

PERFORMANCE CHARACTERIZATION AND PARAMETRIC ANALYSIS OF WIND TURBINE ENERGY CONVERSION

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ABSTRACT

This paper presents a comprehensive examination of the role of converters in enhancing wind energy conversion efficiency. The paper investigates recent advances in converter technology, focusing on their operations, topologies, applications, and the challenges faced in the field. It emphasizes the importance of control systems in optimizing wind energy systems and discusses the main features and related applications of these technologies. Additionally, the review provides recommendations for future improvements in wind energy converters to ensure sustainability and efficiency in wind energy systems. Therefore, this work aims to contribute to the advancement of wind energy technologies by highlighting critical areas for research and development.

Keywords: Wind Energy Conversion, Power Coefficient (C_p), Rotor Diameter (R), Air Density, Power Curve Analysis, Efficiency Evaluation Techniques

1. INTRODUCTION

Wind energy has emerged as a crucial component in the global transition towards sustainable energy systems, offering numerous benefits that underscore its importance. As a clean and renewable resource, wind power contributes significantly to reducing greenhouse gas emissions and environmental pollution [1]. It enhances energy security by reducing dependence on fossil fuel imports and provides economic benefits through job creation and local development. The increasing cost-competitiveness and scalability of wind energy make it an attractive option for diverse geographical and energy demand contexts. Given its growing significance, there is a pressing need for comprehensive performance characterization and parametric analysis of wind turbine energy conversion systems [2]. These studies aim to optimize energy production, improve turbine design, and enhance overall system efficiency. By understanding how various environmental and design parameters affect turbine performance, researchers and engineers can develop more effective wind energy systems. The objectives of such analyses include maximizing annual energy production, refining turbine components, understanding environmental impacts, enhancing modeling accuracy, supporting data-driven decision-making, advancing control strategies, and reducing the overall cost of energy [3,4]. Through these efforts, performance characterization and parametric analysis play a crucial role in improving the efficiency, reliability, and economic viability of wind energy systems, thereby furthering their role in the global energy landscape and contributing to a more sustainable future [5-7].

2. THEORETICAL BACKGROUND

2.1 Wind turbine power equation

The power output of a wind turbine is given by the equation [8]:

$$P = \frac{1}{2} \rho A v^3 \quad (1)$$

Where:

P is the power output in watts

ρ is the air density in kg/m^3 (typically 1.225 kg/m^3 at sea level)

A is the swept area of the rotor blades in m^2

C_p is the power coefficient

V is the wind velocity in m/s

2.2 Power coefficient and Betz limit

The power coefficient (C_p) expresses the fraction of wind power extracted by the turbine. It is a function of the tip speed ratio and blade pitch angle. The theoretical maximum C_p , known as the Betz limit, is 0.593 or 59.3%. Modern wind turbines typically achieve C_p values between 0.25 and 0.45 in normal operating conditions.

$$C_p = \frac{P_t}{P} \quad (2)$$

Where: P_t = turbine power (W)

2.3 Tip speed ratio

The tip speed ratio (λ) is the ratio between the tangential speed of the blade tip and the actual wind speed. It is calculated as:

$$\lambda = \frac{\omega \cdot R}{V} \quad (3)$$

Where:

ω is the angular velocity of the rotor in radians/second

R is the rotor radius in meters

V is the wind speed in m/s

The optimal tip speed ratio varies with blade design and typically ranges from 6 to 8 for modern three-bladed turbines. Maintaining the optimal tip speed ratio is crucial for maximizing the power coefficient and overall turbine efficiency across different wind speeds [9].

3. PERFORMANCES CHARACTERIZATION METHODS

Wind turbine performance characterization involves several key methods that provide comprehensive insights into turbine efficiency and energy production. Power curve analysis, a fundamental technique, examines the relationship between wind speed and power output. This method employs various approaches such as the binning method, curve fitting techniques, and advanced segmentation modeling to accurately represent turbine performance across different wind speeds. Annual energy production (AEP) estimation is another crucial aspect of performance characterization, utilizing methods ranging from simplified formulas based on mean annual wind speed to more sophisticated approaches involving SCADA data analysis and Weibull distribution modeling. These techniques help assess turbine performance and wind farm viability under various environmental conditions. Efficiency evaluation techniques form the third pillar of performance characterization, encompassing power coefficient analysis, productive efficiency metrics, wake effect assessments, and Computational Fluid Dynamics (CFD) simulations and genetic algorithm. These methods allow for a detailed examination of turbine efficiency, considering factors such as the theoretical maximum power output (Betz limit), performance across the entire wind spectrum, and the impact of wind farm layout on individual turbine performance. By combining these diverse methods, researchers and engineers can gain a comprehensive understanding of wind turbine performance, enabling optimization of design, operation, and wind farm planning to maximize energy production and overall system efficiency [10].

