produces the largest increase in cogging torque, which is represented by a median of +25%. This means that in a manufacturing process that deals with remanance tolerances of \pm 5%, more than 50% of the resulting machines will develop a cogging torque that is 25% higher than that originally conceived by design. The angular displacement of magnets, which is particularly relevant in the case of ironless core structures, increases the cogging torque as well, considering a median of +8%. Instead, axial and radial displacement, as well as length, width and depth variations of the magnets do not produce significant changes in cogging torque: the median of the resulting increase is around zero for all these cases (lower than 1%), and the standard deviation is very low (lower than 3%). Notwithstanding, the axial length can be of interest since it results in the greatest PM volume variation and has the greatest dispersion (3%) of all non-highly significant tolerance types. Moreover, there are certain combinations of deviated magnet depths that leads to a torque cogging decrease, down to -10% in very improbable scenarios.

In the case that all tolerances are evaluated simultaneosly, the median of the cogging torque increase is 29%. It is observed that summing the independent contributions (medians) of remanence and displacement of magnets is not equal to this 29% increase. Furthermore, the increase in cogging torque as a consequence of remanence variations only is very similar to the median when all tolerances are considered simultaneously. From this analysis, it is clear that both remanence and angular displacement of magnets have, effectively, an important impact on the cogging torque of the AFPM machine. These tolerances should not be neglected when conducting a tolerance analysis of these designs. Since magnet manufacturers often provide remanence tolerances within $\pm 2.5\%$ to $\pm 5\%$, it is therefore highly probable that the cogging torque of a built AFPM machine is considerably higher than the originally conceived.

Figure 14 presents the observed rated torque variation with respect to the faultless machine. From Figure 14 it should be noted that magnet remanence has the highest impact (although insignificant) on the cogging torque, with a dispersion of around 0.6%, followed by magnet depth variations, which develop a dispersion of around 0.1%. This means that there are several machine samples that provide a mean torque that is within $\pm 0.3\%$.

However, it may be noted that the median of the rated torque variation of all fault types is around 0%, and that in the absolute worst case evaluated (extremely unlikely), the rated torque will be decreased by 1.8%. Thus, it may be concluded that dimensional, positional or remanence tolerances cobmined do not greatly affect the torque capacity of the machine.

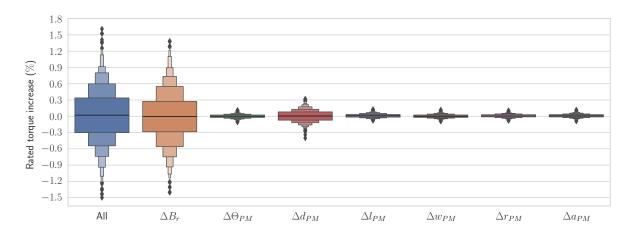


Figure 14. Rated torque increase of the set of representative designs subject to tolerance with respect to the faultless design. The results were obtained by means of a proposed superposition method.

Figure 15 shows the estimated peak-to-peak torque ripple variation with respect to the faultless machine. From Figure 15 it may be observed that magnet remanence has a relevant impact on the torque ripple of the machine, with a median of +25%. In addition, the angular displacement of magnets also provides a significant ripple increase, considering a median of 7%, whilst the magnet depth variations develop a median of 4%. The observed dispersion of the remanence deviation boxplot is very high, as the standard deviation is 25.7%, there are some unlikely combinations that can lower the ripple by around 2%, and there are some other unlikely cases that can provide up to a 63% ripple increase.

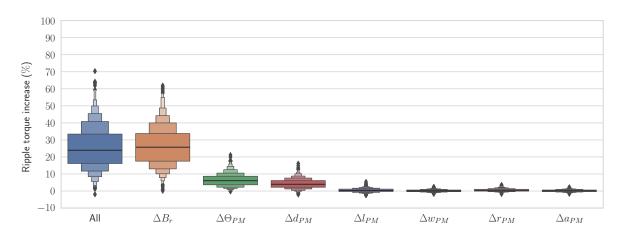


Figure 15. Ripple torque increase of the set of representative designs subject to tolerance with respect to the faultless design. The results were obtained by means of a proposed superposition method.

From the comparison of Figures 13 and 15, a similar behavior can be observed: magnet remanence, angular displacement and depth variations have the most significant impact, with medians higher than 5%. Moreover, when combining all types of faults, the resulting median is similar for both cogging and ripple torque, hovering at 30%. Similarly, axial and radial displacement, as well as length, width and depth variations of the magnets do not provide a significant contribution to cogging or ripple torque variations, and their real

impact cannot be easily analyzed by means of the results of the proposed superposition method. Since the error of the superposition method is comparable in magnitude order, severe estimation noise may be included in these low-magnitude boxplot results. Notwithstanding, the low contribution and lack of significance of these parameters can be stated within acceptable accuracy and certainty.

