


## Article

# Reliability of Variable Speed Pumped-Storage Plant

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**Abstract:** The multi-channel (MC) back-to-back voltage source inverter (VSI)-fed doubly fed induction machine (DFIM) is emerging as a highly interesting topic in large-rated variable speed pumped-storage power plants (PSPP) in view of cost, optimal efficiency, and space requirements. Although the VSI is the fundamental part of the drive controlling the active/reactive power of the plant, redundancy is presently not adopted in practice causing the unit as a whole to shut down upon a failure in the converter and control circuit. This paper evaluates a large-rated (250 MW) DFIM-fed variable-speed unit of a PSPP in terms of its reliability and availability. A Markov model is developed to assess the reliability of the drive based on a number of factors including survivability and annual failure rate (FIT). Further, the Markov model is applied to different PSPPs for comparison of reliability among them.

**Keywords:** pumped-storage power plant; doubly fed induction machine; Markov model; reliability

## 1. Introduction

Several energy storage technologies have been developed including compressed air, pumped-storage power plant (PSPP), flywheels, high energy batteries, super capacitors, biofuels, and thermal energy storage. Among these, the PSPP is a mature technology in the category of large energy storage systems and is critical for power system flexibility [1]. To comply with the Kyoto protocol, worldwide focus is on renewable energy sources like wind, solar, etc.; however, renewable energy generation is highly variable and intermittent in nature affecting the power system operations, especially power balancing; therefore, power grid operators are encouraged to connect the energy storage systems to the power system network. In addition, European countries have introduced regulations for stabilizing the power grid network wherein ‘energy storage systems are mandatory when more than 20% of the power is generated using solar and wind’ [2].

Since the 1900s, synchronous machine-based fixed-speed PSPPs have been installed in European, American, and Asian continents, and more than 110 GW of them are in active operation worldwide [3,4]. Nowadays, variable speed PSPP is an emerging technology used in pumped-storage systems where it offers several benefits, specifically (i) increased efficiency in generation/pumping mode irrespective of water level in the dam, (ii) mode transition from pumping to generation and vice versa in short time, (iii) high dynamic stability against grid and speed fluctuations, (iv) high ramp rate compared to fixed-speed PSPP, (v) quick response in load balancing, and (vi) flywheel effect (inertia energy) [5], etc. Variable speed PSPP was introduced in Japan in the early 1990s, and 18 PSPPs (i.e., 36 units) are installed/under construction worldwide with a total capacity of 9.425 GW [4,6].

The synchronous machine-based variable speed PSPPs (e.g., 100 MW Grimsel 2 at Switzerland) [7] installed in various countries offer several benefits; however, this system is not yet accepted by the

project authorities due to its limitations as listed here: (i) power converter with a rating similar to the machine is required, which is unfeasible due to the larger size (space requirement) and cost, especially in the case of an underground power house, (ii) hydro turbine requires only 10–15% speed variation from the rated speed for significant improvement in efficiency; therefore, focus is shifted to doubly fed induction machine (DFIM) for use in variable speed PSPP (400 MW Ohkawachi PSPP, Japan (1993); 250 MW Linthal PSPP, Switzerland (2015); 250 MW Tehri PSPP, India (under construction)), where power converters with a capacity lower than the rating of the machine are enough to achieve the required efficiency improvement and high dynamic stability [8,9].

Power converters connected on the rotor side of the DFIM ensures active and reactive power control for the drive. Since the 1990s, cycloconverters (e.g., 400 MW Ohkawachi PSPP, Japan (1993)) have been used on the rotor side of DFIM; however, they are now being phased out gradually due to high ripples in rotor current and reactive power consumption from grid (rotor side). Presently, the three-level back-to-back voltage source inverter (VSI) is preferred owing to its less THD and unity power factor on grid side (rotor). In the case of a large current on rotor side, multi-channel (MC) power converters are adopted, e.g., the five-channel, three-level back-to-back VSI (connected on rotor side) at 250 MW Tehri PSPP, India [10] that handles 11,600 A.

It is reported that redundancy in power converter with control circuit is not yet adopted in multi-channel DFIM-fed drives in industries, especially in pumped-storage units, due to the operational challenges [11,12]. Also, faults are more likely in power converters of variable speed drives causing frequent plant shutdowns and huge generation losses [13]; therefore, redundancy in power converters and control circuits, especially in pumped-hydro applications of large rating (>100 MW), is expected to be imposed as a statutory requirement by the regulatory body, e.g., Central Electricity Authority (CEA) of India (2007) [14]. This creates uncertainties in decision-making for the policy makers and project authorities of the variable speed PSPP in view of reliability and availability of the unit.

Considerable research has been conducted in doubly fed induction machine drives with regard to motor control [15,16] grid disturbances, converter faults, sensor failures, fault detection, fault tolerant control, etc. [17–23]. Particularly, references [17,18] discuss the impact of the VSI faults on induction drives. Likewise, faults in power converter, control circuits, and motor are detailed in [19,20]. Grid disturbances such as the unbalanced grid voltage and voltage sag are discussed in [21–23]. Reliability of supply, motor, and components are analyzed in [24–27] for squirrel-cage induction and synchronous machine drives. Several publications discussed the reliability assessment techniques such as fault trees, Markov model, reliability block diagrams, etc., that are discussed in detail in [28]. The Markov model is considered as the most powerful technique with better features such as (i) fault coverage, (ii) time-dependent failure rates, (iii) common mode failures, etc. compared to the fault trees and reliability block diagrams.

