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Optimization of an Axial Flux Permanent Magnet Vernier Generator for Wind Power Generation

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Abstract

Renewable energy has been the topic of much research over the years. Wind power generation, categorized as a direct drive application, requires a low-speed and high-power density generator. The permanent magnet Vernier machine is one of the flux modulation ones which can have both features simultaneously. The axial flux structure can be a better solution for this application instead of the radial counterpart with Having more power density, efficiency and compact structure. So, in this paper, a 300W axial flux permanent magnet Vernier generator (AFPMVG) TORUS type for wind power generation is investigated. with NN type magnet structure, the toroidal winding configuration is used and consequently, end winding connection is descended. The no-load phase voltage and volume of the machine is formulated. Then, the proper decision variables and primary design considerations are discussed. Using genetic algorithm (GA), the volume of the machine is optimized subjected to the constant no-load phase voltage with MATLAB software. Finally, the optimization is simulated using 3D-FEM and flux density, no-load phase voltage with harmonic orders and cogging torque are analyzed. The final design power density reached 196kW/m³. In addition, a low value in THD and cogging torque resulted, which are desired for the wind turbine.

Keywords: Axial flux permanent magnet vernier generator (AFPMVG), Genetic algorithm (GA), Power density, Finite element method (FEM).

Introduction

In recent years, direct-drive applications such as electric vehicles and wind turbines have become one of the most popular research fields [1]–[3]. Low speed and high power/torque density are needed in these applications. Mechanical gears were initially employed as a link between the machine and load or turbine as a viable option. Mechanical gears, however, have restricted reliability, high maintenance costs, and low efficiency [4].

To solve this problem, direct drive machines were proposed. These machines are coupled directly to the turbine or load, but due to the low speed of these applications, volume was increased enormously. Therefore, another type of machine was presented using a concept called magnetic gearing effect. These kinds of machines are also known as flux modulation ones. Magnetic gears, Flux switching, Flux reversal and Vernier are examples of flux modulation machines [5]. Permanent magnet vernier machine (PMVM) is one of the flux modulation types created following the evolution and integration of magnetic gears with permanent magnet machines [2]. Using the gear effect, rotor field of PMVM will rotate at speed much lower than that of armature. In this manner, the machine is capable of both working at low speed and having high power density. Many structures have been proposed for PMVM such as dual rotor, dual stator, Halbach array and so on [6]–[8].

Due to the use of integrated slot distributed winding, most of traditional PMVMs have long ending connections; as a result, volume will be increased. Toroidal winding with a high winding factor is suitable replacement for them because it reduces end winding connections and consequently, the effective diameter length. Moreover, toroidal winding can be used in machines with dual airgap and in addition to increasing the power density, for being exposed of the airgap, the cooling condition will be improved [9].

The radial flux PMVM has generally been the subject of numerous studies. However, axial flux permanent magnet vernier machines (AFPMVM) have also received interest recently. Benefiting from higher efficiency, more compact design and more significant aspect ratio, the AFPMVM is more suited for direct drive applications than the radial counterpart [10], [11]. Up to now, several AFPMVM topologies have been proposed and analyzed. In [12], the axial force between the rotor and stator of a single stator-single rotor structure is optimized and reduced. In [13], a dual stator-single rotor structure is proposed to improve the power factor. In [14], a double rotor-triple stator structure is optimized via genetic algorithm (GA). In [15]-[18], alternative topologies including dual rotor-single stator with consequent pole, triple rotor, triple stator and MAGNUS type have been examined.

Much research is conducted on the optimization of the pulsating torque and efficiency of the PM machines [19]. The PM machines have low working frequency and increase ripple of dc link capacitor in wind power generation system. Also, due to the same stator and rotor pole pairs, the rotor pole pairs can't increase significantly. Thus, in this paper, as a solution and replacement for PM generator, an AFPMVG is studied. To reduce the length of the end winding connection and boost power density, the toroidal winding will be employed in an AFPMVG with dual rotor and single stator. First, the operation principles and structure of the machine will be discussed. Second, the volume and objective function of a 300W machine will be formulated. Third, the decision variables

will be chosen and then, optimization will be performed using GA. At last, the results will be confirmed by 3D-FEM simulation.

