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Wavelet-Based Monitor for Grid Impedance Estimation of Three-Phase Networks

Denis K. Alves, Ricardo L. A. Ribeiro, *Member*, *IEEE*, Flavio B. Costa, *Member*, *IEEE*, Thiago O. A. Rocha, and Josep M. Guerrero, *Fellow*, *IEEE*

Abstract—This paper proposes a wavelet-based monitor (WBM) for grid-impedance estimation, which combines a wavelet-based transient detection scheme (WB-TDS) and a wavelet-based grid impedance estimator (WB-GIE). The WB-TDS employs the analysis of the wavelet coefficients energy for detecting grid impedance changing, whereas the WB-GIE estimates the grid-impedance by using the real-time stationary discrete wavelet packet transform (RT-SDWPT) associated with signal injection scheme. During a grid impedance changing, the WB-TDS triggers the WB-GIE for injecting an interharmonic into the power grid to estimate its current impedance. This method mitigates the THD generated by the continuous signal injection employed in the existing techniques. The WB-GIE identifies the phase grid impedance resistance and reactance accurately in balanced or unbalanced conditions. Due to its inherent characteristics, WBM is suitable to be inserted into the adaptive power flow control of distributed generation systems. Experimental results obtained from a grid-connected photovoltaic generation laboratory setup validated the proposed method and demonstrated its effectiveness.

Index Terms—Grid impedance estimation, steady-state active method, wavelet transform.

I. INTRODUCTION

T HE insertion of renewable energy sources as distributed generations (DG) modified the composition of the power system following the modern concept of the microgrid. In this model, the DG sources interconnect the grid via power converters as active front-end (AFE) that regulate the power flow in any direction [1], [2], which demanded efforts for achieving robustness and reliability. Therefore, to maintain these DGs as secure supplies with suitable power quality has become more challenging. Besides, AFEs must operate in both grid-connected and islanded modes, requiring modifications in the power flow control strategy. In general, the AFE control systems employ droop methods for regulating

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J. M. Guerrero is with the Department of Energy Technology, Aalborg University, 9220 Aalborg East, Denmark (Tel: +45 2037 8262; Fax: +45 9815 1411; e-mail: joz@et.aau.dk). J. M. Guerrero was funded by a Villum Investigator grant (no. 25920) from The Villum Fonden. the active and reactive power injection by regulating the frequency and amplitude of the output voltage [3]. However, conventional droop approaches depend on the grid parameters to decouple the control of active and reactive power flows [4]. Therefore, the knowledge of grid impedance can contribute to suitable control operation decisions, providing inputs for load flow studies, DGs dispatchability, protection, or detection of islanding conditions [5]. Thus, the implementation of an embedded strategy to estimate grid impedance has excellent utility in the power flow control and operation of the actual power system [6].

Different methods could be employed to estimate grid impedance whose implementation can follow passive or active approaches [6]. Passive approaches use the information of noncharacteristic voltage and current harmonics, already present in the system, to estimate the grid impedance [7]. Therefore, these techniques employ the existing structures of control and acquisition for implementing grid impedance estimation algorithms. Regarding this approach, the controlled excitation of the frequency characteristic of an LCL-based inverter demonstrated to be an alternative for estimating the impedance of grid-connected inverters [8]. A recursive leastsquare (RLS) technique for analyzing voltages and currents of the DG interface was another method for obtaining the grid equivalent impedance [9]. Another possibility is to estimate the grid impedance by processing voltage, and current phasors at the point of common coupling (PCC) derived from a frequency-locked loop based on a second-order generalized integrator (SOGI-FLL) [4]. Extended Kalman Filter (EKF) can analyze the PCC voltages and currents to estimate the power network impedance [10]. Also, it is possible to use the discretized grid-tied model in a rotating reference frame to evaluate the grid inductance and resistance [11]. However, passive approaches present a drawback related to the inherent low signal-to-noise ratio (SNR), which can compromise the accuracy of the grid impedance estimation [11].

Active methods that employ a signal injection to estimate the grid impedance overcome drawbacks of passive techniques [11]. Their implementation can follow transient or steady-state techniques [6]. Transient methods employ noncharacteristic signal injections as voltage disturbance, or current spike to estimate the grid impedance over a wide frequency range via a postprocessing procedure [5], [12]–[14]. The drawback of using the voltage disturbance as signal injection refers to its dependence on existing harmonic distortion due to the presence of moderate power electronic loads. Instead, the injection This article has been accepted for publication in a future issue of this journal, but has not been fully edited. Content may change prior to final publication. Citation information: DOI 10.1109/TIE.2020.2972460, IEEE Transactions on Industrial Electronics

of a current spike showed to be more efficient to minimize these disturbances [12]. This signal analysis generates much more data than needed and can overload the real-time control algorithm of power interfaces. An alternative is to use the steady-state approach based on a periodic interharmonic signal injection and analyze the system response [6].

Both transient and steady-state active methods usually use the discrete Fourier transform (DFT) that is dependent on existing harmonic distortions and susceptible to power electronic loads. These estimation approaches can be ineffective during transient events and lead to wrong interpretations due to spectral leakage and picket-fence effects. The use of continuous wavelet transformer (CWT), with a complex mother wavelet, instead of DFT demonstrated to be an alternative to overcome these limitations [15]. However, the CWT is not usually embedded in real-time applications due to its complexity.

