



Unified Control Scheme Based on Model Predictive Control for Hybrid-Energy-Storage-Based Microgrids

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Abstract—This article proposes unified hierarchical control for power distribution among ac microgrids based on hybrid energy storage. In this article, each microgrid comprises hybrid energy storage (i.e., supercapacitor, battery, and hydrogen) and renewable power generator (i.e., photovoltaic module). The proposed hierarchical control framework ensures that power distribution among microgrids depends on the state of charge (SOC) of hybrid storage in the given microgrids. The present article proposes an adaptive model predictive control based tertiary layer, which is responsible for the accurate power-sharing among the microgrids based on the individual SOC of the storages in the given microgrids. The tertiary control layer generates the reference signals for the secondary control layer, where the pulsewidth modulation of the inverters in the respective microgrids is controlled. The primary control is responsible for the optimum power-sharing within individual microgrids based on the source, load, and SOC of energy storage devices. The proposed unified hierarchical control for such a system is validated in different operating scenarios using power hardware-in-the-loop experiments. The proposed control scheme is very effective in smooth and controlled power exchange among microgrids during fuel cell operating mode. The proposed scheme also improves the dc bus regulation during transient power imbalances in microgrids.

Index Terms—Fuel cell (FC), hydrogen energy, microgrids cluster, model predictive control (MPC), power converters.

NOMENCLATURE

Bat	Battery.
C	Capacity of energy storage.
C_s	Inverter filter capacitance.
ECR	Equal concern for relaxation.

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ESS	Energy storage system.
Hyd	Hydrogen.
K_I	Integral gain.
K_P	Proportional gain.
$L.O.$	Luenberger observer.
L_s	Inverter filter inductance.
$L_{t1,2}$	Inductance of transmission line.
MHL	Metal hydride storage level.
MPC	Model predictive control.
MPPT	Maximum power point tracking.
MV	Manipulative variable.
N	Horizons.
OV	Output variable.
P	Active power.
PLL	Phased-lock loop.
$P_{Net,ref}$	Power reference signal in microgrid.
$P_{\mu G}$	Power exchange between microgrid.
Q	Reactive power.
R_o	Load resistance.
$R_{t1,2}$	Resistance of transmission line.
SC	Supercapacitor.
SFC	Secondary frequency control.
SOC	State of charge.
SVC	Secondary voltage control.
t_d	Delay time.
T_{onset}	Scenario onset time.
T_s	Sample time.
VSI	Voltage source inverter.
V_{ac}	Voltage of voltage source inverter (V).
V_r	Receiving end voltage (V).
V_s	Source voltage (V).
X	Line inductance (H).

Subscript and superscripts

k	Sampling instant.
m	Measured.
Net	Net reference.
Nom.	Nominal.
p	Prediction horizon and predicted.
Second,ref	Secondary controller reference.
t	Time.
Y	Output.
μG	Microgrid.

- 1,2 Denotes the power exchange between 1 and 2.
 1,3 Denotes the power exchange between 1 and 3.

Greek symbols

- α_i Weight on the manipulative variables and proportional gain for power sharing in tertiary layer.
 β_i Weight on the variations of manipulative variables.
 γ_i Weight on the output error.
 δ The phase angle between two voltage sources.
 ζ Conversion coefficients.
 η Efficiency.
 $\mu G_{1,2,3}$ Microgrids 1, 2, and 3, respectively.
 ρ Weight on the control effort.
 Δ Difference.

I. INTRODUCTION

MICROGRIDS (μ Gs) are generally defined as a group of power generators, energy storage units, and distributed loads as a single controllable entity that can function in standalone and grid-connected mode [1]. The fact that μ Gs can have better power quality, higher power conversion efficiencies, and economic benefits can be foreseen as a key entity in future electricity networks globally [2]. The control and operation of μ Gs, considering the operational characteristics of renewable power generators (RPGs) and energy storage systems (ESSs) along with load management, have been the central idea of research in the last decade [3]. The μ Gs can also be configured as a cluster of different μ G units to facilitate a better electricity network but a complex controllable system [4].

In the past, several studies have been attempted in the control and operation of a cluster of μ Gs. Secondary power management was proposed for an ac μ G cluster using the two-layer cooperative framework. The secondary controller facilitated the optimum power among distributed energy resources (DERs) in each μ G and economic power dispatch among the μ G group [5]. A cluster-oriented control was proposed for the ac μ Gs cluster. The intercluster scheme was responsible for the optimum power sharing among μ Gs, while the intracluster manages the frequency and voltage of the DERs in each μ G [6]. A study was presented on pinning-based hierarchical and distributed cooperative control strategies for the ac μ G cluster [7]. A tube-model predictive control (MPC) was proposed for the offgrid μ Gs clusters. A mixed-stage optimization was used in which the control objective was optimized progressively at diverse energy management scales and prediction horizons [8]. Unified coordinated power control for the dc μ Gs cluster was proposed using an isolated bidirectional dc–dc converter [9].

In another article, effective power-sharing was presented among the μ Gs for networked ac and dc μ Gs using a set of interconnected converters [10]. An event-based distributed census control was used in the power-sharing method. In this method, each interconnected converter worked as an agent that required the information of its local and neighboring converters [10]. A study was performed on the modeling, analysis, and stabilization of the photovoltaic (PV)-based μ G cluster [11]. A distributed voltage control and power management of networked

μ Gs was studied. In this article, a two-level control framework was used [12]. A unified hierarchical control was proposed for tie-line power flow between the dc μ Gs. In this control scheme, the pinning strategy is unified with distributed optimization and average voltage regulation control loops [13]. A tertiary control for a cluster of dc μ Gs was presented. The proposed controller was very useful for the maximum utilization of renewable power, minimum stress and aging of components, and maintenance cost [14]. In another article, supervisory coordinated control was proposed for the fuel cell (FC) based dc μ Gs cluster based on the multiagent system. However, the concept of hybrid ESS and its effect on power distribution were not studied for the dc μ Gs cluster [15]. A dc power exchange highway-based power-sharing method was proposed for the dc μ Gs cluster [16].

Advanced control scheme such as MPC have shown their usefulness in the control and operation of the hybrid ESS-based μ Gs system [1], [17], [18]. An MPC has been used for the system-level control of the PV and battery ESS [19], [20], [21]. These studies showed that the MPC is a very effective control method for μ Gs considering operational cost, durability, better power quality, and voltage stability. A model predictive voltage control based control was studied for the renewable-energy-based μ Gs without a proportional–integral–derivative (PID) controller. It was found that the proposed work improved the dynamic performance of the μ G as compared to the PID controller [22]. An MPC-based current control for a bidirectional three-level dc/dc converter was proposed for hybrid energy storage based dc μ Gs. However, hydrogen storage characteristics were not considered in the article [23]. In another article, a study was proposed on a finite control set MPC-based control for the fast and reliable operation of the ac μ Gs. The proposed control strategy improved the voltage tracking capacity of the power converters [24]. A review was presented on the multiagent-based distributed control and optimization in the μ G cluster. It was observed that communication delay can significantly affects the overall performance of the μ G system [25]. A network fuzzy predictive control of the network μ Gs was studied for the dynamic voltage stabilization of the dc μ Gs. It was found that the proposed method showed better robustness as compared to the conventional method [26]. In another article, an adaptive dynamic reference control was proposed for the power converter for μ G applications. The proposed control strategy showed better convergence to its nominal reference even in the presence of the model parameter uncertainty, sensor imperfections, and unmodeled dynamics [27]. A computationally efficient MPC was studied for dual-output multilevel converters for μ G applications. It was found that the proposed method improved the system's performance by reducing the computational burden and achieving multivariable control [28]. In another article, a passivity-based partial sequential MPC was studied for grid-connected applications. The proposed control scheme enhanced the antidisturbance abilities and achieved resonance suppression [29]. An ultralocal predictive control was proposed for the grid-connected application using the sliding mode disturbance observer. It was found proposed control method outperformed the conventional methods [30]. A model-free-based predictive control was proposed for the grid-forming applications.

The proposed control scheme showed effective regulation of the grid-forming inverter without the knowledge of the physical model [31]. A review study was performed on the control strategies for the power converters in μ Gs. It was found that MPC is very effective for the better performance of power quality improvements in the μ Gs [32].

It may be concluded that a significant amount of research has been carried out on the power distribution in the μ G cluster using different control schemes, such as hierarchical and distributed control methods. However, according to the aforementioned literature review, there is an information gap in the control and power management of a μ G cluster with hybrid ESS. The different devices in the hybrid ESS (supercapacitor, battery, and hydrogen) have different energy efficiency, overcharging, and deep discharging limits. In addition, the difference in the state of charge (SOC) of ESS in different μ Gs indicates relative energy surplus or deficit in the μ Gs. Therefore, a more appropriate control scheme can facilitate power distribution among the μ Gs depending on the SOC of a given ESS. By doing so, the differences in energy surplus or deficit in different μ Gs can be taken care of. For example, the μ G with a higher battery SOC should deliver higher power than the other μ G which has a lower SOC. The different ESSs may also be active (based on working SOC) at a given operating time in different μ Gs. For example, in a cluster group of three μ Gs, μ G2 can have battery SOC in the working range (40%–80%) while μ G3 does not have battery SOC in the operational range instead hydrogen storage is in the working range (20%–90%). Therefore, power sharing based on SOC of ESS in different μ Gs becomes interesting considering the energy efficiency and response time of ESS. Here, it is worth mentioning that energy management in the given μ G is performed based on the SOC of ESS; therefore, at a time, only one storage is active either hydrogen or battery [33].

It can be summarized that control strategies used in the literature have limitations in that they are unable to facilitate the power-sharing among the μ Gs cluster based on the SOC of hybrid energy storage, constraints on the SOC of hybrid ESS, power output, and rate of power change of devices. Therefore, the proposed control strategy addresses the aforementioned limitations of the existing control methods using the adaptive MPC-based tertiary control layer which facilitates the power-sharing based on the SOC of hybrid ESS, handles the constraints on power and rate of power change of devices, and limits on the SOC of hybrid ESS. A complete closed-loop control of the tertiary layer with secondary and primary layers is presented for such a hybrid ESS-based system which is missing in the literature. Table I summarizes how the proposed control improves the limitations of the previous articles.

In the present article, the problem statement is that power-sharing among μ Gs should be driven by the SOC of the hybrid ESS of respective μ Gs, where each μ G in the cluster has hybrid energy storage (SC, battery, and hydrogen). To the best of the author's knowledge, this kind of system (μ G cluster based on hybrid ESS) and the given problem statement have not been addressed in the previous articles. In addition, the power-sharing is achieved in ac μ Gs; therefore, a suitable control mechanism is developed for controlling the inverters using different control

TABLE I
MAJOR CONTRIBUTION IN COMPARISON WITH STATE-OF-ART

	[5]	[6]	[7]	[9]	[10]	[12]	[13]	[15]	[34]	Proposed
Feature [1]	No	No	No	No	No	No	No	Yes	No	Yes
Feature [2]	No	No	No	No	No	No	No	No	No	Yes
Feature [3]	No	No	No	No	No	No	No	No	No	Yes
Feature [4]	Yes	Yes	Yes	No	Yes	Yes	No	No	No	Yes

*Feature [1] – Power sharing in μ Gs based on SOC considering hybrid ESS.
 Feature [2] – Complete closed-loop analysis based on MPC-based primary, secondary, and tertiary layers and transient performance analysis.
 Feature [3] – Application of adaptive MPC in the tertiary layer.
 Feature [4] – Power sharing between ac μ Gs.

layers framework. Therefore, the contributions of the present article are a unique problem statement and the development of a dedicated control mechanism to achieve the desired objectives. Applications of such type of ESS in μ G become a multi-input and multioutput system subjected to various operating constraints. Owing to the multi-input and multioutput plant subjected to multiple physical constraints on the power limit, rate of power change, and SOC, this kind of system needs a smart control scheme that can handle the multiple constraints and facilitate the desired response. Considering the suitability and advantages of the MPC for the multi-input and multiunit plant with multiple physical constraints, the authors used MPC in a hierarchical control (primary, secondary, and tertiary layers) framework. In this hierarchical control framework, each layer of control optimizes the control variables while fulfilling the various constraints and tracking the reference values. Further, the adaptive MPC capability has been used to ensure the SOC-based proportional power-sharing among the μ Gs while the SOC of battery and hydrogen storage vary in real-time. The major contributions of the present article can be summarized as follows.

- 1) Development of a control strategy for a cluster of hybrid energy storage-based μ Gs in which power exchange among μ Gs is governed by the SOC of hybrid ESS of respective μ Gs. This control scheme renders the minimization of SOC difference between μ Gs.
- 2) To obtain the set objectives and control the given multi-input and multioutput μ Gs system subjected to various operating constraints (SOC and rate of power change), a hierarchical control framework (primary, secondary, and tertiary) is developed.
- 3) The tertiary control layer is responsible for optimizing the reference signals for the power exchange among μ Gs. The different operating modes are defined based on the SOC of ESS in different μ Gs (Algorithm 1. Selection of the operating modes in the tertiary layer).
- 4) The secondary layer of the hierarchical control scheme ensures the effective control of the inverters (connected in cluster as shown in Fig. 2) for the power flow control and facilitating the plug-and-play and facilitating the plug-and-play capability in the μ Gs cluster.
- 5) The dynamic performance analysis of the proposed integrated hierarchical control framework (tertiary controller, secondary controller, and primary controller) is evaluated in different operating scenarios using power hardware-in-the-loop (PHIL) experiments.

Algorithm 1: Selection of the operating modes in tertiary layer.