Reliability analysis is critical for effective development, maintenance, and operation of large-rated variable speed PSPPs. Figure 1 shows the single line diagram of a 250-MW DFIM-fed variable-speed unit consisting of multi-channel VSI, control system, DFIM, phase shift transformer, unit transformer, inter phase reactors, etc. In this study, we analyze the reliability and availability of this system using Markov model in comparison with fixed-speed PSPP.

The rest of this paper is structured as follows. Section 2 discusses the survivability of the test unit (250 MW DFIM) with regard to the converters, sensors, and rotor winding failures. The Markov reliability model and equations are detailed in Section 3. The reliability components of a 250-MW variable-speed unit are presented in Section 4, and the reliability estimation and comparative analysis are discussed in Section 5. Finally, the concluding remarks are presented in Section 6.

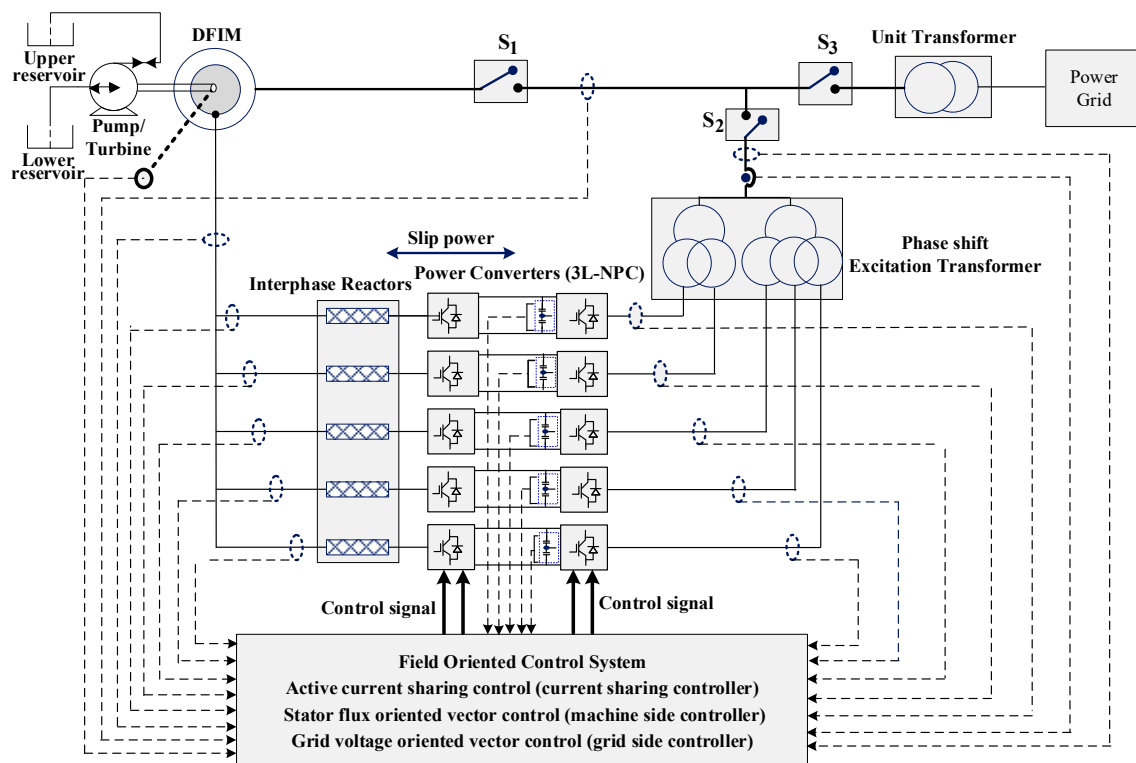
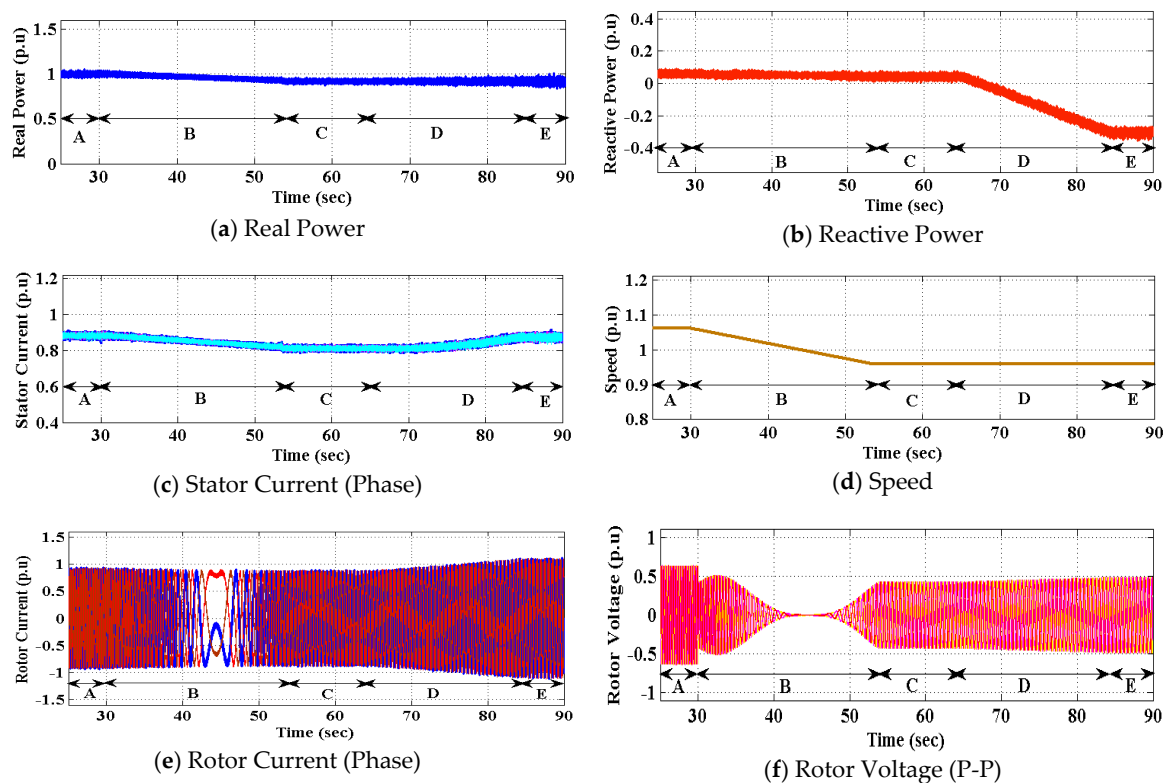


