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# Dynamic synthetic inertial control method of wind turbines considering fatigue load

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This paper proposes a dynamic synthetic inertia control method, considering the fatigue loads of the wind turbine. The control objectives include reducing the rate of change of frequency and frequency nadir of the power system and the fatigue load of the shaft and tower of the wind turbine. A frequency regulation model of the power system containing the primary operating dynamics of the wind turbine is established. The dynamic synthetic inertia control method is proposed according to the relationship between fatigue load, wind velocity, and frequency. Case studies are conducted with a wind turbine fatigue load under a synthetic inertia control with different weights for different wind velocities and system loads. Therefore, the dynamic weights are obtained. Comparing the rate of change of frequency and frequency nadir and equivalent damage load, the efficacy of the proposed method is verified.

#### KEYWORDS

wind turbine, frequency regulation, fatigue load, synthetic inertia, power system

### Introduction

In recent years, with the rapid development of renewable energy technology, wind power constitutes an increasing proportion of the power system (Wu et al., 2021a; Shamlou et al., 2021; Huang et al., 2022). However, as the wind turbine (WT) does not contribute to the inertia of the power system, the total equivalent inertia of the power system will become smaller (Mahish and Pradhan, 2019; Wu et al., 2021b; Lin et al., 2022; Wu et al., 2022). Therefore, large-scale grid connection of the WT brings considerable challenges to the frequency stability of the power system (Arani and El-Saadany, 2013; Mohammad et al., 2017). Although the current WT inertia control methods can improve the inertia of the power system (Ma et al., 2021), these methods do not focus on the fatigue load of the WT. Studies show that participating in inertia control will increase the fatigue load of the WT drivetrain (Ye et al., 2015), which will greatly shorten its service life. Therefore, studying the inertia control method of the WT, considering the fatigue load, can not only improve the inertia of the power system but also extend the service life of the WT.

For a long time, researchers have conducted a series of studies on reducing the frequency nadir (FN) and the rate of change of frequency (ROCOF) of the power system

based on the introduction of inertial control (Mandal and Chatterjee, 2021) (Xu et al., 2019). In order to get rid of the inherent adverse effects of the inertial control strategy with constant parameters, Hwang et al. (2016), Pradhan et al. (2018), Wu et al. (2018), and Yang et al. (2020) proposed an inertial control method based on dynamic gain to improve the frequency stability of the system under fixed wind conditions. Sato et al. (2022) designed a novel virtual inertia control strategy based on fuzzy logic controller (FLC) to reduce the FN. Lu et al. (2021) performed a comprehensive analysis of the existing inertia and droop controllers applicable to offshore WT. However, the aforementioned references only consider the stability of frequency of the system itself and completely ignores the fatigue load of the low-speed shaft and tower of the WT that participate in the system frequency adjustment, which will pose a certain threat to the stability of the WT itself.

The fatigue load of the low-speed shaft and tower of WT has significant influence on its service life (Zhao et al., 2017). The fatigue load of the low-speed shaft is particularly sensitive to the change in energy, and the active power reference value of WT with inertia control will frequently change according to the change in system frequency, thus aggravating the fatigue load of the low-speed shaft (Zhang et al., 2020). The study showed the following: 1) both the droop and virtual inertia methods can expose the shaft of a wind generator to forces capable of stimulating its natural resonance frequencies. 2) The mechanical resonance in a frequency-regulating wind generator should be studied as a part of the integrated power system dynamics. The time-domain simulation results verified the analytical results and discussion (Arani and Mohamed, 2016).

In addition, studies have pointed out that the instantaneous torque response may stimulate the tower of WT, resulting in tower resonance (Attya and Dominguez-Garcia, 2018). It can be seen from the aforementioned analysis that participation in frequency response may lead to the increase in the WT fatigue load. However, there is no inertia control method that considers the WT fatigue load.

It can be seen from the aforementioned analysis that few studies can take into account the ROCOF, FN, and fatigue load simultaneously. Therefore, in this study, the main goal of the control scheme is to minimize these three indicators at the same time. However, since the WT participating in the frequency regulation must frequently change the power reference value to adapt to the frequency change in the power system, it is not easy to reduce the aforementioned three control indicators. Therefore, the following two control results are also acceptable: one is to minimize the ROCOF and FN of the system without affecting the fatigue load; and the other is to minimize the fatigue load without affecting the ROCOF and FN.

