

Article **A New Zero Waste Design for a Manufacturing Approach for Direct-Drive Wind Turbine Electrical Generator Structural Components**

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Abstract: An integrated structural optimization strategy was produced in this study for direct-drive electrical generator structures of offshore wind turbines, implementing a design for an additive manufacturing approach, and using generative design techniques. Direct-drive configurations are widely implemented on offshore wind energy systems due to their high efficiency, reliability, and structural simplicity. However, the greatest challenge associated with these types of machines is the structural optimization of the electrical generator due to the demanding operating conditions. An integrated structural optimization strategy was developed to assess a 100-kW permanent magnet direct-drive generator structure. Generated topologies were evaluated by performing finite element analyses and a metal additive manufacturing process simulation. This novel approach assembles a vast amount of structural information to produce a fit-for-purpose, adaptative, optimization strategy, combining data from static structural analyses, modal analyses, and manufacturing analyses to automatically generate an efficient model through a generative iterative process. The results obtained in this study demonstrate the importance of developing an integrated structural optimization strategy at an early phase of a large-scale project. By considering the typical working condition loads and the machine's dynamic behavior through the structure's natural frequencies during the optimization process coupled with a design for an additive manufacturing approach, the operational range of the wind turbine was maximized, the overall costs were reduced, and production times were significantly diminished. Integrating the constraints associated with the additive manufacturing process into the design stage produced high-efficiency results with over 23% in weight reduction when compared with conventional structural optimization techniques.

Keywords: offshore wind turbine; direct-drive electrical generator; integrated structural optimization; generative design; additive manufacturing

1. Introduction

Energy demand has been drastically increasing on a global scale and to accomplish a sustainable future, the development of renewable energy systems is necessary [\[1\]](#page-21-0). To tackle climate change on a large scale, it needs to be acknowledged that our global economic system is mainly based on fossil fuels, more specifically, oil for all the transportation sector, and coal and gas for electricity generation. However, while fossil fuels become scarcer, the method used to obtain these resources turns more extreme and aggressive with our ecosystem. In today's technology, we can find the right tools and techniques to develop a more sustainable energy landscape [\[2\]](#page-21-1). The research of innovative optimization strategies and the implementation of new technologies for renewable energy systems is crucial for sustainable development. Wind energy is considered one of the most efficient and cost-effective renewable energy sources, with offshore wind farm projects increasing in recent years due to their vast energy density and

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reliability [\[3,](#page-21-2)4]. The implementation of direct-drive generator structures for offshore applications is common for producing more efficient systems, preventing the use of a gearbox, reducing the weight of the structure, and decreasing failure rates. In open sea locations, the simplification of the system is an important factor to account for considering the harsh environmental conditions and inaccessibility [\[5\]](#page-21-4). The costs of development of offshore wind turbine farms are high and the optimization of these projects at an early stage is of significant interest to developers and manufacturers [\[6\]](#page-21-5). New and more innovative optimization approaches for offshore wind turbine projects are in high demand to overcome the challenges involved in the design of the different components integrating these systems $[7–11]$ $[7–11]$ and the current supply chain issues.

in recent years due to their vast energy density and reliability [3,4]. The implementation

1.1. Direct-Drive Wind Turbine Generators 1.1. Direct-Drive Wind Turbine Generators

Large direct-drive generators are rotational electrical machines operating under high Large direct-drive generators are rotational electrical machines operating under high electromagnetic and gravitational loads. In Figure [1,](#page-1-0) we can observe a representation of electromagnetic and gravitational loads. In Figure 1, we can observe a representation of a a direct-drive, wind turbine, electrical machine configuration with different components direct-drive, wind turbine, electrical machine configuration with different components forming the design. forming the design.

Figure 1. Representation of a direct-drive, wind turbine generator system [12]. **Figure 1.** Representation of a direct-drive, wind turbine generator system [\[12\]](#page-21-8).

Direct-drive generators are AC synchronous electrical machines and can be excited Direct-drive generators are AC synchronous electrical machines and can be excited electrically or through permanent magnets. These types of generators are classified de-electrically or through permanent magnets. These types of generators are classified depending on the direction of the magnetic flux crossing between the rotor and the stator pending on the direction of the magnetic flux crossing between the rotor and the stator structure; the three different configurations are axial flux, transverse flux, and radial flux, structure; the three different configurations are axial flux, transverse flux, and radial flux, with the former configuration representing the most popular choice for offshore wind turbine generators [1[3,14](#page-21-9)[\]. D](#page-21-10)irect-drive generator structures work under high torques while rotating at low speed, and this requires high levels of structural stiffness to keep the deformation below the established limits of 10% through the air gap length "*z*" between the rotor and stator of the generator $[12]$.

The main loads generated upon a direct-drive generator structure under working The main loads generated upon a direct-drive generator structure under working conditions are represented in Figur[e 2](#page-2-0). Maxwell stress "*q*", or normal stress, is the electro-conditions are represented in Figure 2. Maxwell stress "*q*", or normal stress, is the electromagnetic force generated in the direction of the magnetic flux across the air gap between magnetic force generated in the direction of the magnetic flux across the air gap between the rotor and the stator, having a typical value of 200–400 kPa for these electrical machines. the rotor and the stator, having a typical value of 200–400 kPa for these electrical machines. Shear stress "*σ*" is the force generated perpendicular to the magnetic flux, having a value Shear stress "*σ*" is the force generated perpendicular to the magnetic flux, having a value of 25–50 kPa. The third main load to consider for the structural analysis of direct-drive of 25–50 kPa. The third main load to consider for the structural analysis of direct-drive generators is the gravitational load [13]. generators is the gravitational load [\[13\]](#page-21-9).

Figure 2. Representation of support structure for a permanent magnet direct-drive generator with working loads; (a) Section view of the air gap; (b) Shear stress " σ "; (c) Maxwell stress "q" (normal stress) [\[13\]](#page-21-9). stress) [13].

