

# Islanding Detection In A Resess Supplied Microgrid Using Pmu-Fuzzy Logic Algorithm

L.O. Mogaka, G.N. Nyakoe, M. J. Saulo

**Abstract:** Islanding and loss of mains detection is very essential in power systems for the safety and reliability in grid connected and standalone Renewable Energy Sources (RESs). These RESs produce power intermittently that can lead to voltage variation, unintentional islanding and total blackouts in case of a contingency. This calls for fast, reliable and local techniques of islanding detection and voltage control criteria within the islanded microgrid (MG) and a means for seamless switching between islanded and grid connected modes. A number of islanding detection methods have been proposed so far. However, many of them fail to give reliable results in microgrids that have high penetration of multi-source RESs. This paper develops a technique for islanding detection using phasor measurement units (PMUs) and fuzzy logic algorithm for local signal extraction and classification at the point of common coupling (PCC) between the MG and the utility grid. The robustness of the proposed approach is established through application to IEEE 9 bus system with high penetration of RESs in a MATLAB/Simulink platform under different contingencies. The obtained results indicate that the proposed algorithm is fast, reliable, and secure in discriminating between the islanding and non-islanding scenarios for the tested cases.

**Index Terms:** Phasor Measurement Unit, Loss of Mains detection, Power system islanding, Microgrids

## 1 INTRODUCTION

There has been increasing interest in the research on the integration of RESs like wind and solar photovoltaic (PV) into the main grid and MG operation. This is because of their friendliness to the environment and abundance of these resources. However, LOMs and unintentional islanding is the main challenge in this integration. Thus, it becomes necessary to detect all the islanding events so that the MG can switch to autonomous operation mode so as to provide reliable power supply to connected loads within the islanded region. An islanded condition can be defined as the situation where a section of the main power grid is isolated from the rest of the main power grid, and DGs continue to supply the isolated loads of the network. This can be due to an occurrence of a fault upstream or some other disturbance that can lead to LOMs. Fast and reliable method for detecting unintentional islanding condition is necessary for a number of reasons. These include posing of a safety hazard to the utility personnel, equipment damage or destruction due to poor quality power supply and out-of-synchronism reclosure of the system to the grid. Immediately upon islanding detection, control signal should be sent to the converters of the connected DGs so that operation strategy is changed to autonomous mode so as to ensure quality power is supplied to the connected loads within the MG [1]. To maintain the system stability and voltage within the required limits, LOMs and islanding condition detection should be followed by appropriate control decisions and actions. The IEEE1547-2003 standard stipulates that the unintended islanding should be detected and disconnected within two seconds of occurrence [2]. However, this maximum time duration of two seconds covers a number of steps and processes.

This include; islanding detection, trip signal generation, trip signal transfer and breaker opening of the generator in the island. Any algorithm to detect islanding condition should therefore have measurement capabilities which would significantly signal a voltage collapse in shortest time possible with a low latency in the transmission of the signals [3]. There have been several approaches and techniques that have been employed in the detection of the LOMs and islanding condition. These include the state estimation of the network from SCADA which is largely dependent on reliable communication channels between the Distributed Generator (DG) and remote-control site. However, the control room operators monitoring large grids usually know about islanding from conventional SCADA system much later after its actual occurrence due to the communication system latencies. A reliable method for islanding detection should work for all the possible scenarios for islanding that can occur. To mitigate this, there is therefore a need of the facilitation for an automated method of islanding detection to control room operators, thus enabling them to take preventive and corrective actions well in advance so as to avert any damage to the grid [4]. A number of studies have been conducted on islanding detection, though not exhaustively. This is because the grids keep on evolving to meet the smart grid requirements as the technology advances. For instance, in [5] the authors developed a test device which could be used to optimize PMU based on islanding detection technology and then confirmed the working of their method in solar PV stations for islanding detection. In [6], the authors used wide area synchrophasor measurements in islanding detection. PMU measurements were also applied for islanding detection using a probabilistic principal component analysis technique in [7]. In [8], a novel method based on Wavelet Transform (WT) and modified feed forward neural network to detect islanding and classify power quality problems is proposed. PMU data was used in the detection of LOMs and islanding in a statistical approach as proposed in [9]. In [10], PMUs were also applied in islanding detection of interconnected grids, Loss of Parallel Feeder, loss of load and generation. In [11], PMUs measurements were used to continuously monitor the phase of generators in a wide area in the detection of LOMs and generator synchronization. However, the

