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## Diagnosis and localization of fault for a neutral point clamped inverter in wind energy conversion system using artificial neural network technique

**Introduction.** To attain high efficiency and reliability in the field of clean energy conversion, power electronics play a significant role in a wide range of applications. More effort is being made to increase the dependability of power electronics systems. **Purpose.** In order to avoid any undesirable effects or disturbances that negatively affect the continuity of service in the field of energy production, this research provides a fault detection technique for insulated-gate bipolar transistor open-circuit faults in a three-level diode-clamped inverter of a wind energy conversion system predicated on a doubly-fed induction generator. **The novelty** of the suggested work ensures the regulation of power exchanged between the system and the grid without faults, advanced intelligence approaches based on a multilayer artificial neural network are used to discover and locate this type of defect; the database is based on the module and phase angle of three-phase stator currents of induction generators. The proposed methods are designed for the detection of one or two open-circuit faults in the power switches of the side converter of a doubly-fed induction generator in a wind energy conversion system. **Methods.** In the proposed detection method, only the three-phase stator current module and phase angle are used to identify the faulty switch. The primary goal of this fault diagnosis system is to effectively detect and locate failures in one or even more neutral point clamped inverter switches. **Practical value.** The performance of the controllers is evaluated under different operating conditions of the power system, and the reliability, feasibility, and effectiveness of the proposed fault detection have been verified under various open-switch fault conditions. The diagnostic approach is also robust to transient conditions posed by changes in load and speed. The proposed diagnostic technique's performance and effectiveness are both proven by simulation in the SimPower/Simulink® MATLAB environment. References 31, tables 2, figures 7.

**Key words:** artificial neural network, insulated-gate bipolar transistors, fault diagnosis technique, neutral point clamped inverter, wind energy conversion system.

**Вступ.** Для досягнення високої ефективності та надійності у галузі чистого перетворення енергії силова електроніка відіграє важливу роль у широкому спектрі застосування. Докладаються зусилля для підвищення надійності систем силової електроніки. **Мета.** Щоб уникнути будь-яких небажаних ефектів або перешкод, що негативно впливають на безперервність роботи в галузі виробництва енергії, у цьому дослідженні пропонується методика виявлення несправностей біполярних транзисторів із ізольованим затвором при обриві ланцюга в трирівневому інверторі з діодною фіксацією системи перетворення енергії вітру, що ґрунтується на асинхронному генераторі з подвійним живленням. **Новизна** запропонованої роботи забезпечує регулювання потужності, що обмінюється між системою та мережею, без збоїв, для виявлення та локалізації цього типу дефекту використовуються передові інтелектуальні підходи, засновані на багатошаровій штучній нейронній мережі; база даних заснована на модулі та фазовому куті трифазних статорних струмів асинхронних генераторів. Запропоновані методи призначені для виявлення одного або двох обривів у силових ключах бокового перетворювача асинхронного генератора подвійного живлення у системі перетворення енергії вітру. **Методи.** У запропонованому методі виявлення для ідентифікації несправного вимикача використовуються тільки трифазний модуль струму статора і фазовий кут. Основною метою цієї системи діагностики несправностей є ефективне виявлення та локалізація відмов в одному або навіть кількох інверторних перемикачах з фіксованою нейтральною точкою. **Практична цінність.** Робочі характеристики контролерів оцінюються за різних умов роботи енергосистеми, а надійність, здійсненість та ефективність запропонованого виявлення несправностей були перевірені за різних умов відмови розімкнутого вимикача. Діагностичний підхід також стійкий до перехідних станів, спричинених змінами навантаження та швидкості. Продуктивність та ефективність запропонованого діагностичного методу підтверджені моделюванням у середовищі SimPower/Simulink® MATLAB. Бібл. 31, табл. 2, рис. 7.

**Ключові слова:** штучна нейронна мережа, біполярні транзистори з ізольованим затвором, метод діагностики несправностей, інвертор з фіксацією нейтралі, система перетворення енергії вітру.

**Introduction.** The latest global reports on the state of wind energy in the world show that this energy has become an important investment sector in major industrialized countries. This is due to various factors such as the significant drop in production costs and the development of the field of power electronics that has solved many problems regarding the quality of the energy produced and the possibility of integrating this energy into the grid [1].