5. Conclusions

This paper presents the tolerance analysis of a two-stator one-rotor TCW-AFPM machine with an ironless rotor structure, focusing on cogging torque, rated torque and torque ripple of the machine. The impact of multiple magnets with simultaneous tolerances was analyzed by using the combination of a superposition technique and a statistical analysis. The utilized superposition method proved to be able to obtain both the cogging torque and the rated torque of the AFPM machine for several tolerance combinations, with acceptable accuracy when compared with 3D-FE simulations. The proposed method can be used to assess the sensitivity of AFPM machines when subject to dimensional tolerances. From the results, it was found that the cogging torque and torque ripple are significantly affected by magnet remanence variations and angular displacement of magnets. Furthermore, the combination of different types of tolerances can generate a significant increase in cogging torque and torque ripple when compared with the flawless design. In turn, electromagnetic torque is not affected by magnet dimensional, positional or remanence tolerances. The findings disclose a relevant aspect of the design stage of AFPM machines: it is probable that the cogging torque and the torque ripple of an assembled AFPM machine with an ironless rotor can be substantially higher than that originally conceived.

Author Contributions: Conceptualization, A.E., G.S., W.J. and C.M.; methodology, software, validation, investigation, formal analysis, A.E., W.J. and C.M.; resources, W.J., J.A.T. and J.R.; data curation and writing—original draft preparation, A.E. and C.M.; writing—review and editing, W.J., J.A.T., J.R. and E.R.; visualization, A.E., supervision, W.J., J.A.T. and E.R.; project administration, W.J.; funding acquisition, W.J., J.R. and J.A.T. All authors have read and agreed to the published version of the manuscript.

Funding: This work is supported by the Agencia Nacional de Investigacion y Desarrollo, Chile through the Project FONDECYT 1230670, FONDEF ID21I10099, ANIDPFCHA/Doctorado Nacional/2020-21200350 and by Pontificia Universidad Catolica de Valparaiso through a postgraduate scholarship (Beca Postgrado PUCV 2021).

Institutional Review Board Statement: Not applicable.

Informed Consent Statement: Not applicable.

Data Availability Statement: Data are contained within the article.

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

References

- 1. Zhang, Z.; Geng, W.; Liu, Y.; Wang, C. Feasibility of a new ironless-stator axial flux permanent magnet machine for aircraft electric propulsion application. *CES Trans. Electr. Mach. Syst.* **2019**, *3*, 30–38. [CrossRef]
- Kelch, F.; Yang, Y.; Bilgin, B.; Emadi, A. Investigation and design of an axial flux permanent magnet machine for a commercial midsize aircraft electric taxiing system. *IET Elect. Syst. Transp.* 2018, *8*, 52–60. [CrossRef]
- Kim, J.H.; Choi, W.; Sarlioglu, B. Closed-Form Solution for Axial Flux Permanent-Magnet Machines With a Traction Application Study. IEEE Trans. Ind. Appl. 2016, 52, 1775–1784. [CrossRef]
- 4. Aydin, M.; Guven, M.K. Comparing Various PM Synchronous Generators: A Feasible Solution for High-Power, Off-Highway, Series Hybrid, Electric Traction Applications. *IEEE Veh. Technol. Mag.* **2014**, *9*, 36–45. [CrossRef]
- Tong, W.; Wang, S.; Dai, S.; Wu, S.; Tang, R. A quasi 3-D magnetic equivalent circuit model of a double-sided axial flux permanent magnet machine considering local saturation. *IEEE Trans. Energy. Convers.* 2018, 33, 2163–2173. [CrossRef]
- 6. Vansompel, H.; Leijnen, P.; Sergeant, P. Multiphysics Analysis of a Stator Construction Method in Yokeless and Segmented Armature Axial Flux PM Machines. *IEEE Trans. Energy Convers.* **2019**, *34*, 139–146. [CrossRef]