Therefore, a WT dynamic synthetic inertia control (DSIC) method, considering fatigue load, is proposed:

- The frequency regulation model is established. The model includes a WT with central operating dynamics, considering shaft torque and tower bending moment.
- 2) The WT fatigue load is analyzed under different turbulent winds and active power reference values.
- 3) The changes in the ROCOF and FN of the system and fatigue load under different inertia gains are analyzed.

Based on the analysis result, the dynamic gain range is determined. By simulating the model and method, the advantages of the proposed DSIC method are verified.

The main contributions are as follows:

The fatigue loads of the WT drivetrain and tower caused by frequency response are analyzed, which can help guide the construction of corresponding methods for WT and frequency control. The DSIC control method is proposed, which can simultaneously reduce the ROCOF and FN of the power system and the fatigue loads of the WT.

### General system description

In this section, the power system and WT models are established, which can be used for the analysis of fatigue load and the establishment of the inertia control method. The research mainly focuses on a doubly fed induction generator (DFIG), so the DFIG is mainly described.

### Electrical power system model

Under normal operation of the power system, the load fluctuates only in a small range. Compared with the dynamic characteristics of voltage and power angle, the dynamic response characteristics of system frequency are relatively slow. Therefore, when studying the long period behavior of the power system frequency under small disturbances (such as primary frequency regulation and secondary frequency regulation), the research on the dynamic characteristics of voltage and power angle is usually ignored. The frequency of the whole power system is considered to be uniform. In order to study the relationship between the frequency change of the power system, the wind turbine inertia, and fatigue load, the model is established as shown in Figure 1. The researched system consists of wind power, hydropower, and thermal power. The selection of the model and parameters refers to Wang et al. (2020). The penetration rates of thermal, hydropower, and wind power are 60%, 20%, and 20%, respectively. Both thermal power and hydropower use power reserves to participate in the primary frequency regulation and secondary frequency regulation of the power system.

The main parameters of the power system are shown in Table 1. The main parameters of the wind turbine are shown in Table 2.



### TABLE 1 Parameters for the frequency regulation model.

Parameter	Name	Value (p.u.)
R <sub>H1</sub>	Speed droop for the hydropower model	0.05
$R_{T1}$	Speed droop for the thermal plant model	0.05
H <sub>1</sub>	Equivalent inertia constant	5.994
$D_1$	Equivalent damping factor of the loads	1
B <sub>1</sub>	Bias factor	0.425
$K_{T1}$	Integral controller for the thermal model	3
K <sub>H1</sub>	Integral controller for the hydropower model	3

### TABLE 2 Main parameters of the wind turbine.

Parameter	Name	Value
J <sub>r</sub>	Rotor inertia	$3.54 \times 10^7$ (kg m <sup>2</sup> )
Jg	Generator inertia	$5.34 \times 10^2 \text{ (kg m}^2\text{)}$
$\eta_{\rm g}$	Gear box ratio	97
$ au_{\mathrm{f}}$	Filter time constant of $\boldsymbol{\omega}_g$	10
$\omega_{g-rated}$	Generator rated speed	122.91 (rad/s)
В	Main shaft viscous friction coefficient	6.22 × 10 <sup>6</sup> (Nm s/rad)
ρ	Air density	1.22 (kg/m <sup>3</sup> )
R <sub>rotor</sub>	Length of the blade	63(m)
τ <sub>g</sub>	Filter time constant of $T_{\rm g_{ref}}$	0.1



### Wind turbine model

Since this research considers the fatigue load of the low-speed shaft torque *Ms* and the tower bending moment *Mt* of the WT, the main dynamics need to be considered when modeling the WT. The WT model used in this paper can be simplified as shown in Figure 2, which is developed by NREL (Jonkman et al., 2009). The main dynamics of the wind turbine are simulated by the FAST (Fatigue, Aerodynamics, Structures, and Turbulence) Code (Jonkman et al., 2005).