Operation principles and structure

PMVM shares the same operating principles as permanent magnetic-geared machines [2]. The sum or difference of the number of rotor and stator pole pairs determines the number of stator teeth. As a result, the number of rotor pole pairs is more than that of armature. So, unlike



Figure 1. Exploded model of AFPMVM

permanent magnet synchronous machines, PMVMs don't adhere to the condition that the number of rotor and stator pole pairs must be equal. Due to the magnetic gearing effect, the produced MMF of rotor magnets is modulated by the stator teeth, then it is synchronized with the stator field and generates electromagnetic torque. The basic equation of PMVM is explained as (1) [1]:

$$P_r \pm P_s = Z_s \tag{1}$$

"Figure 1" shows the exploded view of AFPMVG. Overall, the structure resembles the AFPM machine, albeit with a different number of rotor poles. Magnets are designed in a trapezoidal shape to maintain constant pole arc and, as a result, a uniform flux density distribution over their surface. Utilizing the TORUS NN type machine, the toroidal winding can be used to reduce the end winding connection. It's proposed for stator design to use trapezoidal slots to mitigate cogging torque, but rectangular one is favored due to some production limits [19].

Formulating optimization problem

A. Back-EMF

The design procedure of PMVM is quite different from other types of machines because of flux modulation concept. A series flux tube between the magnet and airgap is considered. Then, the airgap flux density can be written:

$$B_g(\theta_s, r, t) = F_{pm} P(\theta_s, r) \simeq F_{pm} [\cos(P_r \theta_{s-\omega t}) + (2)]$$

$$\frac{P_1}{2}\cos[(Z_s-P_r)\theta_s+\omega t)]+\frac{P_1}{2}\cos[(Z_s-P_r)\theta_s-\omega t)]]$$

where the P_{θ} and P_{I} are calculated using conformal mapping [9]. It was supposed that the F_{pml} , the fundamental harmonic component of magnet, is replaced the Fourier series of magnet MMF.

Using airgap flux density, the flux linkage per phase can be calculated:

$$\lambda_{ph} = k_w N_{ph} \int_{KD_0/2}^{D_0/2} \int_0^{\pi/P_s} B_g(\theta_s, r, t) r \, dr \, d\theta_s \tag{3}$$

replacing (2) in (3), λ_{ph} can be calculated as:

$$\lambda_{ph} = k_w N_{ph} (1 - k^2) \frac{D_o^2}{4P_r} F_{pm1} (P_0 + \frac{6q - 1}{2} P_1) \cos(\omega t) \quad (4)$$

According to the Faraday law, the back-EMF is expressed as:

$$e = -\frac{d\lambda_{ph}}{dt} = k_w N_{ph} \omega_m (1-k^2) \frac{D_o^2}{4} F_{pm1} (P_0 + \frac{6q-1}{2} P_1) \sin(\omega t)$$
(5)

it should be noted that it was supposed there is no saturation point in cores.

B. Sizing equations

The sizing equation of AFPMVM is the same as the AFPM machine [20]. The total diameter is given as:

$$D_{tot} = D_o + 2W_{cu} \tag{6}$$

Where for the slotted TORUS machines, the radial thickness of winding is also considered as slot depth. This thickness can be calculated as:

$$W_{cu} = \frac{D_o k - \sqrt{(D_o k)^2 - \frac{12N_{ph}I_{rms}}{\pi k_{cu} J \alpha_s}}}{2}$$
(7)

The axial length of machine is given by:

$$L_{tot} = L_s + 2L_r + 2g \tag{8}$$

The stator axial length will be:

$$L_s = L_{cs} + 2L_{ss} \tag{9}$$

The axial length of stator yoke can be calculated as:

$$L_{cs} = \frac{B_s \pi \,\alpha_p (1+k) D_o}{4 \, P_r B_{cs}} \tag{10}$$

The axial rotor length is expressed as:

$$L_r = L_{cr} + L_{pm} \tag{11}$$

the axial length of rotor yoke is given by:

$$L_{cr} = \frac{B_u \pi (1+k) D_o}{8 P_r B_{cr}}$$
(12)

For the surface permanent magnets, $B_u=B_g$. The magnet axial thickness can be written as:

$$L_{pm} = \frac{B_g \,\mu r g \,\sigma}{B_r - B_g \,\sigma} \tag{13}$$

For the AFPM machines, if the number of rotor pole pairs were high, an empirical factor would be considered for axial length of rotor and stator yoke to maintain their reliability [11].