Direct-drive generator structures are large components typically made of steel, which account for over 60% of the overall mass of the system, opening the door to ambitious optimizations through high-performance structural analysis strategies. These specific requirements and the harsh operational conditions constitute a great challenge to the structural design of these machine[s \[12](#page-21-8)]. Different support structures for direct-drive generators have been explored through the implementation of simple topologies (discs, cones, and arms) designed to be manufactured commonly in cast iron [15]. The representation of a review of conventional structures can be observed in Figure 3. Advanced optimization have been explored through the implementation of simple topologies (discs, cones, and arms) designed to be manufactured commonly in cast ir[on \[](#page-21-11)15]. The representation of a review of conventional structures can be observed complex multi-objective structural challenges of direct-drive generators and have been implemented to discover nonconventional structural configurations $[16,17]$ $[16,17]$.

Figure 3. Review of different support structures of permanent magnet direct-drive generators based on conventional topologies [\[15\]](#page-21-11); (a) Rotor with internal support arms; (b) Stator with rib stiffeners; (c) Rotor with internal disk support; (d) Rotor with conical support; (e) Stator/rotor with double disk support; (f) Rotor with internal spokes; (g) Stator with spider support arms; (h) Stator/rotor with tension rods. tension rods.

1.2. Additive Manufacturing 1.2. Additive Manufacturing 1.2. Additive Manufacturing

New optimization methods allow engineers to explore nonconventional topologies and, with the development of innovative manufacturing techniques, for the fabrication of these novel topologies to become a reality in the form of high-performance and lightweight structures.

weight structures. Additive manufacturing is a general term used to describe a fabrication process, which generates, layer-by-layer, a physical object from model data [\[18\]](#page-22-1). Additive manufacturing is capable of generating highly efficient, complex parts, that are otherwise unfeasible to for capacite of generating raging emerging complex parts) that are enterwise ameasible to obtain by conventional manufacturing methods. This process of manufacturing consists of adding material through the process of building up a three-dimensional model directly from computer-aided design software, in opposition to conventional manufacturing, which focuses on subtracting techniques [\[19\]](#page-22-2). New progress in additive manufacturing technologies allows the production of nonconventional structural configurations. The recent development of metal additive manufacturing has experienced significant growth, driving innovation in design optimization techniques across different high-profile sectors, such as the aerospace industry, the automotive industry, and the energy sector [\[20\]](#page-22-3). In Figure [4,](#page-3-0) we can observe the result of the implementation of additive manufacturing processes for different high-performance components. Complex designs can be achieved through additive manufacturing methods coupled with advanced optimization strategies linked to algorithmic methods, such as generative design, to efficiently redistribute the mass of the part, which improves mechanical, thermal, and dynamic performance [\[16\]](#page-21-12).

Laser powder bed fusion (L-PBF) is one of the most popular metal additive manufacturing processes, characterized by a high level of precision and short lead times with a minimum feature size of 0.2 mm and large building volume, with new commercial machines achieving just under 1 $m³$ of volume. The laser powder bed fusion process uses powerful lasers, with some commercial machines having up to 12 lasers of 1000 W each [21], powerful lasers, with some commercial machines having up to 12 lasers of 1000 W e[ach](#page-22-4) to melt layers of metal powder and using materials such as steel alloys, aluminum alloys, and nickel and iron super[allo](#page-22-5)ys [22].

Figure 4. Implementation of additive manufacturing approaches for the development of high-efficiency components over diverse disciplines [\[22\]](#page-22-5); (**a**) Prototype rocket nozzle featuring internal cooling channels; ing channels; (**b**) F1 heat exchanger; (**c**) Hyperganic prototype rocket nozzle featuring internal cool-(**b**) F1 heat exchanger; (**c**) Hyperganic prototype rocket nozzle featuring internal cooling channels and an external lattice; (**d**) Liquid hydrogen and liquid oxygen turbopumps by NASA.

Understanding the additive manufacturing process is fundamental to achieving the Understanding the additive manufacturing process is fundamental to achieving the full potential of this new technology. Acknowledging the energy efficiency of a manufacturing process is important to assess the energy usage during the full manufacturing process. To evaluate additive manufacturing processes in comparison to conventional subtracting processes, it is necessary to establish different parameters, such as production costs or environmental impact $[23]$. In Table [1,](#page-4-0) the energy consumption for each stage of a selective laser melting process is described for the production of a single part and for the production of a batch of 12 parts [\[24\]](#page-22-7). In Figure [5,](#page-4-1) an example of energy efficiency assessment has been addressed with a visualization of the energy consumption percentages for a metal additive manufacturing process using selective laser melting (SLM) technology and AlSi10Mg as

printing material. Figure [5](#page-4-1) shows the importance of the build volume optimization during an SLM process on the energy efficiency of the production of the printed part, with a 55.64% total energy consumption reduction per part when producing a batch of 12 parts against a single part production.

Table 1. Energy consumption through the different stages of an SLM process for a single part and a batch of 12 parts of aluminum [\[24\]](#page-22-7).

Recycling/sieving to filter large A1 particles

Figure 5. Energy consumption percentage through the different stages of an SLM process for a single the different stages of an SLM process for a single part and a batch of 12 parts of aluminum [24]. part and a batch of 12 parts of aluminum [\[24\]](#page-22-7).

a structural optimization strategy in order to improve the efficiency of the production and a batch of particular of the process is essential. Integrating additive manufacturing constraints the sustainability of the process is essential. Integrating additive manufacturing constraints into structural optimization strategies allows the development of more efficient, sustain-
allegend fit for managements of management of management of more dilinear managements that **Single Part Batch (12 Parts)** able, and fit-for-purpose processes. Simulation-driven design for additive manufacturing and, more precisely, selective laser melting processes, such as laser powder bed fusion (L-PBF), represents a breakthrough in the fields of design optimization for metal 3D print-The consideration of a design for an additive manufacturing (DfAM) approach during

ing components. L-PBF possess multiple advantages in comparison with conventional manufacturing methods for structural optimization methods of highly efficient metal components. Some benefits of L-PBF applied to optimization processes are a decrease in lead times, waste material reduction, design flexibility, and on-demand production, with great performance on lightweight applications. The recent development of L-PBF commercial machines allows the comparison of metal additive manufacturing against conventional manufacturing techniques and highlights the advantages of using this process [\[25](#page-22-8)[,26\]](#page-22-9). SLM commercial machines such as the NXG XII 600 present a step further toward metal additive manufacturing mass production and incrementing the number of lasers up to 12 to achieve a process 20 times faster in comparison with other SLM machines. This new technology development has been addressed in several academic and industrial investigations across different fields in the last few years [\[27\]](#page-22-10).