Mode 1 Condition 1

IF ($P_{Net,ref} > 0$) && ($SOC_{\mu G2} > 42$) && ($SOC_{\mu G2} < 78$) && ($SOC_{\mu G3} > 42$) && ($SOC_{\mu G3} < 78$) && ($MHL_{\mu G2} > 20$) && ($MHL_{\mu G2} < 90$) && ($MHL_{\mu G3} > 20$) && ($MHL_{\mu G3} < 90$)

Mode 2 Condition 2

IF ($P_{Net,ref} < 0$) && ($SOC_{\mu G2} > 42$) && ($SOC_{\mu G2} < 78$) && ($SOC_{\mu G3} > 42$) && ($SOC_{\mu G3} < 78$) && ($MHL_{\mu G2} > 20$) && ($MHL_{\mu G2} < 90$) && ($MHL_{\mu G3} > 20$) && ($MHL_{\mu G3} < 90$)

Mode 3 Condition 3

IF ($P_{Net,ref} < 0$) && ($SOC_{\mu G2} > 42$) && ($SOC_{\mu G2} < 78$) && ($SOC_{\mu G3} < 42$) && ($SOC_{\mu G3} > 78$) && ($MHL_{\mu G2} > 20$) && ($MHL_{\mu G2} < 90$) && ($MHL_{\mu G3} > 20$) && ($MHL_{\mu G3} < 90$)

Mode 4 Condition 4

IF ($P_{Net,ref} < 0$) && ($SOC_{\mu G2} < 42$) && ($SOC_{\mu G2} > 78$) && ($SOC_{\mu G3} > 42$) && ($SOC_{\mu G3} < 78$) && ($MHL_{\mu G2} > 20$) && ($MHL_{\mu G2} < 90$) && ($MHL_{\mu G3} > 20$) && ($MHL_{\mu G3} < 90$)

Mode 5 Condition 5

IF ($P_{Net,ref} > 0$) && ($SOC_{\mu G2} < 42$) && ($SOC_{\mu G2} > 78$) && ($SOC_{\mu G3} < 42$) && ($SOC_{\mu G3} > 78$) && ($MHL_{\mu G2} > 20$) && ($MHL_{\mu G2} < 90$) && ($MHL_{\mu G3} > 20$) && ($MHL_{\mu G3} < 90$)

Mode 6 Condition 6

IF ($P_{Net,ref} > 0$) && ($SOC_{\mu G2} > 42$) && ($SOC_{\mu G2} < 78$) && ($SOC_{\mu G3} < 42$) && ($SOC_{\mu G3} > 78$) && ($MHL_{\mu G2} > 20$) && ($MHL_{\mu G2} < 90$) && ($MHL_{\mu G3} > 20$) && ($MHL_{\mu G3} < 90$)

Mode 7 Condition 7

IF ($P_{Net,ref} > 0$) && ($SOC_{\mu G2} < 42$) && ($SOC_{\mu G2} > 78$) && ($SOC_{\mu G3} > 42$) && ($SOC_{\mu G3} < 78$) && ($MHL_{\mu G2} > 20$) && ($MHL_{\mu G2} < 90$) && ($MHL_{\mu G3} > 20$) && ($MHL_{\mu G3} < 90$)

Mode 8 ELSE

Table I provides a concise summary of the comparison of the present article with the current state of the art.

The rest of this article is organized as follows. Section II explains the system description. Section III describes the methodology. Section IV explains the results. Finally, Section V concludes this article.

II. SYSTEM DESCRIPTION

In the proposed μG cluster, three μG s ($\mu G1$, $\mu G2$, and $\mu G3$) are considered. Each μG has RPG, hybrid ESS (SC, battery, and hydrogen), and loads as shown in Fig. 1. These μG s

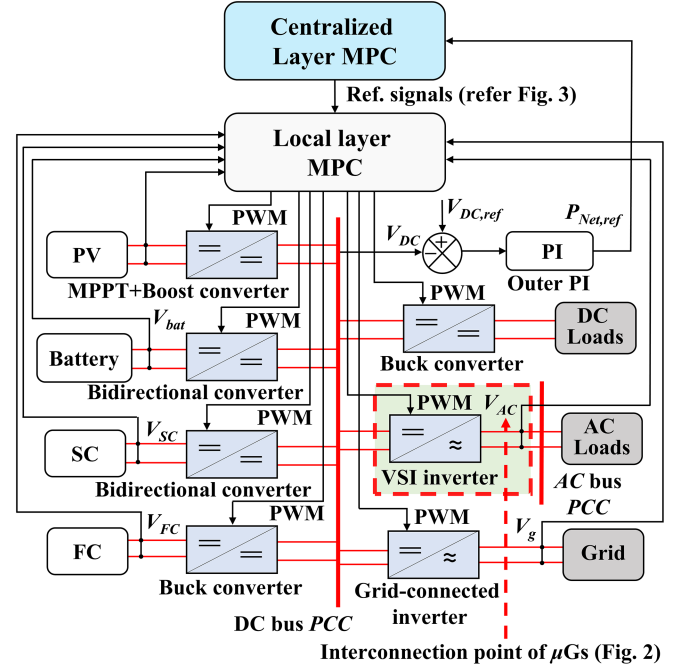


Fig. 1. Internal structure of the hybrid ESS-based μG with MPC in the present article.

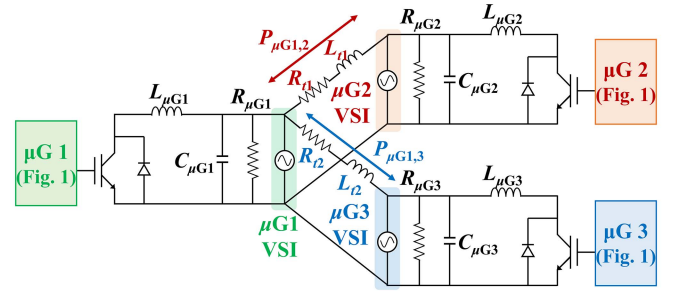


Fig. 2. Schematic of a cluster of μG s in the present article.

are connected using transmission lines based on resistive and inductive elements as shown in Fig. 2. Each μG has supervisory and local control for the optimal power allocation among its components, such as PV, battery, SC, FC, and the grid as shown in Fig. 3. This is referred to as primary control in this article. The working of the primary layer is presented in Section III-C. There is a tertiary controller that is responsible for the power exchange among the μG s based on the different operating modes of power management (described in the methodology Section II-I-A in detail). Tertiary control generates the control signals for the secondary controller. The adaptive MPC approach is used in the tertiary controller in unified control. In the secondary control, the SPWM of the voltage source inverters (VSIs) of each μG is controlled as shown in Fig. 4. The working of the secondary layer is described in Section III-B. The control scheme in the tertiary layer is shown in Fig. 5.

III. UNIFIED CONTROL STRATEGY

This section explains the working of the unified control strategy based on hybrid ESS-based μG s.

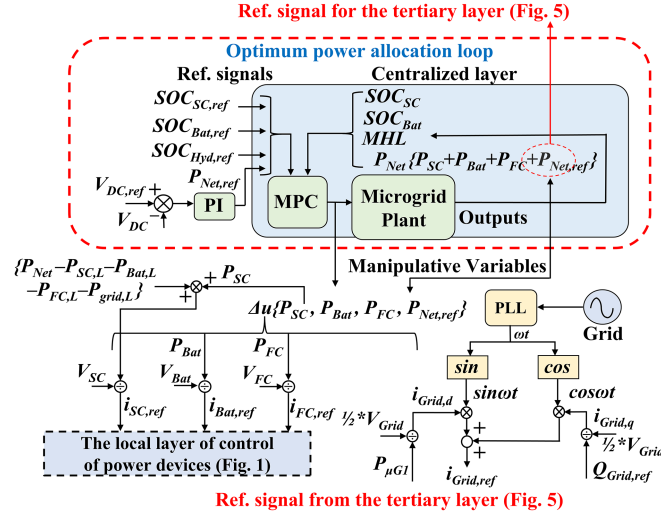


Fig. 3. Control structure of the primary control layer.

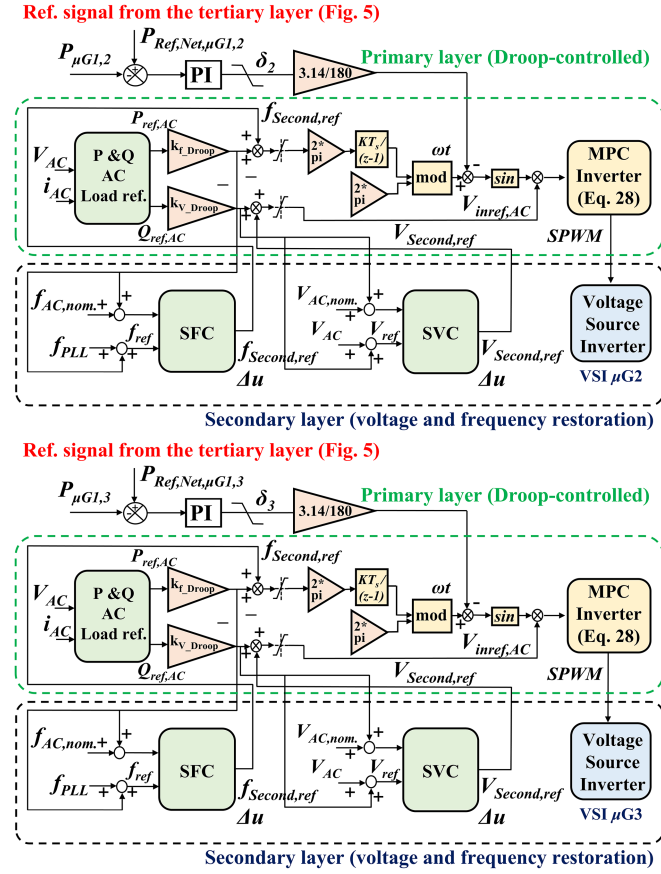


Fig. 4. Control structure of the secondary control layer.

A. Tertiary Layer of Control

The primary objective of the tertiary control is to generate the reference signals for the power exchange ($P_{\mu G1,2}$ and $P_{\mu G1,3}$) in μG s based on the SOC values of the ESSs in the μG s. These reference signals are used by the secondary control layer. For example, if the SOC values of the battery storage in $\mu G1$ and $\mu G2$ are in the working range (40%–80%), then power flow $P_{\mu G1,2}$ and

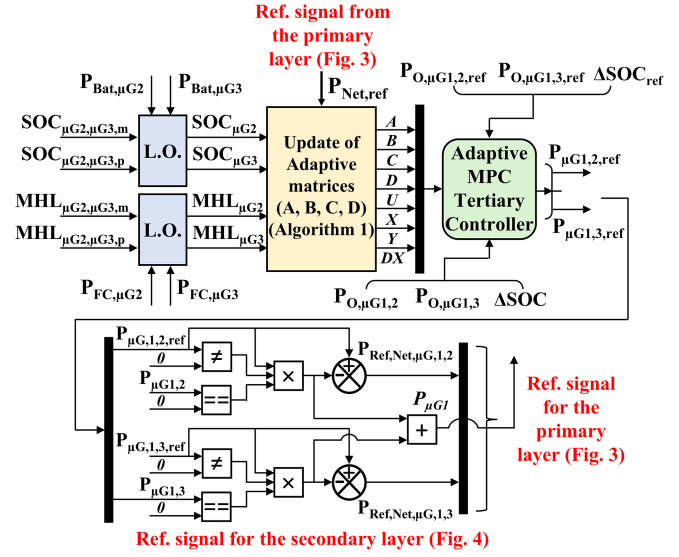


Fig. 5. Control structure of the tertiary control layer.

$P_{\mu G1,3}$ is proportional to the SOC of the battery storage in $\mu G1$ ($SOC_{\mu G1}$) and $\mu G2$ ($SOC_{\mu G2}$).

For ensuring the perfect power balance in the $\mu G1$, the net power reference signal can be provided as follows:

$$P_{Net,ref} = P_{\mu G1,2,ref} + P_{\mu G1,3,ref} \quad (1)$$

where $P_{\mu G1,2,ref}$ and $P_{\mu G1,3,ref}$ are the reference signals for power exchange between $\mu G1$ and $\mu G2$; and $\mu G2$ and $\mu G3$, respectively.

During power deficit conditions (generation < load), ($P_{Net,ref} > 0$), the relation between the $P_{\mu G1,2}$ and $P_{\mu G1,3}$ is required to be proportional to the $SOC_{\mu G2}$ and the SOC of the battery storage in $\mu G3$ ($SOC_{\mu G3}$). That means if the $\mu G2$ has a lower SOC value than $\mu G3$, $\mu G2$ should deliver lower power to $\mu G1$ as compared to the $\mu G3$. It can be formulated as follows:

$$\frac{P_{\mu G1,2,ref}}{P_{\mu G1,3,ref}} = \frac{SOC_{\mu G2}}{SOC_{\mu G3}} \quad (2)$$

Therefore, using (1) and (2), it can be derived as follows:

$$P_{O,\mu G1,2} = P_{\mu G1,2,ref} \left(1 + \frac{SOC_{\mu G3}}{SOC_{\mu G2}} \right) \quad (3)$$

and

$$P_{O,\mu G1,3} = P_{\mu G1,3,ref} \left(1 + \frac{SOC_{\mu G2}}{SOC_{\mu G3}} \right) \quad (4)$$

where $P_{O,\mu G1,2}$ and $P_{O,\mu G1,3}$ are the outputs of the adaptive MPC while $P_{\mu G1,2}$ and $P_{\mu G1,3}$ are the manipulative variables. $P_{Net,ref}$ (Fig. 1) equals to $P_{O,\mu G1,2}$ and $P_{O,\mu G1,3}$.

