

Coordinated Control and Energy Management of Distributed Generation Inverters in a Microgrid

K. T. Tan, *Student Member, IEEE*, P. L. So, *Senior Member, IEEE*, Y. C. Chu, *Senior Member, IEEE*, and M. Z. Q. Chen, *Member, IEEE*

Abstract—This paper presents a microgrid consisting of different distributed generation (DG) units that are connected to the distribution grid. An energy-management algorithm is implemented to coordinate the operations of the different DG units in the microgrid for grid-connected and islanded operations. The proposed microgrid consists of a photovoltaic (PV) array which functions as the primary generation unit of the microgrid and a proton-exchange membrane fuel cell to supplement the variability in the power generated by the PV array. A lithium-ion storage battery is incorporated into the microgrid to mitigate peak demands during grid-connected operation and to compensate for any shortage in the generated power during islanded operation. The control design for the DG inverters employs a new model predictive control algorithm which enables faster computational time for large power systems by optimizing the steady-state and the transient control problems separately. The design concept is verified through various test scenarios to demonstrate the operational capability of the proposed microgrid, and the obtained results are discussed.

Index Terms—Distributed generation (DG), energy management, microgrid, model predictive control (MPC).

I. INTRODUCTION

OVER THE last decade, efficient and reliable communication and control technologies, coupled with an increase in smarter electrical facilities, such as electric vehicles and smart meters, have resulted in an increasing number of consumers participating in demand response management (DRM) [1]–[5]. The current research is also focused on achieving a smarter grid through demand-side management (DSM), increasing energy reserves and improving the power quality of the distribution system, such as harmonic compensation for nonlinear loads [5]–[8]. These new trends enable higher levels of penetration of renewable generation, such as wind and solar power into the grid. The integration of renewable sources can supplement the generation from the distribution grid. However, these renewable sources are intermittent in their generation and might compromise the reliability and stability of the distribution network. As

a result, energy-storage devices, such as batteries and ultra-capacitors, are required to compensate for the variability in the renewable sources. The incorporation of energy-storage devices is also critical for managing peak demands and variations in the load demand.

In this paper, a microgrid consisting of a photovoltaic (PV) array, a proton-exchange membrane fuel cell (PEMFC), and a lithium-ion storage battery (SB) is proposed. The PEMFC is used as a backup generator unit to compensate for the power generated by the intermittent nature of the PV array. The SB is implemented for peak shaving during grid-connected operation, and to supply power for any shortage in generated power during islanded operation and to maintain the stability of the distribution network. An energy-management algorithm is designed for the microgrid to coordinate the sharing of power among different DG units. The proposed controller for the inverters of DG units is based on a newly developed model predictive control (MPC) algorithm, which optimizes the steady-state and the transient control problems separately. In this way, the computation time is greatly reduced.

In what follows, this paper provides a comprehensive solution for the operation of a microgrid which will simultaneously dispatch real and reactive power during both grid-connected and islanded operations, compensate for harmonics in the load currents, and perform peak shaving and load shedding under different operating conditions.

II. SYSTEM DESCRIPTION AND MODELING

A. System Description

Fig. 1 shows the configuration of the microgrid proposed in this paper that is designed to operate either in the grid-connected or islanded mode. The main DG unit comprises a 40-kW PV array and a 15-kW PEMFC, which are connected in parallel to the dc side of the DG inverter 1 through dc/dc boost converters to regulate the dc-link voltage of the DG inverter at the desired level by delivering the necessary power. The PV array is implemented as the primary generation unit and the PEMFC is used to back up the intermittent generation of the PV array. When there is ample sunlight, the PV array operates in the MPPT mode to deliver maximum dc power P_{pv} , which is discussed in detail in [9] and [10], and the output voltage of the PV array is permitted to vary within an allowable range to ensure proper operation of the DG inverter. To maintain the level of the dc-link voltage V_{dc} at the required level, the PEMFC supplements the generation of the PV array to deliver the necessary P_{fc} . When the output voltage of the PV array falls below a preset limit, the PV

Manuscript received January 23, 2012; revised July 23, 2012; accepted January 19, 2013. Date of publication February 25, 2013; date of current version March 21, 2013. This work was supported in part by the School of Electrical and Electronic Engineering, Nanyang Technological University, Singapore, and in part by A*STAR under the Smart Grid Project (SERC Grant No. 112 120 2022), in part by HKU CRCG Fund 20111159110, and in part by NNSFC 61004093. Paper no. TPWRD-00083-2012.

The authors are with the Nanyang Technological University, Singapore 639798, and also with the University of Hong Kong, Hong Kong, China (e-mail: eplso@e.ntu.edu.sg).