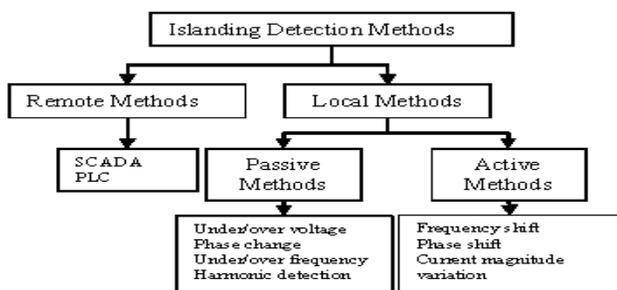
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communication latencies that are associated with this approach were not put into consideration. If an island should occur, it should exist for only a very brief period of time, unless the aggregate real and reactive power output of all the DG supporting the island is equal or close to the load demand. Otherwise, the voltage and frequency within the island will change rapidly and the DG has to be shut down so as to prevent this. This is as per IEEE Standard 1547 which states that the DG must be disconnected from the isolated grid within two seconds after an unintentional islanding event. Generally, passive islanding detection methods exploiting local PMUs are computationally efficient and cheap to implement. In this paper, a simulation of islanding detection locally at the PCC by using a combination of PMU and FL for signal extraction and classification respectively is presented. Performance assessment of the proposed approach is tested by performing islanding condition by opening the Circuit Breaker (CB) at the PCC and compared with the results for normal operating condition. The rest of the paper is structured as follows; Part 2 gives a brief literature review on various approaches of LOMs and islanding detection. Section 3 introduces the formulation of the problem for the proposed islanding detection using PMU-FL algorithm while Section 4 discusses the methodology used in this approach. The simulation results and their discussions are presented in section 5 and finally the paper conclusions are discussed in section 6.

**2 LITERATURE REVIEW**

**1.1 Islanding Detection Techniques**

There are two types of islanding in a power system: Intentional islanding and unintentional islanding [6]. Intentional islanding is performed for either maintenance or load-shedding purposes to protect the rest of the power grid and avoid a total blackout. The isolated generators operate in frequency and voltage control mode to provide constant voltage to local loads in the isolated network while maintaining the isolated grid frequency. On the other hand, unintentional islanding occurs due to equipment failure or severe faults resulting in the opening of circuit breakers that interconnect the island with the rest of the power system. This may result in hazards in power system operation and may lead to safety risks to the maintenance personnel [6]. The safe operation and stability of the grid is very important in DG systems and islanding detection is a very crucial part of it. The islanding detection methods can be classified into two main groups: Local and Remote islanding detection methods [5]. This is elaborated in the figure 1 below [12].

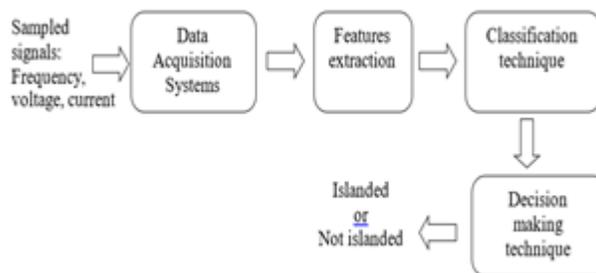


**Figure 1: Classification of Islanding Detection Methods**

The local techniques of islanding detection use the information and data available at the Point of Common Coupling (PCC). The passive methods use the local measurements at the DG side and monitor for sudden electrical parameters variations [13], [14] [15]. The variation in the measured data magnitude is compared with the set tripping thresholds so as to determine the islanding and a grid connected condition. Remote islanding techniques are based on supervisory control and data acquisition (SCADA) LOMs detection systems.