During power surplus conditions (generation > load), ($P_{Net,ref} < 0$), the relation between the $P_{\mu G1,2}$ and $P_{\mu G1,3}$ is desired to be inversely proportional to $SOC_{\mu G2}$ and $SOC_{\mu G3}$

$$\frac{P_{\mu G1,2,ref}}{P_{\mu G1,3,ref}} = \frac{SOC_{\mu G3}}{SOC_{\mu G2}} \quad (5)$$

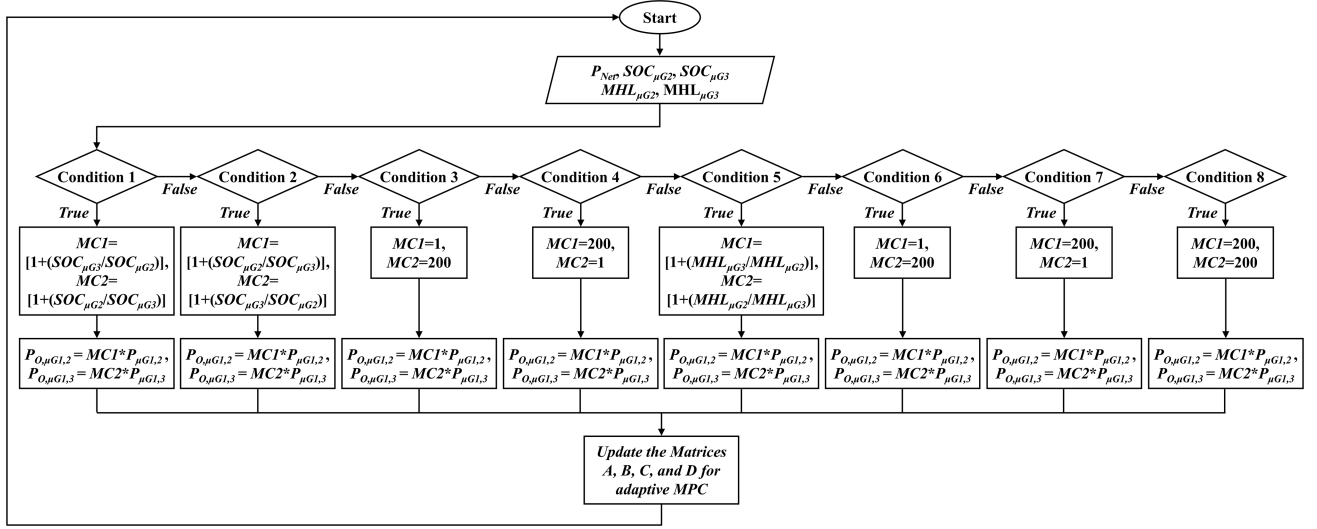


Fig. 6. Flow chart of the control Algorithm 1. Selection of the operating modes in the tertiary layer (in the algorithm, $P_{\mu G1,2}$ refers to $P_{\mu G1,2,ref}$, and $P_{\mu G1,3}$ refers $P_{\mu G1,3,ref}$).

Therefore, using (1) and (5), it can be formulated as follows:

$$P_{O,\mu G1,2} = P_{\mu G1,2,ref} \left(1 + \frac{SOC_{\mu G2}}{SOC_{\mu G3}} \right) \quad (6)$$

$$P_{O,\mu G1,3} = P_{\mu G1,3,ref} \left(1 + \frac{SOC_{\mu G3}}{SOC_{\mu G2}} \right). \quad (7)$$

Similarly, in case the SOC of battery storage is lower than (40%), then hydrogen storage becomes active corresponding to FC operation. Then, power flow among the μG s should be proportional to the metal hydride storage level (MHL) of the hydrogen tanks of respective μG s.

Therefore, in case $\mu G2$ and $\mu G3$ both have hydrogen storage in the working range, then it can be formulated as follows:

$$\frac{P_{\mu G1,2,ref}}{P_{\mu G1,3,ref}} = \frac{MHL_{\mu G2}}{MHL_{\mu G3}} \quad (8)$$

where $MHL_{\mu G2}$ and $MHL_{\mu G3}$ are the MHL of the hydrogen tanks in $\mu G2$ and $\mu G3$, respectively. Therefore, using (1) and (8), it can be derived as follows:

$$P_{O,\mu G1,2} = P_{\mu G1,2,ref} \left(1 + \frac{MHL_{\mu G3}}{MHL_{\mu G2}} \right) \quad (9)$$

and

$$P_{O,\mu G1,3} = P_{\mu G1,3,ref} \left(1 + \frac{MHL_{\mu G2}}{MHL_{\mu G3}} \right). \quad (10)$$

Following the inferences of (1)–(10), the different operating modes are defined based on the values of SOC and MHL in different μG s. The details of different operating modes in the tertiary layer are provided in the selection of the operating modes in the tertiary layer algorithm. The term P_{Net} in the selection of the operating modes in the tertiary layer algorithm captures the difference in the power generation and load demand. Therefore, other possible operating modes exist, and the relationships among different variables are provided in the selection of the operating modes in the tertiary layer algorithm.

Considering the (3), (4), (6), (7), (9), and (10), the desired power allocation among μG s can be achieved only when the SOC and MHL values of the storages are updated in real-time operation. Here is the usefulness of the adaptive MPC can be applied. In adaptive MPC, the plant state–space matrices can be updated at each sampling instant and the change in the plant dynamics due to parameter variations can be captured. In the proposed tertiary layer of control, the power distribution among μG s requires that values of SOC and MHL for given μG s should be updated at each sampling time. In this way, the state–space model of the plant is updated at each sampling time. Therefore, an adaptive MPC is developed, which facilitates the required power sharing among the μG s cluster.

In the case of adaptive MPC, nominal operating points are updated at each sampling time as per the requirement, which is consistent with the updated model of the plant. It can be presented as follows:

$$x(k+1) = \bar{x} + A(x(k) - \bar{x}) + B(u_t(k) - \bar{u}_t) + \Delta \bar{x} \quad (11)$$

and

$$y(k) = \bar{y} + C(x(k) - \bar{x}) + D(u_t(k) - \bar{u}_t) \quad (12)$$

where A , B , C , and D are the plant model matrices to be updated in run-time due to nonlinearity or time-varying characteristics. \bar{x} , \bar{y} , \bar{u}_t , and $\Delta \bar{x}$ are the nominal states, nominal outputs, nominal inputs, and nominal state increments, respectively.

In adaptive MPC, a linear-time-varying Kalman filter is used to estimate the gains L and M at each control interval which is done by the inbuilt facility in the MATLAB Simulink [35]. The value of the gain L_k and M_k can be calculated as follows [35]:

$$L_k = (A_k P_{k|k-1} C_{m,k}^T + N) (C_{m,k} P_{k|k-1} C_{m,k}^T + R)^{-1} \quad (13)$$

$$M_k = P_{k|k-1} C_{m,k}^T (C_{m,k} P_{k|k-1} C_{m,k}^T + R)^{-1} \quad (14)$$

$$P_{k+1|k} = A_k P_{k|k-1} A_m^T - (A_k P_{k|k-1} C_{m,k}^T + N) L_k^T + Q \quad (15)$$

where A_k and $C_{m,k}$ are the state–space matrices updated with time interval k . R , N , and Q are the state covariance matrices. $P_{k|k-1}$ is the state-estimation error covariance matrix estimated at the time interval $k-1$.

In a conventional MPC controller, the system plant mode is linearized at a nominal operating point to obtain the LTI approximation. The state–space model at the nominal operating point (considering the 50% value of SOC and MHL) of the tertiary layer of control based on the MPC is derived as follows:

$$\begin{bmatrix} \dot{P}_{\mu s G1,2,\text{ref}} \\ \dot{P}_{\mu s G1,3,\text{ref}} \\ \Delta \text{SOC} \end{bmatrix} = \begin{bmatrix} 0 & 0 & 0 \\ 0 & 0 & 0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} P_{\mu G1,2,\text{ref}} \\ P_{\mu G1,3,\text{ref}} \\ \Delta \text{SOC} \end{bmatrix} + \begin{bmatrix} 1 & 0 \\ 0 & 1 \\ \zeta T_s / C & -\zeta T_s / C \end{bmatrix} \begin{bmatrix} P_{\mu G1,2,\text{ref}} \\ P_{\mu G1,3,\text{ref}} \end{bmatrix} \quad (16)$$

$$\begin{bmatrix} P_{O,\mu G1,2} \\ P_{O,\mu G1,3} \\ \Delta \text{SOC} \end{bmatrix} = \begin{bmatrix} \text{MC1} & 0 & 0 \\ 0 & \text{MC2} & 0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} P_{\mu s G1,2,\text{ref}} \\ P_{\mu s G1,3,\text{ref}} \\ \Delta \text{SOC} \end{bmatrix} + \begin{bmatrix} 0 & 0 \\ 0 & 0 \\ 0 & 0 \end{bmatrix} \begin{bmatrix} P_{\mu G1,2,\text{ref}} \\ P_{\mu G1,3,\text{ref}} \end{bmatrix}. \quad (17)$$

Therefore, state–space matrices can be obtained as follows:

$$A = \begin{bmatrix} 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 1 & 0 \end{bmatrix}, B = \begin{bmatrix} 1 & 0 \\ 0 & 1 \\ 0 & 0.0002441 \\ 0 & 0 \end{bmatrix}, \quad (18)$$

$$C = \begin{bmatrix} 1.5 & 0 & 0 & 0 \\ 0 & 1.5 & 0 & 0 \\ 0 & 0 & 0 & -0.0003154 \end{bmatrix}, D = \begin{bmatrix} 0 & 0 \\ 0 & 0 \\ 0 & 0 \end{bmatrix}$$

where MC1 and MC2 are the variable gains which are updated in the adaptive MPC scheme as provided in the Algorithm (selection of the operating modes in the tertiary layer). ΔSOC is the change in SOCs between μGs due to $P_{\mu G1,2}$ and $P_{\mu G1,3}$. C_{SC} , C_{Bat} , and C_{H_2} are the storage capacities of SC, battery, and hydrogen tank, respectively. ζ , are the power conversion coefficients into equivalent energy content for the respective storage devices and are taken from [33]. C is storage capacity.

The objective cost-function in the MPC can be formulated as follows:

$$J = \sum_{j=1}^{\text{Nu}} \alpha_1 P_{\mu G1,2,\text{ref}(t+j)}^2 + \alpha_2 P_{\mu G1,3,\text{ref}(t+j)}^2 + \beta_1 \Delta P_{\mu G1,2,\text{ref}(t+j)}^2 + \beta_2 \Delta P_{\mu G1,3,\text{ref}(t+j)}^2 \sum_{j=1}^{\text{Np}} \gamma_1 \left(P_{O,\mu G1,2(t+j)} - P_{O,\mu G1,2,\text{ref}(t+j)} \right)^2$$

TABLE II
DETAILS OF THE PARAMETERS OF THE SECONDARY LAYER OF CONTROL

Parameters	Values
K_p, K_I	0.014, 0.8
$R_{\mu 1,2}, L_{\mu 1,2}$ (tie-line parameters among μGs)	0.2 (Ω), 50e-3 (H)
Off-grid inverter (full-bridge, LC filter type)	$L_s=4\text{e-}4$ H, $C_s=4000\text{e-}6$ (F), f (kHz)=2, $R_o=100$ (Ω)
t_{d1}, t_{d2}	0.7 ms, 1 ms

TABLE III
WEIGHT FACTORS IN MPC OPTIMIZATION OF TERTIARY LAYER

Parameters	Battery mode	FC mode
Weights		
α_1, α_2	0.1, 0.1	0.1, 0.1
β_1, β_2	0.1, 0.1	1, 1
$\gamma_1, \gamma_2, \gamma_3$	10, 10, 0	10, 10, 0
Output variables (OVs) min. ECR*	0, 0	0, 0
OV max. ECR	0, 0	0, 0
Manipulative variables (MVs) min. ECR	0, 0, 0, 0	0, 0, 0, 0
MV max. ECR	0, 0, 0, 0	0, 0, 0, 0
Constraints		
MV min. ($P_{\mu 1,2}, P_{\mu 1,3}$) W	-5000, -5000	-5000, -5000
MV max. ($P_{\mu 1,2}, P_{\mu 1,3}$) W	5000, 5000	5000, 5000
MV rate min. ($\Delta P_{\mu 1,2}, \Delta P_{\mu 1,3}$) W per sample	-2500, -2500	-0.01, -0.01
MV rate max. ($\Delta P_{\mu 1,2}, \Delta P_{\mu 1,3}$) W per sample	2500, 2500	0.01, 0.01
Measured output (MOs) min. ($P_{O,\mu G1,2}, P_{O,\mu G1,3}$) W	-5000, -5000	-5000, -5000
MOs max. ($P_{O,\mu G1,2}, P_{O,\mu G1,3}$) W	5000, 5000	5000, 5000
N_p, N_u, T_s (s)	20, 2, 100e-5	20, 2, 100 e-5

$$+ \gamma_2 (P_{O,\mu G1,3(t+j)} - P_{O,\mu G1,3,\text{ref}(t+j)})^2 + \gamma_3 (\Delta \text{SOC}_{(t+j)} - \Delta \text{SOC}_{\text{ref}(t+j)})^2. \quad (19)$$

The first two weight terms (α) allow the relative utilization of manipulative variables. Weight factor β facilitates the weighted change in the manipulative variables. Weight factor γ is used for assigning the weight to the objectives. The values of the weight factors, physical constraints on manipulative variables, outputs, and rate constraints in (19) are provided in Table III. The ECR stands for the equal concern for relaxation. By opting for the appropriate value of ECR, the designer can provide reasonable flexibility at the constraints. For example, an ECR value equal to zero leads to hard constraints on associated parameters. In Table III, the battery and FC modes column denotes the weight factors used in (19) for the battery and FC operating modes, respectively.