Optimization

A. Decision variables and primary design

The first step for primary design is choosing a good combination of stator and rotor pole pairs. For the directdrive applications, the operation speed is low. For this reason, the number of rotor pole pairs should be high. conversely, a proper combination of stator teeth number and rotor pole pair should be chosen to mitigate cogging torque at low speeds. Besides, to weaken the armature effect, a high number of stator pole pairs should be selected [6] and the most important one is that equation (1) should be satisfied. To earn all these aims, the number of stator and rotor pole pairs are chosen to be 2 and 22, respectively. The number of stator slots or teeth can be either 20 or 24, according to equation (1). Due to having low cogging torque, higher back-EMF with lower winding turns and improvement of voltage regulation, 24 is chosen [1]. "Table 1" shows the specifications of AFPMVG.

Table 1. Specifications of generator

Number	$\mathbf{P}_{\mathrm{out}}$	300(W)
Mechanical speed	ω _m	136.36(rpm)
load voltage RMS value	E_{ph}	30(V)
Number of stator pole pairs	Pr	22
Number of rotor pole pairs	Ps	2
Number of stator slots	Zs	24

To optimize with evolutionary algorithms, the variables should be selected somehow which have the most effect on the objective function. Moreover, if there were any relationship among decision variables, it should be clearly specified for the algorithm. The determined cost function in this paper is:

Subjected to:
$$E_{ph}$$
=30 V (15)

B. genetic algorithm

Considering the cost function, six parameters are chosen for optimization. The outer diameter (D_o) , diameter ratio (k), airgap flux density (B_g) , pole arc coefficient (α_p) , maximum flux density of stator (B_{cs}) and rotor (B_{cr}) . Due to the nonlinearity of the equations and high number of decision variables, manual design can't reach the optimum point. So, optimization algorithms are needed to get to the minimum volume and indirectly, the maximum power density. GA is one of the optimization algorithms which originates in natural selection and

genetic manners. GA Benefits from parallel computation, solving nonlinear equations and independency of the derivations [21]. To optimize with GA, every decision variable should have an acceptable range, so that it should be neither small to limit the search zone nor large to reach a local optimization. "Table 2" shows the boundary of every variable for GA.

The range of every variable is specified around primary designed machine. Besides, some other constraints like having low cogging torque are taken into the consideration, too.

Dimension constraints				
Outer diameter (D _o)	0.22m <d<sub>o<0.24m</d<sub>			
Diameter ratio (k)	0.4 <k<0.75< td=""></k<0.75<>			
Airgap flux density (Bg)	0.4T <bg<1.2t< td=""></bg<1.2t<>			
Pole arc coefficient (α_p)	$0.65 < \alpha_p < 0.85$			
Material constraints				
Stator and rotor maximum flux density	B _{cs} B _{cr} <1.5T			
Magnet remanence	1.21 T			
Magnet permeability	1.05			
Core material	M19-24G			

Table 2. Boundary of optimization variables

Every variable plays the role of a gene in GA and it considers every combination of variables as a chromosome. At first, a primary population is created. Then, the reproduction process (mutation, crossover and selection) is performed and finally the superior chromosomes with the lowest cost function will be selected. This process will be continued until the stopping criteria are satisfied. The optimization is usually repeated a couple of times to make sure that it is global, not a local one.



"Figure 2" shows the convergence process of genetic algorithm. The population for every generation is considered to be 400. The simulation is repeated for 300 generations to reach the global optimization. After 170 generations, the GA has reached the optimum point.

The parameters of the optimized and primary machines are summarized in "Table 3".

Parameter	Primary design	Optimized design
Outer diameter (D _o)	230 (mm)	221.2 (mm)
Diameter ratio (k)	0.6	0.51
Airgap flux density (Bg)	0.73 (T)	0.66 (T)
Pole arc (α_p)	0.83	0.72
Stator maximum flux density (B _{cs})	1 (T)	1.22 (T)
Rotor maximum flux density (B _{cs})	1.15 (T)	1.32 (T)
Slot opening(C)	0.5	0.5
Slot pitch (W _p)	23	21.8
Slot width (W _s)	11.5	10.9
Number of turns per phase (N _{ph})	200	224
Slot depth (L _{ss})	3.5(mm)	4.5(mm)
Winding radial thickness (W _{cu})	3.5 (mm)	4.5 (mm)
Magnet axial length (h _m)	3 (mm)	2.2 (mm)
Stator yoke thickness (L _{cs})	16.5 (mm)	9.4 (mm)
Rotor yoke thickness (L _{cr})	8.6 (mm)	6 (mm)
Airgap length (g)	1 (mm)	1 (mm)
Power density (ζ)	144 (kW/m ³)	196.4 (kW/m ³)

Table 3. Final specification of AFPMVG

Results

The final design is processed according to GA. The 3D-FEM simulation is conducted on Ansys Electronics Desktop 2022 R1. Airgap flux density, no load voltage, harmonic orders and cogging torque are investigated.