4. PARAMETRIC ANALYSIS

4.1 Influence of rotor diameter

The rotor diameter significantly impacts wind turbine performance. As the rotor diameter increases, the swept area grows quadratically, leading to a substantial increase in power output. For instance, doubling the rotor diameter can potentially increase power output by a factor of four. However, larger rotors also increase structural loads and manufacturing costs, necessitating a balance between performance gains and practical constraints [11]

4.2 Effect of air density variations

Air density variations have a notable impact on wind turbine performance. Power output is directly proportional to air density, as shown in the wind turbine power equation. Seasonal and daily fluctuations in air density can lead to significant changes in energy production:

- In some locations, air density variations can cause up to 7% change in instantaneous power generation compared to average conditions
- Temperature changes affect air density, with colder air being denser and resulting in higher power output. For example, a 6 MW turbine can produce 131 MWh more energy in winter than estimated using average air density
- Altitude also influences air density, with higher elevations having lower air density and reduced power output.

4.3 Impact of wind speed distribution

Wind speed distribution is crucial for turbine performance and energy production estimation:

- Power output has a cubic relationship with wind speed, making accurate wind speed assessment critical.
- The Weibull distribution is commonly used to model wind speed probability, allowing for more precise annual energy production estimates
- Cut-in, rated, and cut-out wind speeds define the operational range of a turbine, directly affecting its performance across various wind conditions.

4.4 Role of turbine height

Turbine height plays a significant role in performance [3,11]:

- Hub heights for utility-scale land-based wind turbines have increased by 83% since 1998-1999, reaching an average of 103.4 meters in 2023
- Taller towers access stronger and less turbulent winds due to reduced surface friction, a phenomenon known as wind shear
- Increased hub height can lead to substantial improvements in energy capture, especially in areas with high wind shear.
- Offshore wind turbines are projected to reach even greater heights, with average hub heights expected to increase from 100 meters in 2016 to about 150 meters by 2035

These parametric factors collectively influence wind turbine performance, highlighting the importance of comprehensive analysis and optimization in wind turbine design and siting.

4.5 CASE STUDIES

Table 1 provides a clear overview of the key specifications and features of the Northwind 100C wind turbine, highlighting its suitability for various applications in medium wind regimes [12,13].

Table 1. Summary of the characteristics of the Northwind 100C wind turbine

Characteristic	Details
Model	Northwind 100C (NPS 100C-24)
Rated Power Output	95 kW
Rotor Diameter	24.4 meters
Swept Area	467.6 m ²
Number of Blades	3
Cut-in Wind Speed	3.0 m/s
Rated Wind Speed	12.0 m/s
Cut-out Wind Speed	25.0 m/s
Survival Wind Speed	52.5 m/s
Generator Type	Synchronous permanent magnet
Voltage Output	400 V
Frequency	50 Hz
Hub Height Options	22 m, 29 m, or 37 m
Applications	Farms, businesses, schools, remote locations

The figure 1 depicts the power curve of the Northwind 100C, a 95-kW wind turbine. This graph illustrates the relationship between wind speed and power output, providing crucial information about the turbine's performance characteristics. The curve begins at the cut-in speed of approximately 3 m/s, which is the minimum wind speed at which the turbine starts generating electricity. As wind speed increases, the power output rises rapidly, following a roughly cubic relationship. The turbine reaches its rated power of 95 kW at around 15 m/s, known as the rated wind speed. Beyond this point, the power output remains relatively constant until it reaches the cut-out speed of 25 m/s, at which point the turbine shuts down for safety reasons. The Northwind 100C features a rotor diameter of about 21-24 meters, which contributes to its ability to capture wind energy effectively. It utilizes a direct-drive permanent magnet synchronous generator, eliminating the need for a gearbox and potentially improving reliability. The turbine is typically mounted on a tower with a hub height of around 37 meters, although this can vary depending on the specific installation site. This power curve is essential for predicting the turbine's energy production at different wind speeds and is a key tool for wind farm planners and operators in assessing the potential performance of the Northwind 100C in various wind conditions.