Digital Object Identifier 10.1109/TPWRD.2013.2242495

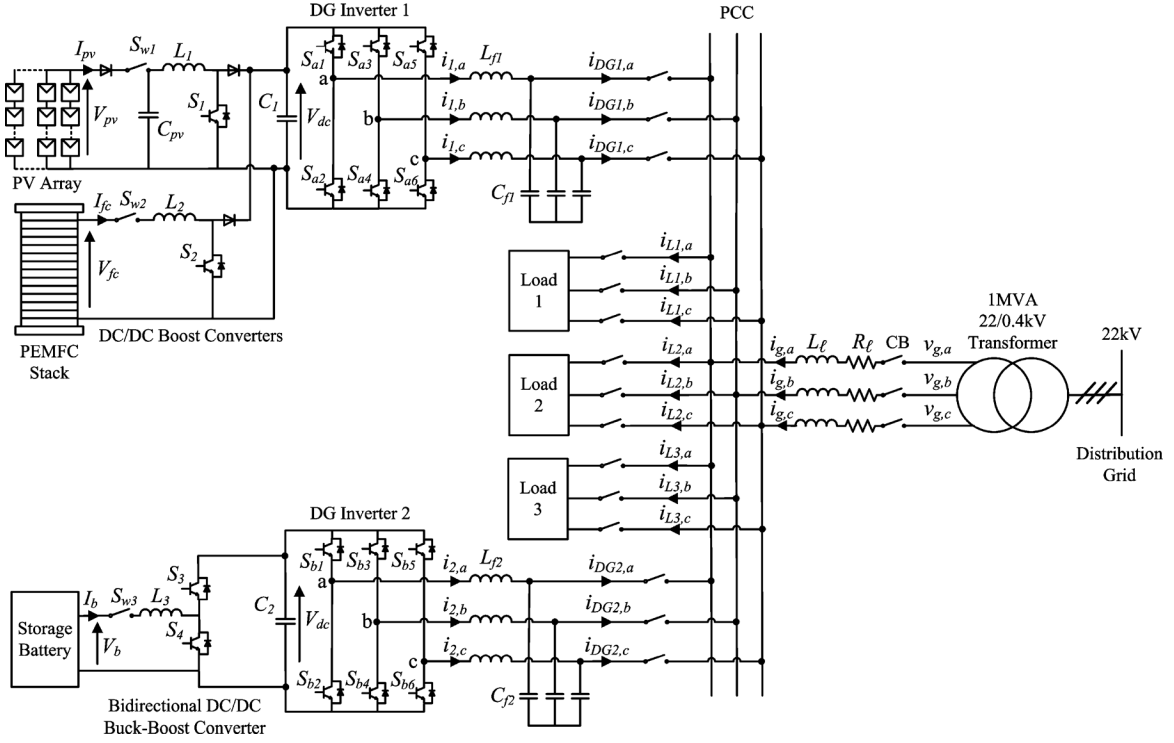


Fig. 1. Overall configuration of the proposed microgrid architecture.

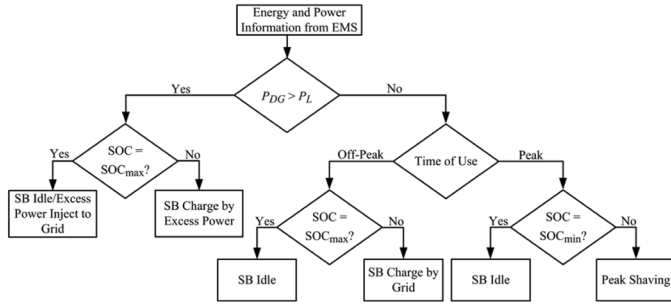


Fig. 2. Operation of the SB during grid-connected operation.

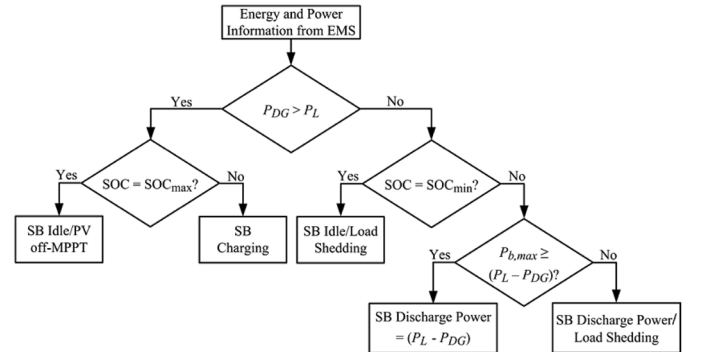


Fig. 3. Operation of the SB during islanded operation.

array is disconnected from the DG unit and the PEMFC functions as the main generation unit to deliver the required power. A 30-Ah lithium-ion SB is connected to the dc side of DG inverter 2 through a bidirectional dc/dc buck-boost converter to facilitate the charging and discharging operations. During islanded operation, the role of the SB is to maintain the power balance in the microgrid which is given by

$$P_{DG} + P_b = P_L \quad (1)$$

where P_{DG} is the power delivered by the main DG unit, P_b is the SB power which is subjected to the charging and discharging constraints given by

$$P_b \leq P_{b,max} \quad (2)$$

and P_L is the real power delivered to the loads. The energy constraints of the SB are determined based on the state-of-charge (SOC) limits which are given as

$$SOC_{min} < SOC \leq SOC_{max}. \quad (3)$$

Although the SOC of the battery cannot be measured directly, it can be determined through several estimation methods presented in [11] and [12]. When the microgrid operates islanded from the distribution grid, the SB can operate in the charging, discharging, or idle mode depending on its SOC and P_b . The flowcharts in Figs. 2 and 3 summarize the operation of the SB based on the output information provided by an energy-management system (EMS) during grid-connected and islanded operation, respectively. The EMS controls and monitors different aspects of power management, such as load forecasting, unit commitment, economic dispatch, and optimal power flow through a centralized server. Important information, such as field measurements from smart meters, transformer tap positions, and circuit-breaker (CB) status are all sent to the centralized server for processing through Ethernet.

During grid-connected operation, the distribution grid is connected to the microgrid at the point of common coupling (PCC)

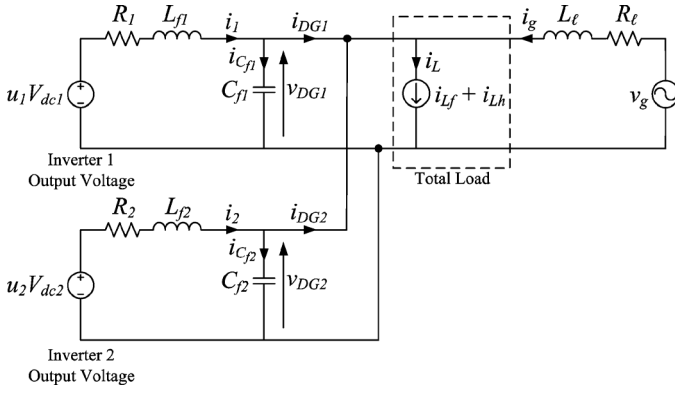


Fig. 4. Equivalent single-phase representation of the DG inverters for grid-connected operation.

through a circuit breaker (CB). The role of the main DG unit functions to provide local power and voltage support for the loads and, hence, reduces the burden of generation and delivery of power directly from the distribution grid. With the proliferation of power-electronics equipment being connected to the microgrid, the load currents could be distorted due to the presence of harmonic components. The DG units also function to compensate for any harmonics in the currents drawn by nonlinear loads in the microgrid, so that the harmonics will not propagate to other electrical networks connected to the PCC. Generally, there are variations in the power generated by the PV array and that demanded by the loads. If the power generated by the main DG unit is greater than the total load demand in the microgrid, the excess power can be used to charge the SB or injected into the distribution grid, depending on the SOC of the SB, as shown in Fig. 2. Conversely, when the total load demand is greater than the power generated by the main DG unit, the SB can be controlled to achieve different energy-management functions depending on its SOC and the time of use (TOU) of electricity. During off-peak periods as shown in Fig. 2, when the cost of generation from the grid is low and if the SB's SOC is below the maximum SOC limit SOC_{\max} , the SB can be charged by the grid and the loads will be supplied by the main DG unit and the grid. During peak periods, when the cost of generation from the grid is high and if the SB's SOC is above the minimum SOC limit SOC_{\min} , the SB can deliver power to the grid to achieve peak shaving.