The aerodynamic torque  $T_r$  can be expressed by:

$$T_r = \frac{0.5\pi R_{rotor}^2 \rho v^3 C_p}{\omega_r},\tag{1}$$

where  $\rho$  is the air density,  $\nu$  is the wind speed,  $R_{rotor}$  is the length of the blade,  $C_p$  is the power coefficient, and  $\omega_r$  is the rotor speed. The tower thrust force  $F_t$  can be expressed by:

 $F_t = 0.5\pi R_{rotor}^2 \rho v^2 C_t, \qquad (2)$ 

where  $C_t$  is the thrust coefficient.

The tower bending moment  $M_t$  can be calculated by:

$$M_t = H_{tower} \cdot F_t, \tag{3}$$

where  $H_{tower}$  is the tower height.

In order to more accurately describe the dynamics of  $M_s$ , a dual mass model is used. The model can be expressed by:

$$\dot{\omega}_r \approx \frac{1}{J_r} \left( T_r - M_s - B \left( \omega_r - \frac{\omega_g}{\eta_g} \right) \right),\tag{4}$$

$$\dot{\omega}_g \approx \frac{1}{J_g} \left( \frac{1}{\eta_g} \left( M_s + B \left( \omega_r - \frac{\omega_g}{\eta_g} \right) \right) - T_g \right), \tag{5}$$

where  $\omega_g$  is the generator speed, *B* is the main shaft viscous friction coefficient,  $M_s$  is the shaft torque,  $J_r$  is the rotor mass, and  $J_g$  is the generator mass.

The generator model can be expressed by:

$$P_{out} \approx T_{g-ref} \times \omega_g, \tag{6}$$



where  $T_{g\text{-ref}}$  is the generator torque reference value. The maximum power of the generator is 5.3 MW, which can exceed the rated power by 6%.

It should be noted that in this research, the wind power only provides inertia frequency regulation without the power reserve. In addition, because the WT fatigue load is lower than the rated wind speed, this research only focuses on the fatigue load of the wind turbine higher than the rated wind speed.

### Proposed control method of a DFIG

In this section, the fatigue loads caused by inertial response is discussed. First, the changes in the WT fatigue load under different wind speeds and power references are analyzed. The relationship between fatigue load, power reference, and wind velocity is clarified, which makes it clear that the influence of fatigue load can be used for the establishment of DSIC. The corresponding analysis was rarely reported in other research studies, so it is the first time to be analyzed. Then, the fixed-gain inertia control method is introduced. Also, the DSIC method is proposed, considering the wind turbine fatigue load. Finally, a



quantitative index that can evaluate the performance of the control method is proposed.

# Effects of wind velocity and reference power on fatigue load

First, TurbSim is used to generate two wind-velocity curves. The curves are shown in Figure 3. The average wind velocity  $(V_{avg})$  of Wind1 is 17 m/s, and the turbulence intensity  $(I_{tur})$  is 0.11. The  $V_{avg}$  of Wind2 is 15 m/s, and the  $I_{tur}$  is 0.04. The simulation time is 100 s. Since the WT is mainly in the starting stage during the first 15 s, in order to accurately compare the results of different control methods, the fatigue load performance of the WT is mainly studied after 20 s. The dynamic behavior of the WT in a simulated wind field yields time series of loads or stresses. Through post-processing, the fatigue cycles based on the rainflow counting method are derived to evaluate the performance of the proposed scheme (TonyNickDavidErvin,

2011). In addition, the WT fatigue load is evaluated by DEL. DEL is calculated according to Miner's rule. The rule depends on the material properties specified by the slope of the S-N curve (Spudi' c et al., 2011). The DEL calculation is performed using the MCrunch code.

In the case of Wind2, four different reference powers shown in Figure 4 are used for this research.  $P_{ref2}$  has a smaller power change and slower recovery (called small positive changes).  $P_{ref3}$ has a larger power change and faster recovery (called large positive changes). The total energy of these two reference power changes is the same. The change of  $P_{ref4}$  is opposite to  $P_{ref3}$  (called large negative changes).

Figure 5 shows the cumulative rainflow cycle results of the WT shaft torque and tower bending moment under different wind velocities and reference power values. In a relatively stable wind speed, relative to the constant load  $P_{ref1}$ , a variable load will increase the fatigue load of the WT. It can be seen from the results of  $P_{ref2}$  and  $P_{ref3}$  that the cycles of  $P_{ref3}$  with large positive changes are larger than those of  $P_{ref2}$  with small positive changes, which implies that the fatigue load of  $P_{ref2}$  is smaller.