The discrete wavelet transform (DWT) versions, such as the stationary discrete wavelet packet transform (SDWPT), with real mother wavelet, have been used successfully as an alternative to the CWT in several practical applications. However, DWT versions with real mother wavelet present mathematical limitations for estimating phase angle [16]. Based on this statement, the DWT has been claimed to be unsuitable for impedance estimation [15], and no method based on it was available in the literature. Nevertheless, [17] demonstrates recently that a cross-analysis of both voltage and current system response overcomes the lack of phase information and makes the SDWPT-based impedance estimation viable for real-time applications. The method proposed in [17], based on a steady-state active approach, injects an interharmonic component continuously into the power system to estimate the grid impedance, which can result in power quality deviations in the PCC. Moreover, important issues such as time duration and magnitude of the signal injection, as well as the best choice of the mother wavelet, were not assessed in [17]. Besides, [17] presents no mechanism to identify when the grid impedance needs to be estimated.

Active steady-state methods inject controlled voltage or current signals (interharmonic, step signals, etc.) into the reference controlled system, provoking disturbances, and power quality problems (harmonic distortions) [18]. To overcome this drawback, a hybrid strategy composed of the integration of transient approach and a Luenberger observer modified the estimation algorithm to only provide the signal injection when grid impedance changes occur [19]. This strategy improves the THD when compared with the alternative proposed by [17] by constraining the signal injection to those time intervals related to the grid changes, but still has the DFT restrictions related before. Also, the insertion of the estimation method into the control strategy generates grid-impedance estimates on the stationary reference frame, which could introduce errors in unbalanced conditions due to the lack of homopolar component information [20].

In the same direction, this paper proposes a wavelet-based monitor (WBM) for grid-impedance estimation, which combines a power system transient detection (WB-TDS) and a grid impedance estimation (WB-GIE) approaches both using wavelet-based techniques. The WB-TDS employs the analysis of the wavelet coefficient energy to detect transit events. According to [21], the first level wavelet coefficient energy can be used for the high-speed detection of voltage sag, faults, nonstationary disturbances, or switching maneuver due to a fast increase of energy in the disturbance inception time. For instance, when the network is subject to any disturbance, such as the grid impedance change, the WB-TDS detects it and triggers the WB-GIE. Therefore, the WB-GIE injects a noncharacteristic signal (interharmonic component) into the PCC for a fast and accurate estimation of the power grid impedance using the SDWPT method. The WBM restricts the signal injection to a small-time interval, and low-level interharmonic required for an accurate grid impedance estimation without inducing power quality problems into the grid.

Furthermore, the WB-GIE estimates the grid impedance resistance and reactance of each PCC phase and correlates it with the previous results for showing the dynamic evolution. The WB-GIE employs a compact mother wavelet for avoiding a long-duration signal injection. Due to their inherent characteristics, the WBM demonstrates to be suitable for integrating power flow adaptive control strategies applied for DG systems. Experimental results obtained from a photovoltaic (PV) distributed generation laboratory setup validated the proposed method and demonstrated its effectiveness and feasibility.

II. SYSTEM MODELING AND CONTROL

Fig. 1 shows the laboratory setup of the DG system implemented by a grid-tied PV system based on dual-stage conversion topology. It comprises a three-phase PV system with a rated power of 8 kWp interconnected to a power grid implemented by a 15 kVA three-phase indoor substation. The dc-dc boost converter regulates the dc-link voltage and implements the MPPT by changing its duty-cycle. An *LCL* filter interconnects the PV voltage source inverter (VSI) to the PCC. Controlled switches K5, K6 and K7 interconnect three-phase linear or nonlinear loads to the PCC for emulating different operational scenarios. The controlled switches K1 - K4, together with the external components r_{test} and l_{test} , allow for the modification of the nominal grid impedance (r_g and l_g). This structure permits the emulation of weak-grid with different R/X rates or unbalanced conditions.

The value of the short-circuit ratio (SCR) defines the grid strength. Considering the system in Fig. 1, where the value of short-circuit power is $S_{SC} = 50.3$ kVA and the nominal power of the distributed generation is $S_n = 8$ kWp, the SCR is computed as follows [22]:

$$SCR = \frac{S_{SC}}{S_n} = \frac{50300}{8000} \approx 6.3,$$
 (1)

in which SCR < 10 addressing to a weak-grid condition according to [23]. The PV-based DG system employs the most commonly multiloop control strategy applied for grid-tied LCL converter, also presented in Fig. 1. The inner control loop regulates output phase currents, and the outer control loop sets the dc-link voltage. The controller $R_v(s)$ regulates the DC-link voltage based on the system energy balance, by determining the amplitude of the PV system output

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Fig. 1. Block diagram of the 8 kWp PV three-phase laboratory setup.

vector current $|i_d|$ imposed by the controllers $R_i(s)$. They are implemented on the stationary reference frame with their bandwidths adjusted for allowing the required interharmonic injection. Both blocks WB-TDS and WB-GIE implement the proposed grid-impedance estimation scheme (WBM). The integration of WB-GIE to the DG control system results in modified reference currents composed by interharmonic injection added to standard track currents (i.e, $i_{dq}^{s*'} = i_{dq}^{s*} + i_{idq}^{s*}$), in which the superscript s represents the stationary reference frame. The WB-GIE injects the interharmonic in the stationary reference frame, but both WB-TDS and WB-GIE use threephase voltages and currents, which permit the grid changing detection and the grid impedance estimation in each PCC phase. Therefore, the WBM provides accurate estimation results, even though the power system operates under unbalanced conditions.