When a fault occurs on the upstream network of the distribution grid, the CB operates to disconnect the microgrid from the distribution grid. The main DG unit and the SB are the sole power sources left to regulate the loads. In the case when the generation capacity of the main DG unit is unable to meet the total load demand, the SB is required to provide for the shortage in real and reactive power to maintain the power balance and stability of the microgrid as shown in Fig. 3. When the total load demand exceeds the generation capacity of the main DG unit and the SB, the EMS detects a drop in the system frequency and load shedding for noncritical loads is required to restore the system frequency and maintain the stability of the microgrid.

B. DG Inverter Modeling

Figs. 4 and 5 show the equivalent single-phase representation of the DG inverters for grid-connected and islanded operation,

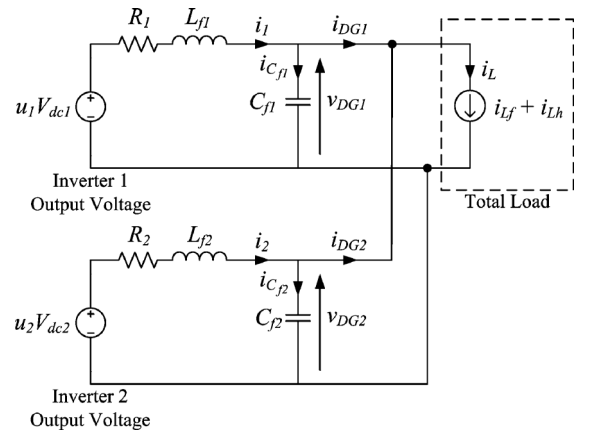


Fig. 5. Equivalent single-phase representation of the DG inverters for islanded operation.

respectively [13]–[15]. The switched voltage across the output of the j th DG inverter is represented by $u_j V_{dcj}$, where u_j is the control input and $j = 1, 2$. The output of the DG inverter is interfaced with an LC filter represented by L_{fj} and C_{fj} to eliminate the high switching frequency harmonics generated by the DG inverter. The resistance R_j models the loss of the DG inverter. The total load current i_L , which is the sum of the currents delivered to the load k ($k = 1, 2, 3$), is given by

$$i_L = \sum_{k=1,2,3} i_{Lk} = i_{L1} + i_{L2} + i_{L3} \quad (4)$$

and can be modeled as two components consisting of fundamental i_{Lf} and harmonic i_{Lh} with their peak amplitudes I_{Lf} and I_{Lh} , respectively, and is represented by

$$\begin{aligned} i_L &= i_{Lf} + i_{Lh} = I_{Lf} \sin(\omega t - \varphi_{Lf}) \\ &+ \sum_{h=3,5,\dots}^N I_{Lh} \sin(h\omega t - \varphi_{Lh}) \\ &= I_{Lf} \sin \omega t \cos \varphi_{Lf} - I_{Lf} \cos \omega t \sin \varphi_{Lf} \\ &+ \sum_{h=3,5,\dots}^N I_{Lh} \sin(h\omega t - \varphi_{Lh}) \\ &= i_{Lf,p} + i_{Lf,q} + i_{Lh} \end{aligned} \quad (5)$$

where φ_{Lf} and φ_{Lh} are the respective phase angles of the fundamental and harmonic components of i_L , and $i_{Lf,p}$ and $i_{Lf,q}$ are the instantaneous fundamental phase and quadrature components of i_L . To achieve unity power factor at the grid side, compensate for the harmonics in the load currents and concurrently achieve load sharing, the inverter of the DG unit supplies a current i_{DGj} that is given by

$$i_{DGj} = (i_{Lf,p} - i_g) + i_{Lf,q} + i_{Lh} \quad (6)$$

where i_g is the grid current. As shown in Fig. 4, the distribution grid is supplied by a utility substation represented by a voltage source v_g during grid-connected operation, and is connected to the microgrid and the loads via a distribution line with resistance R_ℓ and inductance L_ℓ .

In the grid-connected mode, the grid voltage is known and the microgrid shares the load demand with the grid. Hence, to

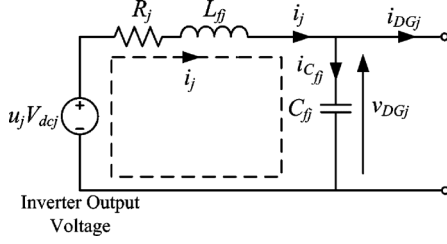


Fig. 6. Single-phase representation of the j th DG inverter for grid-connected and islanded operations.

control the power delivered to the loads, the output current of the DG inverter is controlled using the current control mode (CCM). During islanded operation, the microgrid will supply the overall load demand as shown in Fig. 5, and it is required that the output voltage be regulated to a pure sine wave with a fixed magnitude. This can be achieved through the voltage-control mode (VCM). The control design for the DG inverter will be elaborated on further in Section III.

To derive a state-space model for the DG inverter during both grid-connected and islanded operations, Kirchhoff's voltage and current laws are applied to the current loop i_j as shown in Fig. 6, and the following equations are obtained:

$$\frac{di_j}{dt} = -\frac{R_j}{L_{fj}}i_j - \frac{1}{L_{fj}}v_{DGj} + \frac{V_{dcj}}{L_{fj}}u_j \quad (7)$$

$$\frac{dv_{DGj}}{dt} = \frac{1}{C_{fj}}i_j - \frac{1}{C_{fj}}i_{DGj} \quad (8)$$

where i_j is the current passing through L_{fj} . Hence, the grid-connected DG inverter model can be written as

$$\dot{x}_{gj} = A_{gj}x_{gj} + B_{gj1}v'_j + B_{gj2}u_j \quad (9)$$

$$y_{gj} = C_{gj}x_{gj} + D_{gj1}v'_j + D_{gj2}u_j \quad (10)$$

where the subscripts g and j represent the model of DG inverter j during grid-connected operation ($j = 1, 2$) and

$$A_{gj} = -\frac{R_j}{L_{fj}}; B_{gj1} = \left[-\frac{1}{L_{fj}} \quad 0\right]; B_{gj2} = \frac{V_{dcj}}{L_{fj}}; C_{gj} = 1$$

$$D_{gj1} = [0 \quad -C_{fj}]; D_{gj2} = 0$$

$x_{gj} = i_j$ is the state; $v'_j = [v_{DGj} \quad dv_{DGj}/dt]^T$ is the exogenous input; u_j is the control input, with $-1 \leq u_j \leq 1$; and $y_{gj} = i_{DGj}$ is the output, which will be regulated to track the desired periodic reference waveform.