Therefore, under the same stable wind condition, the greater the load fluctuation, the greater the fatigue load of the shaft.

Compared with  $P_{ref3}$  with large positive changes,  $P_{ref4}$  with large negative changes would cause the shaft to have a great fatigue load. The main reason is that the WT controller will increase the pitch angle to release the obtained air kinetic energy after reducing the power reference value. Therefore,  $M_s$  will decrease, but its fluctuation is greater. The change curves of  $M_s$  are shown in Figure 6.

Figure 5 also shows the cumulative rainflow cycle results under Wind1 and  $P_{refl}$ . It can be seen from the figure that under the same power reference value, the fatigue loads of  $M_s$  and  $M_t$ are 200% of those under Wind2. The main reason is that the fluctuation of Wind1 is greater.







Therefore, under the same reference power value, the greater the average wind speed and turbulence, the greater the fatigue load. Therefore, it is necessary to pay more attention to the fatigue loads when the turbulence intensity is higher or wind velocity is increasing.

As shown in Figure 7, two different power reference values are used for testing under Wind1 conditions. Figure 8 shows cumulative rainflow cycle results of the WT shaft and tower under different reference power and wind velocity values. The difference from the case of Wind2 is that when the reference power fluctuates in the reverse direction (decreases first and then increases), the fatigue loads of the shaft and tower of the wind turbine both decrease instead of showing an increase. The reason is that Wind1 also undergoes significant changes. At this moment, the wind velocity falls first and then rises, consistent with the power change trend. If the power reference value increases at this time, it will cause the air kinetic energy to decrease relative to the steady wind speed. Therefore, the WT controller will reduce the pitch angle to obtain more energy, and shaft torque and tower bending moment will increase and fluctuate more.

Therefore, when the changing trend of the reference power is the same as the changing trend of the wind velocity, it is beneficial to reducing the fatigue load of the wind turbine. Some experience is obtained: 1) when the wind velocity decreases, the reference power of the WT should be reduced as much as possible, or the increased power of the WT should be reduced. 2) Similarly, when the wind velocity increases, the reference power should be increased, or the decreased power should be reduced.





# Conventional fixed-gain inertial control of a DFIG

This part mainly describes the fixed-gain inertia control method, as shown in Figure 9. In order to regulate the output of the wind turbine according to the power system frequency, the frequency of the power system must be measured and filtered through a low-pass filter to reject the measurement noise. Since the derivative of frequency is used for calculation, sufficient filtering is required. Differentiation of a noisy signal may lead to large variations in the value of  $\Delta P_{in}$ , which is undesired because it may cause heavy torque pulsations in the WT drivetrain.

The inertial control scheme based on ROCOF and FN loops is used simultaneously in VDV et al. (2016). As shown in Figure 9,  $\Delta P_{ref}$  consists of two terms:  $\Delta P_{droop}$  and  $\Delta P_{in}$ . In the initial stage of the disturbance, the ROCOF loop dominates and is proportional to the frequency change rate. In contrast, the FN loop dominates near the frequency nadir. The FN loop has two functions: 1) to counteract the control effect of MPPT

and 2) to limit the frequency deviation by increasing the WT power output proportional to the frequency deviation. The WT should return to the operating point before the disturbance after the inertial response. Therefore, the period of overproduction during the inertial response period should be followed by a period of underproduction or recovery. To allow recovery of the WT, a high-pass filter, which prevents a contribution of the droop controller in a steady state, is added:

$$\lim_{t \to \infty} \Delta P_{droop}(t) = \lim_{s \to 0} s \frac{T_h s \cdot \Delta f_L}{T_h s + 1} = 0, \tag{7}$$

where  $T_h$  is the time constant of the high-pass filter.

The output of the droop loop  $\Delta P_{droop}$  can be expressed by:

$$\Delta P_{droop} = K_{droop} \Delta f_L \frac{T_h s}{T_h s + 1},\tag{8}$$

where  $K_{droop}$  is the weight coefficient of the FN loop.