In [\[24\]](#page-22-7), the energy efficiency of the additive manufacturing process is discussed, where manufacturing parameters such as additional support structure could increase energy efficiency by over 45% and bulk part production optimization pushing the energy efficiency even further. Optimization strategies focusing on metal additive manufacturing at a design stage could revolutionize the industry, drastically reducing material waste, energy consumption, and production costs [\[28\]](#page-22-11). The implementation of additive manufacturing constraints over design optimization strategies has a direct impact on the manufacturing stage and the overall sustainability of the production [\[29\]](#page-22-12).

Additive manufacturing has been applied for the structural optimization of directdrive generators in [\[30,](#page-22-13)[31\]](#page-22-14), where triply periodic minimal surfaces were employed for the generation of the lattice topology using evolutionary algorithms, and mass reduction of the generator structure was observed.

1.3. Potential Applications: Multirotor Wind Turbines

The power rate and scale of the systems within traditional horizontal axis wind turbines have been substantially increased recently. Some of the most important logistical challenges of these large wind turbines are those associated with large-scale blades of over 100 m long and structural components, such as the big steel structures of direct-drive generators [\[32\]](#page-22-15). The multirotor configuration demonstrates an improvement in efficiency and a reduction in overall loads, although it introduces a larger number of moving parts in the system [\[33\]](#page-22-16). The multirotor wind turbine concept offers an alternative to increasing the power output of the machine by combining multiple rotors into a single wind turbine. This configuration has been assessed to be 80% of the cost of an equivalent power rate single rotor wind turbine and over 8% higher on power output than a single rotor with an equivalent swept area. The major advantage of this configuration is the standardization offering a modular design in which the systems could be upscaled or adapted to the environmental conditions of the location, with standardized components being easily replaceable [\[34\]](#page-22-17). Due to the advantages presented by the multirotor wind turbine system, new companies such as Myriad Wind Energy Systems [\[35\]](#page-22-18), as well as established multinationals, such as Vestas [\[33\]](#page-22-16), are adopting this unconventional wind turbine configuration. Figure [6](#page-6-0) shows a multirotor wind turbine built and tested by Vestas as part of the review performed for future emerging technologies in the wind power sector [\[33\]](#page-22-16).

Figure 6. Vestas multirotor wind turbine technology [33]. **Figure 6.** Vestas multirotor wind turbine technology [\[33\]](#page-22-16).

A small generator structure implemented on the Vestas multirotor wind turbine A small generator structure implemented on the Vestas multirotor wind turbine opens the door to alternative and innovative manufacturing processes, such as additive manufacturing, as part of a modular, efficient, and more sustainable wind turbine configuration. In [36,37], steel structures and structures made with composite materials are explored for direct-drive generators. The 100-kW generator considered in this study is based on the electrical machine exp[lore](#page-22-19)d in [36] and possesses a rotor diameter of 0.5 m with a cylinder width of 150 mm. The challenges associated with the design of the support structure of a permanent magnet direct-drive electrical generator (PMDD) require the careful assessment of the design parameters in order to develop an efficient structural optimization strategy. The high torques generated in these electrical machines demand a great level of structural stiffness. The parameters of a 3-MW and a 100-kW PMDD electrical generator are described in Table 2, following the co[nsid](#page-21-12)[er](#page-22-0)[ati](#page-22-19)[ons](#page-22-20) in $[16,17,36,37]$.

big enough to manufacture the generator structure of these wind turbine rotors as one single part 3-Me example of a large envelope mean additive manufacturing matrix is the sent
NGX XII 600, with a building envelope of 600 \times 600 \times 600 mm [\[21\]](#page-22-4). The 3-MW generator support structure, with a 2-m rotor diameter, represents a challenge to be manufactured by current commercial additive manufacturing methods due to its size. A modular design with a design for an additive manufacturing approach holds great potential for future research on 3-MW generators. New commercial metal additive manufacturing machines integrate building envelopes part. One example of a large-envelope metal additive manufacturing machine is the SLM

Table 2. Wind turbine generator parameters [\[16,](#page-21-12)[17](#page-22-0)[,36–](#page-22-19)[38\]](#page-22-21).

1.4. Structural Optimization Strategy 1.4. Structural Optimization Strategy

An integrated structural optimization strategy consists of a large set of design analysis data involving the selected structure and its environmental conditions [\[17\]](#page-22-0). Performing a complex three-dimensional structural optimization requires an advanced stress package
end in a modelling piece of software, such as the one used in this study, ANSYSS embedded in a modelling piece of software, such as the one used in this study, ANSYS
Workhamb 2022. Structural optimization is a combination of multiple mathematical algo-Workbench 2022. Structural optimization is a combination of multiple mathematical algo-
rithms representing different aspects of the design specifications, optimization objectives rithms representing different aspects of the design specifications, optimization objectives, dynamic behavior, boundary conditions, or manufacturing constraints [39]. dynamic behavior, boundary conditions, or manufacturing constraints [\[39\]](#page-22-22). \mathcal{A} integrated structural optimization structural optimization strategy consists of a large set of design analysis data involving the selected structure and its environmental conditions [17]. Performing

In a structural optimization process, the initial optimization volume represents the range of volume in which the software performs the optimization study. Depending on the range of volume in which the software performs the optimization study. Depending on the software or the parameters, this volume can be described, or the software can determine it software or the parameters, this volume can be described, or the software can determine it automatically. The initial optimization volume range is represented in Figure [7.](#page-7-1)

Figure 7. Structural optimization volume range representation, where "Ω_{mat}" denotes the volume of \rightarrow the material, "Ω" and "Ω₀" are the different optimization volume domains, " *f*_{mag}" represents the magnetic loads, and "*Γ*mag" is the surface where the magnetic loads are applied [39]. magnetic loads, and "Γmag" is the surface where the magnetic loads are applied [\[39\]](#page-22-22).