During islanded operation, the frequency will change due to power imbalance in the microgrid. This change in frequency is detected by the EMS of the microgrid, which is used to manage and monitor the power dispatch by each DG unit. Based on the frequency change information, the EMS will require the main DG unit and the SB to generate the necessary power to meet the overall load demand in the microgrid as shown in the flowchart of Fig. 3, such that (1) is satisfied. During islanded operation, it follows from (7) and (8) that DG inverter j can be modeled as

$$\dot{x}_{ij} = A_{ij}x_{ij} + B_{ij1}i'_j + B_{ij2}u_j \quad (11)$$

$$y_{ij} = C_{ij}x_{ij} + D_{ij1}i'_j + D_{ij2}u_j \quad (12)$$

where the subscript i denotes the model of the DG inverter j during islanded operation ($j = 1, 2$) and

$$A_{ij} = \begin{bmatrix} -\frac{R_j}{L_{fj}} & -\frac{1}{L_{fj}} \\ \frac{1}{C_{fj}} & 0 \end{bmatrix}; B_{ij1} = \begin{bmatrix} 0 \\ -\frac{1}{C_{fj}} \end{bmatrix}; B_{ij2} = \begin{bmatrix} \frac{V_{dcj}}{L_{fj}} \\ 0 \end{bmatrix}$$

$$C_{ij} = \begin{bmatrix} 0 & 1 \\ 1 - \frac{C_{fj}}{C_f} & 0 \end{bmatrix}; D_{ij1} = \begin{bmatrix} 0 \\ \frac{C_{fj}}{C_f} \end{bmatrix}; D_{ij2} = \begin{bmatrix} 0 \\ 0 \end{bmatrix}$$

with $C'_f = \sum_{j=1}^2 C_{fj}$; $x_{ij} = [i_j \quad v_{DGj}]^T$ is the state vector; $i'_j = i_L - \sum_{n \neq j} i_n$ is the exogenous input of the DG inverter j ; u_j is the control input, with $-1 \leq u_j \leq 1$; and $y_{ij} = [v_{DGj} \quad i_{DGj}]^T$ is the output, which will be regulated to track the desired reference waveform. Note that although the emphasis is on the voltage v_{DGj} , both v_{DGj} and i_{DGj} will be regulated in the VCM to ensure that the power is delivered. Furthermore, it is assumed that the exogenous input i'_j in the model is not directly measurable by the DG inverter j since it involves quantities outside that inverter. Precisely, i'_j represents the sum of all load currents i_L minus the sum of all i_n from the other DG inverters $n \neq j$ in the microgrid. Although only one other inverter has been presented in the proposed microgrid, the model is extendable to more DG inverters.

III. CONTROL DESIGN

With the mathematical model presented in Section II-B, this paper proposes a novel MPC algorithm for the control of the DG inverters of the microgrid. The proposed algorithm is a newly developed MPC algorithm specifically designed for fast-sampling systems, to track periodic signals so as to deal with the dual-mode operation of the microgrid. The algorithm decomposes the MPC optimization into a steady-state sub-problem and a transient sub-problem, which can be solved in parallel in a receding horizon fashion. Furthermore, the steady-state sub-problem adopts a dynamic policy approach in which the computational complexity is adjustable. The decomposition also allows the steady-state sub-problem to be solved at a lower rate than the transient sub-problem if necessary. These features help to achieve a lower computational complexity and make it suitable for implementation in a fast-sampling system like our microgrid applications. In the simulation studies in this paper, the sampling interval is chosen as 0.2 ms, which is considered pretty small in conventional MPC applications, but necessary for the high order of harmonics being tackled for our problem. According to [16], sampling in the range of tens of kHz is possible with state-of-the-art code generation techniques.

It is noted that in either the grid-connected or the islanded operation, the state-space model of Section II-B after time-discretization will take the form

$$x^+ = Ax + B_1w + B_2u \quad (13)$$

$$y = Cx + D_1w + D_2u \quad (14)$$

where the superscript $+$ represents the time-shift operator (with sampling interval T_s), and the exogenous signal w is periodic. In general, any periodic signal with a finite number of harmonics can be written as the output of an autonomous finite-dimensional linear time-invariant

state-space model. For example, if the periodic signal has a fundamental frequency ω and consists of only odd harmonics, the A -matrix of the corresponding state-space model can take a block diagonal form with the blocks given by $\begin{bmatrix} \cos(h\omega T_s) & \sin(h\omega T_s) \\ -\sin(h\omega T_s) & \cos(h\omega T_s) \end{bmatrix}$ where $h = 1, 3, 5, \dots$, and the C -matrix $[1 \ 0 \ 1 \ 0 \ \dots \ 1 \ 0]$. Furthermore, the initial state of this autonomous model determines the magnitude and phase angle of this periodic signal. Hence, the exogenous signal w in (13) and (14) together with the reference d that y in (14) desires to track can be modeled by

$$\xi^+ = A_\xi \xi \quad (15)$$

$$w = C_w \xi \quad (16)$$

$$d = C_d \xi \quad (17)$$

for some A_ξ , C_w and C_d as described above. For the CCM during grid-connected operation, $y = i_{DG}$ and the current reference $d = di_{DG}$ for i_{DG} to track consist of the same order of harmonics as i_L and is derived from the desired active and reactive power outputs of the DG units generated by the EMS. On the other hand, for the VCM as described in Section II-B during islanded operation, $y = [v_{DG} \ i_{DG}]^T$ for the DG unit and the reference $d = [dv_{DG} \ di_{DG}]$ consists of a voltage reference and a current reference. The voltage reference dv_{DG} for v_{DG} to track is typically a pure sine wave, which is derived from the monitored v_{DG} prior to islanding. To ensure that the respective DG units deliver the necessary power for stable operation of the microgrid during islanded operation, the current reference di_{DG} for i_{DG} to track is regulated according to the power reference generated by the EMS.

The state-space model given by (15)–(17) is known as the exogenous system in this paper. Although only odd harmonics up to the 29th order have been considered, the methodology can be easily extended to include even harmonics. The exogenous state ξ , which essentially represents the sets of Fourier coefficients of w and d , can be automatically identified using a Kalman-based observer known as the exogenous Kalman filter once the signal w is measured and the reference d is specified. The exogenous Kalman filter is given by

$$\tilde{\xi}^+ = A_\xi \tilde{\xi} + L_w(w - \tilde{w}) + L_d(d - \tilde{d}) \quad (18)$$

$$\tilde{w} = C_w \tilde{\xi} \quad (19)$$

$$\tilde{d} = C_d \tilde{\xi} \quad (20)$$

where $\tilde{\xi}$ is the estimated exogenous state, L_w and L_d are the observer gain matrices of the Kalman filter, and the terms $(w - \tilde{w})$ and $(d - \tilde{d})$ are essentially the difference between the actual w , d and the estimated \tilde{w} , \tilde{d} generated from the Kalman filter, such that $(w - \tilde{w})$ and $(d - \tilde{d})$ should tend to zero asymptotically. Since ξ is actually a Fourier decomposition of the periodic signals w and d , the exogenous Kalman filter given by (18)–(20) functions like a harmonic extraction circuit from the power system point of view [17], [18].