The output of the ROCOF loop  $\Delta P_{in}$  can be expressed by:



$$\Delta P_{in} = K_{in} \frac{d\Delta f_L}{dt},\tag{9}$$

where  $K_{in}$  is the weight coefficient of the ROCOF loop.

The loop gain of these schemes is fixed, so a more significant gain can ensure that the FN and ROCOF are reduced. However, it can be known from the analysis of Part 3.1 of this section that more extensive power changes may cause larger fatigue loads. Therefore, it is necessary to change the gains when the frequency regulation method has a more significant impact on the fatigue loads of the WT to minimize the effect of frequency regulation on the fatigue loads.

### The proposed DSIC scheme

This DSIC scheme aims to: 1) reduce the FN and ROCOF; and 2) mitigate the fatigue loads of a DFIG caused by frequency

regulation. This scheme dynamically adjusts the weight based on the wind velocity increase or decrease and the frequency deviation increase or decrease. The main reasons analyzed in Part 3.1 of this section are the following two points:

- The fatigue load experienced by the shaft torque of WT is related to the wind speed and increase or decrease in the reference power change. The reference power of the WT participating in frequency regulation is mainly determined by the change in the power system frequency.
- 2) Under the exact reference power change, the fatigue load of the WT is related to the change in wind velocity and its increase or decrease. When the wind velocity is in the rising phase, the falling reference wind power should be reduced, and the increasing reference power should continue to increase. When the wind velocity decreases, the decreasing value should continue to decrease, and the increasing value should be reduced.

The following equation expresses the increase or decrease in wind velocity:

$$\frac{dV_L}{dt} = \frac{V_L(t) - V_L(t-1)}{\Delta t},\tag{10}$$

where  $V_L$  is the filtered wind speed. The main function of the filter is to eliminate the interference of low-frequency wind fluctuations to judge the increase or decrease in the wind speed.

The increase or decrease in  $\Delta f$  is expressed by:

$$\frac{d\Delta f_L}{dt} = \frac{\Delta f_L(t) - \Delta f_L(t-1)}{\Delta t},$$
(11)

where  $\Delta f_L$  is the filtered frequency deviation.

The weight of K (K is short for  $K_{droop}$  and  $K_{in}$ ) depends on the increase or decrease in frequency deviation and the increase or decrease in wind velocity. Since the fatigue load is related to the speed of the power change, the weight cannot have rapid fluctuations. In this study, K changes every 1s. Moreover, different K values cannot differ too much. Otherwise, it would cause the reference power to change too much and increase the fatigue load experienced by the WT.

# Evaluation method for control scheme performance

This study has three control objectives: FN, ROCOF, and fatigue load. A quantitative analysis of these three goals is needed when comparing controller performance. Since the ROCOF and FN constantly change during the simulation process, equations are needed to quantify. DEL mainly compares the fatigue load.

The quantification of ROCOF is mainly shown in Equation 12. The quantification method is to mainly evaluate the ROCOF integral during the simulation operation cycle to evaluate the ROCOF situation for a period of time.

$$\operatorname{ROCOF} = \int_{0}^{\infty} \left| \frac{\Delta f(t) - \Delta f(t-1)}{\Delta t} \right| dt.$$
(12)

The quantization of FN mainly considers the absolute value of the maximum frequency deviation. Moreover, every time an extreme value occurs, it will be accumulated.

$$FN = \sum_{t=0}^{\infty} \left| \Delta f_{ext}(t) \right|, \tag{13}$$

where  $\Delta f_{ext}$  is the extremum of  $\Delta f$ . Every time an extremum value appears, it will be accumulated once.

The fatigue load of the tower and shaft is evaluated using DEL. Following the fatigue load evaluation method in Zhang et al. (2018), the fatigue loads of the tower and the shaft are combined, and the calculation method of the total DEL is as follows:

$$DEL_{tot} = K_{Ms}DEL_{Ms} + K_{Mt}DEL_{Mt},$$
(14)

where  $DEL_{Ms}$  represents the equivalent damage load of  $M_{ss}$  which is used to evaluate the fatigue load of the shaft.  $DEL_{Mt}$ represents the equivalent damage load of  $M_t$ , which is used to evaluate the fatigue load of the tower.  $K_{Ms}$  and  $K_{Mt}$  are tunable weightings and can be tuned according to the costs and the designed lifetime of the shaft and the tower. In this paper,  $K_{Mt}$  is chosen as 1, and  $K_{Ms}$  is chosen as 2 (Zhang et al., 2016), since the shaft stress is higher than the tower stress when participating in frequency regulation. Since the DEL value of the tower is much larger than the DEL value of the shaft, the DELs of the tower are normalized with base  $5 \times 10^7$ , and the DELs of the shaft are normalized with base  $2 \times 10^6$ . In this way, the DEL values of both series are all transferred to per unit values.