On a structural optimization strategy for a direct-drive generator structure, maintain-On a structural optimization strategy for a direct-drive generator structure, maintaining the air gap deformation is crucial. Therefore, the primary criteria for the structural indicates in the structural optimization strategy, as in [\[17\]](#page-22-0), is determined by the limit of deformation through the air $\frac{1}{2}$ gap between the rotor and the stator. In Equation (1), we can see a strain-based function used in structural optimization, where "Ω*mat*" represents the volume of the material, "*ε*" used in structural optimization, where "Ω*mat*" represents the volume of the material, "*ε*" represents the strain, "*u*" is the displacement, and "*σ*" is the density [39]. represents the strain, "*u*" is the displacement, and "*σ*" is the density [\[39\]](#page-22-22). gap between the rotor and the stator. In Equation (1), we can see a strain-based function

$$
\min \int\limits_{\Omega_{mat}} \varepsilon \left(\vec{u}\right)^T \sigma \left(\vec{u}\right) d\Omega_{mat} \tag{1}
$$

The considerations of structural vibrations of a rotational machine are fundamental for the optimization strategy. A modal analysis needs to be performed and integrated into the optimization strategy in order to identify and modify the natural frequencies of the structure and avoid the effect of resonance. Vibrations on rotating machinery need to be minimized to avoid fatigue, noise generation, and ultimately catastrophic system failure [\[17\]](#page-22-0). The major excitation frequencies to consider for a direct-drive wind turbine generator are the turbine rotation speed "1P", the electrical frequency "f_e", and the frequencies generated by the rotor blades "*3P*" and "*6P*" [\[38\]](#page-22-21). *Machines* **2024**, *12*, x FOR PEER REVIEW 9 of 23

A complex three-dimensional model requires the assessment of a modal analysis, in which the natural frequencies of the structure are identified and compared against the excitation frequencies of the system. The method used by the modal analysis to identify the frequency modes affecting the dynamic behavior of the structure is known as the effective mass participation factor (EMPF), in which the mass participation for a specific direction can be determined for each natural frequency mode of the structure. A frequency mode is identified as dangerous when over 1% of the participation mass is contributing within the operational range of the wind turbine [17]. A modal analysis is integrated as part of the advanced structural optimization strategy to optimize the structure, avoiding dangerous frequency modes [40]. \blacksquare

An example of the algorithm used in the modal analysis can be seen in Equation (2), where " η_r " is the generalized mass of mode r , " Ω_{mat} " represents the volume of the material, " φ_r " is the load participation factor of mode r, " f_{mag} " is the spatial distribution of the displacement and magnetic force, " ω_r " is the frequency of mode r, and " ω_{ext} " is the **harmonic excitation frequency [\[39\]](#page-22-22).** *ω*

$$
\eta_r = \frac{\int_{mat} \vec{\varphi}_r \cdot \vec{f}_{mag} d\Omega_{mat}}{\omega_r^2 - \omega_{ext}^2}
$$
(2)

Introducing additive manufacturing constraints into the structural optimization strat-Introducing additive manufacturing constraints into the structural optimization egy is fundamental to achieving an optimal result model. The implementation of design for additive manufacturing (DfAM) practices is essential to incorporating this new manufacturing knowledge into advanced structural optimization techniques for high-efficiency results [\[41\]](#page-22-24). [In](#page-8-0) Figure 8, different additive manufacturing tests, such as design guidance, can be observed.

Figure 8. Design for additive manufacturing (DfAM) examples: (**a**) additive manufacturing feature **Figure 8.** Design for additive manufacturing (DfAM) examples: (**a**) additive manufacturing feature testing batch, such as design guidance [\[20\]](#page-22-3); (b) additive manufacturing overhang quality exam-[42]. ples [\[42\]](#page-22-25).

Manufacturing constraints such as overhang angle are essential to produce efficient Manufacturing constraints such as overhang angle are essential to produce efficient result models while performing structural optimization techniques for additive manufacturing applications. The overhang angle constraint represents the minimum angle

to accomplish the design performance required, obtaining the minimum surface finish intended or avoiding part failure. In Figure [8b](#page-8-0), we can observe the results at various overhang angle values. Considering design for additive manufacturing while developing a structural optimization strategy centered on the use of generative design techniques is structural optimization strategy centered on the use of generative design techniques is an an efficient approach that can lead to the generation of complicated designs. An example of the design for additive manufacturing is shown in Figure 9, where the consideration of the design for additive manufacturing is shown in Figure [9,](#page-9-0) where the consideration of additive manufacturing constraints generates a self-supported structure, avoiding the need additive manufacturing constraints generates a self-supported structure, avoiding the for additional supporting structure and reducing waste material, production costs, and manufacturing time. and manufacturing time.

Figure 9. Design for additive manufacture example: (a) nonself-supported structure; (b) self-supported structure [\[42\]](#page-22-25).

Adding all the previously mentioned functions and constraints into an advanced, Adding all the previously mentioned functions and constraints into an advanced, multi-objective, structural optimization strategy produced an adaptable and efficient multi-objective, structural optimization strategy produced an adaptable and efficient method of analysis. Nonetheless, the complexity of the optimization strategy is proportional to the computing cost needed and needs to be considered through the iteration process [\[42\]](#page-22-25).

An integrated structural optimization strategy has been developed based on the studies [\[16](#page-21-12)[,17\]](#page-22-0) for a 100-kW permanent magnet direct-drive, wind turbine generator struc-ture [\[36\]](#page-22-19). A generative design process has been used, combining a static structural analysis and the structural analysis and the static structural analysis and the structural analysis and the structural analysis and the st and a modal analysis using the commercial software packages ANSYS for the structural optical software packages ANSYS for the structural mization process and Fusion 360 for the additive manufacturing process simulation. optimization process and Fusion 360 for the additive manufacturing process simulation.

The process starts by determining the electrical generator design parameters and $\frac{1}{100}$ specifications, the considerations for the diverse optimization volume ranges for the different approaches, and the integrated structural optimization strategy, including the static structural optimization strategy, including the static structural analyses, the modal analyses, and the design and manufacturing constraints as structural analyses, the modal analyses, and the design and manufacturing constraints as part of the iterative generative design stage.

part of the iterative generative design stage. A workflow of the structural optimization strategy developed in this study has been A workflow of the structural optimization structural optimization structural optimization structural optimization structural optimization strategy developed in this study has been controlled in this study and α represented in Figure [10,](#page-10-0) where we can see the different steps followed during the process.
The structural optimization strategy consists of The structural optimization strategy consists of: The structural optimization strategy consists of:

- 1. The initial specification parameters of the direct-drive generator structure to be optimized.
- 1. The initial specification parameters of the direct-drive generator structure to be optimized.
2. The consideration of the different initial optimization volume ranges for the diverse zne eeneme
- ². The design and manufacturing constraints strategy as objectives for the structural optimization process.
- 4. The development of the iterative generative design process integrating static structural analyses and modal analyses.
- 5. The evaluation of the results obtained from finite element analysis techniques and a metal additive manufacturing process simulation study. $\frac{1}{\sqrt{2}}$

Figure 10. Structural optimization strategy workflow diagram. **Figure 10.** Structural optimization strategy workflow diagram.