In what follows, the control u in (13) and (14) is decomposed into a steady-state control u_s and a transient control u_t as

$$u = u_s + u_t \quad (21)$$

such that $u \rightarrow u_s$ and $u_t \rightarrow 0$ asymptotically. Both u_s and u_t will employ a MPC strategy, but the former will adopt a dynamic MPC policy whereas the latter will adopt a more conventional finite-horizon approach.

A. Steady-State Subproblem

The control objective of the steady-state subproblem is to identify an optimal control signal u_s such that when $u \rightarrow u_s$ asymptotically and, thus, $x \rightarrow x_s$ and $y \rightarrow y_s$, the steady-state output y_s should be as close to the desired reference d as possible. According to (13) and (14), u_s , x_s and y_s should satisfy

$$x_s^+ = Ax_s + B_1w + B_2u_s \quad (22)$$

$$y_s = Cx_s + D_1w + D_2u_s \quad (23)$$

subject to the constraint that

$$|u_s| \leq 1. \quad (24)$$

We consider the steady-state control u_s being generated from a dynamic MPC policy

$$\hat{\xi}^+ = A_\xi \hat{\xi} \quad (25)$$

$$u_s = C_\xi \hat{\xi} \quad (26)$$

where the matrices A_ξ and C_ξ are designed offline but the initial state $\hat{\xi}$ at time k will be optimized online to minimize a quadratic penalty on the tracking error $e_s = y_s - d$ in a receding horizon fashion.

B. Transient Subproblem

Once the optimal u_s , x_s , and y_s are identified by the steady-state subproblem, the control objective of the transient subproblem is to ensure that the transient signals $u_t = u - u_s$, $x_t = x - x_s$, and $y_t = y - y_s$ will go to zero promptly. Then according to (13) and (14), and (22) and (23), u_t , x_t and y_t should satisfy

$$x_t^+ = Ax_t + B_2u_t \quad (27)$$

$$y_t = Cx_t + D_2u_t. \quad (28)$$

In this transient subproblem, the objective is to make $y_t \rightarrow 0$ as fast as possible, subject to the constraint

$$|u_s + u_t| \leq 1. \quad (29)$$

A conventional approach of MPC that employs a finite horizon with a terminal cost can be adopted. It requires the information of u_s and x_s , which will be provided by the solution of the steady-state subproblem, and the information of the plant state x , which can be estimated using a plant Kalman filter on (13)

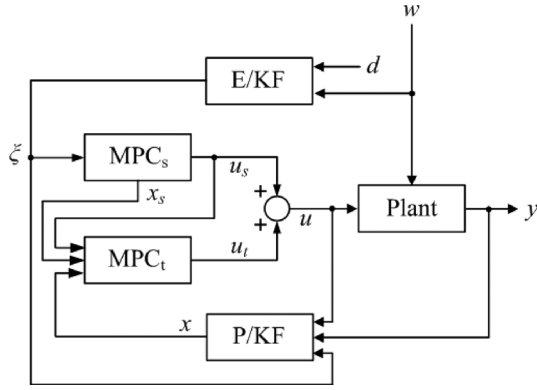


TABLE I
PARAMETERS OF THE PROPOSED SYSTEM

and (14). Similar to the case of the exogenous Kalman filter, the plant Kalman filter is given by

$$\tilde{y} = C\tilde{x} + D_1w + D_2u \quad (31)$$

coarsely estimated since these values are not precisely known in practice.

A. Test Case 1: Power Quality Improvement With Load-Sharing During Grid-Connected Operation

The first test case demonstrates the capability of the micro-grid to improve the power quality of the distribution network by compensating for the harmonics in the total load current i_L due to the nonlinear loads that are connected to the distribution network, such that the harmonics will not propagate to the rest of the distribution network during grid-connected operation. In this test case, the main DG unit accounts for 20% of the total load demand. The SB is operating in the charging mode to store energy during off-peak period where the cost of generation from the grid is low to meet future sudden demands for power. The SB current I_b (as shown in Fig. 1) and the SOC during charging for $0 \leq t < 0.4$ s are shown in Figs. 10 and 11, respectively.

The waveforms of the total load current i_L , the current supplied by the main DG unit i_{DG} and grid current i_g under this test case are shown in Fig. 12. The unsteady measurements in i_{DG} and i_g as shown in Fig. 12(middle) and Fig. 12(bottom) respectively during initialization for $0 \leq t \leq 0.06$ s are due to the fact

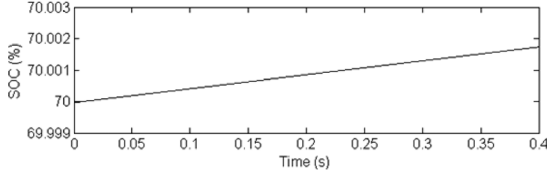
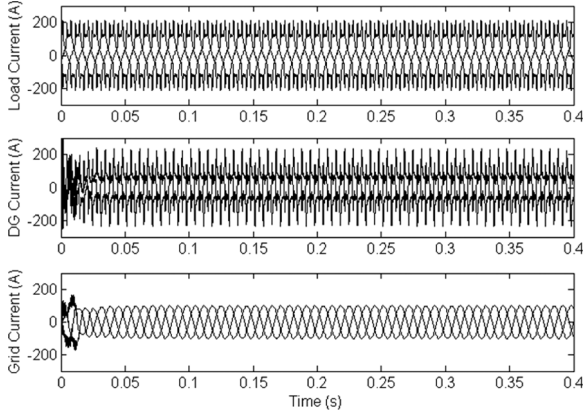
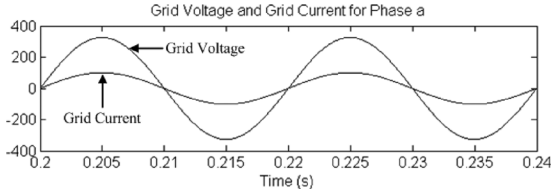


Fig. 11. SOC of the SB during charging.