III. BASIS OF THE PROPOSED WBM ESTIMATOR

The proposed WBM employs the real-time SDWPT (RT-SDWPT) to implement the network transient detection and grid impedance estimation strategies.

A. The Real-Time Wavelet Packet Coefficients

The RT-SDWPT decomposition packet coefficients at level *j* are computed as follows [24]:

$$s_j^{2z}(k) = \frac{1}{\sqrt{2}} \sum_{l=0}^{L-1} h_{\varphi}(l) s_{j-1}^z(k+l-L+1), \qquad (2)$$

$$s_j^{2z+1}(k) = \frac{1}{\sqrt{2}} \sum_{l=0}^{L-1} h_{\psi}(l) s_{j-1}^z(k+l-L+1), \qquad (3)$$

where $0 \le z \le 2^{j-1} - 1$ is the node number; s_j^z is the wavelet packet coefficients associated to the node z at scale j; $s_0^0 = x$ represents the original signal; L is the length of the wavelet filter; k is the current sampling associated to the time k/f_s , where f_s is the sampling rate; h_{φ} and h_{ψ} are low- and highpass finite impulse response (FIR) quadrature mirror filters. Based on [25], the spectral energy (\mathcal{E}) of a signal x in terms of the SDWPT, at any scale j, is given by:

$$\mathcal{E}(k) = \sum_{n=k-\Delta k+1}^{k} |x(n)|^2 = \mathcal{E}_{j,x}^0(k) + \sum_{z=1}^{2^j-1} \mathcal{E}_{j,x}^z(k), \quad (4)$$

where

$$\mathcal{E}_{j,x}^{0}(k) = \frac{1}{2\Delta k} \sum_{n=k-\Delta k+1}^{k} \sum_{l=0}^{L-1} \left[s_{j,x}^{0}(k-l) \right]^{2}, \quad (5)$$

$$\mathcal{E}_{j,x}^{z}(k) = \frac{1}{2\Delta k} \sum_{n=k-\Delta k+1}^{k} \sum_{z=1}^{2^{j}-1} \sum_{l=0}^{L-1} \left[s_{j,x}^{z}(k-l) \right]^{2}, \quad (6)$$

where $k \ge \Delta k$ -1, $\mathcal{E}_{j,x}^0$ is the energy of wavelet packet coefficients of the lowest frequency band at node zero and level j, whereas $\mathcal{E}_{j,x}^z(k)$ is the energy of wavelet packet coefficients at node $z \ne 0$; Δk is the number of samples per cycle of the power system frequency (f = 50 or 60 Hz).

B. Estimation of Power Components with RT-SDWPT

The RT-SDWPT can estimate the main power components according to the IEEE Standard 1459-2010 [26], useful for accomplishing the accurate grid impedance estimation.

1) The RMS Values: The discrete time-domain signal x(k) can be described in terms of the RF-SDWPT coefficients as follows (s_{i}^{z}, x) [24]:

$$x(k) = \frac{1}{\sqrt{2}} \sum_{l=0}^{L-1} h_{\varphi}(l) s_{j,x}^{0}(k-l) + \frac{1}{\sqrt{2}} \sum_{z=1}^{2^{j}-1} \sum_{l=0}^{L-1} h^{z}(l) s_{j,x}^{z}(k-l)$$
(7)

The filter h is defined as follows:

$$h^{2z} = h_{\varphi} \quad \text{and} \quad h^{2z+1} = h_{\psi}. \tag{8}$$

The signal x(k) can also be termed in function of the wavelet packet coefficient energy as follows [24]:

$$[x(k)]^{2} = \frac{1}{2} \left[\sum_{l=0}^{L-1} (\mathcal{E}_{j}^{0}, x(k-l))^{2} + \sum_{z=1}^{2^{j}-1} \sum_{l=0}^{L-1} (\mathcal{E}_{j}^{z}, x(k-l))^{2} \right].$$
(9)

Therefore, the wavelet-based RMS value is given by [24]:

$$X_w(k) = \sqrt{\frac{1}{2\Delta k} \sum_{n=k-\Delta k+1}^{k} \left[\sum_{z=0}^{2^j-1} (X_j^z(n))^2\right]},$$
 (10)

where $X_w = V_w$ for voltage or $X_w = I_w$ for current, and

$$X_j^z(n) = \sqrt{\sum_{l=0}^{L-1} (\mathcal{E}_j^z, x(n-l))^2}.$$
 (11)

is the wavelet-based RMS value at node z.