The aim of this study is to develop an advanced structural optimization strategy based on the methodology produced in the investigations presented in [\[16,](#page-21-12)[17\]](#page-22-0), making use of generative design techniques that consider static structural and modal analyses and include a design for the additive manufacturing approach.

This novel design and manufacturing structural optimization strategy represents a zero-waste approach that integrates not only the optimization of the structures but also the zero-waste approach that integrates not only the optimization of the structures but also optimization of the intended manufacturing process, virtually reducing the material waste the optimization of the intended manufacturing process, virtually reducing the material to zero and significantly reducing the energy and water usage during fabrication. The to zero and significantly reducing the energy and water usage during fabrication. The integrated consideration of the latest developments in technology, both for computational The integrated consideration of the latest developments in technology, both for computa-structural optimization and manufacturing techniques, is a novel approach for complex $\frac{1}{\sqrt{1-\frac{1$ engineering applications, such as the design of the support structures of permanent magnet direct drive algorithms. direct-drive electrical generators. This novel design and manufacturing structural optimization strategy represents a

2. Methodology

The integrated structural optimization strategy with generative design techniques developed in the studies [\[16](#page-21-12)[,17\]](#page-22-0) produced efficient results for the application of multi-MW permanent magnet direct-drive wind turbine generators. Nevertheless, due to the large scale of offshore wind turbine generator structures, the additive manufacturing process was unfeasible to implement with commercial metal additive manufacturing machines. The most organic-like topologies produced by the generative design process were avoided by controlling different design parameters of the process, such as the cyclic symmetry, to generate a more standard outcome adapted for conventional manufacturing processes such as casting. Based on the potential of multirotor wind turbine concepts and the use of smaller generator structures in these systems, suitable for the building envelope of commercial metal additive manufacturing machines, a 100-kW permanent magnet direct-drive generator structure was chosen for this study [33]. A comparison between a 3-MW and a 100-kW direct-drive generator structure is performed in [36], where a 100-kW generator with a rotor diameter of 0.5 m and a cylinder width of 150 mm was assessed. The deformation limit calculated for this structure across the air gap between the rotor and $\frac{1}{100}$ stator was 0.208 mm.

The approach chosen for this study is founded on the knowledge acquired in the The approach chosen for this study is founded on the knowledge acquired in the previous studies [\[16](#page-21-12)[,17\]](#page-22-0), where the initial optimization volume range would be varied previous studies [16,17], where the initial optimization volume range would be varied from a wider volume to a pre-optimized volume, with the intention of giving flexibility to from a wider volume to a pre-optimized volume, with the intention of giving flexibility to the generative design process to produce more adaptative topologies. The material used the generative design process to produce more adaptative topologies. The material used for this study is Inconel 625. This material is widely used in aerospace, chemical, and for this study is Inconel 625. This material is widely used in aerospace, chemical, and mamarine industries, demonstrating good mechanical properties for harsh environmental conditions [\[43\]](#page-23-0). Inconel 625 owns an excellent combination of yield, creep, and fatigue strength, with good frictional wear and corrosion resistance, which makes it ideal for marine systems applications. Inconel alloys also have printable and weldable suitable characteristics for selective laser melting (SLM) additive manufacturing processes [\[44\]](#page-23-1). The mechanical properties of the material are excellent for the optimization of the generator mechanical properties of the material are excellent for the optimization of the generator support structure and the additive manufacturing process, with a Young's modulus "*E*" of support structure and the additive manufacturing process, with a Young's modulus "*E*" 2.07 GPa, a density "*σ*" of 8440 kg/m³ , and a Poisson's ratio "*ν*" of 0.278–0.312. of 2.07 GPa, a density "*σ*" of 8440 kg/m3, and a Poisson's ratio "*ν*" of 0.278–0.312.

The integrated structural optimization strategy was developed using the finite element analysis package of ANSYS Workbench 2022, adapting the mesh analysis to each of the initial optimization volume ranges with local mesh control applied to the fixed support surface and a mesh analysis method of hexahedron elements. A single fixed support is used in the structural optimization strategy on the generator shaft axis, and the three loads considered for the static structural analysis (normal stress, shear stress, and gravitational load) are applied following th[e p](#page-21-12)[roc](#page-22-0)ess utilized in [$16,17$].

A representation of the mesh analysis and boundary conditions can be observed in A representation of the mesh analysis and boundary conditions can be observed in Figure [11.](#page-11-0) The parameters selected for the iterative process were set with a limit of 100 iterations and a convergence rate of 0.1%, obtaining computational times of 60 to 560 min throughout the different simulations. As part of the multi-objective optimization, a displacement limit across the air gap between the rotor and stator structures of the generator was set as a primary criterion with a value of 0.208 mm. Moreover, cyclic symmetry was set as was set as a primary criterion with a value of 0.208 mm. Moreover, cyclic symmetry was a design constraint due to the impact of mass distribution on inertia for rotating machinery. The cyclic symmetry is a crucial design parameter for the structural optimization strategy as an uneven distribution of mass on rotating machines could produce a system malfunction through vibration reducing the lifespan and provoking structural failure [\[40\]](#page-22-23). In [\[17\]](#page-22-0), the manufacturing constraint of cyclic symmetry was explored as a variable for the structural optimization strategy. The impact on the dynamic behavior and mass reduction for the generated topologies was assessed using this method. Based on the knowledge acquired in $[16,17]$ $[16,17]$ a cyclic symmetry of 12 sectors was assumed for this study.

Figure 11. Structural optimization strategy with a solid cylinder as initial optimization volume **Figure 11.** Structural optimization strategy with a solid cylinder as initial optimization volume range: range: (**a**) structural optimization strategy with a solid cylinder with loads and bou[nda](#page-21-12)ry conditions (**a**) structural optimization strategy with a solid cylinder with loads and boundary conditions [16]; [16]; (**b**) structural optimization strategy with a solid cylinder mesh analysis [16]. (**b**) structural optimization strategy with a solid cylinder mesh analysis [\[16\]](#page-21-12).