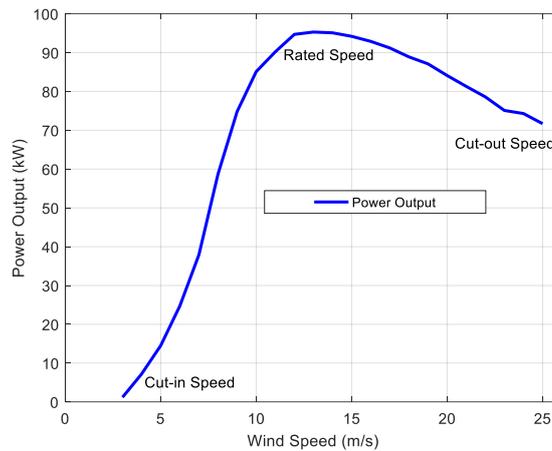


Figure 1. Wind Turbine Power Curve

The variation of power output with these parameters can be studied individually and in pairs using a Genetic Algorithm (GA). Table 2 summarizing typical values for the GA operators used in this optimization.

Table 2. Summary typical values for the GA operators

GA Parameter	Typical Value
Mutation probability (Pm)	0.03
Crossover probability (Pc)	0.7
Population size	200
Number of iterations	1000
Selection method	Tournament
Crossover type	Two-point crossover
Mutation type	Gaussian mutation

4.6 Mono-Objective Optimization

Study of Power as a Function of Each Parameter: C_p , R, and Density In this section, we focus on mono-objective optimization to analyze the power output of wind turbines as a function of individual parameters: the power coefficient (C_p), rotor diameter (R), and air density. The optimization process aims to maximize the annual energy production (AEP) by adjusting one parameter at a time while keeping the others constant. For instance, varying C_p involves optimizing blade design and pitch angles to enhance aerodynamic efficiency. Similarly, increasing the rotor diameter expands the swept area, leading to greater power capture from the wind. Air density variations, influenced by temperature and altitude, also impact power output; thus, understanding these relationships is critical for turbine performance. The results from this mono-objective optimization can reveal how each parameter independently affects turbine efficiency and energy production, providing valuable insights for turbine design and operational strategies.

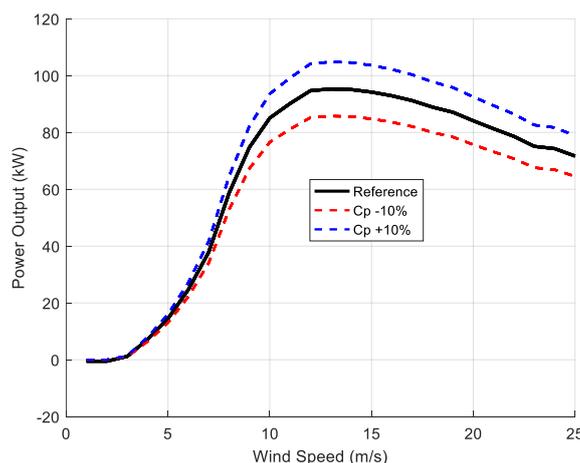


Figure 2. Impact of Power Coefficient Variation

Figure 2 illustrates the impact of variations in the power coefficient (C_p) on the performance of a wind turbine. The power coefficient is a crucial parameter that indicates how effectively a wind turbine converts the kinetic energy of the wind into mechanical energy, defined as the ratio of the actual power output of the turbine to the power available in the wind. The graph typically presents a curve showing how C_p varies with wind speed. As wind speed increases, the power coefficient changes, reflecting the turbine's efficiency at different operational conditions. Key points of interest in this figure include the cut-in speed, which is the minimum wind speed (usually around 3 m/s) at which the turbine begins to generate electricity; below this speed, the power output remains zero. The rated wind speed, typically around 15 m/s, is where the turbine reaches its rated power output and where C_p is maximized, indicating optimal efficiency in converting wind energy into electrical energy. Above a certain wind speed, typically around 25 m/s, known as the cut-out speed, the turbine will shut down to prevent damage from excessive wind forces, resulting in a significant decrease in C_p during this phase. The graph highlights a non-linear relationship between wind speed and power output; for instance, an increase in wind speed from 5 m/s to 10 m/s can lead to nearly a tenfold increase in power output due to the cubic relationship between wind speed and available wind energy. Additionally, Figure 1 may illustrate how C_p varies across different types of turbines or under varying environmental conditions, emphasizing that different designs and configurations can lead to significant differences in performance. It may also reference Betz's law, which states that no turbine can capture more than 59.3% of the kinetic energy in the wind (the theoretical maximum C_p), providing context for observed values of C_p . Therefore, this figure serves as a vital tool for engineers and researchers in assessing how changes in wind conditions affect turbine performance and for making informed decisions regarding turbine selection and site placement to maximize energy production from wind resources.