Figure 1. Large-rated DFIM-based variable speed PSPP unit.

## 2. Survivability Analysis of a 250-MW Variable-Speed Unit

This section discusses the survivability status of the 250-MW DFIM-fed variable-speed unit [29] with regard to power converters, sensors, and rotor winding faults. A 250-MW DFIM with five-channel three level neutral point back-to-back converter (3L-NPC) is designed in Matlab/Simulink tool to observe the drive behavior. A field-oriented vector control system is designed to control the active (real)/reactive power of the unit, and an active current sharing control is embedded in the controller for proper sharing of rotor currents among the converters. The detailed control circuit and equations are detailed in [29]. Faults are simulated in the system using the multi-port switch and breaker in Matlab/Simulink. The switching frequencies of the grid-side and machine-side converters are selected as 500 Hz and 300 Hz, respectively, considering the switching losses.

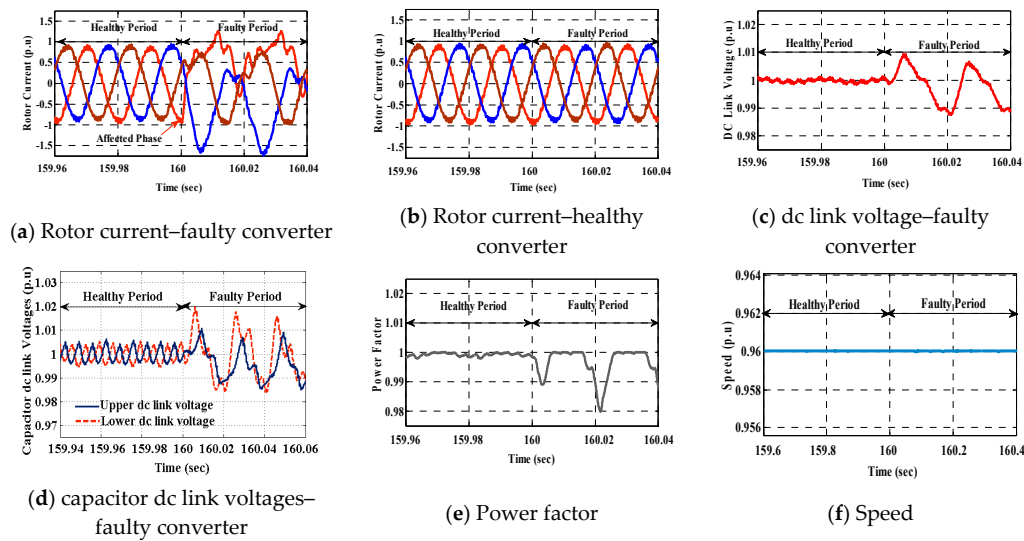
The active and reactive powers of the 250-MW DFIM at normal operating condition are shown in Figure 2. Stator current of the machine is shown in Figure 2c. It is inferred that magnitude of the stator current changes with respect to the change in real and reactive power delivery, and frequency of the stator current is constant at grid frequency. In case of rotor currents, both magnitude and frequency are changed (shown in Figure 2e). Frequency of the rotor currents depends on slip frequency. In addition, it is noted that the rotor voltage also depends on the slip of the machine. In the case of faults, the machine is instructed to operate at 0.96 p.u. (221.5 rpm), and the shaft power is considered as 240 MW. Furthermore, the power factor is set as 0.95 through the reactive power control system. The test results show that: (i) the line current in stator winding is 9157 A (0.814 p.u.), (ii) the voltage (P-P) applied to the rotor winding by the rotor-side converter is 1255 V (0.38 p.u.), (iii) the line current in rotor winding is 10,360 A (0.893 p.u.), (iv) the reactive power consumption of the machine is 15.3 MVar (0.05 p.u.), and (v) the frequency of rotor current is 2 Hz.