The simulation studies have been performed on a standard workstation HP Z2 Intel $^{\circledR}$ $\rm Core^{TM}$ i7-9700K (12 MB Cache, 3.6 GHz) with 64 GB of memory RAM, and the methodology has been adapted to the capabilities of the system with the aim of optimizing computational times. In Table [3,](#page-12-0) the general parameters for the structural optimization strategy are described. strategy are described.

Table 3. Structural optimization strategy parameters.

The first analysis was developed using a solid cylinder structure as an initial optimization volume range, allowing the generative design process more flexibility but decreasing computational efficiency considerably. Figu[re 1](#page-11-0)1 represents the structural loads with boundary conditions (a) and mesh analysis (b). boundary conditions (a) and mesh analysis (b).

Due to large computational times and low-efficient optimization results, the initial Due to large computational times and low-efficient optimization results, the initial optimization volume range was modified. In Figure 12[, th](#page-12-1)e representation of different initial optimization volume ranges is described. itial optimization volume ranges is described.

Figure 12. Initial optimization volume ranges for the structural optimization strategy using generative design techniques: (a) parabolic cylinder initial optimization volume range; (b) pre-optimized disk disk initial optimization volume range; (**c**) pre-optimized cone initial optimization volume range. initial optimization volume range; (**c**) pre-optimized cone initial optimization volume range.

In order to evaluate the manufacturability of the generated models produced by the structural optimization strategy, an additive manufacturing process simulation was performed with a virtual machine in Fusion 360. The additive manufacturing virtual machine selected for the evaluation of the results was the commercial metal additive manufacturing laser powder bed fusion (L-PBF) machine SLM NGX XII 600 due to its high performance and large build envelope. The specifications of the metal additive manufacturing virtual machine and its setup are given in Table 4. As mentione[d,](#page-13-0) the SLM NGX XII 600 is a laser powder bed fusion (L-PBF) commercial machine with high-power multi-laser technology. With a quick production time of a build-up rate of 1000 cm/h and its large volume build envelope available, it represents a revolution in metal additive manufacturing [\[21\]](#page-22-4).

Table 4. Metal additive manufacturing virtual machine SLM NGX XII 600 configurations.

3. Discussion of Results

3.1. First Approach: Solid Cylinder as Initial Volume Range s.i. i irsi zipproach. sona Cynr

The results of the first approach of the structural optimization strategy with a solid cylinder as the initial optimization volume range can be seen in Figure 13 , where the iterative optimization process (c.1–c.4) and the resulting model of the generative design (b) can be observed. The wide initial volume of the optimization strategy produced a time-consuming iterative process.

Figure 13. Structural optimization strategy with solid cylinder: (a) structural optimization strategy with solid cylinder mesh analysis [\[16\]](#page-21-12); (b) generative design solid cylinder result model; (c.1) initial stage of the generative design process; (**c.2**) early stage of development of the generative design stage of the generative design process; (**c.2**) early stage of development of the generative design process; (c.3) later stage of development of the generative design process; (c.4) generative design process of solid cylinder final stage. process of solid cylinder final stage.

In Table [5,](#page-14-0) the details for the iterative process are described, where it can be observed that the computational time exceeded 9 h of simulation. This is due to the large percentage of mass to reduce, starting with an original mass of 208.62 kg for the solid cylinder as the
. reation volume lange and generating a topology with a man mas representing a mass reduction in relation to the original mass of 90.86%. initial optimization volume range and generating a topology with a final mass of 19.06 kg,

Table 5. Structural optimization strategy with a solid cylinder.

The results observed in Figure 13 and Table 5, represent the structural optimization The results observed in Figur[e 13](#page-13-1) and Tabl[e 5](#page-14-0), represent the structural optimization strategy with a solid cylinder as the initial optimization volume range. This method generates a high percentage of mass reduction, producing a fully functional support structure erates a high percentage of mass reduction, producing a fully functional support structure throughout an automated iterative process. The automation of the process and the inte-throughout an automated iterative process. The automation of the process and the integration of multiple optimization objectives and design constraints represent an advantage gration of multiple optimization objectives and design constraints represent an advantage against more time-consuming conventional parametric optimization strategies. However, against more time-consuming conventional parametric optimization strategies. However, as demonstrated in previous investigations [\[16](#page-21-12)[,17\]](#page-22-0), the preoptimization of the initial opti-as demonstrated in previous investigations [16,17], the preoptimization of the initial optimization volume range proved to achieve more efficient results on the optimization of the mization volume range proved to achieve more efficient results on the optimization of the support structure of the PMDD generator. support structure of the PMDD generator.

The additive manufacturing constraint of the overhang angle was suppressed, as the The additive manufacturing constraint of the overhang angle was suppressed, as the simulation process with this manufacturing constraint actively produced a nonconvergence result for this first approach. The nonconvergence result when implementing the additive manufacturing overhang constraint can be seen in Figure 14 , with a topological resemblance to the pre-optimized conical structure study in [\[16\]](#page-21-12).

Figure 14. Generative design solid cylinder with an overhang additive manufacturing constraint **Figure 14.** Generative design solid cylinder with an overhang additive manufacturing constraint with a nonconvergence result model. with a nonconvergence result model.

3.2. Second Approach: Pre-optimized Solid Cylinder as Initial Volume Range 3.2. Second Approach: Pre-optimized Solid Cylinder as Initial Volume Range

The second approach was developed with an initial optimization volume range of a The second approach was developed with an initial optimization volume range of a pre-optimized solid cylinder. The iterative process of the structural optimization strategy pre-optimized solid cylinder. The iterative process of the structural optimization strategy can be seen in Figur[e 15](#page-15-0), where one can observe the resulting model of the generative can be seen in Figure 15, where one can observe the resulting model of the generative design process (b) and the iterative generative design optimization process (c). The struc-design process (b) and the iterative generative design optimization process (c). The structural optimization strategy produced a very organic-like structure, and how the structure tural optimization strategy produced a very organic-like structure, and how the structure grows throughout the iterative generative design process to comply with the requirements established can be observed.

