# Fault Diagnosis for Building Grid-Connected Photovoltaic System Based on Analysis of Energy Loss

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Abstract. The photovoltaic (PV) systems are the most promising options to meet the rapidly increasing energy demand for renewable energy resources development. A simple and well fault diagnosis system can guarantee the normal operation of photovoltaic systems. This paper proposes a simple diagnostic method to tell the operating status of the PV systems by contrasting the simulation parameters and the measured parameters. The diagnostic algorithm uses the irradiance level, the PV modules temperature, the number of PV modules and its output power as the inputs. So, just temperature and irradiance sensors, as well as several power meters are needed in the monitoring system forming part of the fault diagnostic system. The proposed fault detection method has been successfully validated in simulation and experiment.

# **Introduction**

In the new century, as a renewable energy source, the solar photovoltaic (PV) power generation has been researched as a popular topic in the trend of low carbon economy. Large and small scale PV systems have been regarded as one of most promising renewable energy [1]. In the future, more and more PV system will be used in buildings and the application will not be limited to roof but expanded to anywhere expose to sunshine in buildings [2]. In the process of operation, many factors have adverse effect on PV system and result in output value lower than normal, such as degradation of system component, fault of component, dust gathering, sheltering, etc. The diagnosis and alarm corresponding with operation conditions above can decrease the energy loss of abnormal operation; thus decrease the input-output ratio in full life circle of PV system in another way.

Until now, a few researchers have come up with some fault diagnosis methods for PV components and system. For PV components, some researchers made a study of fault diagnosis for PV modules [3], inverter [4], maximum power point tracking [5], etc. For the system, S. K. Firth et al proposed seven faults of PV system and divided them into four categories to diagnose, considering those seven faults can't be fully distinguished by test data [6]. T. Takashima used ground capacity method to diagnose faults of parallel connection module in PV array [7]. A. Choude et al proposed a method of fault diagnosis based on the energy loss of PV array [8]. Y. Yagi et al developed a PV diagnosis method based on data analysis [9]. N. Gokmen proposed a method for diagnosing open circuit and short circuit of a string of PV panels in array [10].

The fault detection and diagnosis (FDD) system can keep the PV system in normal operation. This paper presented a FDD system based on environmental parameters and electric power parameters, which needs less parameters and easy to obtain. The corresponding test bed was established to test and verify this system.

## Grid-connected PV System and Data Acquisition System

In the grid-connected PV system, the power generated by PV array was transferred to grid-connected PV inverter, which inverts the direct current (DC) received to alternating current (AC), and provides to the electric equipment or power grid. When the power generated by PV array is not enough, inverter will get the power from grid for itself. And it will transfer redundant electric energy to grid if the power generated is sufficient. The data collection system will collect the environmental parameters (e.g., irradiance, ambient temperature, the temperature of photovoltaic cell) and electric parameters of PV system (e.g., output direct current and voltage of PV array, output alternating current and voltage of inverter). The hardware schematic diagram of whole system is shown in Fig. 1.



Fig. 1 The hardware schematic diagram of whole PV system

# **Simulation Model of PV System**

Simulation model of PV system consists of model of PV cell, MPPT model, model of inverter and other simulation models, which represents the process of electric power transformation (the power is generated by photovoltaic cells and transferred to alternating current by inverter then accesses the power grid). The simulation model of this system is shown in Fig. 2.



Fig. 2 The simulation model of the whole PV system

**Model of PV Cell.** The model of PV cell can be established by equivalent circuit based on the physical property of the cell. The common photovoltaic cell equivalent circuits are four-parameter single diode model (low degree of accuracy) [11, 12], five-parameter single diode model (complicated equation and long time for solving) [12, 13] and two-diode model (solution procedure is very difficult and normally needs necessary assumptions to solve) [14]. In this paper, two correction factors are added to traditional four-parameter single diode model, which can obtain output curve of PV cell in specified conditions accurately and quickly.

The mathematical expression of the traditional four-parameter single diode model is

$$
I = I_{ph} - I_D = I_{ph} - I_0 (\exp(\frac{V + IR_s}{nV_t}) - 1) \tag{1}
$$

Where,  $I_{ph}$  is photo-generated current (A),  $I_0$  is dark saturation current of diode (A),  $R_s$  is module internal series resistance ( $\Omega$ ), n is ideality factor of diode, V<sub>t</sub> = k\*q/T is thermal voltage of photovoltaic cell (V), where k =  $1.381 \times 10^{-23}$  J/K is Boltzmann's constant, q =  $1.602 \times 10^{-19}$ C is charge of an electron, T is temperature of PV cell (K),  $N = n*V_t$ .