The wind turbines are equipped with a double fed induction generator (DFIG) to produce electricity at variable speeds. It is connected to a multi-level inverter of neutral point clamped (NPC) structure, to improve the performance of this system.

During operation, NPC inverter faces various constraints that can cause certain faults which is why production lines must be equipped with efficient fault detection and diagnostic systems, because any failure even the most trivial, can lead to multiple mandatory damages. The causes of IGBT failure in NPC inverters can be

classified into three categories: control faults, transient operating regimes, in particular those concerning terminal voltages, thermal overloads, and environmental conditions of use [2]. The environmental conditions leading to IGBT failure are mainly extreme ambient temperatures, humidity, natural ionizing radiation, and mechanical vibration [3, 4]. Less frequently, contamination and dust are also sources of IGBT malfunction.

A simple switch-open or circuit-open defect usually results in the whole or partial loss of operation of one of the IGBTs constituting the static converter it occurs due to a gate failure or a break in a connecting wire in the transistor, this break can be caused by thermal cycling or a short circuit fault [5]. An open circuit (OC) fault is one of the most prevalent faults of the IGBT in NPC inverter, it is necessary to examine and fault diagnosis in the arm of the inverter and detect it [6-8].

Recently, several methods for detecting faults in power transformers have been developed to correspond to

the diversity of problems encountered [9-17]. Park's vector-based methods [18-22] unfortunately require complex pattern recognition algorithms. Voltage-based methods require the use of additional sensors [23, 24]; The proposed diagnostic approach [25] is based on analyzing the inverter's output pole voltages and output currents. In [26] utilized a diagnostic procedure based on the phase current's instantaneous frequency after analyzing it with the Hilbert transform. In [27, 28] an artificial neural network (ANN) based multiple open-switch fault diagnostic approach was proposed. Using the DC components and total harmonic distortion (THD) of the stator currents, the 21 fault modes of multiple open-switch faults were localized. In this article, we focus on sophisticated intelligent techniques based on ANN to identify and detect these faults. We are interested in intermittent faults of the open circuit type of IGBT in the rotor side converter (RSC) to diagnose and locate them, to avoid degradation of the performance in the wind energy conversion system (WECS).

**Topology of a three-level diode-clamped inverter and fault detection method. Topology of an inverter.** Figure 1 depicts the NPC inverter topology [29, 30]. The DC-link supply was shared by each phase of the inverter, as indicated in Fig. 1. The common point of the series capacitors is connected to the center of each phase. The inverter is powering a three-phase load with an AC. According to the DC-bus voltage, the output has 3 levels:  $(-V_{dc})$ , 0, and  $(+V_{dc})$ .

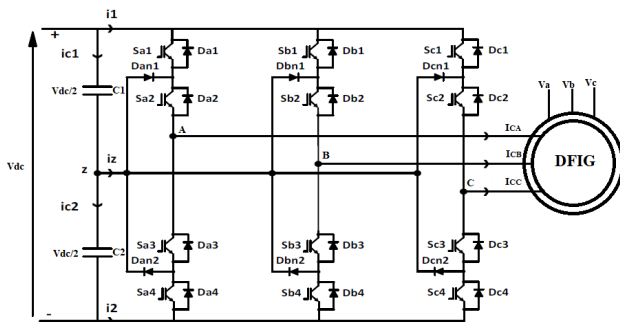


Fig. 1. NPC inverter circuit

The working principle is shown in Table 1. The converter should offer complementarities between both the couples of switches  $(S_{i1}, S_{i4})$  and  $(S_{i2}, S_{i3})$  in obtaining to get the appropriate 3-level voltages, where  $i$  denote the indication of phase ( $i = A, B, C$ ), and  $V_{io}$  is the phase-to-fictive midpoint value.

Table 1

The functioning principle for NPC inverter

Switching states	NPC inverter $i$ -phase				Voltage
	$S_{i1}$	$S_{i2}$	$S_{i3}$	$S_{i4}$	
N	1	1	0	0	$+V_{dc}/2$
O	0	1	0	1	0
P	0	0	1	1	$-V_{dc}/2$

Table 1 depicts  $i$ -phase switching in Fig. 1 with switching stages and output voltage levels.

To simplify the intricacy of the structure of a 3-level inverter, each pair (transistor – diode) semiconductor is marked by a single bidirectional switch  $S_a$  and can be seen

that, the structure is symmetric. Figure 2 illustrated the structure of a single leg, with an open circuit fault in  $S_{a1}$ .