Figure 3 illustrates the impact of rotor diameter variation on the performance of wind turbines. The rotor diameter is a critical factor in determining a turbine's ability to capture wind energy, as it directly influences the swept area through which the turbine blades move. A larger rotor diameter allows the turbine to sweep a greater area, thereby capturing more wind and generating more electricity. The graph typically presents a curve that shows how power output varies with rotor diameter across different wind speeds. As the rotor diameter increases, the power output generally rises, reflecting the enhanced capacity of larger rotors to harness available wind energy. This relationship is particularly significant at lower wind speeds, where larger rotors can capture more energy and improve overall turbine efficiency. Key points in this figure include the comparison of power output for turbines with varying rotor diameters, highlighting that turbines with larger rotors can operate effectively in areas with lower average wind speeds. This capability expands the potential locations for wind farm development, making renewable energy generation more accessible in diverse geographical regions. The figure may also reference specific examples of modern wind turbines that feature significantly larger rotor diameters compared to older models. For instance, recent advancements have seen rotor diameters exceeding 133.8 meters (approximately 438 feet), which is substantially larger than those used in earlier designs. This growth trend reflects an industry-wide shift towards maximizing energy capture and improving capacity factors. Additionally, Figure 2 may discuss the implications of rotor diameter on turbine design and operational efficiency, emphasizing that while larger rotors can enhance performance, they also pose challenges related to transportation and installation due to their size. Therefore, this figure serves as a crucial resource for understanding how rotor diameter variations impact wind turbine performance and energy production capabilities.