**Figure 2.** Active and reactive power control of 250 MW DFIM. A—260 MW, 15.3 MVar (consumption), 245 rpm; B—Transition from 260 to 240 MW, 245 to 221.5 rpm, 15.3. MVar (consumption); C—240 MW, 221.5 rpm, 15.3 MVar (consumption); D—Transition from 15.3 MVar (consumption) to 91.8 MVar (Deliver to grid); E—240 MW, 91.8 MVar (Deliver to grid), 221.5 rpm.

### 2.1. Converter Faults

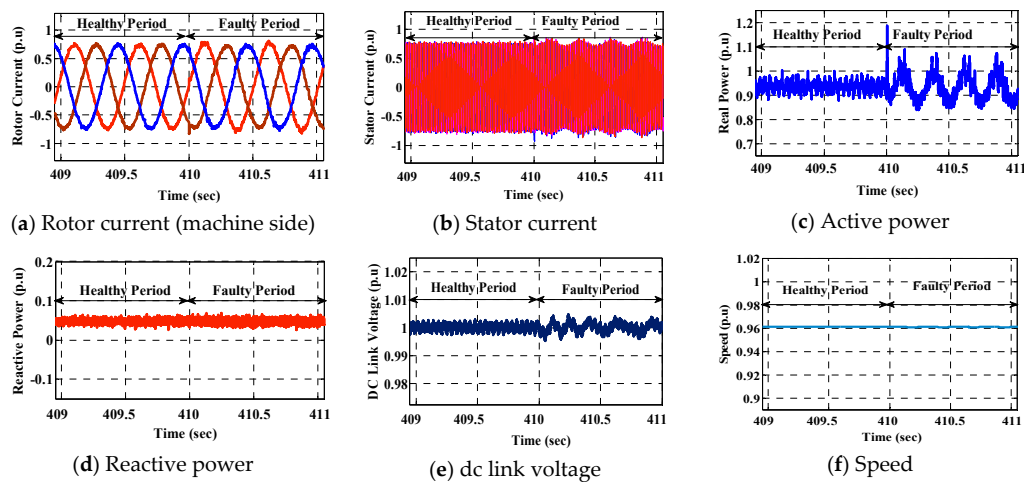
A single-switch gate-drive open-circuit fault (upper switch) is injected into one of the parallel connected grid-side converter (GSC) at 160 s, and the results are shown in Figure 3. During the fault, the phase current corresponding to the faulty leg is distorted in upper half cycle, and the negative half cycle is found to be omitted, resulting in variation of phase and magnitude of the other two phase currents (Figure 3a); however, the current flowing through the other healthy converters are not affected as shown in Figure 3b. From the test results, it is inferred that: (i) the dc-link voltage fluctuates marginally in the faulty converter as shown in Figure 3c (oscillation at grid frequency), (ii) variation in both capacitor dc-link voltages as shown in Figure 3d, (iii) the power factor on grid side (rotor) fluctuates (Figure 3e) due to the variation in reactive power consumption, and (iv) the speed of the machine is constant as set by the machine-side control system. In the case of an open-circuit fault in lower switch, the results are similar to the upper switch; however, it is observed that (i) the phase current of the faulty leg is disturbed in lower half cycle, while it is omitted in upper half cycle, (ii) the variations in the dc-link capacitor voltages are reversed when compared to the open-circuit fault of the upper switch.



**Figure 3.** GSC upper single-switch open-circuit faults for a 250-MW DFIM unit.

## 2.2. Sensor Faults

Single rotor current sensor omission fault is injected at 410 s, and the results are shown in Figure 4. During the fault, one of the current sensor reads zero value, resulting in changes in  $I_{qr}$  (q-axis (torque) component of machine). The changes in  $I_{qr}$  distort the electro-magnetic torque of the machine, resulting in fluctuations in the real power delivery and speed. From the results, it is observed that (i) the speed of the machine marginally fluctuates (Figure 4f), resulting in changes in the active power delivery (Figure 4c) and (ii) there are variations in rotor and stator currents (Figure 4a,b). Despite these variations, the machine is observed to be in continuous operation, and  $I_{dr}$  maintains the controlled reactive power at grid (stator side). It is observed that all controllers are in regular operation in the grid-side converters, and the dc-link voltage is maintained.



**Figure 4.** Single rotor current sensor omission fault for a 250-MW DFIM unit.

## 2.3. Rotor Winding Faults

Simulation study is repeated for single-phase rotor winding fault that is injected into machine side converter (MSC) at 410 s, and the results are shown in Figure 5. When a fault occurs, one of the rotor phase current goes to zero (Figure 5a), and the conduction mode is equivalent to the single-phase mode with other two healthy phases. During the fault, the magnitude of the rotor and stator phase transient currents increase to a level of 2.96 p.u. (Figure 5a) and 4.15 p.u. (Figure 5b), respectively. Consequently, the active and reactive powers of the machine are affected (Figure 5c,d). From the test

results, it is observed that: (i) the healthy phase rotor currents undergo deviations in phase, and they produce transients at meeting point of these two phase currents, (ii) both stator and rotor currents increase to the levels above the rated value, (iii) there are fluctuations in dc-link voltage and speed of the machine, (iv) there is instability in active and reactive power delivery, and (v) the rotor side converter (both GSC and MSC) control system falls out of action. Likewise, all the power converter and sensor faults are injected, and the results are summarized in Tables 1 and 2, respectively.