Fig. 12. Waveforms of three-phase load current i_L (top), three-phase DG current i_{DG} (middle), and three-phase grid current i_g (bottom).Fig. 13. Waveforms of grid voltage v_g and grid current i_g for phase a.

that the controller needs a period of 3 cycles to track the generated references. During steady-state condition, the total harmonic distortion (THD) value of i_L is 42.1% as shown in Fig. 12 (top). With the main DG unit compensating for the harmonic currents as shown in Fig. 12 (middle), the THD value of i_g is improved to about 0.4% as shown in Fig. 12 (bottom). To achieve power factor correction at the grid side, the main DG unit is also controlled to provide the reactive component $i_{Lf,q}$ of the current i_L as given in (5). Fig. 13 shows closed-up waveforms of the grid voltage v_g and i_g of phase a for $0.2 \leq t < 0.24$ s. It is observed that the waveform of i_g is in phase with that of v_g with power factor correction.

The total real and reactive power delivered to the loads is about 58 kW and 35 kVar as shown in the power waveforms of Fig. 14. The real power dispatched by the main DG unit is 11.6 kW (20% of the real power consumed by the loads) as shown in Fig. 15, which demonstrates the capability of the main DG unit to dispatch the required power. The main DG unit also delivers all of the reactive power required by the loads to achieve unity power factor at the grid side. The real and reactive power delivered by the grid is shown in Fig. 16. It can be observed from Fig. 16 that the grid supplies 80% (46.4 kW) of the total real power delivered to the loads and dispatches an additional power of about 3 kW to charge the SB. It is also observed that

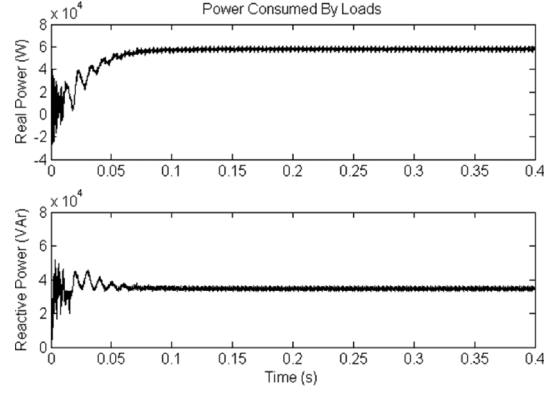


Fig. 14. Real (top) and reactive (bottom) power consumed by loads.

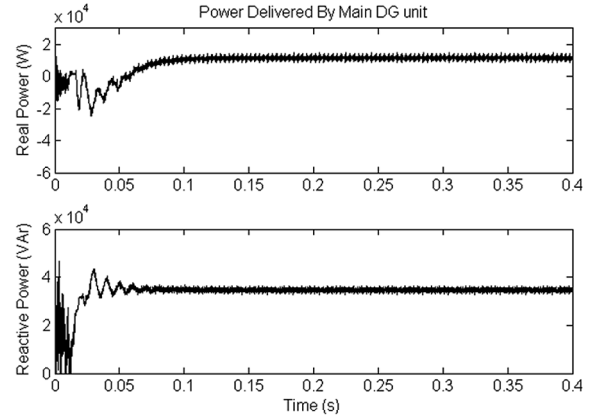


Fig. 15. Real (top) and reactive (bottom) power delivered by the main DG unit.

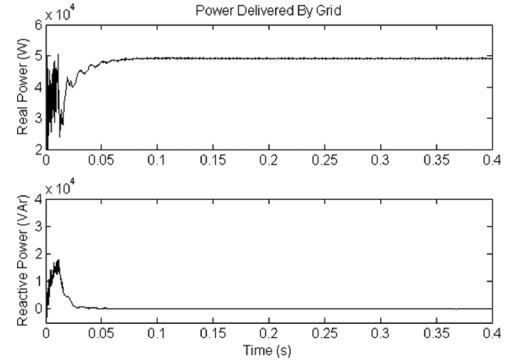


Fig. 16. Real (top) and reactive (bottom) power delivered by the grid.

the reactive power supplied by the grid is zero, resulting in unity power factor at the grid side.

B. Test Case 2: Peak Shaving of Loads During Peak Periods

The electricity pricing in many countries is impacted by the TOU tariffs. In DSM, energy-storage devices can be used to reduce the burden of generation of power directly from the distribution grid during peak periods. The second test case demonstrates the operation of the microgrid to achieve peak shaving in order to reduce the cost of generation from the grid when consumers practice DSM.

Fig. 17 shows a typical hourly demand response curve in a day indicated by the solid line. As in test case 1, the main DG

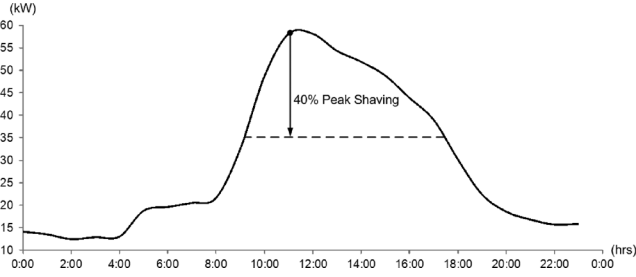


Fig. 17. Hourly demand response curve.

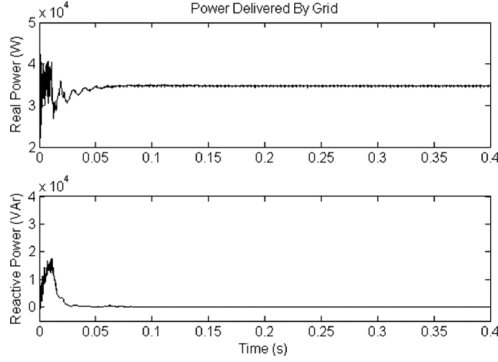


Fig. 18. Real (top) and reactive (bottom) power delivered by the grid.

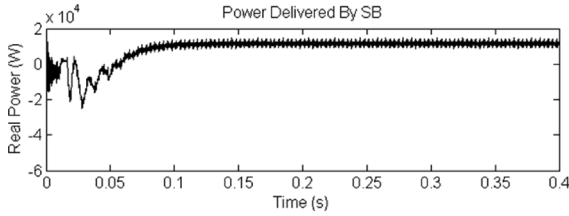


Fig. 19. Real power delivered by SB.

unit is controlled to deliver 20% of the load demand. To achieve peak shaving at 11:00 h, the SB is operating in the discharge mode to provide 20% (11.6 kW) of the load demand. With a further reduction of 20% in the power supplied by the grid, the total load demand at 11:00 h is reduced by a total of 40% as shown by the dotted line in Fig. 17.