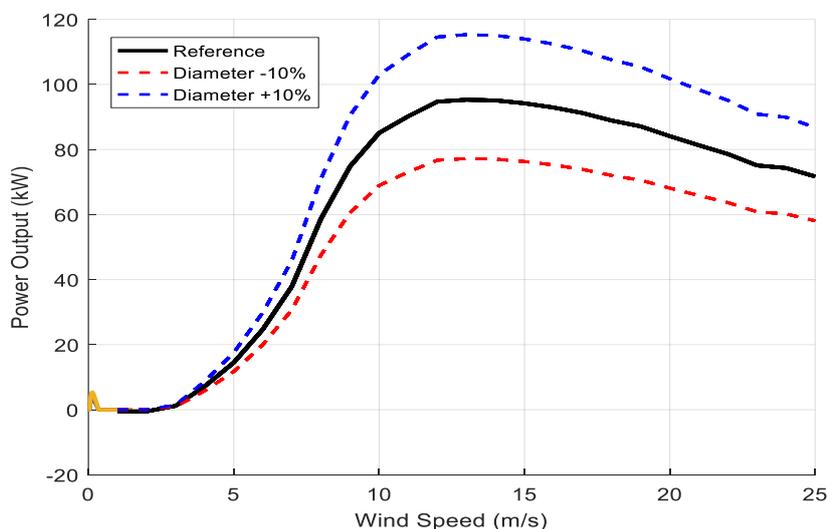


Figure 3. Impact of Rotor Diameter Variation

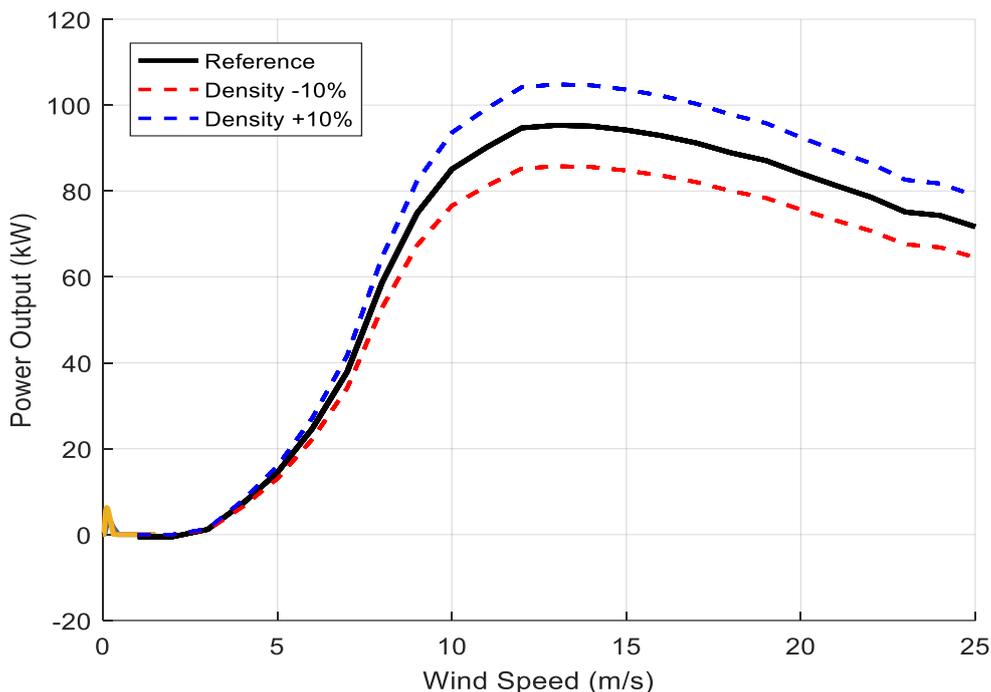


Figure 4. Impact of Air Density Variation

Figure 4 illustrates the impact of air density variation on the performance of wind turbines, emphasizing how changes in air density can significantly influence energy production. Air density is a critical factor in wind energy generation, as it directly affects the amount of power available in the wind. The power produced by a wind turbine is proportional to the air density, the area swept by the turbine blades, and the cube of the wind speed, as described by the formula given by equation (1).

In this context, Figure 3 typically presents data showing how variations in air density, which can occur due to changes in temperature and atmospheric pressure, affect the power output of wind turbines. As air density increases—often associated with lower temperatures or higher pressures—the available power also increases. This relationship highlights the importance of considering local atmospheric conditions when estimating energy production from wind farms. The figure may showcase different scenarios or case studies where air density measurements were taken at various altitudes and temperatures. For instance, it might illustrate how turbines operating at higher altitudes experience lower air densities, leading to reduced power output compared to those at sea level.

This effect can be particularly pronounced in mountainous regions where fluctuations in temperature and pressure are more significant. Additionally, Figure 3 could emphasize that neglecting to account for air density variations can lead to substantial inaccuracies in energy production estimates. Studies have shown that failing to incorporate these variations can result in energy production estimates that deviate by as much as 15% or more over extended periods. Therefore, accurately measuring and modeling air density is essential for optimizing turbine performance and ensuring reliable energy forecasts. Then, this figure serves as a vital resource for understanding how air density variations impact wind turbine efficiency and energy production capabilities. It underscores the necessity for wind farm developers and operators to consider local atmospheric conditions when planning and operating wind energy projects.

4.7 Bi-Objective Optimization

Study of Power as a Function of Two Parameters Among C_p , R, and Density This section explores bi-objective optimization, where we analyze the power output of wind turbines based on combinations of two parameters at a time— C_p , rotor diameter (R), and air density. By examining pairs such as C_p and R or C_p and density, we can identify trade-offs and synergies that influence turbine performance. For example, optimizing both C_p and R simultaneously can lead to enhanced energy production while balancing structural integrity and cost considerations. Similarly, analyzing C_p in conjunction with air density allows for a better understanding of how environmental conditions affect turbine efficiency. This approach utilizes multi-objective optimization techniques to find Pareto-optimal solutions that maximize power output while minimizing costs or other constraints. The findings from these studies provide a comprehensive view of how interdependencies between parameters can be leveraged to improve wind turbine designs and operational efficiencies in various environmental contexts.

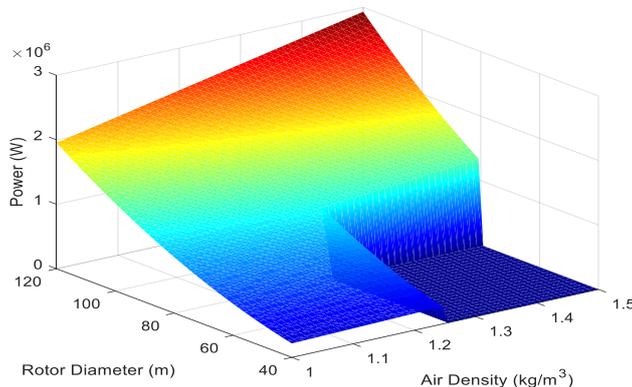


Figure 5. Wind Turbine Power as a Function of R and Density

Figure 5 illustrates the relationship between wind turbine power output, rotor diameter (R), and air density. The L-shaped surface demonstrates that power output increases quadratically with rotor diameter and linearly with air density. The effect of rotor diameter on power generation is more pronounced than that of air density. The color gradient, transitioning from cool blues to warm reds, visually represents the increase in power output as both variables increase.