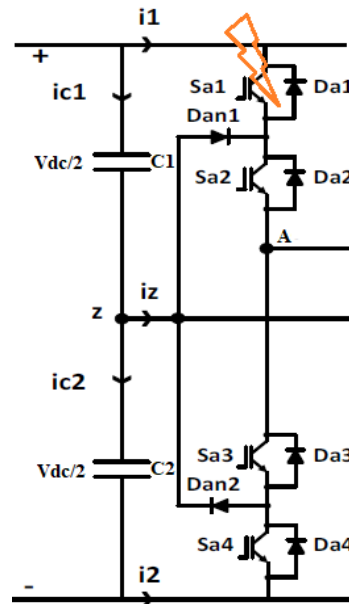


Fig. 2. A single leg of a 3-level NPC inverter

The OC fault is influences by raising the oscillations of the power signals and the deformity at the level of the stator-phase current with the increase of their amplitudes. In order to avoid these faults, which negatively affect the work of the power conversion system, we must put in place mechanisms to monitor and detect these faults in order to avoid any disaster that may arise. Among the detection techniques, we have presented in this work a technique based on the neural network, which has shown us a satisfactory performance.

**Fault detection method.** Diagnosis by neural networks (NN) is a computational model whose design is very schematically inspired by the functioning of real human neurons, so the principle is inspired by biological neurons, to identify faults in a system, the diagnosis carried out by NN must have an adequate number of examples of good functioning and defects to be able to learn them. During the training phase, the features are provided to the input network, and the output network receives the required diagnosis [31].

Firstly, we apply a Fourier analysis technique to the stator current properties presented in Fig. 3 in this model. After the neuron network processes, the data, the system monitors the phase angle and amplitude of the 3-phase stator currents  $(I_{sabc})$ , which will be the inputs to the NN; the semi-faulty driver is recognized and identified by the network. The selected features of each fault, which are specified in the tabular form of samples to be investigated, are used to extract features.

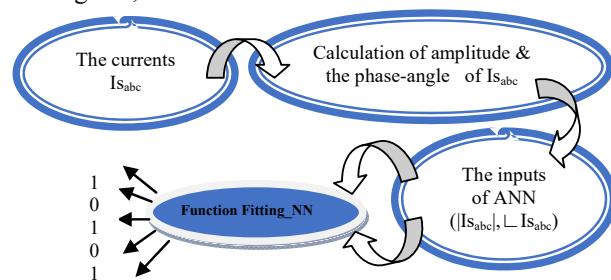


Fig. 3. The neuron network's structure

**Simulation of system studies.** In this work, for power conditioning in the WECS applications, various topologies of power converters have been suggested (Fig. 4). The multilevel converters, particularly the NPC topology, are widely utilized in the creation of high voltage and high power, wind power plants because of their benefits, which include the optimum waveform of the output voltage and a reduction in overall harmonic distortion.

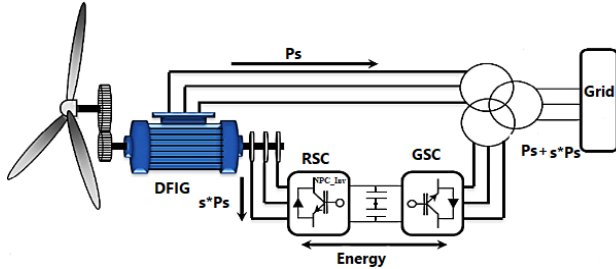


Fig. 4. Structure of the wind power conversion chain based on DFIG with NPC structure of RSC