From (10) in (11), the wavelet-based RMS voltage is given by:

$$V_w(k) = \sqrt{\frac{1}{2\Delta k} \sum_{n=k-\Delta k+1}^{k} \left[\sum_{z=0}^{2^{j-1}} \sum_{l=0}^{L-1} (\mathcal{E}_j^z, v(n-l))^2\right]}.$$
(12)

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Similarly, the wavelet-based RMS current is given:

$$I_w(k) = \sqrt{\frac{1}{2\Delta k} \sum_{n=k-\Delta k+1}^{k} \left[\sum_{z=0}^{2^j-1} \sum_{l=0}^{L-1} (\mathcal{E}_j^z, (n-l))^2\right]}.$$
 (13)

2) *Power Components:* The active power can also be described in terms of the RT-SDWPT coefficients as follows:

$$P_{w}(k) = \frac{1}{\Delta k} \sum_{n=k-\Delta k+1}^{k} v(k)i(k),$$
 (14)

where v(k)i(k) in wavelet terms is given by [24]:

$$v(k)i(k) = \frac{1}{2} \sum_{l=0}^{L-1} s_{j,v}^{0} (k-l) s_{j,i}^{0} (k-l) + \frac{1}{2} \sum_{z=1}^{2^{j-1}} \sum_{l=0}^{L-1} s_{j,v}^{z} (k-l) s_{j,i}^{z} (k-l).$$
(15)

Therefore, substituting (15) in (14) yields [24]:

$$P_{w}(k) = \frac{1}{2\Delta k} \sum_{n=k-\Delta k+1}^{k} \left[\sum_{l=0}^{L-1} \mathcal{E}_{j}^{0}, v(n-l) \mathcal{E}_{j}^{0}, i(n-l) + \sum_{z=1}^{2^{j-1}} \sum_{l=0}^{L-1} \mathcal{E}_{j}^{z}, v(n-l) \mathcal{E}_{j}^{z}, i(n-l) \right],$$
(16)

where $P_w(k)$ represents the total active power of the frequency band associated to the node z and level j. (16) is in accordance with the Parseval's theorem.

From (10), the wavelet-based apparent power is given by

$$S_w(k) = V_w(k)I_w(k).$$
(17)

Based on the classical power theory, the wavelet-based power factor is given by:

$$PF_w(k) = \frac{P_w(k)}{S_w(k)}.$$
(18)

IV. THE PROPOSED GRID CHANGING DETECTION - WB-TDS

The implementation of the proposed WB-TDS employs the analysis of the wavelet coefficient energy for detecting transient network events based on [21]. According to this method, the wavelet coefficients of power system voltages and currents, at the first decomposition level, present a Gaussian probability distribution function with zero mean ($\mu_w \approx 0$) and a standard deviation (σ_w) , termed as $N(0, \sigma_w^2)$, with harmonics disregarded in this related wavelet sub-band. In this fashion, the wavelet coefficient energy in the steady-state is only affected by high-frequency noises and can be employed to detect disturbances through established thresholds, which follows the chi-square probability distribution [27]. Therefore, the occurrence of any grid disturbance (e.g., faults, voltage sag, nonstationary disturbances, switching maneuver, etc.) produce an increase of the wavelet coefficient energy providing a high-speed detection of the grid-impedance changing, which follows a simple criterion:

$$\mathcal{E}^{1}_{1,\{v,i\}}(k-1) < E \quad \text{and} \quad \mathcal{E}^{1}_{1,\{v,i\}}(k) > E,$$
 (19)

where $\mathcal{E}_{1,\{v,i\}}^1$ represents the energy of wavelet coefficients of the node one in the first level, at the frequency band [480, 960] Hz (s_1^1) and E is an energy threshold stochastically defined in [27] as two times of the steady-state average energy level and, hence, when (19) is verified, the proposed WB-TDS triggers the WB-GIE for injecting a synthesized interharmonic into the power grid for estimating its impedance.

V. THE PROPOSED GRID IMPEDANCE ESTIMATOR -WB-GIE

The proposed WB-GIE method estimates the grid impedance by injecting a temporary interharmonic (i_{fint}) to the PV control system reference currents. The use of this noncharacteristic signal injection relies on the fact that under standard operational such frequency component does not exist in the system. Moreover, the chosen interharmonic must have a frequency higher than the fundamental, with low magnitude and short duration to avoid interference in the power grid performance. The suggested frequency is addressed in this Section, whereas its magnitude and duration will be discussed in Section VI.

A. Sampling Rate and the Decomposition Level

According to the Nyquist criterion, a discrete signal with the sampling rate of f_s has frequency band components limited from 0 to $f_s/2$. From the multiresolution analysis, it is possible to decompose an input signal in various frequency sub-bands with different resolution levels. The SDWPT employs the multiresolution analysis, obtained through the inner product of an input signal with a quadrature mirror filter pair (low- and high-pass filters). The extraction of the synthetic interharmonic component depends on both the sampling rate and wavelet decomposition level. Firstly, the fundamental and the harmonics must be located on the cutoff frequencies of the wavelet filters, which means that f_s must be multiple integers of 8f. Besides that, the synthetic interharmonic must be centered in one of the wavelet sub-bands to ensure superior performance in its component extraction.

For instance, employing a sampling frequency of $f_s = 1920$ Hz with a fundamental frequency of f = 60 Hz (32 samples per cycle), it is necessary four decomposition levels (j = 4). Therefore, the frequency spectrum is divided into sixteen bands with a regular 60-Hz interval, with the fundamental and harmonic components located on cutoff frequencies of these bands. For improving the grid impedance estimation and avoiding the side-effects due to the fundamental and low-order harmonics of the power grid, it is essential to choose the interharmonic frequency far from them. One possible solution is to select the interharmonic frequency of $f_{int} = 630$ Hz. Fig. 2 presents the decomposition tree to extract the interharmonic component of this example, with the synthesized interharmonic centralized at the band [600 - 660] Hz in the fourth decomposition level.