B. Secondary Layer of Control

The objective of the secondary control layer is to control the power flow among the μGs . The reference power flow for the secondary control is generated by the tertiary control layer. The active power flow between two inverters can be represented as follows:

$$P = \frac{V_s V_r \sin \delta}{X} \quad (20)$$

$$Q = \frac{V_s V_r}{X} \cos \delta - \frac{V_r^2}{X} \quad (21)$$

where P and Q are active and reactive power, respectively. V_s and V_r are sending and receiving end voltages of inverters, respectively. X is the transmission line impedance, and δ is the phase angle difference between the sending and receiving ends. It is assumed that impedance is inductively dominated.

Hence, the power flow between the μ Gs can be controlled by controlling the phase angle between the μ Gs. The μ Gs are interconnected by each other using the VSIs. It is required that one μ G inverter makes the reference grid, and the other μ G inverters should follow it and change their phase angle relative to it (the reference grid inverter) as per the power requirement. Therefore, the VSI of μ G1 makes the reference grid, and the VSIs of μ G2 and μ G3 follow this and change their phase angle.

Proportional–integral (PI) controller is used to obtain the value of the phase angle (Fig. 4). The value of the phase angle change can be obtained by

$$\delta_2 = (K_p + K_i/s) (P_{\mu G1,2(t+j)} - P_{\text{Ref,Net},\mu G1,2(t+j)}) \quad (22)$$

$$\delta_3 = (K_p + K_i/s) (P_{\mu G1,3(t+j)} - P_{\text{Ref,Net},\mu G1,3(t+j)}) \quad (23)$$

where k_p and k_i are the proportional and derivative gains of the PI controller (Table II). $P_{\mu G1,2(t+j)}$ and $P_{\text{ref,Net},\mu G1,2(t+j)}$ represent the actual power exchange and reference power exchange between μ G1 and μ G2, respectively. Therefore, the reference voltage of the inverters can be formulated as follows:

$$V_{\text{VSI},\mu G1} = V_{\text{ref}} \sin(2\pi f_{\text{ref}} t) \quad (24)$$

$$V_{\text{VSI},\mu G2} = V_{\text{ref}} \sin(2\pi f_{\text{ref}} t) - \delta_2 \quad (25)$$

$$V_{\text{VSI},\mu G3} = V_{\text{ref}} \sin(2\pi f_{\text{ref}} t) - \delta_3 \quad (26)$$

where V_{ref} and f_{ref} are the nominal values of the μ G voltage and frequency, respectively. $V_{\text{VSI},\mu Gi = 1,2,3}$ denotes the reference signals for the VSIs for μ G1, μ G2, and μ G3, respectively.

The discrete state–space model of the VSI inverter can be represented as follows:

$$\begin{bmatrix} i_L(k+1) \\ V_o(k+1) \end{bmatrix} = \begin{bmatrix} 1 & -\frac{T_s}{L_s} \\ \frac{T_s}{C_s} & \left(1 - \frac{T_s}{R_o C_s}\right) \end{bmatrix} \begin{bmatrix} i_L(k) \\ V_o(k) \end{bmatrix} + \begin{bmatrix} \frac{T_s}{L_s} V_{\text{dc}} \\ 0 \end{bmatrix} u \quad (27)$$

where i_L and V_o are the inverter inductor current and output voltage, respectively; R_o , C_s , and L_s are the ac load resistance, output inverter capacitance, and inductance, respectively.

The cost function for the inverters can be given as follows:

$$J = \sum_{k=1}^{N_p} \lambda |V_{\text{VSI},\mu Gi=1,2,3}(t+k|t) - V_o(t+k)|^2 + \sum_{k=1}^{N_p} \beta |\Delta u(t+k-1)|^2 \quad (28)$$

where Δu and V_o are the control effort and output voltage of the inverter, respectively. The control effort is the magnitude of the sine wave which is compared with the triangular wave for generating the SPWM signal for the given inverters.

C. Primary Layer of Control

The objective of the primary control layer is optimally distributing the power among the components within each μ G considering their response time and physical constraints on the SOCs. MPC methodology is used in the primary control layer. The state–space model for the primary layer can be provided as follows:

$$\begin{bmatrix} \dot{\text{SOC}}_{\text{SC}} \\ \dot{\text{SOC}}_{\text{Bat}} \\ \dot{\text{SOC}}_{\text{Hyd}} \end{bmatrix} = \begin{bmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} \text{SOC}_{\text{SC}} \\ \text{SOC}_{\text{Bat}} \\ \text{SOC}_{\text{Hyd}} \end{bmatrix} + \begin{bmatrix} \zeta_{\text{SC}} T_s / C_{\text{SC}} & 0 & 0 & 0 \\ 0 & \zeta_{\text{Bat}} T_s / C_{\text{Bat}} & 0 & 0 \\ 0 & 0 & \zeta_{\text{FC}} T_s / C_{\text{Hyd}} & 0 \end{bmatrix} \begin{bmatrix} P_{\text{SC}} \\ P_{\text{Bat}} \\ P_{\text{FC}} \\ P_{\text{Grid}} \end{bmatrix}. \quad (29)$$

The output matrix can be written as follows:

$$\begin{bmatrix} P_{\text{Net}} \\ \text{SOC}_{\text{SC}} \\ \text{SOC}_{\text{Bat}} \\ \text{SOC}_{\text{Hyd}} \end{bmatrix} = \begin{bmatrix} 0 & 0 & 0 \\ 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} \text{SOC}_{\text{SC}} \\ \text{SOC}_{\text{Bat}} \\ \text{SOC}_{\text{Hyd}} \end{bmatrix} + \begin{bmatrix} 1 & 1 & 1 & 1 \\ 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 \end{bmatrix} \begin{bmatrix} P_{\text{SC}} \\ P_{\text{Bat}} \\ P_{\text{FC}} \\ P_{\text{Grid}} \end{bmatrix}. \quad (30)$$

C_{SC} , C_{Bat} , and C_{Hyd} are the storage capacities of SC, battery, and hydrogen tank, respectively. The cost function for the primary layer is given as follows:

$$J = \sum_{j=1}^{N_u} \alpha_1 P_{\text{SC}(t+j)}^2 + \alpha_2 P_{\text{Bat}(t+j)}^2 + \alpha_3 P_{\text{FC}(t+j)}^2 + \alpha_4 P_{\text{Grid}(t+j)}^2 + \beta_1 \Delta P_{\text{SC}(t+j)}^2 + \beta_2 \Delta P_{\text{Bat}(t+j)}^2 + \beta_3 \Delta P_{\text{FC}(t+j)}^2 + \beta_4 \Delta P_{\text{Grid}(t+j)}^2 + \sum_{j=1}^{N_p} \gamma_1 (P_{\text{Net}(t+j)} - P_{\text{Net,ref}(t+j)})^2 + \gamma_2 (\text{SOC}_{\text{SC}(t+j)} - \text{SOC}_{\text{SC,ref}(t+j)})^2 + \gamma_3 (\text{SOC}_{\text{Bat}(t+j)} - \text{SOC}_{\text{Bat,ref}(t+j)})^2 + \gamma_4 (\text{MHL}_{(t+j)} - \text{MHL}_{\text{Hyd,ref}(t+j)})^2. \quad (31)$$

The methodology and constants in (29) of the primary control layer and the weight-tuning and constraints of (31) are taken from [33]. This part is not discussed here in detail to avoid redundancy.

Information exchange is required among different layers in the μ G groups. In practical applications, this information exchange

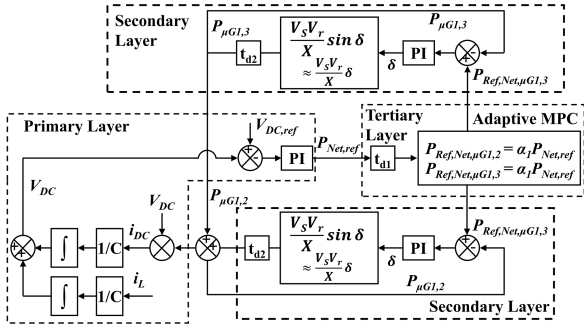


Fig. 7. Simplified overall control diagram of all layers.

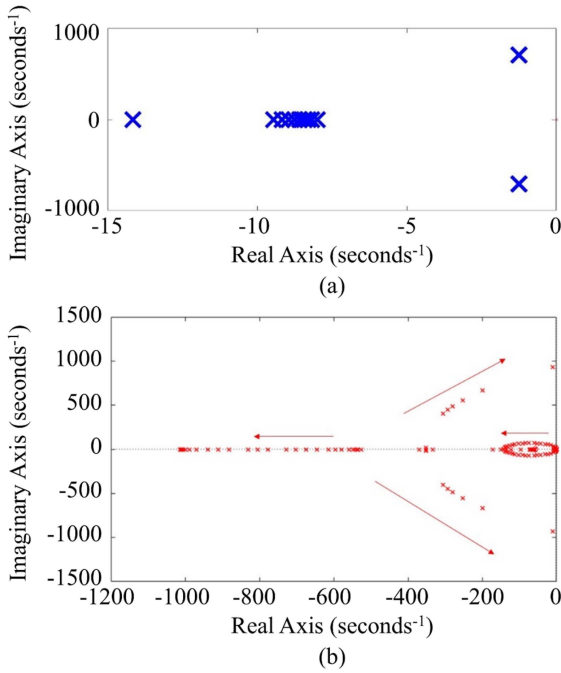


Fig. 8. Stability analysis of the system: (a) secondary layer and (b) overall system.

can be achieved via wired (i.e., PLC or CAN) or wireless (i.e., Zigbee, Wi-Fi, Bluetooth, or cellular network communication) [36]. In this article, the direct connection of different signals is considered for information exchange in simulation development.

The overall stability of the overall system (primary, secondary, and tertiary) is studied in a simplified scenario. In this cluster of μ Gs, the power exchange occurs when all the storages are saturated and power balance is achieved by exporting/importing the power to other μ Gs. Therefore, during the power exchange among the μ G, the dc bus voltage is regulated by exchanging power with other μ Gs and the overall system can be simplified as shown in Fig. 7. Furthermore, it is assumed the MPC controller in the second and tertiary layer is sufficiently fast to track the reference value. A delay is added in the control loops to take care of the delay in tracking the reference values in MPC controllers. The secondary layer MPC stability is studied as shown in Fig. 8(a). The Root locus diagram shows that for the giving tuning parameters (weight factors) the system behaves

stably. Similarly, using the design parameters the overall system behaves stable as shown in Fig. 8(b).

D. Design Guidelines and Procedure for the Proposed Controller

The tertiary layer working is based on the optimization of the cost-function J . MPC optimizes its control actions (manipulative variables) to minimize the cost-function subjected to given constraints on the control and output variables. By using the appropriate weights, one manipulative variable can be penalized compared to another in optimization. Therefore, tuning of parameters is essential for the desired response of the controller. In the tertiary layer of control, tracking the reference power is of utmost importance; therefore, high values are assigned to γ_1 and γ_2 . However, the minimization of the SOC difference between the ESSs in μ G 2 and μ G 3 is not important; therefore, γ_3 is kept at 0 to provide flexibility in the operation. For effective power balance, the cost terms associated with $P_{\mu G1,2}$ and $P_{\mu G1,3}$, and $\Delta P_{\mu G1,2}$ and $\Delta P_{\mu G1,3}$ are relatively less important compared to tracking the power reference signal. Therefore, in battery mode (Table III), lower weights are assigned to β_1 and β_2 as compared to the Y_1 and Y_2 . Similarly, lower values of α_1 and α_2 are assigned as compared to Y_1 and Y_2 . However, the FC mode has higher weights of β_1 and β_2 for penalizing the rate of power exchange during this mode. In addition, further constraints are added to the rate of power change during FC mode. In this case, it was kept at 100 W/s.

Prediction and control horizons are also very important in the controller design. Generally, a suitable choice can be $T = T_s N_p$, where N_p is the prediction horizon, T_s is the sampling time, and T is the desired response time. The control horizon (N_c) must be equal to or less than the prediction horizon. A large value of the control horizon may require a high computational power. In the present article, several simulations in different conditions were performed for the suitable choice for N_p and N_c .

Similarly, in case of designing the MPC for the secondary layer to minimize the cost function (28), tracking the reference output voltage is of utmost importance. Therefore, the higher weight is assigned to λ (for tracking reference signal) while the lower weight is assigned to β (for control move).