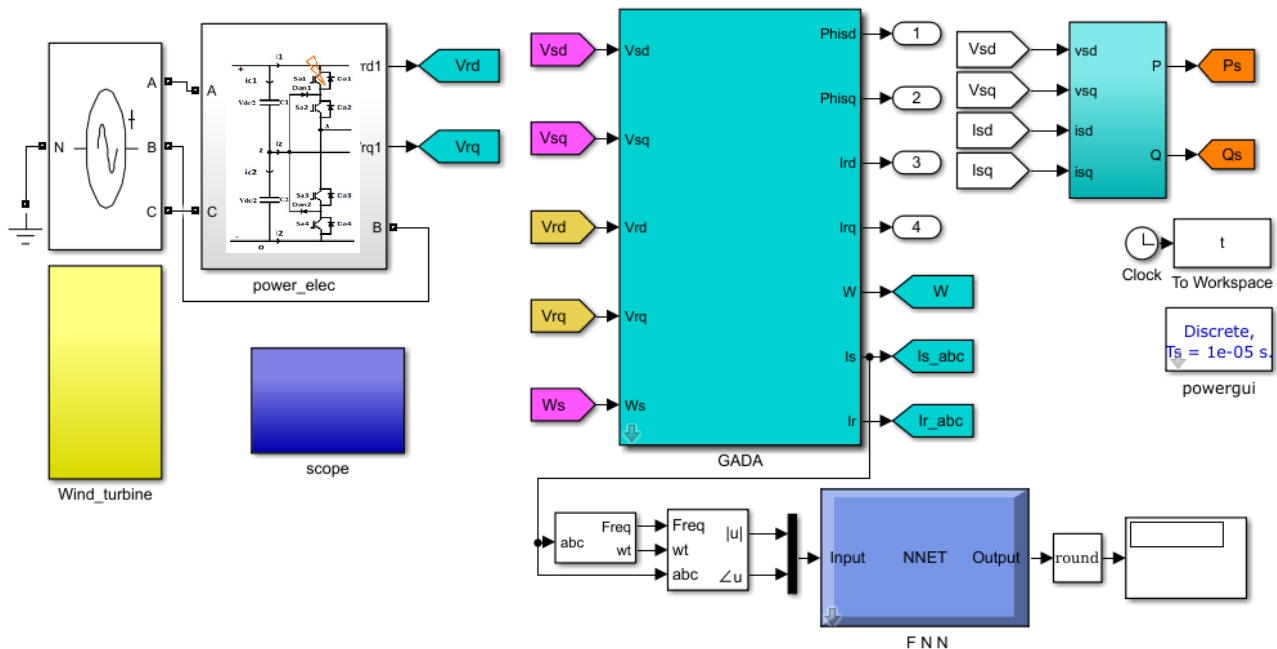


Fig. 5. Model Simulink of WECS and fault diagnosis using neural network

**Tests of ANN.** The NN achieved higher learning performance to discover the fault position in the circuit after numerous tests; Fig. 6,*a,b,c* shows the training performance, regression, and error histogram of the study. To achieve and assess the NN learning and training performance, we use the mean quadratic error (MQE).

The ANN in our case reached a value of  $1.9656 \cdot 10^{-20}$ . The goal error has been reached after just 470 of the 1000 training epochs of the training parameter, and the regression figure shows an acceptable regression ( $R$  equal to 1) among both network outputs and network targets.

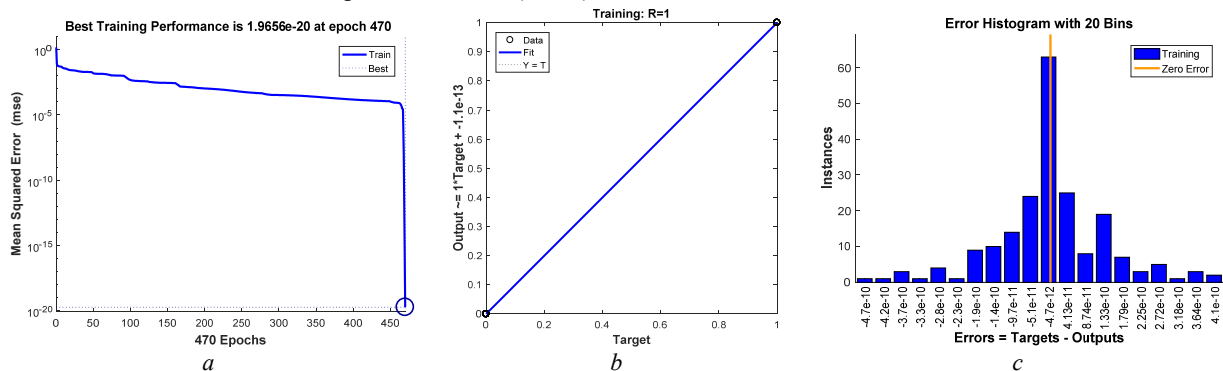


Fig. 6. *a* – Training performance plot for the classifier; *b* – NN-training regression and *c* – error histogram