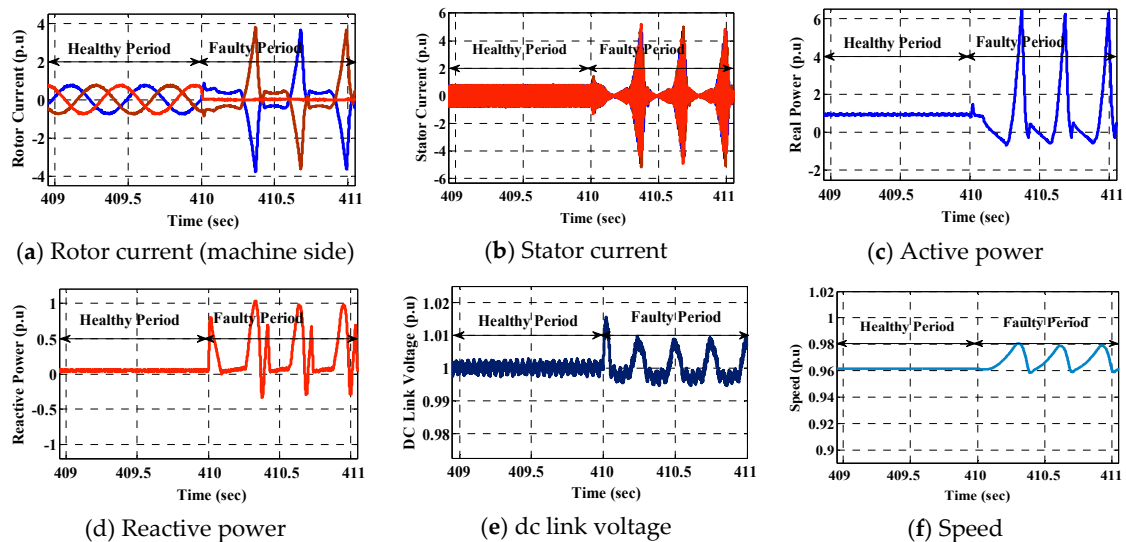


Figure 5. Single-phase rotor winding fault for a 250-MW DFIM unit.

Table 1. Survivability status for power converter faults [13,30].

System	Faults	Fault Status
Power Converter	Machine side converter	Single Device/Leg Open Circuit Fault
		Single Device/Leg Short Circuit Fault
	Grid side converter	Single Device/Leg Open Circuit Fault
		Single Device/Leg Short Circuit Fault
	DC Link	Open circuit/Short circuit

S—Survived; F—Failed.

Table 2. Survivability status for sensor faults [13].

System	Faults	Fault Status
Sensors	Omission/saturation	Speed sensor
		DC link voltage sensor
		Reactive power signal
		Single rotor Current Sensor
		Single grid current sensor
		Single grid voltage sensor
	Gain/Bias	Speed sensor
		DC link voltage sensor
		Reactive power signal
		Single rotor Current Sensor
		Single grid current sensor

S—Survived; F—Failed.

### 3. Markov Reliability Model

Reliability is a term used to measure the successful rate of operation of equipment/components in a given period. Let us assume that an equipment is in successful operation in the interval from time  $t_1$  to time  $t_2$ . Then, 'F' is a variable denoting time to failure in an equipment, and reliability of the equipment is mathematically defined as,

$$R(t) = P(F > t_2) \quad t_2 \geq 0 \quad (1)$$

$P \rightarrow$  Probability.

Mean Time to Failure (MTTF) is given by,

$$MTTF = \int_0^{\infty} R(t) dt \quad (2)$$

In general, a component failure is exponentially distributed in reliability analysis. Therefore, reliability is given by

$$R(t) = e^{-\lambda t} \quad (3)$$

$\lambda \rightarrow$  Failure rate over the period, and it is reported as constant.  $t \rightarrow$  Time period between initial commissioning and the instant of susceptibility to fail.

Exponential distribution shows that the reliability decays to zero when the component ages. For a single component, MTTF is also given by,

$$MTTF = \frac{1}{\lambda} \quad (4)$$

In a series system, with 'n' components having failure rates  $\lambda_1, \lambda_2, \dots, \lambda_n$  and reliability functions  $R_1(t), R_2(t), \dots, R_n(t)$ , the overall reliability function and MTTF are given by,

$$R_s(t) = \prod_{i=1}^n R_i(t) = e^{-\lambda_s t} \quad \text{where, } \lambda_s = \sum_{i=1}^n \lambda_i \quad (5)$$

$$MTTF = \frac{1}{\sum_{i=1}^n \lambda_i} \quad (6)$$

Reliability for 'n' paralleled systems is given by,

$$R_p(t) = 1 - \prod_{i=1}^n (1 - R_i(t)) = 1 - \prod_{i=1}^n (1 - e^{-\lambda_i t}) \quad (7)$$

Availability of an equipment is considered by the time to repair and number of failures. System availability is mathematically given by,

$$A_u = \frac{T_{up}}{T_{up} + T_{down}} \quad (8)$$

$A_u \rightarrow$  unit Availability;  $T_{up} \rightarrow$  unit uptime;  $T_{down} \rightarrow$  unit downtime.

### 4. Reliability Calculation of a 250-MW DFIM Variable-Speed Unit

Reliability of a 250-MW DFIM unit is estimated with the following assumptions: (i) all the components/equipment are operational during their scheduled period, (ii) input power supply has been fully reliable. The reliability model is created by considering the working and failure conditions of



each component used in the variable-speed unit. Two-state block models are developed to determine the reliability and availability of each component. Subsequently, the reliability of the entire unit is determined.