In Table [6,](#page-15-1) the details of the generative design iterative process are described. It can be seen that, even though the initial optimization volume range has decreased, the computational time still exceeds 9 h of simulation. The starting mass of the pre-optimized solid cylinder structure was 83.50 kg, and the final generated topology mass was 15.05 kg, i.e., 81.98% mass reduction in comparison with the original mass.

Figure 15. Structural optimization strategy with pre-optimized solid cylinder; (a) Structural optimization strategy with pre-optimized solid cylinder mesh analysis; (b) Generative design pre-optimized solid cylinder result model; (c.1) Generative design process of pre-optimized solid cylinder initial stage; (c.2) Generative design process 5th iteration; (c.3) Generative design process 10th iteration; $(c.4)$ Generative design process 15th iteration; $(c.5)$ Generative design process 25th iteration; $(c.6)$ Generative (**c.6**) Generative design process 35th iteration; (**c.7**) Generative design process 55th iteration; (**c.8**) erative design process 35th iteration; (c.7) Generative design process 55th iteration; (c.8) Generative design process 76th iteration (Final iteration).

Table 6. Structural optimization strategy with pre-optimized solid cylinder.

3.3. Third Approach: Pre-Optimized Disk as Initial Volume Range

In the third approach, a pre-optimized disk has been used as the initial optimization volume range based on the results obtained in the previous study [\[16,](#page-21-12)[17\]](#page-22-0). The use of prewas observed to generate more efficient results for the structural optimization strategy on the processes developed in [16,17]. The results of the iterative process of the structural optimization strategy can be seen in Figure 16, including the generative design iterative process (a) and the combined objective convergence diagram (b). The details of the process are described in Table 7, where one can see the mesh information and the computational process, achieving a simulation of under an hour of computational time with a number of 52 iterations and a final mass of 2.57 kg, representing a mass reduction of 21.27%. optimized structures, including the disk structure, for the initial optimization volume range

Figure 16. Structural optimization process with pre-optimized disk as initial volume range; (**a.1**) **Figure 16.** Structural optimization process with pre-optimized disk as initial volume range; (**a.1**) Initial stage; (a.2) 15th iteration; (a.3) 35th iteration; (a.4) 52nd iteration (final iteration); (b) Combined objective convergence.

Table 7. Structural optimization strategy with pre-optimized disk. **Table 7.** Structural optimization strategy with pre-optimized disk.

an initial optimization volume range due to the dynamic performance and mass reduction 3.4. Fourth Approach: Pre-Optimized Cone as Initial Volume Range

In the fourth and last approach, a pre-optimized conical structure has been used as an initial optimization volume range due to the dynamic performance and mass reduction of this type of topology based on the results obtained in the previous study [\[16\]](#page-21-12), where conical and disk support structures are explored. The use of pre-optimized structures, including the conical structure, for the initial optimization volume range was observed to generate more efficient results for the structural optimization strategy on the process developed in [\[16\]](#page-21-12). The iterative process of the structural optimization strategy can be seen in Figure [17.](#page-17-0) The details of the process, such as the mesh information, are described in Table [8.](#page-17-1) The optimization process accounts for just under an hour and a half of computational time with 60 iterations and a final mass of 2.84 kg, representing a mass reduction of 22.50%.

Figure 17. Structural optimization strategy with pre-optimized cone as initial volume range; (a.1) Initial stage; (a.2) 24th iteration; (a.3) 48th iteration; (a.4) 60nd iteration (final iteration); (b) Combined objective convergence.

Table 8. Structural optimization strategy with pre-optimized cone. **Table 8.** Structural optimization strategy with pre-optimized cone.

tial optimization volume range, as seen in the previous studies [16,17]. The results ob-*3.5. Analysis Validation*

tained from the pre-optimized disk and cone structures have been evaluated using a finite The most promising results were obtained from the pre-optimized structures as initial and a metal additional and a metal and a optimization volume range, as seen in the previous studies $[16,17]$ $[16,17]$. The results obtained In Figure 18, we can observe the graphical representation of the finite element analy-from the pre-optimized disk and cone structures have been evaluated using a finite elements analysis technique with ANSYS Workbench 2022 and a metal additive manufacturing manufacturing process simulation with Fusion 360.

process simulation with a usion soo.
In Figure [18,](#page-18-0) we can observe the graphical representation of the finite element anal-In Tigure 10, we can be serve the graphical representation of the finite element that ysis static structural results for the GD disk and GD cone-generated topologies for total deformation and total von Mises stress under working load and boundary conditions.

In Table [9,](#page-19-0) it can be observed that the deformation across the air gap between the rotor and the stator structures is kept under the limit of 0.208 mm (10% of the air gap length *final the states is a technics is neptrimated the mander of 0.200 mm (1876 of the air gap reagalities*) and the von-mises stress under the safety factor of 200MPa for both of the disk and cone pre-optimized structures [\[16,](#page-21-12)[36\]](#page-22-19). The GD pre-optimized disk result achieved a final mass of 2.57 kg with a total deformation of 0.15 mm and a value for the von Mises stress of 139.07 MPa; however, the frequency mode 3 of the generated structure with 17.07 Hz interfered with the operational range of the wind turbine generator. The GD pre-optimized cone result achieved a final mass of 2.84 kg with a total deformation of 0.201 mm and a value for the von Mises stress of 171.88 MPa. The dynamic behavior of the natural frequencies of the generated cone structure was found to be safe under working conditions, with modes 17 and 18 at 349.3 Hz, far away from the excitation frequencies for the operational range of the wind turbine generator.

Figure 18. Structural optimization results; (a) GD Disk result with deformation limit 0.15 mm (a.1) and von-Mises stress 139.07 MPa (**a.2**); GD Cone result with deformation limit 0.201 mm (**b.1**) and and von-Mises stress 139.07 MPa (**a.2**); GD Cone result with deformation limit 0.201 mm (**b.1**) and von-Mises stress 171.88 MPa (**b.2**). von-Mises stress 171.88 MPa (**b.2**).

The metal additive manufacturing process simulation with the virtual machine SLM NGX XII 600 has been performed with the results generated from the pre-optimized disk and the pre-optimized cone using the software Fusion 360.