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Fig. 2. Wavelet-packet decomposition for a sampling frequency of 1920 Hz: (a) four-level decomposition tree; (b) ideal frequency response.

B. Estimating the Grid Impedance of the Power Grid

Based on (10), the RMS interharmonic voltage and current are computed as follows:

$$V_{f_{int}}(k) = \sqrt{\frac{1}{2\Delta k} \sum_{n=k-\Delta k+1}^{k} \left[\sum_{l=0}^{L-1} (\mathcal{E}_{j,v}^{f_{int}}(n-l))^2 \right]}, \quad (20)$$

$$I_{f_{int}}(k) = \sqrt{\frac{1}{2\Delta k} \sum_{n=k-\Delta k+1}^{k} \left[\sum_{l=0}^{L-1} (\mathcal{E}_{j,i}^{f_{int}}(n-l))^2 \right]}, \quad (21)$$

where $\mathcal{E}_{j,v}^{f_{int}}$ and $\mathcal{E}_{j,i}^{f_{int}}$ are wavelet coefficient energies of the voltage and current, respectively, at node z and scale j which include the interharmonic frequency f_{int} in the band center.

It is well-known that the SDWPT with a real mother wavelet cannot provide the phase information of a single signal, such as a voltage or a current directly. However, the phase angle difference between the current and voltage can be properly computed using power concepts as follows [17]:

$$P_{f_{int}}(k) = \frac{1}{2\Delta k} \sum_{n=k-\Delta k+1}^{k} \left[\sum_{l=0}^{L-1} \mathcal{E}_{j,v}^{f_{int}}(n-l) \mathcal{E}_{j,i}^{f_{int}}(n-l) \right],$$
(22)

$$PF_{f_{int}}(k) = \frac{P_{f_{int}}(k)}{S_{f_{int}}(k)} = \frac{P_{f_{int}}(k)}{V_{f_{int}}(k)I_{f_{int}}(k)},$$
 (23)

$$\theta_{f_{int}}(k) = \cos^{-1}(PF_{f_{int}}(k)) = \cos^{-1}\left[\frac{P_{f_{int}}(k)}{V_{f_{int}}(k)I_{f_{int}}(k)}\right],$$
(24)

where $\theta_{f_{int}}$ is the phase difference between the voltage and current, which is associated with the phase angle impedance of the interharmonic.

The interharmonic impedance $(\widehat{Z}_{f_{int}}(k))$ can be properly computed by using the RT-SDWPT approach as follows [17]:

$$\widehat{Z}_{f_{int}}(k) = \frac{V_{f_{int}}(k)}{I_{f_{int}}(k)} \angle \theta_{f_{int}}, \qquad (25)$$

where the real part of $\widehat{Z}_{f_{int}}(k)$ refers to the resistance of the grid impedance as follows [17]:

$$R_{g}^{w}(k) = \operatorname{Re}\{\widehat{Z}_{f_{int}}(k)\} = Z_{f_{int}}(k)\cos(\theta_{f_{int}}(k)), \quad (26)$$

whereas the reactance related to the interharmonic frequency corresponds to the imaginary part of $\hat{Z}_{fint}(k)$ given by [17]:

$$X_{f_{int}}^{w}(k) = \operatorname{Im}\{\widehat{Z}_{f_{int}}(k)\} = Z_{f_{int}}(k)\operatorname{sin}(\theta_{f_{int}}(k)), \quad (27)$$

The grid reactance is given by [17]:

$$X_g^w(k) = X_{f_{int}}^w(k) \frac{\omega_1}{\omega_{f_{int}}},$$
(28)

where ω_{int} and ω_1 are frequencies of the interharmonic and fundamental components, respectively.

VI. PERFORMANCE ASSESSMENT

The proposed WBM method employs the experimental platform depicted in Fig. 1 for validating its performance. A dSPACE platform executes both the control and estimation algorithms. Take into account the selected interharmonic has the frequency of $f_{int} = 630$ Hz, the current regulators employed in the PV-based DG were redesigned for providing a closed-loop bandwidth of $\omega_{Ri} \cong 1320\pi \ rad/s$ to guarantee the effective signal injection. The commissioning experimental tests fulfill the WBM desired performance by setting up the mother wavelet length, the interharmonic magnitude, and the signal injection duration.

Several measurements realized at different times along the day results in an expected grid impedance of $Z_g \approx 0.53 + j0.15$ (i.e., $R_g \approx 0.53 \ \Omega$ and $X_g \approx 0.15 \ \Omega$), with a deviation of $\pm 10\%$. Based on these measurements, this work adopted the grid impedance of $Z_g \approx 0.53 + j0.155$ as a reference value employed to validate the estimation methods that will be tested in the following experiments.

A. Definition of the Mother Wavelet Length

The WB-GIE implementation can use long or compact mother wavelets. For evaluating those effects, the WB-GIE performs the grid impedance estimation with several mother wavelets. Table I summarizes the used mother wavelets and the average values of the estimated grid impedance.