The power-sharing among the μ Gs depends on the SOC and MHL of ESSs in the given cluster. This accurate power-sharing can be achieved by updating the parameters MC1 and MC2 using adaptive MPC (refer to selection of the operating modes in the tertiary layer algorithm). MC1 and MC2 can be defined as variables that depend on the SOC and MHLs of μ Gs. The calculation of these variables is conducted based on certain decision-making using the algorithm (selection of the operating modes in the tertiary layer) in Fig. 6. Therefore, MC1 and MC2 are estimated based on the SOC and MHL values in mode 1, mode 2, and mode 5. In mode 1 and mode 2, power-sharing is based on the SOC of ESSs and in mode 5 power-sharing is based on the MHLs. However, in certain situations, SOC or MHL-based power-sharing among μ Gs is not desirable. For example, SOC in μ G 2 is out of the working range while SOC in μ G 3 is in the working range. Therefore, in such a

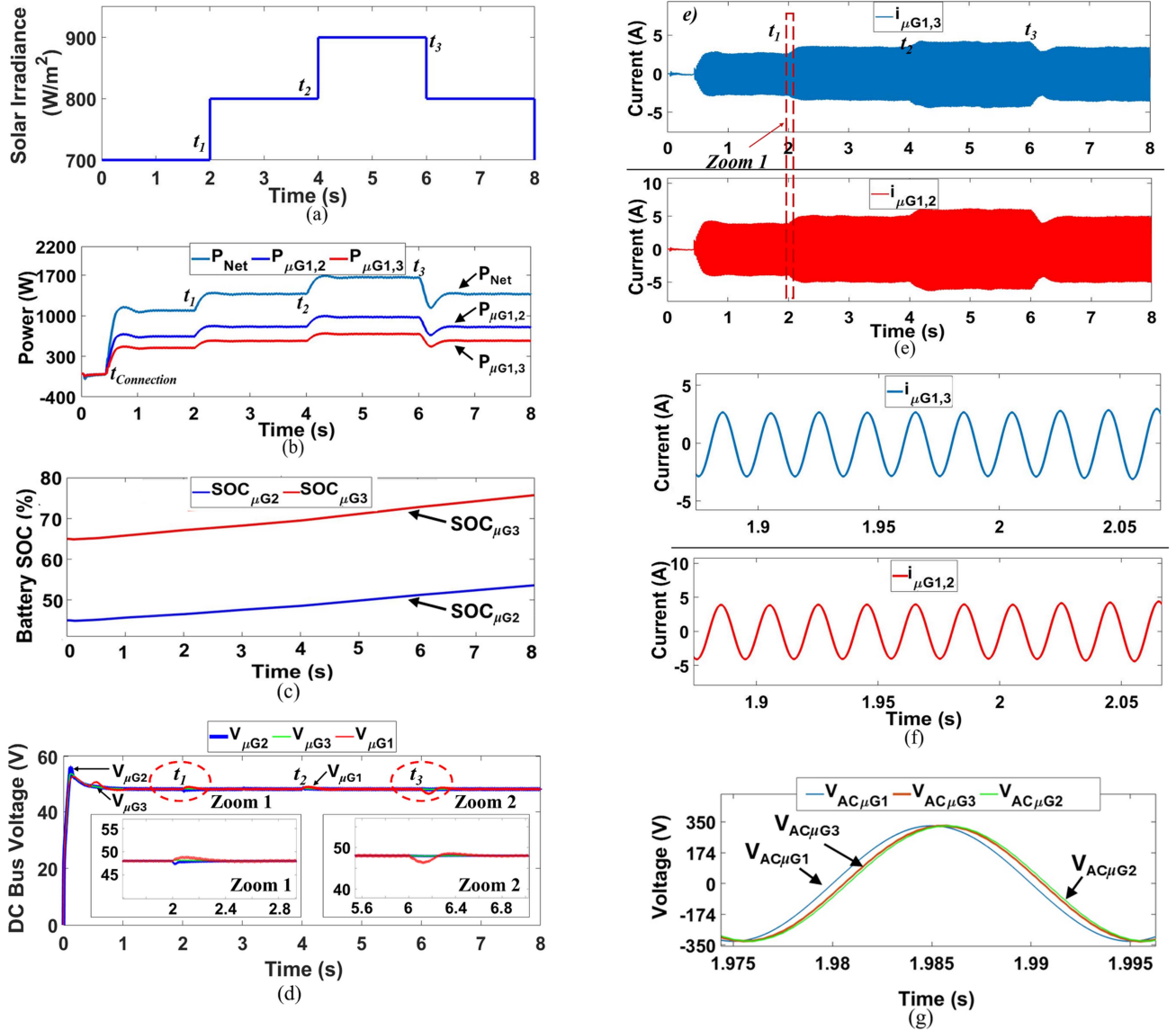


Fig. 9. Coordination of proposed controller for μ Gs cluster in Scenario 1. (a) Solar Irradiance. (b) Power exchange among the μ Gs. (c) SOC in μ Gs. (d) DC bus voltage in the μ Gs. (e) Current exchange among the μ Gs. (f) Current exchange among the μ Gs zoomed-in view. (g) AC bus voltage in the μ Gs.

situation, FC power in μ G 2 can be used for power exchange among μ Gs avoiding the overcharging and deep-discharging of the battery. However, utilization of the FC in μ G 2 is not as energy efficient as compared to the battery. Hence, the proposed controller prefers to share the entire power with μ G 3 which has a battery SOC in the working range. By doing this, both objectives of energy-efficient operation (avoiding the FC operation) as well as avoidance of the deep-discharging and overcharging of the battery storage can be achieved. In other words, the proportional power-sharing is disabled and power is exchanged between two μ Gs only (that SOC in the working range). In such cases, MC1 and MC2 are chosen appropriately. The high weight of MC is used to minimize the power exchange with the associated μ G. For example, in mode 4, μ G 2 does not have SOC in the working range while μ G 3 has SOC in the working range; therefore, as per control logic it is intended to exchange the power between μ Gs 1 and 3 and power exchange between μ Gs 1 and 2 should be disabled. This is achieved using a high value of MC1 which

is taken around 200 and a low value of MC2 which is 1 (refer to mode 4 in selection of the operating modes in the tertiary layer algorithm). Selection of the operating modes in the tertiary layer). Using value 1 for MC2 ensures that all the power is exchanged between μ Gs 1 and 3. Similarly, MC1 and MC2 are updated for mode 4, mode 6, and mode 7.

The adaptive MPC accurately updates the plant matrices by measuring the SOC and MHL in real-time conditions. Therefore, accurate power-sharing among the μ Gs can be ensured based on the SOC/MHL. The power exchange among the μ Gs during the FC mode (when hydrogen MHL is within the range) is effectively controlled by incorporating the constraints on the maximum and minimum values of the rate of power exchange. In addition, the appropriate weights of the rate of power exchange (as given in Table III) are also chosen carefully. During smooth power control of power exchange among μ Gs, grid power is used to provide the required power balance in the μ G cluster. In this mode, power exchange among the μ Gs (provided by

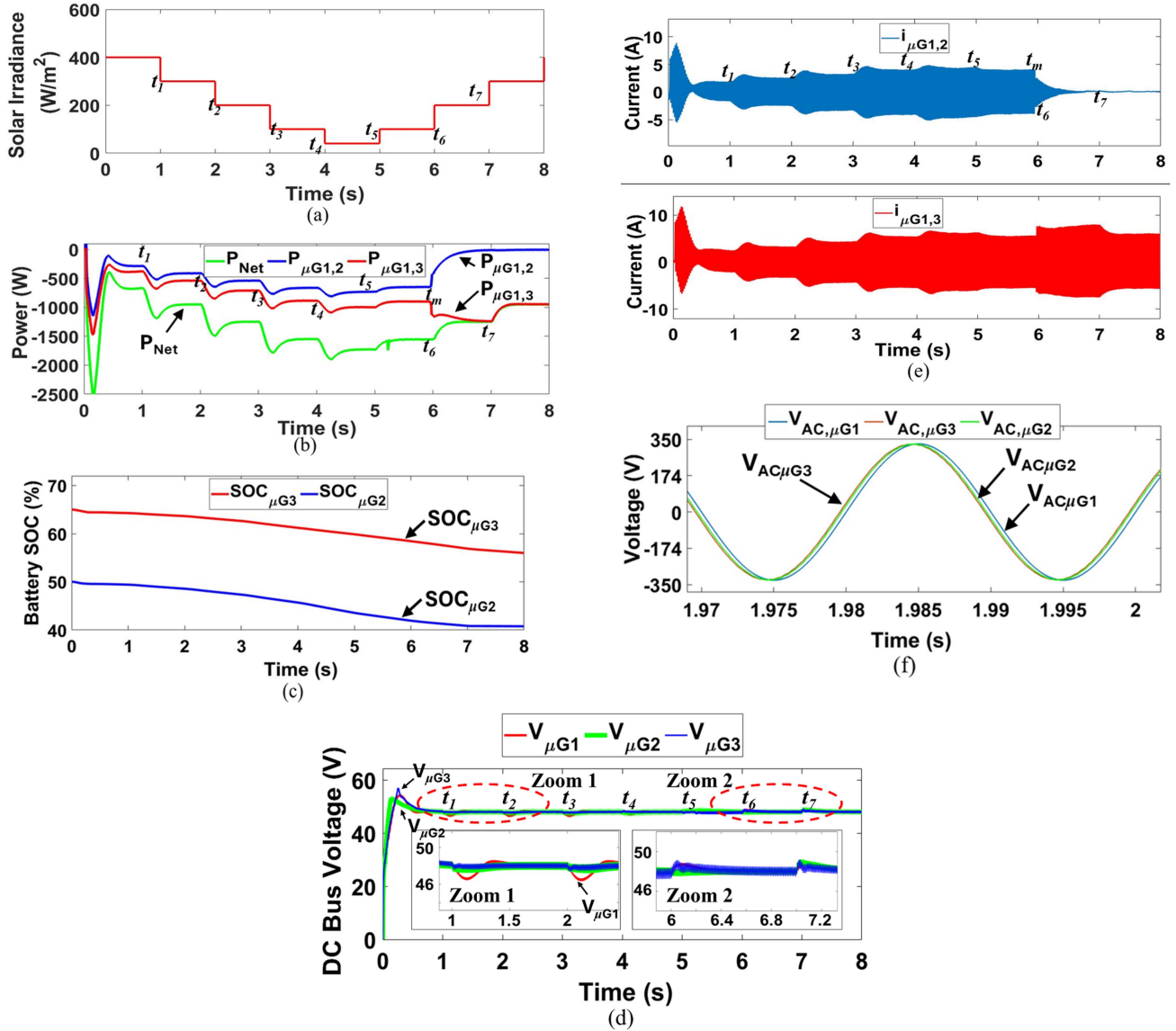


Fig. 10. Coordination of the proposed controller for μG s cluster in Scenario 2. (a) Solar Irradiance. (b) Power exchange among the μG s. (c) SOC in μG s. (d) DC bus voltage in the μG s. (e) Current exchange among the μG s. (f) AC bus voltage in the μG s.

the FC generators) is smoothly controlled by the tertiary layer ensuring the better and more durable operation of the FCs. A similar approach is used for the battery mode, however, a less strict condition is imposed for the rate of power exchange during battery mode as compared to the FC mode (Table III). Effective and controlled power exchange using tertiary layer control provides efficient and durable operation of the FC. The tuning of the PI in table is performed by the root locus method by obtaining the transfer function of (22)–(24).

IV. RESULTS AND DISCUSSIONS

A. Scenario 1: $\mu G1$ Has Surplus Power and Battery Storage in $\mu G2$, and $\mu G3$ is in the Functional Range (40%–80%)

The working of the unified controller in Scenario 1 is shown in Fig. 9. In this scenario, both $\mu G2$ and $\mu G3$ have battery SOC in the working range corresponding to mode 2 (selection of the

operating modes in the tertiary layer algorithm). The status of the $P_{Net,ref}$ in the $\mu G1$ is negative (the sign convention has been taken reverse as compared to algorithm [selection of the operating modes in the tertiary layer, in Fig. 9(b) for better illustration]. Battery SOC in $\mu G1$ reaches the maximum value (approximately 78%), which means that an excess of power needs to be utilized to maintain the power balance in the $\mu G1$. The power imbalance in the $\mu G1$ is simulated by varying PV power, as shown in Fig. 9(a) at instants t_1 , t_2 , and t_3 , respectively. Fig. 9(b) shows that as the power imbalance in $\mu G1$ happens, the power exchange among the μG s is varied proportionally. Fig. 9(b) represents the power distribution $P_{\mu G1,2}$, and $P_{\mu G1,3}$ which is proportional to the SOC of $\mu G2$ and $\mu G3$. The SOC of the $\mu G3$ is higher than the SOC of $\mu G2$; therefore, the magnitude of the power flow $P_{\mu G1,2}$ is higher than the power flow between $P_{\mu G1,3}$, which is consistent with the derived equations in (5), (6), and (7). As the power exchange between the μG s is used to charge the

battery storages in respective μ Gs, the SOC of battery storage in μ G2 and μ G3 increase correspondingly, as justified in Fig. 9(c). The stability of the dc bus voltage in different μ Gs is shown in Fig. 9(d). The transient variations in the dc bus voltage in μ G1 correspond to the transient power imbalance. In Fig. 9(e), the magnitude of the current flowing $i_{\mu G1,2}$ and $i_{\mu G1,3}$ between the μ Gs is proportional to the corresponding values of the power exchange $P_{\mu G1,2}$ and $P_{\mu G1,3}$, respectively. This can be seen as the proposed unified control facilitates the stable operation of all the μ Gs during all the conditions of the power imbalances. The waveforms of the ac current flowing between the different μ Gs are shown in Fig. 9(e). Fig. 9(f) shows the zoom-in view of ac current waveforms in the tie-lines among the different μ Gs. The output voltage waveforms of the VSIs in different μ Gs are shown in Fig. 9(g). Based on the power reference signals generated by the tertiary layer control, the secondary layer control adjusts the relative phase angles of the respective VSIs. The VSI in the μ G1 (VSI $_{\mu G1}$) functions as a reference voltage node while the magnitude and phase of the VSIs in μ G2 and μ G3 (VSI $_{\mu G2}$ and VSI $_{\mu G3}$) are adjusted according to the VSI $_{\mu G1}$. The phase of the VSI $_{\mu G2}$ and VSI $_{\mu G3}$ are lagged compared to the VSI $_{\mu G1}$ depending on the power exported from the μ G1 to μ G2 and μ G1 to μ G3. As the power exchange $P_{\mu G1,2}$ is higher compared to $P_{\mu G1,3}$, the phase difference between $V_{AC\mu G1}$ and $V_{AC\mu G2}$ is greater than that between the $V_{AC\mu G1}$ and $V_{AC\mu G3}$. It is worth mentioning that small capacities of ESS are used for showing reasonable variations in the SOC and MHL in a short time duration.