> In Figure [19,](#page-19-1) the simulation for the metal additive manufacturing process is presented for the GD results of the pre-optimized disk structure (a), and the pre-optimized cone $structure(b).$

Initial Model	GD Optimization	Mass	Static Structural	Modal Analysis
Pre-optimized disk	52 iterations Convergence: 0.1% Time: $53 \text{ m } 4 \text{ s}$	Original: 3.26 kg Final: 2.57 kg Mass reduction: 21.27%	Total deformation: 0.15 mm von-Mises: 139.07 MPa	Mode 3: 17.07 Hz Mode 12: 169.5 Hz
Pre-optimized cone	60 iterations Convergence: 0.1% Time: $1 h 25 m$	Original: 3.67 kg Final: 2.84 kg Mass reduction: 22.50%	Total deformation: 0.201 mm von-Mises: 171.88 MPa	Mode 17: 349.3 Hz Mode 18: 349.3 Hz

Table 9. Results for the structural optimization strategy with pre-optimized disk and cone.

sented for the GD results of the pre-optimized disk structure (a), and the pre-optimized

Figure 19. Additive manufacturing process simulation results: (**a.1**) GD disk AM simulation initial **Figure 19.** Additive manufacturing process simulation results: (**a.1**) GD disk AM simulation initial **Figure** layers of support structure; (a.2) GD disk AM simulation first disk section layers over support structure; (**a.3**) GD disk AM simulation disk section layers; (**a.4**) GD disk AM simulation last layers; (a.5) GD disk result model AM simulation with support structure; (b.1) GD cone AM simulation initial layers without support structure; (b.2) GD cone AM simulation first self-supported conical section layers; (b.3) GD cone AM simulation first section layers of optimized volume; (b.4) GD cone AM simulation last layers of optimized volume; (b.5) GD cone result model AM simulation In Table 10, the details of the additive manufacturing process simulation \mathcal{L} self-supported.

In Table 10, the details of the results of the additive manufacturing process simulation with the virtual machine SLM NGX XII 600 are described. It can be observed that the with the virtual machine SLM NGX XII 600 are described. It can be observed that the
implementation of design for additive manufacturing approaches, such as overhangs and support structure considerations with design and manufacturing constraints as an integrated part of the structural optimization process, can achieve more efficient results.

The additive manufacturing process of the GD disk structure has a printing process time of over 16 h and 210.141 cm³ of waste material as a support structure. This is an example of the lack of compliance by the design for additive manufacturing constraint of overhang angle. As we can see in the additive manufacturing process simulation for the optimized disk structure in Figure [19b](#page-19-1), an extra support structure needs to be created (represented in blue) during the manufacturing process to support the generated disk topology as it surpasses the limit of the overhang angle of 35 degrees.

In comparison, the GD cone structure has a printing process of under 9 h and does not require extra material as the support structure due to its self-supported performance.

GD cone

SLM NXG XII 600 Self-supported structure: yes Layer count: 937 8:40:29
Material: Inconel 625 Support volume: 0.000 cm³ Height: 150.880 mm Support volume: 0.000 cm^3 Height: 150.880 mm

Table 10. Results for the additive manufacturing process simulation with pre-optimized disk and cone.

3.6. Discussion

Build spot size: 160 μm Support type: n/a

The implementation of additive manufacturing considerations as part of the structural optimization strategy of direct-drive generator structures using generative design techniques has been demonstrated to produce highly efficient and adaptative results. Additionally, metal additive manufacturing has rapidly developed in recent years, particularly laser powder bed fusion (L-PBF) [\[42\]](#page-22-25). New commercial metal additive manufacturing L-PBF machines possess high production capabilities and can gain efficiency over conventional subtracting manufacturing processes if adequate manufacturing parameters are considered during optimization processes [\[21\]](#page-22-4).

We can observe that the development of an integrated structural optimization strategy generates efficient fit-for-purpose structures when integrating relevant design parameters. As seen in [\[16\]](#page-21-12), the use of a pre-optimized initial optimization volume range performed more efficiently in order to achieve a reduction in structural mass when compared with a wider initial optimization volume range, with an additional reduction in computational processing time. The topology characteristics of the conical structure represent a higher efficiency for an additive manufacturing process due to the unnecessary use of extra support material, resulting in a self-supported structure with minimal production time and material waste [\[42\]](#page-22-25). On top of that, conical structures achieve higher dynamic performance against excitation frequencies of direct-drive electrical generators.

An integrated structural optimization process requires full control and understanding of all aspects affecting the integrity of the structure to obtain efficient results, including the manufacturing process parameters affecting the mechanical and thermophysical properties of the final manufactured component. Increasing the understanding of metal additive manufacturing processes and the relevant parameters will boost mechanical design optimization strategies. Integrating additive manufacturing as a crucial element in optimization processes and the research of material parameters and quality assessment on additive manufacturing processes will enhance the capabilities of structural optimization techniques [\[22\]](#page-22-5).

4. Conclusions

In this study, the integration of additive manufacturing as part of the structural optimization strategy with generative design techniques for direct-drive generator structures has been demonstrated to be a revolutionary and cost-effective method to produce highly efficient results. The flexibility of an integrated optimization process allows the development of an adaptative process to fit the application required. An optimized, lightweight structure has been generated, integrating not only the working condition loads and dynamic frequencies of the structure but also the manufacturing constraints tailored for our application. Controlling high-adaptative optimization strategies such as generative design techniques with an adequate understanding of additive manufacturing processes represents a revolution in structural optimization methods for direct-drive generator structures. Exploring these new integrated optimization techniques could provide a breakthrough in sustainable outcomes, not only in the efficiency of the final optimized components but also in the sustainability of the manufacturing process used.

Recent advances in metal additive manufacturing technologies represent an improvement in cost-effectiveness compared with conventional manufacturing subtractive processes for small-volume production, showing a great future prospect for the field of structural optimization strategies for high-performance topologies. However, a better understanding of design for additive manufacturing approaches is needed as it represents a complete reversal in thinking in comparison to conventional manufacturing processes, as most mechanical design optimization techniques are based on subtracting knowledge.

The integrated structural optimization strategy with generative design techniques and additive manufacturing constraints produced a fit-for-purposed result with a weight reduction of over 22% in comparison with conventional structural optimization techniques, while improving the dynamic behavior of the structure against the excitation frequencies of the generator and maximizing the sustainability of the manufacturing process.

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