In [6], a DFT-based method for estimating grid impedance considers the injection of an interharmonic with a frequency of 90 Hz, which is close to the fundamental component. This method injects the interharmonic signal continuously. For the sake of comparison with the proposed method, this

0278-0046 (c) 2019 IEEE. Personal use is permitted, but republication/redistribution requires IEEE permission. See http://www.ieee.org/publications_standards/publications/rights/index.html for more information. Authorized licensed use limited to: Aalborg Universitetsbibliotek. Downloaded on February 24,2020 at 08:36:46 UTC from IEEE Xplore. Restrictions apply. existing method was adapted to estimate the grid impedance considering the interharmonic frequency of 630 Hz instead of 90 Hz. Table I demonstrates the performance of both estimation approaches.

According to Table I, both long and compact mother wavelets provided similar performance and agreed with the expected values. However, long mother wavelets present the highest computational burden and highest time delay, leading to drawbacks on real-time applications because it requires long-duration interharmonic injection. Therefore, the mother wavelet db(4) is the most suitable. The WB-GIE provided similar performance to the DFT-based method. However, its use in the proposed WBM produces superior results because the injection of the interharmonic occurs only when the WB-TDS detects a grid impedance changing.

TABLE I GRID IMPEDANCE ESTIMATION OBTAINED WITH RT-SDWPT-BASED METHOD WITH DIFFERENT MOTHER WAVELETS .

Description		DET				
Description	db(4)	db(6)	db(14)	db(30)	DFI	
Resistance $[\Omega]$	0.53	0.53	0.53	0.53	0.53	
Reactance $[\Omega]$	0.15	0.15	0.15	0.15	0.15	
Impedance $[\Omega]$	0.55	0.55	0.55	0.55	0.55	

B. Magnitude of the Interharmonic

The accuracy of the grid impedance estimation depends on both the magnitude and the repetition rate of the interharmonic injection. Small amplitudes can deteriorate the impedance estimation due to the SNR, whereas high amplitudes can increase the total harmonic distortion of output currents (THD_i). To achieve a suitable magnitude level, the WB-GIE performed the grid impedance estimation with different interharmonic amplitudes and compared them with the DFT-based method described before. Table II summarizes the average values of the impedance estimation obtained with both methods by using different interharmonic amplitudes, and associated with: apparent power, shortcircuit power, system SNR, and the THD_i deviation.

The experimental results presented satisfactory and accurate impedance estimation with low- and high-magnitude of the injected interharmonic while demonstrated that their amplitudes did not influence the estimation. However, the use of interharmonic with higher amplitude could result in significant THDi deviations (see Table II). Therefore, the criterion for the selection of the interharmonic amplitude should consider the THD impact on the grid. Furthermore, the small deviations of impedance values verified in Table II for the same interharmonic magnitude are due to the variation of the penetration level that occurred during the tests.

C. Duration of the Interharmonic Injection

Another critical issue for the implementation of the WB-GIE is the signal injection duration. Continuous signal injection increases the THD, causing possible power quality problems. An alternative is to provide the signal injection for a short period, triggered by the proposed WB-TDS. The advantage of this method is the mitigation of the harmonic distortion. This paper adopted a duration time of the signal injection of 100 ms (six cycles of the fundamental) to avoid undesired power quality issues. Therefore, WB-GIE estimates the grid impedance during this time interval after the detection of a possible grid impedance variation. At the end of this interval, the WB-GIE provides the average value of the grid impedance estimation on the last two cycles.

D. Experimental Results

The performance evaluation and effectiveness of the proposed WBM grid impedance estimator employ four experimental tests in the following operational scenarios: (i) balanced grid impedance variation, (ii) interconnection of three-phase nonlinear load, (iii) unbalanced grid impedance, and (iv) interconnection of a three-phase capacitive load. In all experimental tests, controlled switches K1-K4 provide the interconnection of external components $r_{test} = 0.5 \ \Omega$ and $l_{test} = 0.5 \ \text{mH}$ (inserted simultaneously or individually) in series with the power grid, modifying its nameplate impedance. Table III presents the setup parameters obtained from the commissioning tests. The WB-GIE employs four decomposition levels with a synthetic interharmonic. The decomposition process is only accomplished on the bottom levels of the tree, as highlighted in Fig. 2.

1) Balanced Grid Impedance Variation: Fig. 3 depicts the phase current waveform on the PCC and the grid impedance estimation obtained through the proposed WBM. At the beginning of the experiment, the startup algorithm triggers the WB-GIE for injecting the interharmonic and estimates the power grid impedance, which resulted in $R_a^w \approx 0.53 \ \Omega$, $X_q^w \approx 0.15 \ \Omega$ and $Z_q^w \approx 0.57 \ \Omega$, as presented in Figs. 3(b)-(d), which follows the expected values of $Z_q \approx 0.53 + j0.15$ Ω , with $\pm 10\%$ of deviation. At $t \approx 1.65 \ s$, switches K1 - K4interconnect the external components $(r_{test} \text{ and } l_{test})$ in series with the grid, causing a transient in the currents, as shown in Fig. 3(a) and (e). The WB-TDS detected the grid impedance variation through a fast increase of the first-level wavelet coefficient energy, as shown in Fig. 3(e), which triggers the WB-GIE (flag signal in Fig. 3(a)) for injecting an interharmonic and providing the grid impedance estimation $R_q^w \approx 1.20 \ \Omega$, $X_g^w \approx 0.37 \ \Omega$ and $Z_g^w \approx 1.22 \ \Omega$ (Figs. 3(b)-(d)), which corresponds to the expected impedance (i.e., $Z_g \approx 0.53 + j0.15$ Ω in series with $Z_{test} \approx 0.5 + j0.188 \ \Omega$). In this test, the estimated grid reactance presented a deviation of less than 10% of the predicted value, inside the impedance range imposed by the PV penetration variation. At $t \approx 2.90 \ s$, the switches K1-K4 removed the external components, provoking another disturbance, also detected by WB-TDS that triggered the WB-GIE to re-estimate the grid impedance. The interharmonic employed in this test was 2.12 A.