**2.2 General Islanding Detection Steps**

Islanding condition and LOMs detection has been a concern for a while now, that is why researchers have been tirelessly working on ways of quickly detecting it and taking appropriate action. Signal processing techniques and artificial intelligence are generally used in signal extraction and classification as islanded or not islanded. In whatever technique combination adopted, the steps used to detect the LOMs and island formation are as shown in figure 2 below [16]



**Figure 2: General islanding detection steps**

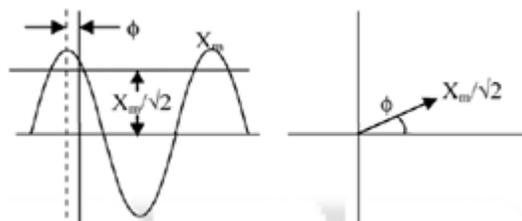
**1.2 Phasor measurement units**

Now that the existing power system is a complex network consisting of various interconnected components, it is important to continuously monitor the system and protect its elements so as to avoid any contingency that can occur. In this study PMUs are used in islanding detection. Consider a pure sinusoidal waveform as shown in equation (1) below.

$$x(t) = X_m \cos(\omega t + \phi) \tag{1}$$

This can be represented by a unique complex number known as a phasor as shown in equation (2). This equation can be represented graphically as shown in figure 3 below [17].

$$x(t) = \text{Re}\{X_m e^{j(\omega t + \phi)}\}$$



**Figure 3: Phasor representation of sinusoidal signal**

The PMUs give operators a time-stamped snapshot of the power system. They consist of bus voltage phasors and branch current phasors, in addition to information such as

locations and other network parameters. Time synchronization allows synchronized real-time measurements of multiple remote measurement points on the grid. PMUs have found numerous applications in identification and evaluations of power system states. Since they measure multiple parameters synchronized by a time reference, they can be used for islanding detection too more quickly with higher accuracy as compared to the conventional methods [4].

### 3 PROPOSED METHODOLOGY

The operation of PMUs is based on a recursive Discrete Fourier Transform (DFT) [18] [19]. This is as shown below.

$$X^{N-1} = \frac{\sqrt{2}}{N} \sum_{n=0}^{N-1} x_n \{ \cos(n\theta) + j \sin(n\theta) \} \quad (3)$$

Where  $N - 1$  is the signal sample up to the time when the phasor is evaluated. The frequency measurement can be expressed as shown in the equation below.

$$f = \frac{\omega}{2\pi} = \frac{\cos^{-1} \left( \frac{v(n-1) + v(n+1)}{2v(n)} \right)}{2\pi T} = \frac{\cos^{-1} \left( \frac{\eta}{2} \right)}{2\pi T} \quad (4)$$

Where  $T$  is the sampling time and  $v(n-1)$ ,  $v(n)$ ,  $v(n+1)$  are three successive extracted signal samples. The voltage measurement can be expressed by the equation below.

$$V = \sum_{n=1}^N A_n \sin(n\omega t + \varphi_n) + A_{dc} e^{-\sigma t} + \varepsilon \quad (5)$$

Where  $\varepsilon$  is the noise in the signal,  $A_n$  is the amplitude of the voltage,  $A_{dc}$  is the dc amplitude decay,  $\varphi_n$  the phase of the measured signal,  $\omega$  the radian frequency of the signal and  $t$  is the sampling time. The PMU data variations are measured at the PCC during normal and islanding conditions in the process of islanding detection. The extracted signals are then subjected to FL algorithm for classification. Islanding is detected when phasor voltage, frequency and phase angle measurements exceed the set safe limit. IEEE 9-bus was modified to include RESs in the network by replacing the conventional generators with equivalent capacity wind and solar farms as shown in figure 4 below. The system contains 3 generators, 9 buses and 3 loads. The system is grid connected at the PCC. PV and wind generation RESs are connected at bus number 1 and 3.