### Case studies

# The effects of the controller parameter change on the system performance with Wind2

In the Wind2 scenario, the system load increases and decreases by 5% p. u. at 35 s. The control objectives are given in the following paragraphs. In the next two sections, we would focus on the influence of control variables on the WT fatigue load.

The ROCOF and FN of the system are shown in Figure 11. The same is that ROCOF and FN decrease with the increase in K, and the decreasing trend is the same. In addition, when the load increases, the decreasing trend of ROCOF and FN becomes insignificant after K increases to a certain level (such as (6, 10), (7, 9), and (8, 8)). This is due to the limitation of the wind power output. In this case, the benefit of continuing to increase K is not obvious to the system.

Figure 12 shows the results of  $DEL_{Ms}$  under this condition. It can be seen from the figure that under stable wind speed, the  $DEL_{Ms}$ increases no matter how the frequency changes. Also, the larger the *K*, the more obvious the increasing trend, and the maximum increase is 16.9% within the weight range. This is because the fatigue load of the shaft under this working condition mainly depends on the reference power fluctuation. The greater the *K*, the greater the fluctuation of the reference power under the same frequency fluctuation, which will cause an increase in the fatigue load.

Figure 13 shows the results of  $DEL_{Mt}$  under this condition.  $DEL_{Mt}$  shows a slight downward trend when the load



ROCOF and FN of the system. (A) ROCOF results under the change in K when the system load increases and decreases by 5% at 35 s. (B) FN results under the change in K when the system load increases and decreases by 5% at 35 s.





increases. When K is changed within the range of 11, the tower DEL is reduced by up to 0.4%.  $DEL_{Mt}$  increases with the increase in  $K_{droop}$  when the load decreases. Also, the more significant the  $K_{droop}$ , the more pronounced the increasing trend. Compared with  $K_{droop}$ ,  $K_{in}$  has less effect on  $DEL_{Mt}$ , which implies that the FN loop has a

more significant impact on tower fatigue than the ROCOF loop. Figure 14 shows the results of DELtot under this condition. Under this working condition, the evaluation result of  $DEL_{tot}$  shows that  $DEL_{tot}$  increases with the increase in K, which implies that the increase in K will increase the total fatigue load of the WT.



FIGURE 14





According to the analysis in this part, *K* should not be too large or too small. If *K* is too large, the fatigue load will increase. If *K* is too small, the frequency regulation performance will be poor. Therefore, the range of *K* is set between 6 and 11 in this research.

# The effects of the controller parameter change on the system performance with Wind1

In Wind1, the system load increases and decreases by 5% at 60.5 s (that is, the load also changes when the wind velocity is

TABLE 3  $DEL_{Ms}$  up to three different times under different  $K_{droop}$  values when the system load increases and decreases by 5%.

Time (s)	$DEL_{Ms}$ for different $K_{droop}$ values		
	0	9	11
62.5	1.328	1.339	1.355
63	1.352	1.342	1.358
63.5	1.423	1.351	1.366



about to change significantly). In the study of this working condition, the changing trend of the ROCOF and FN is the same as in the previous section, so the analysis is not repeated.

After the load decreases at 60.5 s, the frequency will increase to a specific value and decrease. The changing frequency trend will be opposite to the changing trend of wind velocity. At this time,  $DEL_{Ms}$  and  $DEL_{Mt}$  will decrease as K increases. Consistent with the results of the previous analysis, the changing trend of the reference power is the same as the wind speed change trend, reducing the fatigue load. Similarly, there is almost no effect on  $DEL_{Mt}$  by  $K_{in}$  after  $K_{droop}$  reaches a value greater than 8. Furthermore,  $DEL_{Mt}$  will decrease with the increase in  $K_{droop}$ .