In this paper, two correction factors are added to traditional four-parameter single diode model, which can obtain output curve of PV cell in specified conditions accurately and quickly. The difference between model output and measured output could be controlled to be less than 1%. The mathematical expression of four-parameter single diode model with correction factors is

$$
I = I_{ph} - I_o \left( \exp\left(\frac{V + K \cdot I + I \cdot R_s}{N}\right) - 1 \right)
$$
 (2)

where, 
$$
K = \frac{V_{mp,348} - V_{mp,348}'}{I_{mp,348} \cdot (348 - 298)} \cdot (T - T_{ref}) \cdot \frac{G}{G_{ref}} = \frac{V_{mp,ref} + 50 \cdot b - V_{mp,348}'}{50 \cdot (I_{mp,ref} - 50 \cdot a)} \cdot (T - T_{ref}) \cdot \frac{G}{G_{ref}}
$$
 is the correction factor

for maximum power point;  $V_{mp,348}$  is the measured voltage on the maximum power point when the temperature of photovoltaic module is 348K; the subscript "ref" means the parameter is under the reference state and "mp" means the parameter is on the maximum power point; a is temperature coefficient of short-circuit current, A/K; b is temperature coefficient of open circuit voltage, V/K. Generally, we take the standard test condition as the reference condition, i.e.  $G_{ref} = 1000 W/m^2$ ,  $T_{ref} =$ 298K. In this paper, we chose 348K as the benchmark to calculate K, because the maximum test temperature provided by manufacturer of photovoltaic is 348K. And this equation can be revised according to specific circumstances.

In reference condition, relevant data in technical documentation provided by manufactures can be used to calculate parameters of model, such as the open circuit voltage  $V_{\text{oc}}$ , short-circuit current  $I_{\text{sc}}$ , voltage and current of maximum power point  $V_{mp}$ ,  $I_{mp}$ , in standard test condition.

When the PV cell doesn't operate in reference condition, the equation below can be used to calculate as an extension of model parameters:

$$
I_{sc} = I_{sc,ref} \cdot \frac{G}{G_{ref}} + a(T - T_{ref}) \quad ; \tag{3}
$$

$$
I_{mp} = I_{mp,ref} \cdot \frac{G}{G_{ref}} - a(T - T_{ref}) \tag{4}
$$

$$
V_{oc} = V_{oc,ref} + b(T - T_{ref}) + M \ln(\frac{G}{G_{ref}}) \quad ; \tag{5}
$$

$$
V_{\text{mp}} = V_{\text{mp,ref}} + b(T - T_{\text{ref}}) + M \ln(\frac{G}{G_{\text{ref}}})
$$
\n
$$
\tag{6}
$$

$$
M = (V_{oc,200} - V_{oc,ref}) / \ln(\frac{G_{200}}{G_{ref}})
$$
 is the correction factor of voltage when the irradiance is

Where changing,  $V_{\text{oc,200}}$  is the open circuit voltage of PV array when  $G = 200 \text{W/m}^2$ , T=298K.

This extension can be used from PV cell to module and then to array, thus the simulation model of PV array in whole working condition is got and the form of its equation will stay the same.

**MPPT model.** From the output curve of PV characteristics, we can get the output curve of PV cell in particular environmental condition. There is a maximum output point here, i.e. maximum power point (MPP). The most commonly used algorithms of searching maximum power point are perturbation and observation method and conductance increment method. Perturbation and observation method is used to search the maximum power point in particular environmental condition in this paper.

**Model of Inverter.** Inverter consumes some power when it works, and the output efficiency will change according to different input power. In this paper, the relationship between output power and input power of inverter is fitted based on efficiency curve provided by manufacturer, which is used to simulate its theoretical output power.

**Other Models.** Other models are based on other limitation and physical laws of PV components and aim at obtaining more precise simulation. The examples are degradation model of PV cell (represents the influence of degradation in output property of cell), temperature model of PV cell (uses heat transfer method to get more accurate temperature of cell), etc.

#### **Classification and Diagnostic Method for Faults**

In this paper, nine common kinds of faults and their diagnostic method are listed here, as shown in Table 1.







On the basis of type and diagnostic method above, we divided them into time sequence fault and non-time sequence fault, according to the duration of each fault. The time sequence fault includes fault 1, 2, 3, 6, 7, 8 and 9, which uses real time data to diagnose. Fault 4 and 5 belong to non-time sequence fault, which can use historical data to diagnose.

#### Application and Verification of the Fault Diagnostic Method

We developed a fault diagnostic system based on the fault diagnostic method above in Matlab/Simulink. Tests for proposed fault diagnosis system were conducted in simulation conditions and experimental conditions respectively.

The test in simulation used a PV system combined with a PV array which has 4\*2 KC175GHT-2 PV panels and a Sunny Boy 1200 inverter. We tested the 9 faults by giving the diagnostic system the prepared data and the result is that the system can distinguish and show the corresponding fault correctly.

And using the PV test bench we built, we done the experimental test. But we could not do all the 9 fault types, so we tested the fault types from 1 to 5. The result shows that the system can distinguish and show the corresponding fault correctly in the experimental conditions. And the PV test bench we built is combined with a PV array which has 4\*2 ENN PV panels, a Sunny Boy 1200 inverter and a data acquisition system.

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