2) Interconnection of Nonlinear Load: The interconnection of nonlinear loads at the PCC can result in incorrect impedance estimations [13]. To evaluate the effectiveness of the proposed method, under these operational conditions, switches K5 and

Magnitude	Apparent			THD;	THD;	Grid impedance $[\Omega]$			[Ω]
of the interharmonic	power [kVA]	S_{SC} [kVA] SNR –	(χ)	(√)	R_w	R_{DFT}	X_w	X_{DFT}	
0.71A	5.40	50.3	35.52 dB	3.34%	7.40%	0.58	0.60	0.17	0.16
0.71A	6.20	50.3	35.42 dB	3.37%	6.77%	0.58	0.61	0.17	0.15
1.41A	5.83	50.3	35.50 dB	3.33%	12.20%	0.57	0.58	0.16	0.16
1.41A	6.49	50.3	35.37 dB	3.35%	11.35%	0.59	0.59	0.16	0.15
2.12A	5.94	50.3	35.47 dB	3.42%	16.62%	0.54	0.54	0.15	0.15
2.12A	6.23	50.3	35.47 dB	3.34%	16.00%	0.57	0.57	0.15	0.15

 TABLE II

 GRID IMPEDANCE ESTIMATION WITH DIFFERENT MAGNITUDE OF THE INTERHARMONIC.

 χ : Before interharmonic injection.

 \checkmark : During interharmonic injection.

TABLE III		
PARAMETERS USED FOR THE GRID IMPEDANCE ESTIMATION	P	

Frequency of the Interharmonic	630 Hz
Magnitude of the interharmonic	0.71-2.12 A
Duration of the signal injection	6 cycles of the
Duration of the signal injection	fundamental frequency
Window size	$\Delta k = 64$ samples
Sampling rate	1920 Hz

K6 (Fig.1) interconnected linear and nonlinear loads simultaneously. Fig. 4 depicts the grid impedance estimation of this experiment. Initially, the estimated impedance has the same values as the test before. At $t \approx 0.4 \, s$, controlled switches K5 and K6 interconnect the linear and nonlinear loads at PCC provoking a transient. The WB-TDS detects this disturbance and triggers the WB-GIE for injecting the interharmonic for estimating the grid impedance. The obtained results demonstrated a slight variation in the grid impedance estimates, as expected.

At $t \approx 1.0$ ss, the switches K1-K4 interconnected r_{test} in series to the PCC, producing a disturbance, which was detected by the WB-TDS that triggered the WB-GIE for performing the grid impedance estimation. The estimated results are $R_g^w \approx$ $1.10 \ \Omega$, $X_g^w \approx 0.16 \ \Omega$ and $Z_g^w \approx 1.10 \ \Omega$, demonstrating that only the equivalent resistance modified, as expected (the initial value is $R_g^w \approx 0.53$). At $t \approx 1.8 \ s$, controlled switches K1 - K4 removed r_{test} , and WBM re-estimated the PCC grid impedance, resulting in the same values of the beginning of the experiment. This test demonstrated that the proposed method produced accurate results even under the presence of nonlinear loads interconnected to the PCC.

3) Unbalanced Grid Impedance: The knowledge of the grid-impedance under the unbalanced condition is essential for determining the stability limits of power system operation, especially in low voltage network systems. Fig. 5 shows the experimental results of the grid impedance estimation when the power grid is unbalanced. Initially, the estimated grid impedance has the same values of the tests realized before. At $t \approx 1.0 \ s$, the controlled switches K1 - K4 interconnect r_{test} and l_{test} in series with the phases A and B of the PCC to emulate a grid impedance asymmetry. The WB-TDS

detected the transient event in both PCC phases and triggered the WB-GIE for estimating the grid impedances of both PCC phases, which resulted in $R_{ga}^w \approx 1.25 \ \Omega$, $X_{ga}^w \approx 0.37 \ \Omega$, and $Z_{ga}^w \approx 1.35 \ \Omega$ for phase A, and $R_{gb}^w \approx 1.10 \ \Omega$, $X_{gb}^w \approx 0.36 \ \Omega$, and $Z_{ga}^w \approx 1.17 \ \Omega$ for phase B. The impedance values of phase C remained the same. At $t \approx 2.4 \ s$, switches K1-K4 removed the external components, and the estimated impedance provided by WBM corresponded to the startup values. Power grid employed in the experimental setup has a slight asymmetry, accentuated by the interconnection of the external components. This experiment showed that WBM is also effective in unbalanced PCCs.