#### 4.1. Power Converter Modelling

A five-channel three-level back-to-back voltage source converter is used in the variable-speed unit to control the active and reactive powers of the drive. Each converter is rated as 8 MVA (3.3 kV; 11,600 A) to handle the large rotor current. IEGT-based (injection enhanced gate transistor) switches are used in these converters in view of the low on-state voltage drop and efficiency improvement. Two capacitors are placed in the dc-link to resist the dc-link voltage of 5000 V (i.e., dc-link voltage is 2500 V each) and the dc-link capacitance value is selected as 18,000  $\mu\text{F}$  in view of the ripples and the protection requirements during the grid disturbances [29]. In addition, a crowbar and a dc-link chopper circuit are placed in the converter circuit to protect the converter from the internal and external faults. It is reported that power converter redundancy is not yet adopted in the commissioned/under construction variable speed PSPP units due to operational issues; therefore, if a failure occurs in any one of the converters, then the entire unit trips. Hence, the converter would be considered as connected in series with other components. It follows a two-state model with the Up (healthy operation) and Down (failed operation) states (Figure 6). Block model helps determining precise failure rate ( $\lambda_c$ ) and repair rate ( $\mu_c$ ) of the converter. The failure rate of each component used in the converter is shown in Table 3. Further, failure rates of each machine side and grid-side converter [31] is shown in Table 4. Failure rate is defined as number of failures occurs per operating hours ( $10^9$  h). Average time to repair a converter is 14 h [32].

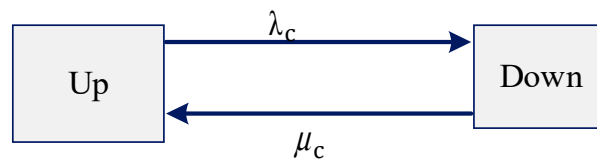


Figure 6. Two-state model for power converter.

Table 3. Failure rate for power converter components [31,33].

S.No	Components	Failure Rate (1 FIT = 1 Failure over $10^9$ h)
1	Power IEGT	100 FIT
2	Power Diode	80 FIT
3	DC-Link Capacitance	300 FIT
4	DC-Link	45 FIT

Table 4. Failure rate for power converter [31].

S.No	Components	Failure Rate (1 FIT = 1 Failure over $10^9$ h)
1	Grid Side Converter	5562 FIT
2	Machine Side Converter	46,040 FIT

#### 4.2. Sensor Modelling

Sensors are crucial components in controlling the drive. Being sensitive to the environment and operational conditions, they are prone to more kinds of fault such as (i) omission, (ii) gain, (iii) bias, (iv) constant/saturation, and (v) noise. A large number of sensors are used to control all the five converters. The sensors are considered as connected in series with other components, since it leads to shutdown of the entire unit even if a single sensor unit fails. However, DFIM drive is survived under some sensor failures including single rotor and grid current sensors as listed in Table 2. Therefore, estimation of reliability chain for the sensors is calculated based on Table 2. A Markov



model for sensors is considered as the two-state model with the Up (healthy operation) and Down (failed operation) states. The average time taken to repair a sensor is 8 h. Failure rate of each sensor with respect to the fault is given in Table 5.

**Table 5.** Failure rate for sensors [32,34].

S.No	Sensor	Type of Fault	Failure Rate (1 FIT = 1 Failure over 10 <sup>9</sup> h)
1	Speed encoder	Omission	740
		Gain	190
		Bias	420
		Constant	190
		Noise	190
2	Current sensor	Omission/Gain/Bias/Constant/Noise	100
3	Voltage sensor	Omission/Gain/Bias/Constant/Noise	160

#### 4.3. Converter Control System

Field-oriented vector control system is employed in the large-rated variable speed PSPP units to achieve accuracy and low ripple in torque. Stator flux-oriented vector control system is employed in the machine-side converters to control the active/reactive power of the DFIM, and grid voltage-oriented vector control system is employed to control the dc-link voltage of the back-to-back converter and maintain unity power factor at grid (rotor) through the grid-side converter. Active current sharing is also employed in the control system for proper sharing of rotor current. The average time taken to repair the control system is 14 h. Failure rate of each component of the control system is given in Table 6. As presented in Figure 6, the control system follows the two-state model with Up (healthy operation) and Down (failed operation) states. In addition, all components are connected in series considering the reliability aspect.

**Table 6.** Failure rate for control system components [35].

S.No	Components	Failure Rate (1 FIT = 1 Failure over 10 <sup>9</sup> h)
1	Control power supply	800 FIT
2	Binary I/O	800 FIT
3	Main processing board	800 FIT
4	Pulse processing board	400 FIT
5	Communication board	200 FIT
6	Operator panel	400 FIT
7	Internal I/O board	400 FIT
8	External I/O board	800 FIT

#### 4.4. Transformer

The power transformer selected is a two-winding step-down transformer. The failure rate of power transformer is as high as 5940 FIT [32]. Power transformer (PT) unit has a primary and secondary windings, also each windings has three bushings. Major failures (i.e., 64%) occurs in windings (47.25%) and bushings (16.53%) [36]. Phase shift transformer (PST) is considered for the excitation system in a variable speed DFIM unit to limit the harmonics and circulating currents. It has two primary windings and five secondary windings with a phase shift of (Yd1 (−12°) d1 (−6°) d1 (0°) d1 (+6°) d1 (+12°)) as shown in Figure 1, each winding has three bushings. Each winding and bushing are considered as series in reliability chain of PST, since any failure in PST's leads to affecting converter power output and leads to shut down the entire unit. Failure rate of PST's is similar to the power transformer unit [37]. However, it has two primary and five secondary windings, the failure rate for PST is estimated as 20,790 FIT (i.e.,  $(7/2) \times 5940 = 20,790$ ). The average time taken to repair the

transformer is 26 h, although it takes 168 h for a major replacement. A two-state model is adopted, and the power and excitation transformers are connected in series with other components.