- 7. Jara, W.; Lindh, P.; Tapia, J.A.; Petrov, I.; Repo, A.K.; Pyrhönen, J. Rotor Eddy-Current Losses Reduction in an Axial Flux Permanent-Magnet Machine. *IEEE Trans. Ind. Electron.* **2016**, *63*, 4729–4737. [CrossRef]
- Frank, Z.; Laksar, J. Analytical Design of Coreless Axial-Flux Permanent Magnet Machine With Planar Coils. *IEEE Trans. Energy* Convers. 2021, 36, 2348–2357. [CrossRef]
- Wang, X.; Zhao, M.; Zhou, Y.; Wan, Z.; Xu, W. Design and Analysis for Multi-Disc Coreless Axial-Flux Permanent-Magnet Synchronous Machine. *IEEE Trans. Appl. Supercond* 2021, 31, 1–4. [CrossRef]
- Palani, D.; Azar, Z.; Thomas, A.; Zhu, Z.Q.; Gladwin, D. Modeling technique for large permanent magnet generators accounting for manufacturing tolerances and limitations. In Proceedings of the 2016 XXII International Conference on Electrical Machines (ICEM), Lausanne, Switzerland, 4–7 September 2016; pp. 452–458.
- 11. Lee, S.G.; Kim, S.; Park, J.C.; Park, M.R.; Lee, T.H.; Lim, M.S. Robust Design Optimization of SPMSM for Robotic Actuator Considering Assembly Imperfection of Segmented Stator Core. *IEEE Trans. Energy Convers.* 2020, 35, 2076–2085. [CrossRef]
- 12. Ortega, A.J.P.; Xu, L. Analytical Prediction of Torque Ripple in Surface-Mounted Permanent Magnet Motors Due to Manufacturing Variations. *IEEE Trans. Energy Convers.* 2016, *31*, 1634–1644. [CrossRef]
- Coenen, I.; van der Giet, M.; Hameyer, K. Manufacturing Tolerances: Estimation and Prediction of Cogging Torque Influenced by Magnetization Faults. *IEEE Trans. Magn.* 2012, 48, 1932–1936. [CrossRef]
- Madariaga, C.; Jara, W.; Riquelme, D.; Bramerdorfer, G.; Tapia, J.A.; Riedemann, J. Impact of Tolerances on the Cogging Torque of Tooth-Coil-Winding PMSMs with Modular Stator Core by Means of Efficient Superposition Technique. *Electronics* 2020, *9*, 1594. [CrossRef]
- 15. Gerber, S.; Wang, R.J. Statistical analysis of cogging torque considering various manufacturing imperfections. In Proceedings of the 2016 XXII International Conference on Electrical Machines (ICEM), Lausanne, Switzerland, 4–7 September 2016; pp. 2066–2072.
- 16. Di Gerlando, A.; Foglia, G.M.; Iacchetti, M.F.; Perini, R. Effects of Manufacturing Imperfections in Concentrated Coil Axial Flux PM Machines: Evaluation and Tests. *IEEE Trans. Ind. Electron.* **2014**, *61*, 5012–5024. [CrossRef]
- Li, J.; Qu, R.; Cho, Y.H. Effect of unbalanced and inclined air-gap in double-stator inner-rotor axial flux permanent magnet machine. In Proceedings of the 2014 International Conference on Electrical Machines (ICEM), Berlin, Germany, 2–5 September 2014; pp. 502–508.
- 18. Thiele, M.; Heins, G. Computationally Efficient Method for Identifying Manufacturing Induced Rotor and Stator Misalignment in Permanent Magnet Brushless Machines. *IEEE Trans. Ind. Appl.* **2016**, *52*, 3033–3040. [CrossRef]
- Taran, N.; Rallabandi, V.; Ionel, D.M.; Zhou, P.; Thiele, M.; Heins, G. A Systematic Study on the Effects of Dimensional and Materials Tolerances on Permanent Magnet Synchronous Machines Based on the IEEE Std 1812. *IEEE Trans. Ind. Appl.* 2019, 55, 1360–1371. [CrossRef]
- Guo, B.; Huang, Y.; Peng, F.; Guo, Y.; Zhu, J. Analytical Modeling of Manufacturing Imperfections in Double-Rotor Axial Flux PM Machines: Effects on Back EMF. *IEEE Trans. Magn.* 2017, 53, 1–5. [CrossRef]
- Taqavi, O.; Ehsan Abdollahi, S.; Aslani, B. Investigations of Magnet Shape Impacts on Coreless Axial-Flux PM Machine Performances. In Proceedings of the 2021 12th Power Electronics, Drive Systems, and Technologies Conference (PEDSTC), Tabriz, Iran, 2–4 February 2021; pp. 1–5.
- 22. Zhu, Z.; Ruangsinchaiwanich, S.; Chen, Y.; Howe, D. Evaluation of superposition technique for calculating cogging torque in permanent-magnet brushless machines. *IEEE Trans. Magn.* **2006**, *42*, 1597–1603. [CrossRef]
- Klausnitzer, M.; Möckel, A. Quick cogging torque calculation for electronically commutated motors considering combinations of deviant and flawless magnets. In Proceedings of the International Symposium on Power Electronics Power Electronics, Electrical Drives, Automation and Motion, Sorrento, Italy, 20–22 June 2012; pp. 66–69.
- Escobar, A.; Sánchez, G.; Jara, W.; Madariaga, C.; Tapia, J.; Degano, M.; Riedemann, J. Statistical Analysis of Manufacturing Tolerances Effect on Axial-Flux Permanent Magnet Machines Cogging Torque. In Proceedings of the 2021 IEEE Energy Conversion Congress and Exposition (ECCE), Vancouver, BC, Canada, 10–14 October 2021; pp. 4342–4346.
- 25. Gasparin, L.; Cernigoj, A.; Markic, S.; Fiser, R. Additional Cogging Torque Components in Permanent-Magnet Motors Due to Manufacturing Imperfections. *IEEE Trans. Magn.* **2009**, *45*, 1210–1213. [CrossRef]

Disclaimer/Publisher's Note: The statements, opinions and data contained in all publications are solely those of the individual author(s) and contributor(s) and not of MDPI and/or the editor(s). MDPI and/or the editor(s) disclaim responsibility for any injury to people or property resulting from any ideas, methods, instructions or products referred to in the content.