Table 2

Neural network training data

Faulty switch	Training_data		Output code of neural network	Faulty switch	Training_data		Output code of neural network
	$ I_{abc} $	$\angle I_{abc}$			$ I_{abc} $	$\angle I_{abc}$	
Normal	22.26	-0.01744	000000000000	Sc1	45.52	-1.21	000100000000
Sa1	46	-0.3975	000000000001	Sc2	45.91	-1.106	001000000000
Sa2	47.46	1.233	000000000010	Sc3	51.17	23.51	010000000000
Sa3	47.05	2.59	000000000100	Sc4	47.93	0.3295	100000000000
Sa4	45.78	-0.2721	000000001000	Sa1 & Sa2	49.54	-1.683	000000000011
Sb1	45.69	0.3253	000000010000	Sa1 & Sb1	42.37	-0.2402	000000010001
Sb2	48.93	-0.9666	000000100000	Sa1 & Sc1	39.95	4.864	000100000001
Sb3	45.99	3.038	000001000000	Sa1 & Sb1 & Sc1	45.71	-0.02463	000100010001
Sb4	49.12	2.8	000010000000				

### Checking the performance of the neural network.

We did tests for numerous sorts of operations, and the results are displayed in Fig. 7. Once the ANN was established and our learning had attained an acceptable level, we made tests for various types of operations.

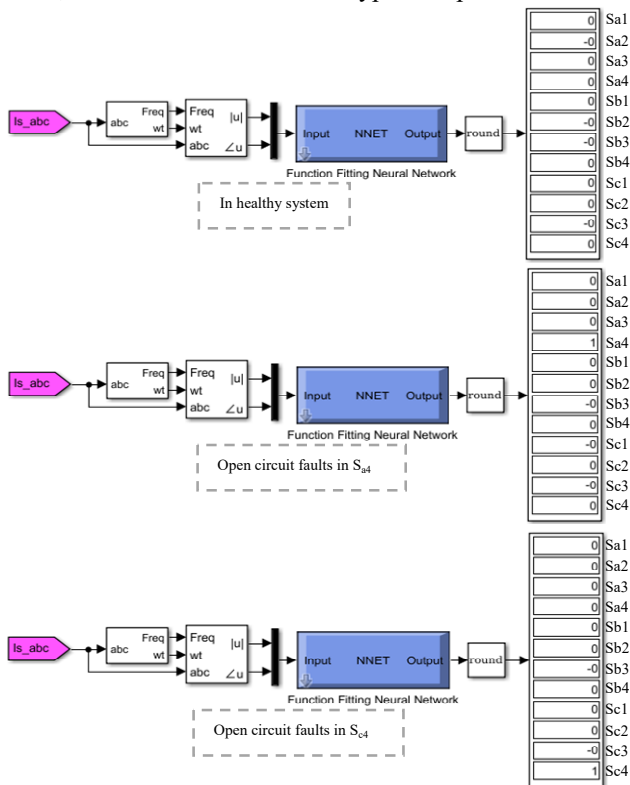


Fig. 7. ANN testing

**Conclusion.** This work proposes an open-switch fault detection approach for a rotor side converter with a neutral point clamped topology in a wind energy conversion system; where a neural network was used to obtain fault codes for open-circuit switches, the system was able of analyzing circuit faults when tested with two inputs, the first representing the current module and the second representing the phase shift. Simulation in a MATLAB environment was used to create open circuit failures in one or more insulated-gate bipolar transistors. The detection and diagnostic system monitor and records the module and argument values of these currents, which will be the neural network's inputs, after extracting the three-phase stator currents for healthy and fault-free functioning. After the neural network has trained and

processed this information, it recognizes and locates the malfunctioning insulated-gate bipolar transistors.

A 3-phase neutral point clamped inverter monitoring system is built using the stator current spectrum analysis technique paired with the artificial neural network. Where the suggested feature extraction is simple because it does not require any complexity, and we proved that the system's performance has vastly improved in terms of accurately detecting faults; where the mean squared error was approximately  $1.9656 \cdot 10^{-20}$ , and training regression was equal to 1 which indicates that the training performance of the network was good, which facilitated the rapid detection process. Therefore, the system is capable of identifying the various operating causes of neutral point clamped inverter (the healthy and the open-circuit faulty of insulated-gate bipolar transistors).

**Conflict of interest.** The authors declare that they have no conflicts of interest.

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