Figure 3. Flux density distribution of AFPMVG at no-load condition

"Figure 3" illustrates the flux density distribution of the optimized machine. Utilizing the TORUS NN slotted machine, the flux density closes path through the stator yoke and for the mentioned reason, the flux density is more than the other parts. The maximum flux density is 1.8T, which is less than the saturation point of the material.



Figure 4. Flux density distribution in air gaps (a) Upper air gap (b) Lower air gap

"Figure 4" presents the flux density distribution of both airgaps. The shapes are almost the same but due to the flux direction, they are inverse. The maximum flux density of airgap is 1T, which is lower than the remanence of the magnet because of high flux leakage of surface permanent magnets.



Using FFT, the harmonic spectrum of air gap flux density is plotted in "Figure 5". The prominent harmonics are 2nd, 22nd and 44th, which are the multiple of stator teeth and rotor pole pairs. The main harmonics are the 22nd and 2nd. Other harmonics with low amplitude will contribute to no-load voltage distortion, torque ripple and core loss.



Figure 6. No-load voltage of machine (a)Voltage waveform (b)Harmonic order

"Figure 6" represents harmonic order and no-load EMF waveform. The lower total harmonic distortion (THD), the more sinusoidal waveform will be got and consequently, the stress over the dc link capacitor for wind power generation will be decreased [6]. As it can be seen in "Figure 6(b)", the amplitude of the disturbance harmonics is not comparable with the fundamental component. The calculated THD is 1.75%, which satisfies the requirements for wind power generation.



Cogging torque, already known as pulsating torque accompanied with torque ripple, is defined as result of interaction between magnets and stator teeth. Therefore, a good combination of rotor pole pairs and stator teeth will be led to the low cogging torque [19]. As shown in "Figure 7", the peak-to-peak cogging torque is 0.75N.m, which makes the machine work with low noise.

Conclusion

In this paper, an axial flux permanent magnet vernier generator with TORUS structure was analyzed. Benefiting from NN type magnet, a toroidal configuration was used to decrease the effective diameter and the volume of the machine, consequently. Using GA, the volume of the machine was optimized provided to constant no-load phase voltage. Then, the optimized generator performance was analyzed using 3D-FEM. The results of the simulation confirmed optimization. The AFPMVG showed low cogging torque and voltage THD, which is suitable for wind power generation. Besides, volume optimization was led to power density optimization, too. Despite low power, the power density reached about 196.4 kW/m³, which shows the potential of this kind of machine as a good replacement for PM machine for wind power generation.

Nomenclatures

- B_{cr} Maximum flux density of rotor core
- B_{cs} Maximum flux density of stator core
- B_g Airgap flux density
- *B_r* Permanent magnet remanence
- B_u Attainable flux density on surface of magnet
- C Slot opening
- *D_o* Outer diameter
- *D*_{tot} Total diameter
- *e* Amplitude of no-load phase voltage
- E_{ph} Phase voltage rms value
- F_{pm1} Magnet fundamental component
- *g* Airgap length
- *I_{rms}* Phase Current rms value
- J Current density
- *k* Diameter ratio
- k_{cu} Slot filling factor
- k_w Winding factor
- L_c Axial length of stator core
- *L_{cr}* Rotor yoke thickness
- *L_{cs}* Stator yoke thickness
- *L_{pm}* Magnet axial length
- L_r Axial length of rotor
- *L*_{ss} Slot depth
- *L*_{tot} Total length of the machine
- *N*_{ph} Number of phase winding turns
- P_1 fundamental component of airgap permeance
- *P*_o Constant component of airgap permeance
- *P*_{out} Output power
- P_r Rotor pole pairs
- *P_s* Stator pole pairs
- *q* Slot per pole per phase
- V Volume
- *W*_{cu} Radial thickness of winding
- W_p Slot pitch
- *W_s* Slot width
- Z_s Stator slots number
- α_p Pole arc coefficient
- α_s Stator teeth portion to stator pole pitch portion
- ζ Power density
- θ_s Relative angle to stator axis
- λ_{ph} Flux linkage per phase
- σ Magnetic flux leakage coefficient
- ω Electrical rotor speed
- ω_m Mechanical rotor speed

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