B. Scenario 2: μ G1 Has Deficit Power and Battery Storage in μ G2, and μ G3 is in the Functional Range (40%–80%)

The working of the unified controller in Scenario 2 is shown in Fig. 10. In this scenario, the battery SOC in μ G2 and μ G3 are in the working range; however, power is in deficit (mode 1, selection of the operating modes in the tertiary layer algorithm). Therefore, to maintain the power balance in the μ G1, deficit power needs to be imported from the μ G2 and μ G3. Fig. 10(a) shows the transient power imbalance due to variation in solar irradiance at the instants $t_1, t_2, t_3, t_4, t_5,$ and t_6 , respectively. The power exchange at these instants is shown in Fig. 10(b). The magnitude of the power is negative which shows the power is imported from μ G2 and μ G3 to μ G1 [the sign convention has been taken reverse as compared to algorithm; selection of the operating modes in the tertiary layer in Fig. 10(b) for better illustration]. The power exchange is inversely proportional to the PV power because lower PV output requires more power to be imported from the other μ Gs to balance the supply and demand in the μ Gs cluster. The value of the SOC in μ G3 is higher compared to that in the μ G2; therefore, power flow $P_{\mu G1,3}$ is higher compared to the $P_{\mu G1,2}$, which is in accordance with (2), (3), and (4). The SOC values decrease in the respective μ Gs, as shown in Fig. 10(c), which is justified by the discharge of battery storages in μ G2 and μ G3. The stability of the dc bus in the μ Gs cluster is shown in Fig. 10(d). It represents the transient variation in the dc bus voltage of μ G1 due to power imbalance [Fig. 10(d)]. It can be seen that the dc bus remains stable in all

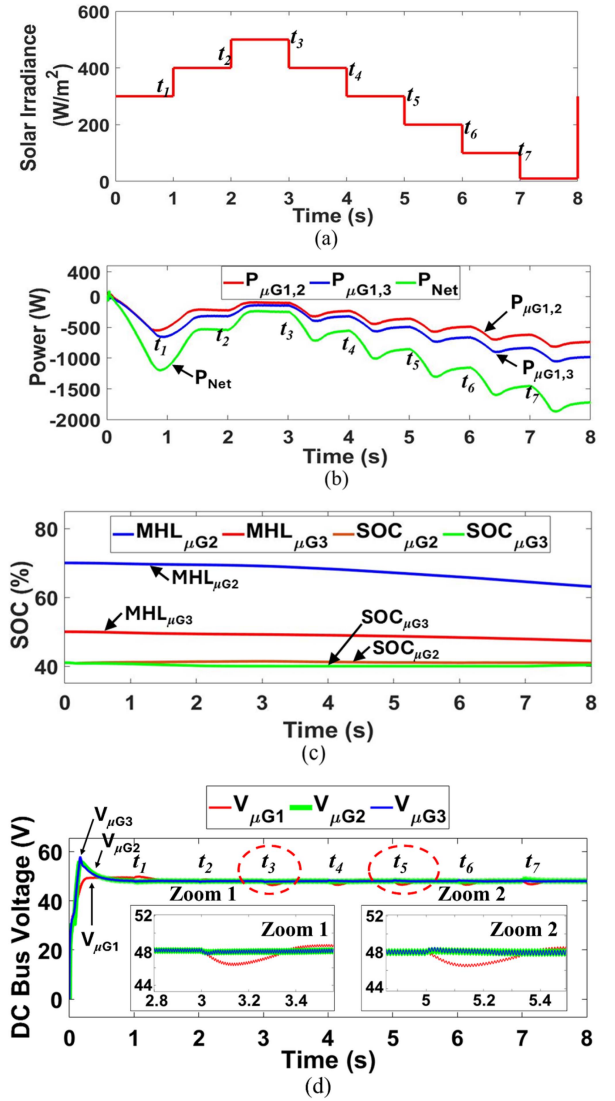


Fig. 11. Coordination of the proposed controller for μ Gs cluster in Scenario 3. (a) Solar Irradiance. (b) Power exchange among the μ Gs. (c) SOC and MHL in μ Gs. (d) DC bus voltage in the μ Gs.

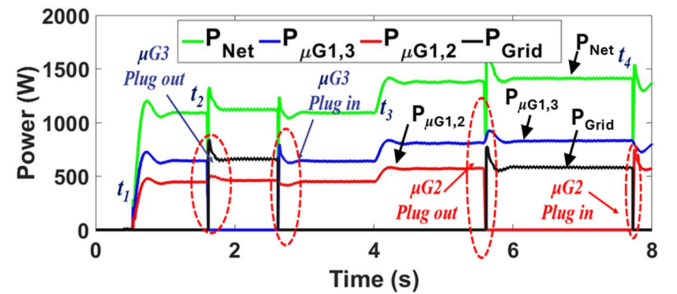


Fig. 12. Plug and play performance of μ Gs cluster.

the instants of the power transients. The waveforms of the ac current in the tie-lines between μ G1,2 and μ G1,3 are shown in Fig. 10(e). The magnitude of the current following $i_{\mu G1,2}$ and $i_{\mu G1,3}$ between the μ Gs is proportional to the power exchange $P_{\mu G1,2}$ and $P_{\mu G1,3}$, respectively, as shown in Fig. 10(e).

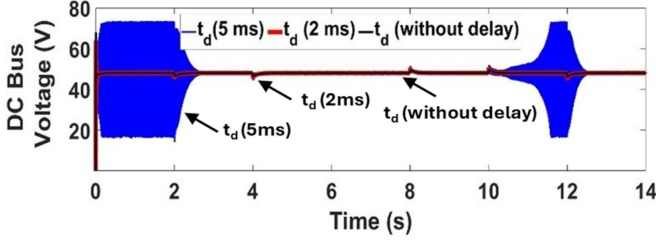


Fig. 13. Effect of the time delay on the DC-link voltage.

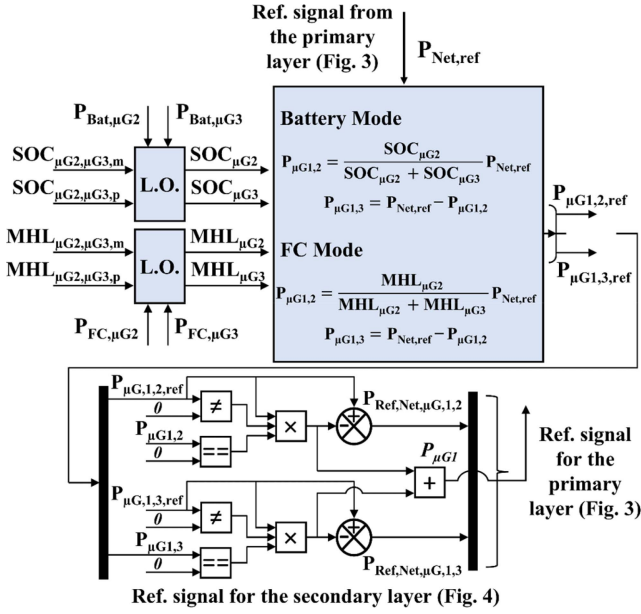


Fig. 14. Rule-based proportional power sharing based tertiary layer control (Conventional 1).

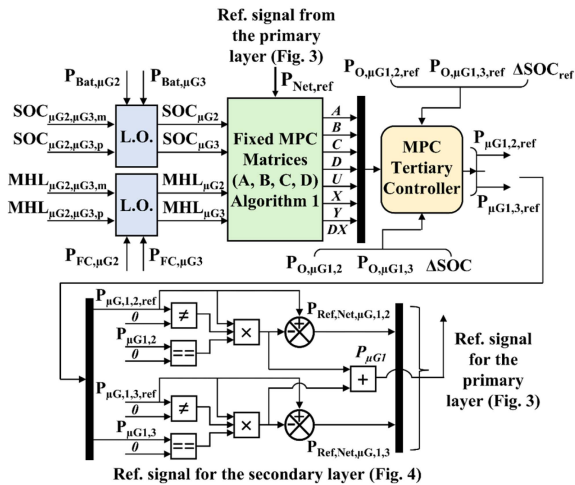
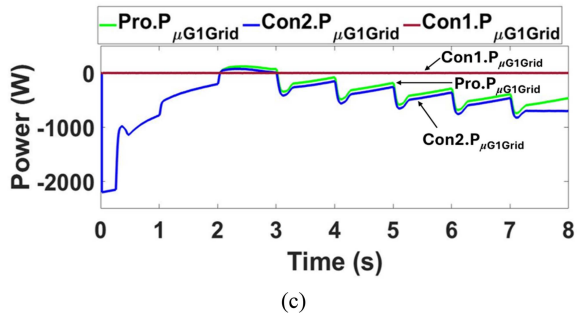
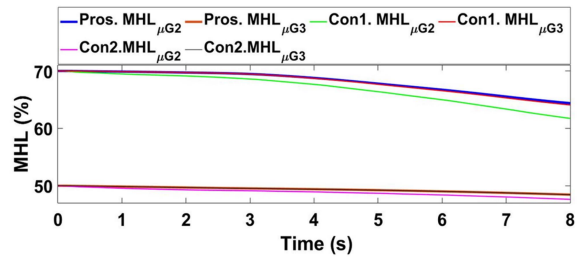
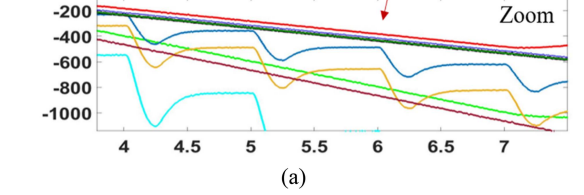
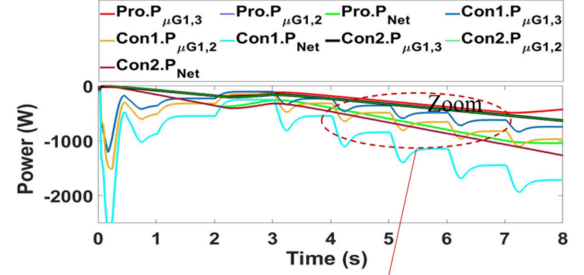


Fig. 15. Without adaptive MPC-based proportional power sharing based tertiary layer control (Conventional 2).

The zoomed-in view of the waveforms of the VSIs in all three μ Gs at a given instant is provided in Fig. 10(f). Following the power reference signals by the tertiary layer control, the secondary layer controls the relative phase angles of the respective VSIs. As it can be seen that the power is imported


 Fig. 16. Comparison of power distribution using different control approaches. (a) Power exchange among the μ Gs. (b) SOC and MHL in μ Gs. (c) Power exchange with grid. (d) DC bus voltage in the μ Gs.

to the μ G1 from μ G2 and μ G3; therefore, the phase of $VSI_{\mu G1}$ lagged compared to the $VSI_{\mu G2}$ and $VSI_{\mu G3}$. As the power exchange $P_{\mu G1,2}$ is lower compared to $P_{\mu G1,3}$, the phase difference between $V_{ac,\mu G1}$ and $V_{ac,\mu G3}$ is higher (lagging) than that between $V_{ac,\mu G1}$ and $V_{ac,\mu G2}$. Fig. 10(b) instant t_m , represents the transition from mode 1 to mode 7 (selection of the operating modes in the tertiary layer algorithm). In this case (mode 7), the

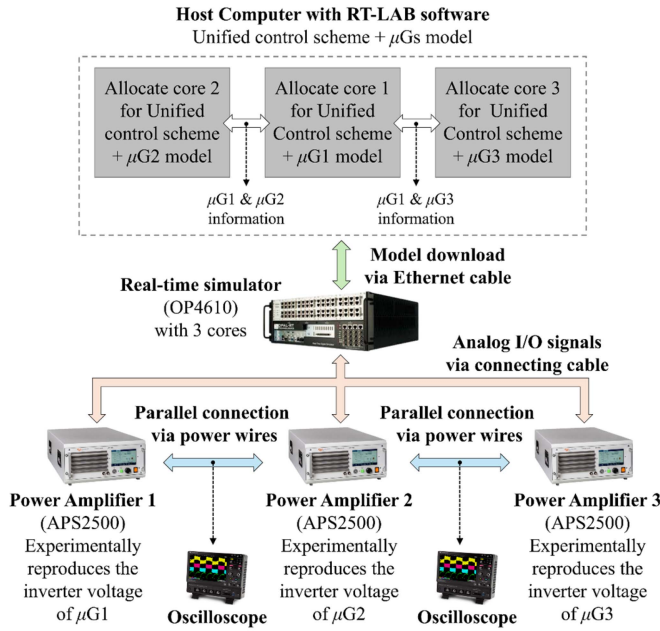


Fig. 17. Schematic of the PHIL experimental setup.

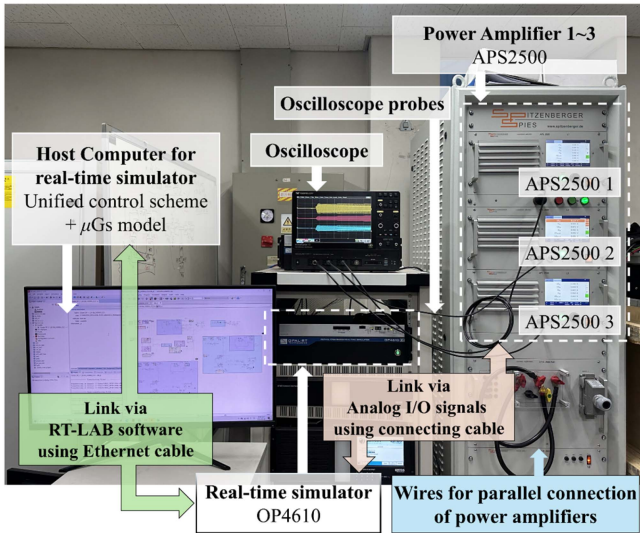


Fig. 18. PHIL experimental setup.

power exchange occurs only between $\mu G 1$ and 3 , and $P_{\mu G 1,2}$ decreases to zero because the SOC of the $\mu G 3$ decreases to a lower value (nearly 40%). This is achieved by assigning a higher value in MC1 as compared to MC2 in the selection of the operating modes in the tertiary layer algorithm.