The power waveforms of the grid for $0 \leq t < 0.4$ s are shown in Fig. 18. It can be seen from Fig. 18 that the real power delivered by the grid is 60% (34.8 kW) of the load demand with peak shaving, and the reactive power supplied is zero with the main DG unit compensating for the reactive components of the load currents. The real power waveform delivered by DG inverter 2 (as shown in Fig. 1) of the SB during discharging is shown in Fig. 19. It can be observed from Fig. 19 that the SB delivers the required real power of about 20% (11.6 kW) of the load demand during peak shaving.

C. Test Case 3: Load Shedding During Islanded Operation

During islanded operation, the total generation of the microgrid might not be able to sustain its generation to meet the power demand of the loads. Under such circumstances, consumers participating in DRM will allow the non-critical load to be shed so

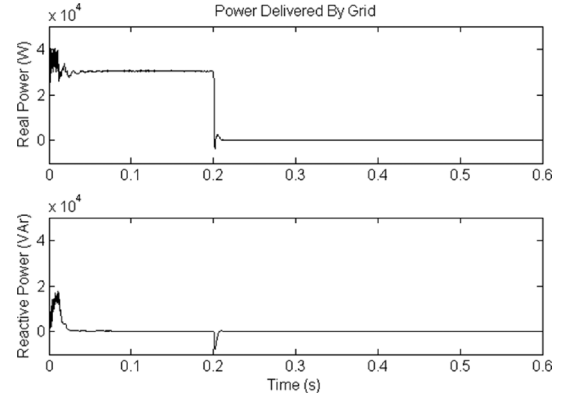


Fig. 20. Real (top) and reactive (bottom) power delivered by the grid.

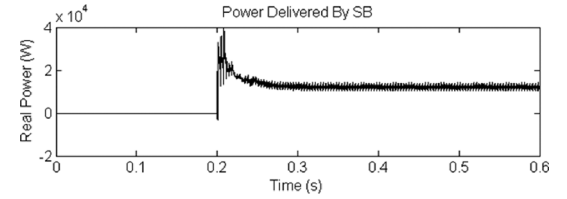


Fig. 21. Real power delivered by SB.

as to maintain the stable operation of the microgrid. The third test case demonstrates the operation of the microgrid when it islands from the grid. In this test case, the microgrid is initially operating in the grid-connected mode for $0 \leq t < 0.2$ s. The SB is initially operating in the idle mode and its SOC is 80%. A fault occurs on the upstream network of the distribution grid and the CB operates to disconnect the microgrid from the distribution grid at $t = 0.2$ s.

Fig. 20 shows the waveforms of the real and reactive power supplied by the grid. It can be seen from Fig. 20 that the CB manages to fully isolate the microgrid from the distribution grid in about half a cycle, resulting in zero real and reactive power delivered by the grid for $0.2 \leq t < 0.6$ s. The real power delivered by DG inverter 2 of the SB is shown in Fig. 21. For $0 \leq t < 0.2$ s, the SB is in the idle mode. After the initiation of the islanding operation at $t = 0.2$ s, the DG inverter 2 is tasked by the EMS to increase its generation to provide real power of about 12.5 kW to the loads which reach steady-state operation in about 3 cycles. With only the main DG unit and the SB supplying for the loads, the power imbalance results in a decrease in the system frequency, which is detected by the EMS. To maintain the stability of the microgrid during islanded operation, the shedding of load 3 ($P_{L3} = 18$ kW and $Q_{L3} = 12.3$ kVAr) is also initiated at $t = 0.4$ s by the EMS such that the total generation from the main DG unit ($P_{DG} = 27.5$ kW and $Q_{DG} = 22.7$ kVAr) and the SB ($P_b = 12.5$ kW) can meet the power demand by the loads. A delay of 0.2 s is introduced between islanding of the microgrid and load shedding to cater for frequency transients that might occur momentarily due to the energization of large motor loads. The waveforms of the real and reactive power delivered to the loads for $0 \leq t < 0.6$ s are shown in Fig. 22. It can be observed from Fig. 22 that when load 3 is shed at $t = 0.4$ s, the total real and reactive power delivered to the loads gradually decreases to

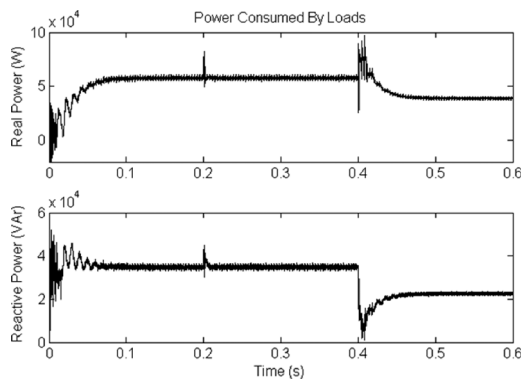


Fig. 22. Real (top) and reactive (bottom) power consumed by loads.

settle and operate stably at about 40 kW and 22.7 kVAr, respectively, in about 3 cycles.

V. CONCLUSION

In this paper, a control system that coordinates the operation of multiple DG inverters in a microgrid for grid-connected and islanded operations has been presented. The proposed controller for the DG inverters is based on a newly developed MPC algorithm which decomposes the control problem into steady-state and transient subproblems in order to reduce the overall computation time. The controller also integrates Kalman filters into the control design to extract the harmonic spectra of the load currents and to generate the necessary references for the controller. The DG inverters can compensate for load harmonic currents in a similar way as conventional compensators, such as active and passive filters, and, hence, no additional equipment is required for power-quality improvement. To realize the smart grid concept, various energy-management functions, such as peak shaving and load shedding, have also been demonstrated in the simulation studies. The results have validated that the microgrid is able to handle different operating conditions effectively during grid-connected and islanded operations, thus increasing the overall reliability and stability of the microgrid.