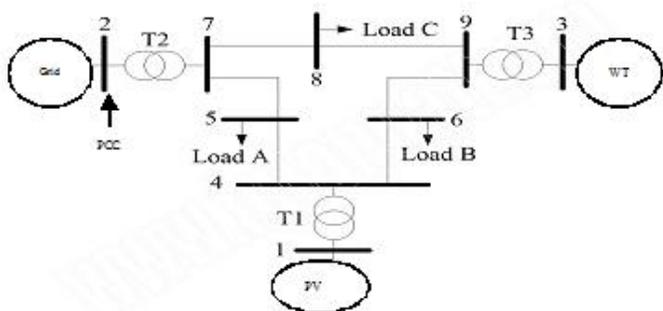


Figure 4: Modified 9-bus test system

The corresponding generation, load and line data is shown in table 1 and 2.

Table 1: RESs Generation and load data

Bus	P <sub>G</sub> (MW)	P <sub>L</sub> (MW)	Q <sub>L</sub> (MW)
1	0	0	0
2	163	0	0
3	85	0	0
4	0	0	0
5	0	125	50
6	0	90	30
7	0	0	0
8	0	100	35
9	0	0	0

Table 2: 9 bus line data

From Bus	To Bus	Resistance (PU)	Reactance (PU)
1	4	0.0000	0.0580
2	7	0.0170	0.0920
3	9	0.0390	0.1700
4	5	0.0000	0.0590
4	6	0.0119	0.1010
7	5	0.0085	0.0720
7	8	0.0000	0.0630
9	6	0.0320	0.1610
9	8	0.0100	0.0850

There are three equal loads  $L_A$ ,  $L_B$  and  $L_C$  all are rated at 125MW, 90MW and 100MW. An islanding condition was simulated by disconnecting the mains and observations made. The phase currents and voltages were measured and extracted using PMU located at the PCC. The extracted signal was then subjected to FL algorithm to classify whether the system is islanded or not. This is demonstrated by the figures in the following sub-sections. The PMU-FL arrangement was modelled as shown in figure 5 below.

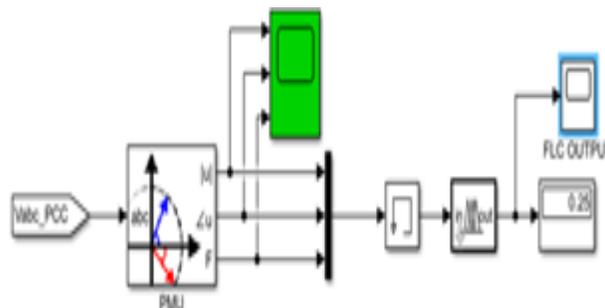


Figure 5: PMU-FL arrangement

Now that the solar PV array has a nonlinear behaviour and its output changes repeatedly due to change in weather conditions, a perturb and observe (P&O) MPP tracker was used to help the PV array to deliver maximum power at its output and thus increases the system efficiency. In order to evaluate the applicability of this approach, the following test scenarios are performed; Normal operating condition and islanding condition by opening the CB. Figure 6 below is the proposed flowchart for this approach of islanding detection.

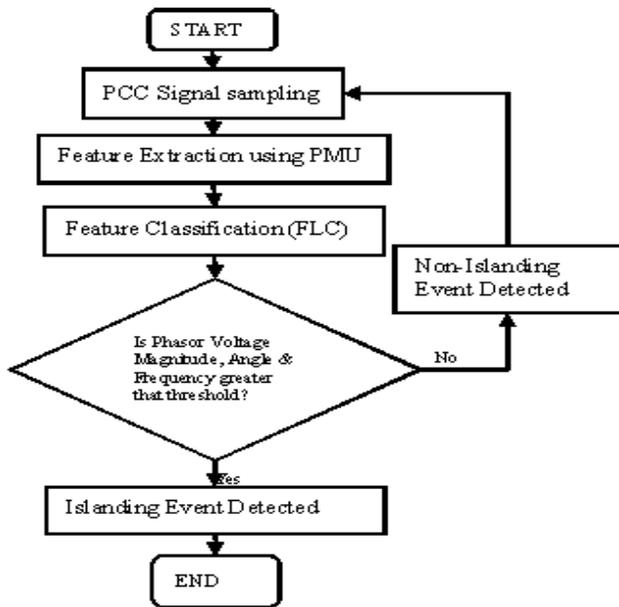


Figure 6: Proposed Islanding Detection flowchart

#### 4 SIMULATION RESULTS AND DISCUSSIONS

The PCC voltage and current measurements before and after islanding condition were observed as shown in figure 7 and 8 below.

phasor voltage magnitude, angle and frequency for both normal an islanding condition was measured at the PCC. This is shown in figure 9-11 below.