C. Scenario 3: $\mu G 1$ Has Deficit Power, and Hydrogen Storage is in the Functional Range in $\mu G 2$ and $\mu G 3$ (20%–90%)

In this scenario, the hydrogen storage in $\mu G 2$ and $\mu G 3$ is active, which means both SOCs of battery storage in $\mu G 2$ and $\mu G 3$ have achieved lower limits of SOC. Therefore, the deficit power in $\mu G 1$ needs to be provided by the FCs from the $\mu G 2$ and $\mu G 3$. In this case, the magnitude of the power exchange among the μG s is inversely proportional to the PV power because a

TABLE IV
THD PERFORMANCE OF THE VSI IN A GIVEN MICROGRID CLUSTER

Inverter voltage THD (%) for $\beta=0.01$ tuning weight in (28)			
N_p	$N_u=1$	$N_u=2$	$N_u=3$
2	3.1	3.12	3.11
4	2.89	2.81	2.82
6	2.81	2.81	2.81
8	2.6	2.5	2.5
10	2.5	2.4	2.4
15	2.6	2.7	2.8
20	2.7	2.7	2.9

lower value of PV power needs more power to be imported to make the balance in supply and demand. This power exchange is made by the FCs of respective μG s; therefore, the corresponding values of the MHL in $\mu G 2$ and $\mu G 3$ decrease, as shown in Fig. 11(c). The SOC values in $\mu G 2$ and $\mu G 3$ remain stable as they are dormant and do not operate in this scenario [Fig. 11(c)].

As FC has a slow response, the power output of the FC varied in a controlled way as mentioned in Table III. The different weight factors and constraints are used in the case of FC mode.

As the value of the MHL in $\mu G 2$ is higher as compared to that in $\mu G 3$, power flow $P_{\mu G 1,2}$ is higher as compared to $P_{\mu G 1,3}$, which is in good agreement with the design formulation in Section III-A (8), (9), and (10). The power curve in this scenario is shown in Fig. 11(b), while the status of MHLs is shown in Fig. 11(c). Fig. 11(d) depicts the transient variations in the dc bus voltage of the $\mu G 1$ during the power imbalance conditions which is justified.

D. Performance Analysis of the Proposed Controller for Voltage Source Inverter and DC–DC Converter

As a case study (Scenario 1) in a given μG s cluster, it is found that the proposed method decreases the inverter voltage THD and rms error by 23.04% and 34.87%, respectively, compared to the conventional PID-based method. In the given microgrid cluster, the THD of the VSI inverter current and grid current are found to be 3.85% and 3.24%, respectively. The MPC is applied to track the reference inductor current of the dc–dc converter in the primary layer of the μG s cluster; it is found that maximum overshoot decreases by 5.23% and the setting time reduces to 1 from 10 ms compared to the conventional PI method. A comparative study is performed in the present article to evaluate the performance of PI-MPC and deadbeat-MPC in the secondary layer and their effect on the system performance. It is found that the dc bus overshoot increases by 1.2% in deadbeat MPC as compared to the proposed PI-MPC. However, the setting time decreased to 0.85% in the deadbeat MPC as compared to the proposed method. Table IV shows the THD at the output voltage of the inverter for different values of the prediction and control horizons. It is found that the THD value does not vary significantly by increasing the control horizon; however, it increases the computational requirements. THD value increases for the lower and higher values of the prediction horizon. For example, Table IV shows that the THD value is higher for $N_p = 2$ and reduced for $N_p = 10$. Therefore, there is a tradeoff between the accuracy and computational requirement, and a suitable value

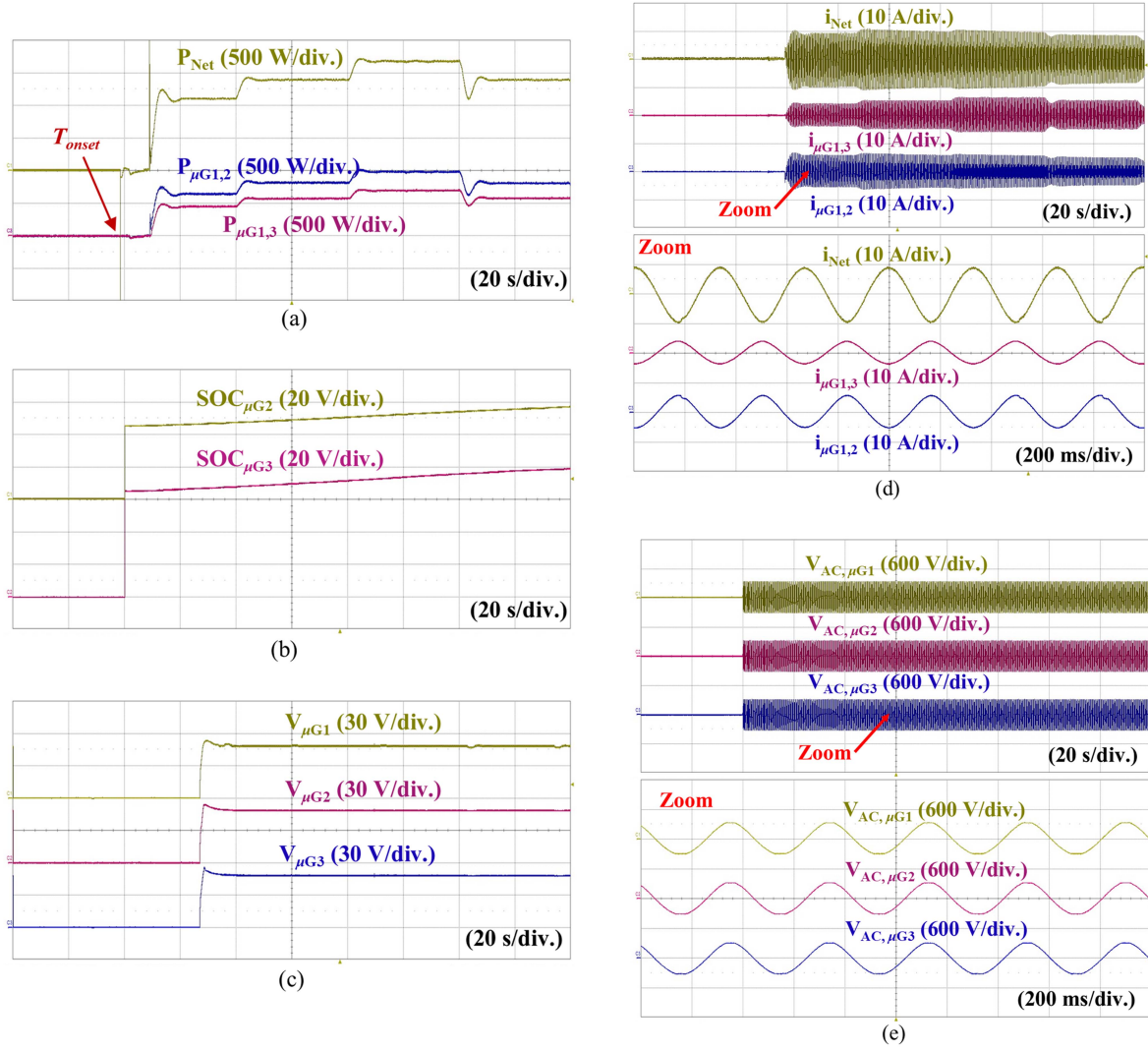


Fig. 19. PHIL analysis of the proposed controller in Scenario 1. (a) Power exchange among the μG s. (b) SOCs in μG s. (c) DC bus voltage in the μG s. (d) Current exchange among the μG s. (e) AC bus voltage in the μG s.

TABLE V
RMS ERROR ANALYSIS OF THE VSI IN A GIVEN MICROGRID CLUSTER

Inverter voltage rms error (%) for $\beta=0.01$ tuning weight in (28)			
N_p	$N_u=1$	$N_u=2$	$N_u=3$
2	0.47	0.46	0.46
4	0.46	0.46	0.46
6	0.44	0.43	0.42
8	0.42	0.42	0.42
10	0.41	0.40	0.40
15	0.43	0.42	0.42
20	0.45	0.45	0.45

of the prediction and control horizon is selected considering the required accuracy and computational requirement. Table V shows the rms error at the inverter output for different values of the control and prediction horizons.

A parametric uncertainty analysis is performed for the inverter system using the adaptive MPC in the present article, to evaluate the robustness of the proposed MPC controller for the inverter system. LC parameters uncertainty can happen in the inverter

system due to temperature effects and aging of components. Multiple simulations have been carried out to evaluate the LC parameter uncertainty on the grid power. In the simulation, the plant model of the voltage source converter is kept similar, while the values of the LC filter parameters in the physical circuit are varied. The effect of the LC parameters on the inverter current is analyzed. It is found that the present controller is robust against the reasonable uncertainty in the LC parameters (-60% to 80%). It is found that the inverter current remains stable and its THD varies from 4.2% to 4.8% for -60% to 80% variation in the uncertainty in L and C values of the inverter system. The inverter current THD is 3.24% at the original values of the L and C (considering negligible uncertainty) in the inverter system. The adaptive MPC-based tertiary layer also handles the uncertainties in hybrid storage's SOC and facilitates the desired power sharing.

$\mu G 1$ is connected to the main grid using the grid-connected inverter. This grid-connected inverter is controlled using the MPC controller. The MPC for the inverter enables the robust performance of the inverter during the changes in the grid

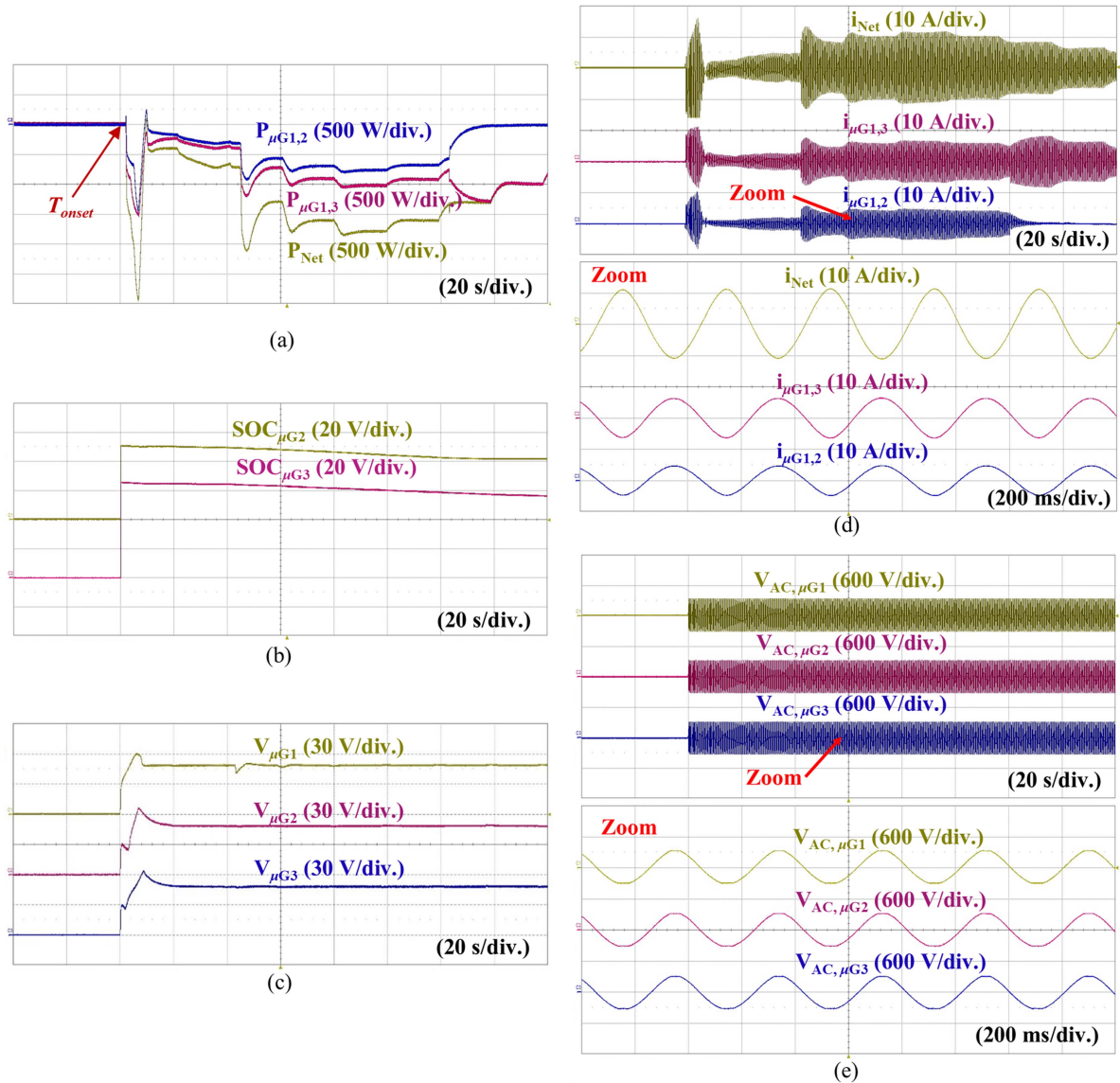


Fig. 20. PHIL analysis of the proposed controller in Scenario 2. (a) Power exchange among the μ Gs. (b) SOCs in μ Gs. (c) DC bus voltage in μ Gs. (d) Current exchange among the μ Gs. (e) AC bus voltage in the μ Gs.

conditions such as variation in the grid frequency and voltage. It is found that the power exchange with the grid remains stable concerning the 0.5% and 5% variations in the grid frequency and amplitude of the grid voltage, respectively.