REFERENCES

- [1] S. Braithwaite, "Behavior management," *IEEE Power and Energy Mag.*, vol. 8, no. 3, pp. 36–45, May/Jun. 2010.
- [2] N. Jenkins, J. Ekanayake, and G. Strbac, *Distributed Generation*. London, U.K.: IET, 2009.
- [3] M. Y. Zhai, "Transmission characteristics of low-voltage distribution networks in China under the smart grids environment," *IEEE Trans. Power Del.*, vol. 26, no. 1, pp. 173–180, Jan. 2011.
- [4] G. C. Heffner, C. A. Goldman, and M. M. Moezzi, "Innovative approaches to verifying demand response of water heater load control," *IEEE Trans. Power Del.*, vol. 21, no. 1, pp. 1538–1551, Jan. 2006.
- [5] R. Lasseter, J. Eto, B. Schenkman, J. Stevens, H. Vollkommer, D. Klapp, E. Linton, H. Hurtado, and J. Roy, "Certs microgrid laboratory test bed, and smart loads," *IEEE Trans. Power Del.*, vol. 26, no. 1, pp. 325–332, Jan. 2011.
- [6] A. Molderink, V. Bakker, M. G. C. Bosman, J. L. Hurink, and G. J. M. Smit, "Management and control of domestic smart grid technology," *IEEE Trans. Smart Grid*, vol. 1, no. 2, pp. 109–119, Sep. 2010.
- [7] A. Mohsenian-Rad, V. W. S. Wong, J. Jatskevich, R. Schober, and A. Leon-Garcia, "Autonomous demand-side management based on game-theoretic energy consumption scheduling for the future smart grid," *IEEE Trans. Smart Grid*, vol. 1, no. 3, pp. 320–331, Dec. 2010.

- [8] S. Chowdhury, S. P. Chowdhury, and P. Crossley, *Microgrids and Active Distribution Networks*. London, U.K.: IET, 2009.
- [9] A. Yazdani and P. P. Dash, "A control methodology and characterization of dynamics for a photovoltaic (PV) system interfaced with a distribution network," *IEEE Trans. Power Del.*, vol. 24, no. 3, pp. 1538–1551, Jul. 2009.
- [10] K. T. Tan, P. L. So, Y. C. Chu, and K. H. Kwan, "Modeling, control and simulation of a photovoltaic power system for grid-connected and stand-alone applications," in *Proc. Int. Power Energy Conf.*, 2010, vol. 56, pp. 608–613.
- [11] M. Charkhgard and M. Farrokhi, "State-of-charge estimation for lithium-ion batteries using neural networks and EKF," *IEEE Trans. Ind. Electron.*, vol. 57, no. 12, pp. 4178–4187, Jun. 2010.
- [12] M. Coleman, C. K. Lee, C. Zhu, and W. G. Hurley, "State-of-charge determination from EMF voltage estimation: Using impedance, terminal voltage, and current for lead-acid and lithium-ion batteries," *IEEE Trans. Ind. Electron.*, vol. 54, no. 5, pp. 2550–2557, Oct. 2007.
- [13] A. Gosh and G. Ledwich, *Power Quality Enhancement Using Custom Power Devices*. Norwell, MA: Kluwer, 2002, pp. 380–406.
- [14] J. M. Guerrero, J. Matas, L. García de Vicuña, M. Castilla, and J. Miret, "Decentralized control for parallel operation of distributed generation inverters using resistive output impedance," *IEEE Trans. Ind. Electron.*, vol. 54, no. 2, pp. 994–1004, Apr. 2007.
- [15] C. L. Chen, Y. B. Wang, J. S. Lai, Y. S. Lai, and D. Martin, "Design of parallel inverters for smooth mode transfer of microgrid applications," *IEEE Trans. Ind. Electron.*, vol. 25, no. 1, pp. 6–15, Jan. 2010.
- [16] J. Mattingley, Y. Wang, and S. Boyd, "Receding horizon control: Automatic generation of high-speed solvers," *IEEE Control Syst. Mag.*, vol. 31, no. 3, pp. 52–65, Jun. 2011.
- [17] J. A. Macias and A. Gomez, "Self-tuning of Kalman filters for harmonic computation," *IEEE Trans. Power Del.*, vol. 21, no. 1, pp. 501–503, Jan. 2006.
- [18] V. Moreno, A. Pigazo, and R. I. Diego, "Reference estimation technique for active power filters using a digital Kalman algorithms," in *Proc. Int. Conf. Harmonics Qual. Power*, 2002, vol. 2, pp. 490–494, 1.

K. T. Tan (S'08) received the B.Eng. degree in electrical and electronic engineering from Nanyang Technological University, Singapore, in 2008, where he is currently pursuing the Ph.D. degree.

His research interests include clean and renewable energy, microgrids, and smart grids.

P. L. So (M'98–SM'03) received the B.Eng. degree (Hons.) in electrical engineering from the University of Warwick, Warwick, U.K., in 1993, and the Ph.D. degree in electrical power systems from Imperial College, University of London, London, U.K., in 1997.

Currently, he is an Associate Professor in the School of Electrical and Electronic Engineering, Nanyang Technological University, Singapore. Prior to his academic career, he was a Second Engineer with China Light and Power Company Ltd., Hong Kong, for 11 years, working in the field of power system protection. His research interests are power system stability and control, power quality, power-line communications, clean and renewable energy, as well as microgrids and smart grids.

Dr. So was the Chair of the IEEE Singapore Section from 2009 to 2010. Currently, he is a member of the Electrical Testing Technical Committee, Singapore Accreditation Council, and a member of the Working Group under the purview of the Telecommunications Standards Technical Committee, Infocomm Development Authority (IDA) of Singapore.

Y. C. Chu (S'88–M'97–SM'06) received the B.Sc. degree in electronics and the M.Phil. degree in information engineering from the Chinese University of Hong Kong, Hong Kong, in 1990 and 1992, respectively, and the Ph.D. degree in control from the University of Cambridge, Cambridge, U.K., in 1996.

He then was a Postdoctoral Fellow with the Chinese University of Hong Kong, a Research Associate with the University of Cambridge, and an Assistant Professor and subsequently an Associate Professor with the Nanyang Technological University, Singapore. From 2011 to 2012, he was a Visiting Associate Professor with the University of Hong Kong, Hong Kong, China. His research interests include control theory and artificial neural networks, with applications of spacecraft, underwater vehicles, combustion oscillations, microgrids, and smart grids.

Dr. Chu was a Croucher Scholar in 1993–1995 and has been a Fellow of the Cambridge Philosophical Society since 1993.

M. Z. Q. Chen (M'08) received the B.Eng. degree in electrical and electronic engineering from Nanyang Technological University, Singapore, in 2003, and the Ph.D. degree in control engineering from Cambridge University, Cambridge, U.K., in 2007.

Currently, he is an Assistant Professor in the Department of Mechanical Engineering, University of Hong Kong. He is a Fellow of the Cambridge Philosophical Society and a Life Fellow of the Cambridge Overseas Trust. Since 2008, he has been a reviewer of the IEEE TRANSACTIONS ON AUTOMATIC CONTROL, *Automatica*, *International Journal of Robust and Nonlinear Control*, *International Journal of Adaptive Control and Signal Processing*, *International Journal of Systems Science*, and *Journal of Sound and Vibration*, amongst others. He is a Guest Associate Editor for the *International Journal of Bifurcation and Chaos*.