#### 4.5. Doubly Fed Induction Machine

Failure rate of DFIM is estimated as 14,040 FIT [32]. The major failures are related to the slip rings (31.1%), bearings (11.6%), and rotor (7.4%). Average time to repair the machine is 24 h, although it takes 168 h for a major replacement, similar to the case of the transformer. The machine components are connected in series considering the reliability, and a two-state model is adopted.

#### 4.6. Interphase Reactors

Interphase reactors (IR) are used for proper sharing of current among the converters and for limiting the circulating currents in the machine-side converters. The failure rate of IR is 950 FIT [35]. The estimated time for repair/replacement of IR is 21 h. The reactors are connected in series with other components and considered as two-state model.

#### 4.7. Circuit Breakers

Two-state model (based on Markov model) is adopted for the circuit breakers that are connected in series with other components. Failure rate and time to repair are considered as 640 FIT [35] and 19 h, respectively.

#### 4.8. Cooling System

The cooling system of the variable-speed unit consists of fans, water, air circulation systems, pumps, etc. Failure rate and time to repair are considered as 3200 FIT and 14 h, respectively. It is considered as a two-state Markov model.

#### 4.9. Cabling

The incoming (grid-to-converter) and outgoing (converter-to-rotor winding) cables are considered as two-state models, and these are connected in series with other components. Average failure rate is considered as 800 FIT [35] and time taken for repair/replacement is 21 h. The failure rate depends on the length of the cable.

### 5. Reliability Estimation of a 250-MW DFIM Variable-Speed Unit

A reliability model (based on the Markov model) is developed for the equivalent block representing the overall unit, and the reliability and availability of the unit is calculated. Since all the components are represented individually using two-state model, the equivalent variable-speed unit model is represented as two-state model. Since all the components of the unit are connected in series, the failure rate for the overall unit is calculated based on (5). It is worth mentioning that the survivability of the unit is considered during the estimation of failure rate. In the case of current sensors, two sensors are used while the third is not of any significance. The system failure rate is given as,

$$\lambda_s = \lambda_{\text{converter}} + \lambda_{\text{sensors}} + \lambda_{\text{control system}} + \lambda_{\text{DFIM}} + \lambda_{\text{Transformer}} + \lambda_{\text{Interphase reactors}} + \lambda_{\text{Circuit breakers}} + \lambda_{\text{Cooling Systems}} + \lambda_{\text{Cabling}} \quad (9)$$

$$\lambda_s = 387005 \text{ FIT} \quad (10)$$

Based on the system failure rate, reliability of the whole unit is estimated as shown in Figure 7a. MTTF is calculated as

$$\text{MTTF} = \int_0^{\infty} R_s(t) dt = \int_0^{\infty} e^{(-3.39t)} dt = 0.295 \text{ (year)} \quad (11)$$

It is observed from the figure that the system reliability under steady state condition (i.e., initial reliability state of the unit) is 0.9996. However, reliability is considered as an exponential function as shown in Figure 7a. The repair rate of the year is estimated as 197.53 repairs/year. It is observed that the availability of the variable speed PSPP unit is estimated as 0.9775.

### 5.1. Reliability Calculation with Power and Control Redundancy

In this section, it is assumed that the redundancy in both power converter and control circuit is applied to variable-speed unit. The reliability of the unit is calculated as shown in Figure 7b, and it is observed to be 0.999 at steady state condition. The repair rate of the year is estimated as 73.5 repair/year. It is observed that the availability of the variable speed PSPP unit is 0.9916 considering the redundancy in power converter and control circuit. The MTTF of the variable-speed unit with redundancy is calculated as,

$$MTTF = \int_0^{\infty} R_s(t) dt = \int_0^{\infty} e^{(-1.0696t)} = 0.934 \text{ (year)} \quad (12)$$

### 5.2. Reliability Calculation for Fixed-Speed Unit

Synchronous machine employing fixed speed is considered for the calculation of reliability and availability of the unit. In a fixed-speed PSPP, thyristor-based converters are used in the excitation system. It is noted that the 2 + 1 redundancy in power converter and control circuit is adopted in fixed-speed unit. Failure rate for the synchronous machine with excitation system is 8300 FIT. Also, phase-shift transformers are not adopted in these power plants where single channel is enough to provide the required rotor current. Static frequency converters (SFC) are used in fixed-speed PSPPs during the starting-up process of pumping mode. The failure rate of SFC is similar to the back-to-back converter discussed in Section 4; nonetheless, the operating hours of SFC is bare minimum i.e., less than 300 h/year. The reliability of the unit is calculated, and it is shown in Figure 7c. It is observed that the reliability of the fixed-speed unit at steady state condition is 0.9998. The repair rate of the year is estimated as 30.7 repair/year. It is observed that the availability of the variable speed PSPP unit is 0.9964. MTTF of the fixed-speed unit is considered as,

$$MTTF = \int_0^{\infty} R_s(t) dt = \int_0^{\infty} e^{(-0.3789t)} = 2.63 \text{ (year)} \quad (13)$$

The comparison of failure rate and availability between the fixed- and variable-speed units is shown in Tables 7 and 8, respectively, and that of failure probability is shown in Figure 8. It is inferred that the availability of the PSPP unit is low in a variable-speed unit without redundancy of power converter and control circuit; however, providing redundancy helps enhance the availability to a level comparable with fixed speed unit.