E. Plug-and-Play of μ Gs

The plug-and-play performance of the proposed controller is validated in this section. The μ G1 and μ G2 are disconnected and reconnected at certain instants (t_1, t_2) and (t_3, t_4), respectively, as shown in Fig. 12. The operation of the μ G remains stable and power balance is achieved. During the events of disconnection of the μ G2 and μ G3, the surplus power is supplied to the grid to provide the balance in the supply and demand in the μ Gs cluster. As soon as given μ G1 or μ G2 is reconnected to the μ G1, the grid power becomes zero. Therefore, it is concluded that the proposed

unified controller is fully capable of handling the plug-and-play characteristics of the μ Gs.

F. Effect of Time Delay

The effect of the delay in the tertiary layer on the overall system stability was observed. It was found that the proposed control scheme worked satisfactorily for a considerable range of the delay and the dc bus for μ G1 remained stable showing stable behavior of the overall system. However, for a large value of the delay the dc bus voltage started showing unstable behavior as shown in Fig. 13.

G. Comparison With Existing Benchmark Methods

The proposed power-sharing scheme has been compared with existing/conventional methods [1], [17]. In conventional 1 (Con1), the power-sharing among μ Gs is achieved by a

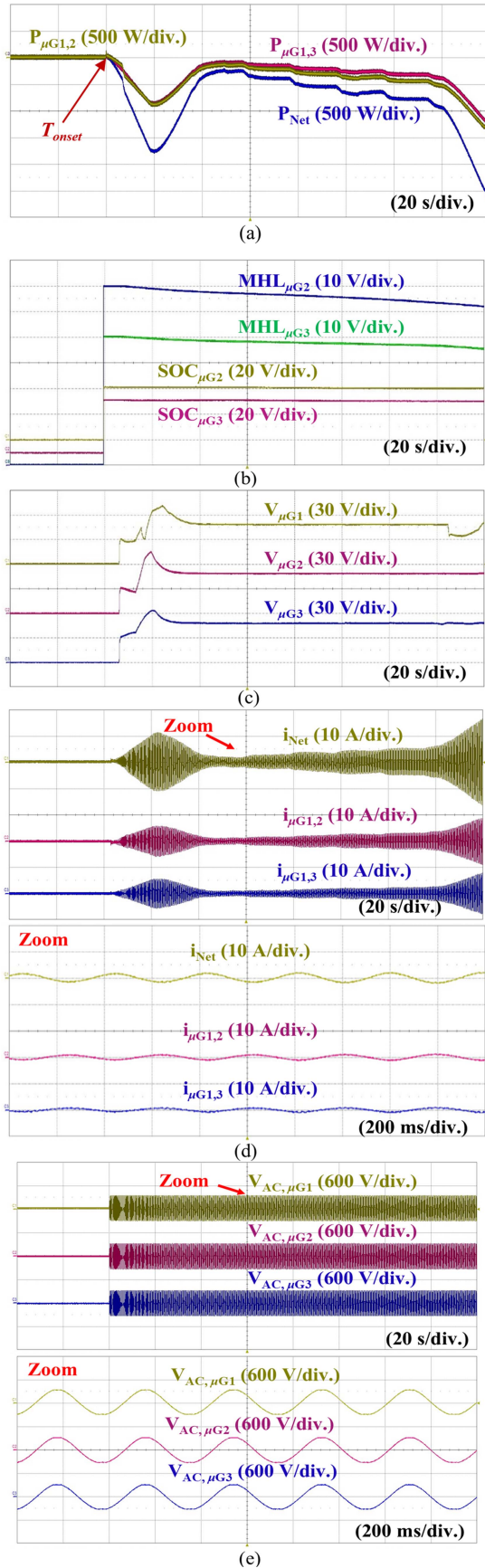


Fig. 21. PHIL analysis of the proposed controller in Scenario 3. (a) Power exchange among the μ Gs. (b) SOCs and MHLs in μ Gs. (c) DC bus voltage in μ Gs. (d) Current exchange among the μ Gs. (e) AC bus voltage in the μ Gs.

TABLE VI
COMPREHENSIVE ANALYSIS OF DIFFERENT CONTROL STRATEGIES

Parameters	Con 1	Con 2	NMPC	Proposed
Max. $\Delta P_{\mu G1,2}$ (W/s)	6693	100	110	100
Max. $\Delta P_{\mu G1,3}$ (W/s)	7246	100	100	100
Min. $\Delta P_{\mu G1,3}$ (W/s)	-5215	-100	-115	-100
Min $\Delta P_{\mu G1,3}$ (W/s)	-3728	-100	-100	-100
ΔMHL (%)	5.91	4.34	5.70	4.05
Max. dc bus voltage (V)	1.67	0.91	1.62	0.92
Max. overshoot dc bus (%)	15.02	9.02	14.88	9.02

rule-based approach as shown in Fig. 14. The conventional 2 (Con2) strategy does not use adaptive MPC features in power sharing as shown in Fig. 15. The proposed adaptive MPC is suitable for handling the constraints on the rate of power exchange among μ Gs. Therefore, a smooth variation in the power exchange among μ Gs can be ensured during the FC operations using the proposed tertiary control as shown in Fig. 16. This is very helpful for the durability improvement of the FC device whose lifespan can be adversely affected by the high-frequency operating power. It is worth mentioning that the rate of power exchange among μ Gs is strictly regulated [using high weight factors in (19) compared to Scenario 3]. Conventional 1 is ineffective for conventional 2 facilitates equal power-sharing irrespective of the SOC. The difference in MHL for different μ Gs is shown in Fig. 16(b). The difference in the MHL between μ G2 and μ G3 can be reduced significantly using the proposed method compared to the conventional 2. However, a higher value of difference in the MHL is obtained using the conventional 1 power scheme. This can be due to the high-power output of FC in both μ Gs. However, this uncontrolled FC output is not desirable for FC considering its slow response and tendency to performance decline at high fluctuating power. Therefore, the proposed method is more effective considering the controlled (smooth) power exchange as well as minimizing the difference in the MHL between μ Gs. The effect of the dc bus regulation using the proposed and conventional methods is shown in Fig. 16(d). It can be seen that the proposed method is effective in minimizing the maximum overshoot in the dc bus as compared to conventional 1. A comprehensive comparison of the performance of μ Gs in different cases is provided in Table VI. In the present article, the steady-state error for tracking the reference dc bus voltage of microgrids with the complete MPC-based model was found to be 0.41% while the PI-MPC-based method was found to be 0.19%. The results demonstrate that the rate of power change is effectively controlled in the proposed method compared to the conventional 1. The zoom-in-view of the power exchange is shown in Fig. 16(a). Fig. 16(d) shows the comparison of power exchange with the grid for different control strategies. In the proposed method, the rate of change of FC power is controlled and restricted, resulting in higher power exchange with the grid in both the proposed and conventional 2 methods compared to conventional 1. The maximum overshoot in the dc bus in μ G1 decreases by 39.94% while the maximum deviation in the dc bus is reduced by 42.44% using the proposed method as compared to

the conventional 1. Table VI provides a comprehensive comparison between the proposed method and existing benchmarks.

One of the major advantages of the proposed method is that the difference between the SOC of the hybrid ESS for μ Gs can be minimized. As the level of the SOC of hybrid ESS (for given storage for example battery or hydrogen) given μ G indicates the level of surplus renewable energy; therefore, the SOC-based power-sharing equalizes the level of surplus/deficit renewable power. In addition, the tertiary layer also provides energy-efficient operation by enabling the higher power exchange with μ G having battery SOC in the working range as compared to other μ G (where hydrogen storage is working). The proposed method also considers the rate of power change of the expensive devices i.e., FC which is helpful for the betterment of their lifespan. The MPC is also helpful for operating the hybrid ESS in a safe operating range of SOC; which is better for their safe and reliable operation. The proposed tertiary controller also enables the smooth plug-in and plug-out operation of the μ Gs.

H. Experimental Analysis

For experimental verification, the proposed controller is implemented using PHIL equipment, with the real-time simulator OPAL-RT4610 and the power amplifier APS2500. The μ Gs cluster model is designed on the host computer using MATLAB 2018 and executed on the target computer via the RT-Lab tool. The RT-Lab interface generates the C code of the plant model and compiles it on the CPU of the host computer. The description of the PHIL experimental setup is depicted in Figs. 17 and 18. One core is used for replicating each μ G; therefore, a total of three cores are used. The inverters' voltage, current, and power as well as the μ Gs' connection points are replicated by three power amplifiers (APS2500 1–3) connected in parallel as shown in Fig. 18. In other words, the voltage and current of the VSI located in each μ G are reproduced through each power amplifier. In detail, the inverter voltage and current of μ G1 are reproduced through power amplifier 1, which operates in constant voltage mode to perform voltage control on the voltage of the μ G interconnection point. The inverter voltage and current of μ G2 are reproduced through power amplifier 2, which operates in constant current (CC) mode to perform current control on the current input and output through μ G2. Similarly, the inverter voltage and current of μ G3 are reproduced through power amplifier 3, which operates in CC mode to replicate the current amount of μ G3. As a result, since the power amplifiers are connected in parallel, the currents flowing into (or going out from) μ G2 and μ G3 are combined and output from power amplifier 1. The combined quantity current is fed into the real-time simulator device (OP4610) through the analog input port.

Experimental verification using PHIL is performed based on the three scenarios applied in the simulation verification. The experimental verification results are measured from the (T_{onset}) to the scenario end time using an oscilloscope. Fig. 19 shows the experimental validation results of the proposed controller in Scenario 1 using PHIL. As can be seen, the power exchange between the μ Gs is proportional to the SOCs of the storage. The variations in SOCs of the respective μ Gs are shown in

Fig. 19(b). The 20 V in Fig. 19(b) in SOC represents 20% of SOC. The variations in the dc bus voltages of the given μ Gs are demonstrated in Fig. 19(c) using the PHIL experiments. The dc bus voltages of μ G1 ($V_{\mu G1}$), μ G2 ($V_{\mu G2}$), and μ G3 ($V_{\mu G3}$) are shown to remain stable under all power imbalance conditions through the proposed unified control. Fig. 19(d) depicts the flowing of the ac current exchange among the μ Gs. As designed in the PHIL experimental setup, the current exchange between μ G1 and μ G2 ($i_{\mu G1,2}$) and the current exchange between μ G1 and μ G3 ($i_{\mu G1,3}$) are reproduced by the power amplifier.

The current flowing among μ G1, μ G2, and μ G3 (i_{Net}) is the sum of $i_{\mu G1,2}$ and $i_{\mu G1,3}$, which is also reproduced by the power amplifier. It is found that the variations in the current PHIL experiments are similar to those expected in the simulation. The voltage of VSI in the different μ Gs is shown in Fig. 19(e). The voltages of VSI $_{\mu G1}$ ($V_{\text{ac},\mu G1}$), VSI $_{\mu G2}$ ($V_{\text{ac},\mu G2}$), and VSI $_{\mu G3}$ ($V_{\text{ac},\mu G3}$) are shown to be stable under the conditions of changing power exchange between μ Gs. The operation of the proposed control strategy in Scenario 2 is shown in Fig. 20. Similar to those expected in the simulation results, the power exchange is inversely proportional to the SOCs of the respective μ Gs. The variations in the $V_{\mu G1}$, $V_{\mu G2}$, and $V_{\mu G3}$ are demonstrated in Fig. 20(c) and are similar to those in the simulation study. The variations in the SOCs and current waveforms are also shown in Fig. 20(b) and (e), respectively. The 20 V in Fig. 20(b) in SOC denotes 20% of SOC. Fig. 21 depicts the operation of the proposed controller in Scenario 3 using PHIL experiments. The power exchange between the μ Gs is shown in Fig. 21(a). $P_{\mu G1,2}$ and $P_{\mu G1,3}$ are inversely proportional to the SOC value of the ESS and the MHL level of the hydrogen tank in the μ Gs. The 10 V in Fig. 21(b) for MHL denotes 10% of MHL, and the 20 V in Fig. 21(b) for SOC denotes 20% of SOC. Fig. 21(d) depicts the variations in current flowing through each μ G in Scenario 3, which are similar to those expected in the simulation. Fig. 21(e) represents the VSI voltages for different μ Gs, and the enlarged figures demonstrate that the ac voltage waveforms are properly output through the power amplifier.

V. CONCLUSION

This article addresses a hierarchical (primary, secondary, and tertiary) power-sharing scheme in the μ Gs cluster especially based on the hybrid ESS. An adaptive MPC-based unified tertiary controller is proposed for the hybrid ESS-based μ Gs cluster for facilitating the SOC-based power distribution. All three hierarchical control layers (i.e., primary, secondary, and tertiary) are solved simultaneously, and the overall dynamic performance is presented. It was found that it is capable of facilitating all the set objectives while taking care of all operating conditions i.e., SOC limitations, rate of power change of power devices, and maximization of renewable power. The proposed control strategy provided the maximum overshoot of 9.02% in the dc bus which was found to be 15.02% using the conventional approach. In addition, using the proposed tertiary control method, the rate of power exchange among μ Gs can be smoothly controlled (100 W/s) corresponding to the FC operating modes in the respective μ Gs which is better for the FC lifetime. An interesting future

research proposal can be developing and testing new variants of MPC such as hybrid models that can combine physics-based models with data-driven techniques to improve the accuracy and reduce the model complexity.

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