Under the same  $K_{droop}$  condition, the changing trend of  $DEL_{Ms}$  increases with the increase in  $K_{in}$ . The reason is that  $K_{in}$  mainly limits the frequency change rate. The increase in  $K_{in}$  will make the power fluctuations become larger, which will cause the fluctuations in Ms to increase the fatigue load. However, in the case of the same  $K_{in}$ ,  $DEL_{Ms}$  decreases first and then increases with the increase in  $K_{droop}$ . Ms under different  $K_{droop}$  values is shown in Figure 15.

Between 60.5 s and 65 s,  $M_s$  increases with the increase in  $K_{droop}$ . However, this does not mean that  $DEL_{Ms}$  increases with the increase in  $K_{droop}$  before 65 s.  $DEL_{Ms}$  up to three different times is shown in Figure 15.



TABLE 4  $K_{droop}$  and  $K_{in}$  weights under different working conditions.

$\frac{d\Delta f_L}{dt}$	$d\Delta V_L/dt$		
	>0	≤0	
>0	$\begin{split} K^1_{droop} &= 8 \\ K^1_{in} &= 11 \end{split}$	$\begin{split} K^2_{droop} &= 11 \\ K^2_{in} &= 9 \end{split}$	
≤0	$K^{3}_{droop} = 8$ $K^{3}_{in} = 7$	$ \begin{aligned} K^4_{droop} &= 9 \\ K^4_{in} &= 7 \end{aligned} $	

It can be seen from Table 3 that only  $DEL_{Ms}$  values of the 0–62.5 s time period increase with the increase in  $K_{droop}$ . It shows that increasing  $K_{droop}$  leads to the increase in  $DEL_{Ms}$  when the load changes within 2 s. When  $K_{droop}$  increases to 9,  $DEL_{Ms}$  increases by 0.83%. However, due to the inertia of the power system and WT, it takes time for changes in the system load to be converted into the output power of WTs. For load changes exceeding 2 s, the fatigue load of  $M_s$  will still decrease first and then increase as  $K_{droop}$  increases. This is because the fluctuation in  $M_s$  will increase with the increase in  $K_{droop}$  after  $K_{droop}$  exceeds a certain value.

As shown in Figure 16 and Figure 17A, when the change trends of wind velocity and frequency are the same, the fatigue load of the shaft and tower will increase with the increase in  $K_{droop}$ . Considering the changing trends of FN and ROCOF,  $K_{droop}$  is selected as 8. Since the fatigue load of the shaft and the tower does not change much when  $K_{in}$  increases,  $K_{in}$  can be increased as much as possible when the wind speed decreases, and  $K_{in}$  is selected as 11. This does not increase the fatigue load. However, when the wind velocity increases, in order to reduce the burden on the shaft and tower,  $K_{in}$  should not be too large, and

 $K_{in}$  is selected as 7 in this case. When the changing trend of wind speed is opposite to the changing trend of frequency,  $K_{in}$  should not be selected too large. So, when the wind speed increases,  $K_{in}$  is selected as 6. When the wind velocity decreases,  $K_{in}$  can be increased appropriately, and  $K_{in}$  is selected as 9. When the frequency increases,  $K_{droop}$  can be increased as much as possible, and  $K_{droop}$  is selected as 11. When the frequency decreases,  $K_{droop}$  is selected as 9. The K weights under different working conditions are shown in Table 4.

### System performance for DSIC under random load fluctuations

In this case, the random system load that changes every 2 s is applied to Wind1 to verify the advantages of the proposed method. In addition, the performances of FN and ROCOF, and DEL under different fixed gains are compared. The choice of fixed gain mainly considers ROCOF, FN, and DEL, so values from 7 to 9 are selected, respectively. The load changes from 25 s to 100 s are shown in Figure 18A, and the K changes for DSIC are shown in Figure 18B. The ROCOF and FN and the fatigue loads are compared under the fixed gain and the DSIC methods, respectively. The results are shown in Table 5 and Table 6.