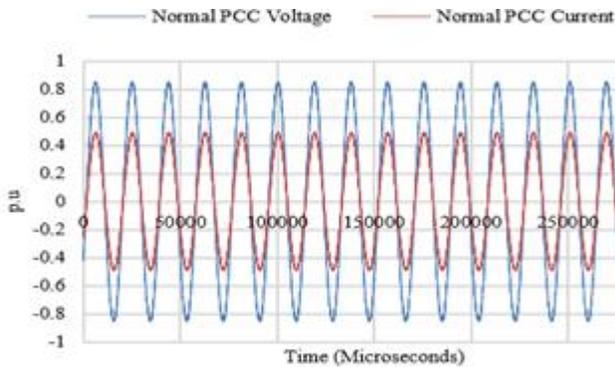


Figure 7: Normal PCC Measurements

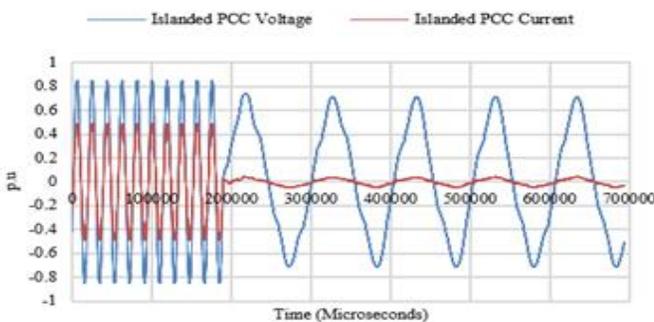


Figure 8: Islanded PCC Measurements

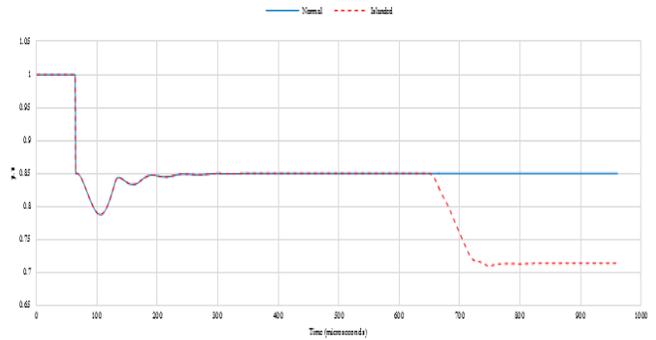


Figure 7: Phasor voltage magnitude

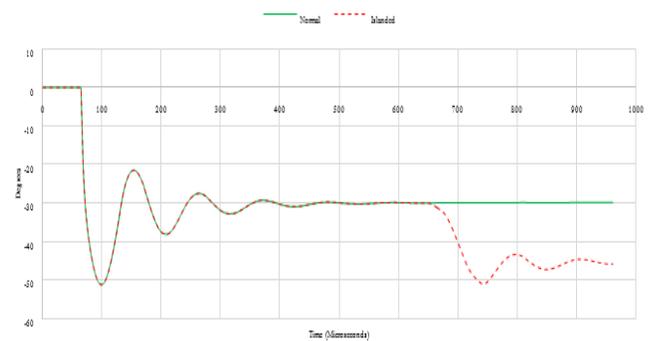


Figure 8: Phasor Voltage Angle

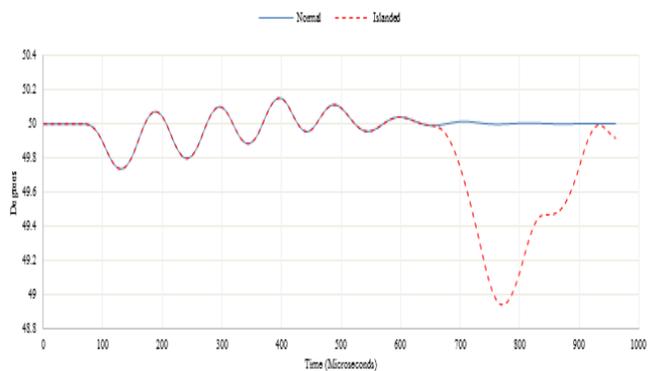
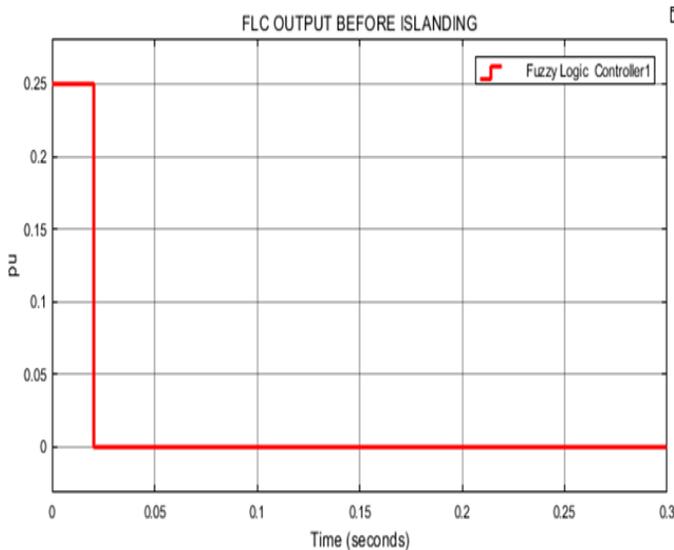


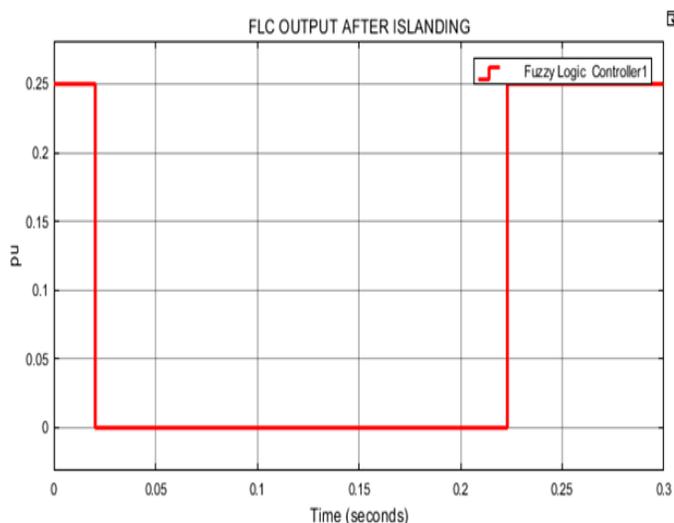
Figure 9: Phasor Voltage Frequency

Disconnection of the switch at the PCC causes the loss of mains, and this needs to be detected within 2 seconds for compliance with IEEE standard 1547. In this study, the data extracted by PMU is subjected to FL algorithm for classification. The FL output before and after islanding is as shown in figure 13 and 14 below.

When there is loss of mains and an island is formed, the phasor voltage magnitude, phase angle and frequency at DG side changes significantly. If these variations exceed the set threshold, an islanding condition is detected. The



**Figure 10: FL output before islanding**



**Figure 11: FL output after islanding**

The above results show that this approach can accurately distinguish between islanding and non-islanding scenarios.

## 5 CONCLUSION

In this paper, a PMU-FL based local islanding detection approach is proposed and tested under different contingencies and different penetration levels. The results indicate that a combination of PMU and FL can successfully be used to extract and classify signals locally to quickly signify the loss of mains and islanding occurrence. The proposed approach is robust enough to detect islanding events rapidly with high level of accuracy and can avoid unnecessary DG outage for any fault event within the MG as the signals are extracted at the PCC and classified locally. It can therefore be concluded that given the actual parameters of any given grid with RESs LOMs and islanding can be quickly detected locally using this approach and hence avoid associated catastrophes and losses.

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