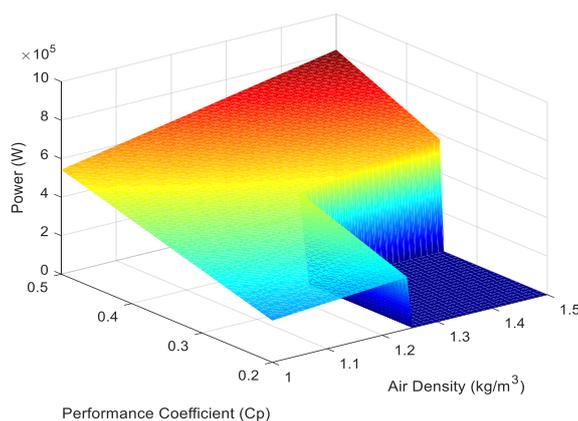


Figure 6. Wind Turbine Power as a Function of Cp and Density

Figure 6 displays the relationship between wind turbine power output, power coefficient (Cp), and air density. The L-shaped surface reveals that power output increases linearly with both Cp and air density. It's important to note that Cp has an upper limit known as the Betz limit (0.593), which is not shown but implied in the graph. The color gradient from cool to warm hues visually emphasizes the multiplicative effect of Cp and air density on power output.

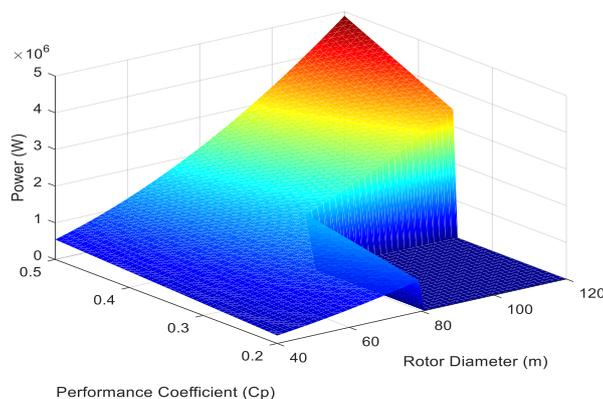


Figure 7. Wind Turbine Power as a Function of Cp and R

Figure 7 depicts the relationship between wind turbine power output, power coefficient (Cp), and rotor diameter (R). The L-shaped surface illustrates that power output increases quadratically with rotor diameter and linearly with Cp. The graph clearly shows that the impact of rotor diameter on power output is more significant than that of Cp. The color gradient, transitioning from cool blues for lower power outputs to warm reds for higher outputs, provides a visual representation of how power increases as both Cp and rotor diameter increase.

5. CONCLUSION

In conclusion, the performance characterization and parametric analysis of wind turbine energy conversion are essential for optimizing the efficiency and reliability of wind energy systems. Through a comprehensive understanding of key parameters such as the power coefficient (C_p), rotor diameter (R), and air density, we can significantly enhance turbine performance and energy production. Theoretical foundations, including the wind turbine power equation and the Betz limit, provide a framework for evaluating turbine efficiency, while advanced techniques such as power curve analysis, annual energy production estimation, and efficiency evaluation methods offer practical insights into turbine operation. The parametric analysis highlights the influence of various factors on wind turbine performance, emphasizing the importance of rotor diameter, air density variations, wind speed distribution, and turbine height. Case studies focusing on both mono-objective and bi-objective optimization demonstrate how individual parameters and their combinations can be systematically analyzed to maximize power output while considering trade-offs. As the demand for renewable energy continues to grow, ongoing research and development in wind turbine technology will play a crucial role in enhancing energy conversion efficiency. By leveraging advanced modeling techniques, optimization algorithms, and real-world data analysis, we can further improve wind turbine designs and operational strategies. Therefore, these efforts will contribute to a more sustainable energy future by maximizing the potential of wind energy as a clean and reliable resource.

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