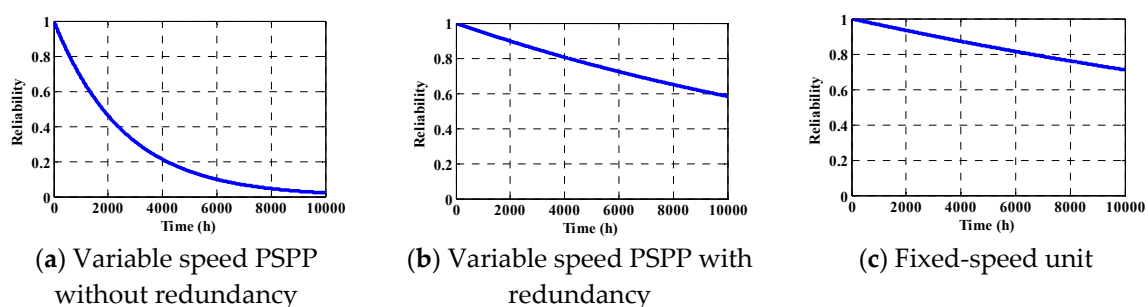


Figure 7. Reliability of a 250-MW pumped-storage power plant unit.

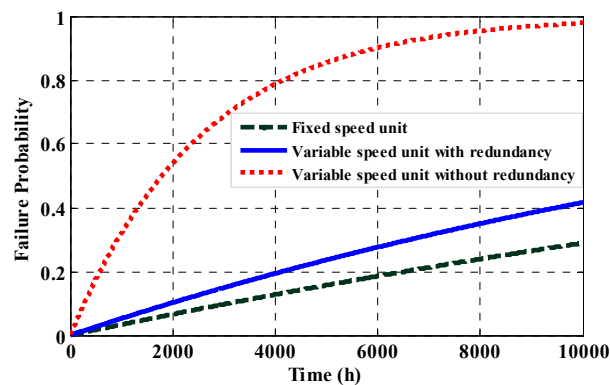


Figure 8. Failure probability of a 250-MW pumped-storage power unit.

Table 7. Failure rate and reliability chain of pumped-storage power plants.

S.No	Components	Fixed Speed PSPP (Single Channel Power Converter ****)		Variable Speed PSPP (Five Channel Power Converter ****)			
		Failure Rate	Reliability Chain	Without Redundancy		With Redundancy	
				Failure Rate	Reliability Chain	Failure Rate	Reliability Chain
1	Power Converters	4267	Parallel *	277,135	Series	36,950	Parallel ***
2	Converter Control System	3200	Parallel *	27,600	Series	3680	Parallel ***
3	Sensors	1620	Parallel	27,630	Series/ parallel **	27,630	Series/ Parallel **
4	Machine	8300	Series	14,040	Series	14,040	Series
5	Power Transformer	5940	Series	5940	Series	5940	Series
6	Excitation Transformer	5940	Series	20,790	Series	20,790	Series
7	Interphase Reactors/Filters	950	Series	4750	Series	4750	Series
8	Circuit Breakers	1920	Series	1920	Series	1920	Series
9	Cooling System	3200	Series	3200	Series	3200	Series
10	Cabling	800	Series	4000	Series	4000	Series

\*\*\*\* excitation system. \* 2 + 1 redundancy in power converter and control circuit is adopted. \*\* based on Table 2. \*\*\* Assumed standby (redundancy) power converter and control circuit are implemented.

Table 8. Availability of pumped-storage power plants.

S.No	Particulars	Pumped-Storage Power Plant Unit (250 MW)		
		Variable-Speed Unit		Fixed-Speed Unit
		Without Redundancy	With Redundancy	
1	MTTF (years)	0.295	0.934	2.63
2	Availability	0.9775	0.9916	0.9964

## 6. Conclusions

This paper presents the reliability and availability of a large-rated (250-MW) DFIM-fed variable speed pumped-storage power plant using a Markov reliability model. The availability of the unit is calculated using the failure rate and time to repair the individual equipment of the unit. The result shows that the mean time-to-failure (MTTF) of the variable-speed unit is low compared to that of a fixed-speed unit, and the availability is observed to be 0.9775 per year for the variable-speed unit compared to 0.9964 per year for the fixed-speed unit. The estimated mean time to failure (MTTF) of as low as 0.295 years is considered to be a minimum value for a large pumped-storage plant. In addition, the availability of the variable-speed unit is marginally lower by 2% compared with that of the fixed-speed unit; however, with redundancy in power converter and control circuits, the availability improves considerably, and it is expected to provide confidence to the policy makers and project authorities of hydro power plants.

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performed the literature review, simulation, collecting technical details, wrote and revised the manuscript as well. All authors have equally contributed to the simulation results, reliability calculation and result discussions.

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