It can be seen from Table 5 that  $DEL_{Ms}$  and  $DEL_{Mt}$  under the DSIC method are lower than those of the inertia control based on a fixed gain. It can be seen from Table 6 that  $DEL_{tot}$  under the DSIC method is lower than that of the inertia control of fixed gain. The reduction range is about 4%, which can significantly mitigate the wind turbine drivetrain fatigue load. For the FN, the reduction ranges from -3.41% to 9.57%. The ROCOF decreases from 0 to 5.23%. It can be known from the aforementioned data that the proposed DSIC method can significantly reduce ROCOF and FN while reducing fatigue load. This shows that the proposed DSIC scheme has good performance in reducing fatigue load and ROCOF and FN at the same time.

# Performance of wind turbine operation dynamics

In order to further clarify the dynamic behavior of wind turbine under different parameters, power output, rotor speed, and torque of drive chain are compared. Figure 19A shows the output power under different parameters. It can be seen that the rise in parameters increases the fluctuation of power output. The increase in output power is beneficial to the stability of system frequency. The DSIC method can have higher output power, so it can make the system frequency deviation and rate of change of frequency smaller.

The rotor speed under different parameters is shown in Figure 19B. It can be seen that the rotor speed difference is



Load change from 25 s to 100 s, and K change in the corresponding DSIC scheme. (A) Random system load that changes every 2 seconds. (B)  $K_{droop}$  and  $K_{in}$  changes for the DSIC scheme when a random white noise system load appears.

TABLE 5 DELs of shaft torque and tower bending moment under the fixed gain and DSIC methods.

(K <sub>droop</sub> , K <sub>in</sub> )	<i>DEL<sub>Ms</sub></i> (MNm)	<i>DEL<sub>Mt</sub></i> (MNm)
(7,7)	1.466	50.309
(8,8)	1.472	50.216
(9,9)	1.477	50.131
DSIC	1.463	50.021

small, which indicates that the proposed method will not affect the stable operation of the wind turbine. Figure 19C shows the drive chain torque. It can be seen that with the increase in the parameters of the traditional method, the torque fluctuation of the transmission chain increases. This is because larger parameters are easy to cause torsional vibration of the transmission chain. The proposed DSIC method further changes the generator torque by dynamically adjusting the output power, which can restrain the torsional vibration of

### TABLE 6 DEL<sub>tot</sub> and ROCOF and FN under the fixed gain and DSIC methods.

(K <sub>droop</sub> , K <sub>in</sub> )	DEL <sub>tot</sub>	ROCOF (Hz/s)	FN (Hz)
(7.7)	2.572	0.153	0.094
DSIC	2.464	0.145	0.085
Percentage	-4.20%	-5.23%	-9.57%
(8.8)	2.577	0.149	0.091
DSIC	2.464	0.145	0.085
Percentage	-4.39%	-2.68%	-6.59%
(9.9)	2.579	0.145	0.088
DSIC	2.464	0.145	0.085
Percentage	-4.50%	0.00%	-3.41%

the drive chain to a certain extent. Therefore, the proposed method can reduce the fatigue load of the WT. In conclusion, the results show that the proposed DSIC method can reduce the



fatigue load of the wind turbine while improving the frequency regulation capability of the WT.

### Conclusion

A WT DSIC method, considering fatigue load, is proposed. This method uses two loops of the ROCOF and FN, and the loop gain would change dynamically according to wind speed and frequency. This method can simultaneously reduce the system's FN and ROCOF and the wind turbine's fatigue load.

The analysis shows that the *K* weight under different working conditions should not be too different to prevent the power reference value from changing too much and causing the DEL to increase. For working conditions with significant changes in

wind velocity, the FN loop has a more significant impact on the DEL than the ROCOF loop. When the changing trend of wind velocity is opposite to the changing trend of frequency, the weight of inertia control can be increased, which helps to reduce the DEL. The results show that compared with the conventional scheme, the proposed DSIC scheme can significantly reduce the FN and ROCOF while reducing the DEL. The reduction in  $DEL_{tot}$  is about 4%. The reduction in the ROCOF ranges from -5.23% to 0%. The reduction in the FN ranges from -9.57% to -3.41%.

### Data availability statement

The original contributions presented in the study are included in the article/Supplementary Material; further inquiries can be directed to the corresponding author.

### Author contributions

All authors listed have made a substantial, direct, and intellectual contribution to the work and approved it for publication.

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## Conflict of interest

The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

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