4) Interconnection of the Capacitive Load: Fig. 6 depicts the grid impedance estimation of the PCC interconnected to a capacitive bank (provided by the switch K7 in Fig. 1). At the beginning of the experiment, the estimated grid impedance has the same values as the last tests. At $t \approx 0.4 \ s$, switches K1-K4 inserted external components in series with the PCC, causing a transient event, detected by the WB-TDS, which triggered the WB-GIE for estimating the grid impedance. The results obtained are $R_q^w \approx 1.10 \ \Omega$, $X_q^w \approx 0.38 \ \Omega$ and $Z_q^w \approx 1.20 \ \Omega$. At $t \approx 1.4$ s, the switch $\vec{K7}$ interconnected the three-phase capacitive load ($c_l = 150 \ \mu\text{F}$ or $X_c = -17.38$ Ω) in parallel to the PCC, provoking a disturbance. Therefore, the WBM re-estimated the grid impedance as $R_q^w \approx 1.00 \ \Omega$, $X_g^w \approx 0.34 \ \Omega$, and $Z_g^w \approx 1.12 \ \Omega$, which corresponds to the expected impedance of the equivalent circuit. Theoretically, the parallel association of the impedance $Z \approx 1.10 + j0.38 \Omega$, the capacitive load of $X_c = -j17.38$, results in an equivalent impedance of $Z \approx 1.14 + j0.32 \ \Omega$. The WBM estimated the equivalent grid resistance and reactance with acceptable error margins of 12.28% and 6.25%, respectively. This test also demonstrated the effectiveness of the WBM for grid impedance estimation in the PCC interconnected to capacitor banks.

Table IV summaries experimental results related to all operational scenarios.

E. Computational Burden

The computational burden (i.e., the number of multiplications, additions, and other floating-point operations) must be less than the sampling time $(1/f_s)$. The proposed grid



Fig. 3. Real-time grid impedance estimation: (a) time-domain current waveform (blue line) and transient detection flag (red line); (b) grid resistance; (c) grid reactance; (d) grid impedance and; (e) wavelet coefficient energy.

impedance estimation and DFT-based method were implemented, on the dSPACE 1103 PPC board, with a sampling rate of 1920 Hz to evaluate their computational burden. Table V summarizes both computational load in μs , per sampling. The proposed WBM, implemented through db(4) mother wavelet, presented a computational burden of 2.07 μs , while the use of db(30) resulted in 4.32 μs . The grid impedance implemented via DFT method required 3.87 μs for providing only the grid impedance estimate. The recursive DFT-based method could also be implemented by using stored values of cosine and sine values in a buffer to minimize the computational burden,



Fig. 4. Real-time grid impedance estimation with the interconnection of nonlinear load: (a) grid resistance; (b) grid reactance and; (c) grid impedance.

TABLE IV SUMMARY OF THE EXPERIMENTAL RESULTS.

Companies	Phase -	Step	in grid imp	Grid impedance		
Scenarios		$R(\Omega)$	$X_L(\Omega)$	$X_C(\Omega)$	$R_{g}^{w}(\Omega)$	$X_g^w(\Omega)$
T	-	$\uparrow 0.50$	↑0.188	-	1.20	0.37
1	-	$\downarrow 0.50$	↓0.188	-	0.53	0.15
п	-	↑0.50	-	-	1.10	0.16
11	-	$\downarrow 0.50$	-	-	0.53	0.16
	A	$\uparrow 0.50$	↑0.188	-	1.25	0.37
		$\downarrow 0.50$	↓0.188	-	0.53	0.15
тп 	В	$\uparrow 0.50$	↑0.188	-	1.10	0.36
111		$\downarrow 0.50$	↓0.188	-	0.53	0.15
	C	-	-	-	0.52	0.16
		-	-	-	0.52	0.16
IV	-	<u></u> ↑0.50	↑0.188	-	1.10	0.38
1 V	-	$^{\uparrow 0.50}$	$\uparrow 0.188$	↑17.38	1.00	0.34

resulting in the execution time of 2.13 μs . Nevertheless, the proposed WBM implemented through db(4) presented the lowest computational burden.

TABLE V COMPUTATIONAL BURDEN.

	DFT	db(4)	db(30)
Impedance estimation	$3.87 \ \mu s$	$2.07 \ \mu s$	$4.32 \ \mu s$
impedance estimation	$2.13^{*} \ \mu s$	-	-

*Recursive DFT.



Fig. 5. Real-time grid impedance estimation with the unbalanced grid impedance: (a) grid resistance; (b) grid reactance and; (c) grid impedance.

VII. CONCLUSION

This paper introduced a WBM for estimating the power grid-impedance, consisted of a WB-TDS and a WB-GIE, both implemented with RT-DWPT. When a grid changing occurs, the WB-TDS triggers the WB-GIE for injecting an interharmonic into the power grid to estimate the power grid impedance. This approach mitigates THD generated by the continuous signal injection employed in existing estimation techniques. This paper also presented the theoretical wavelet basis for implementing the WB-GIE, and the required adjusts for achieving accurate results. It also suggested a set of commissioning tests for determining the length of the mother wavelet, the interharmonic magnitude, and its duration. The experimental essays demonstrated that the proposed WBM provided an accurate grid impedance estimation of PCCs interconnected with standard loads, nonlinear loads, and capacitive banks. Besides, it is also effective under unbalanced operational conditions. Compared with existing methods, the proposed WBM provided reliable and fast grid transient detection and accurate grid impedance estimation. For its inherent characteristics, the proposed WBM should be further used in adaptive power flow control in distributed generation in lowvoltage power systems.

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Fig. 6. Real-time grid impedance estimation with the interconnection of the capacitive load: (a) grid resistance; (b) grid reactance and; (c) grid impedance.

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