# DC-Distributed Power System Modeling and Hardware-in-the-Loop (HIL) Evaluation of Fuel Cell-Powered Marine Vessel

Wenjie Chen<sup>®</sup>, *Student Member, IEEE*, Kang Tai, Michael Lau, Ahmed Abdelhakim<sup>®</sup>, *Senior Member, IEEE*, Ricky R. Chan, Alf Kåre Ådnanes, and Tegoeh Tjahjowidodo

Abstract—Environmentally driven regulations are significantly 6 affecting shipping in recent years, where the shipbuilding industry 7 is required to comply with upcoming restrictions concerning 8 polluting emissions. The all-electric ship (AES) is one of the 9 most promising technologies for complying with the increasingly 10 11 strict environmental regulations, improving fuel efficiency, and 12 enhancing system dynamic performance. In this study, the dc-distributed power grid of an AES integrated with fuel cells 13 and batteries has been configured using extensive electrification 14 15 technology, where the system-level shipboard power plant has 16 been modeled with the average modeling method. The model not 17 only incorporates the hybrid power source integration but also the primary and secondary power management as a whole. In addition, 18 a hardware-in-the-loop (HIL) has been set up to replicate the 19 real-time system behavior, which is essential for the verification of 20 21 any optimal power management control algorithms to be developed in future work. Finally, both the mathematical and real-time models 22 23 are validated against the full-scale hybrid shipboard power system.

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*Index Terms*—All-electric ship, fuel cell system (AES),
 hardware-in-the-loop (HIL), hybrid shipboard power microgrid,
 renewable energy sources.

## I. INTRODUCTION

ARITIME transport has played a dominant role in the global trade system for centuries, and it is expected that

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Wenjie Chen is with the School of Mechanical and Aerospace Engineering, Nanyang Technological University, Singapore 639798, and also with the ABB Pte. Ltd., Singapore 139935 (e-mail: wenjie003@e.ntu.edu.sg).

Kang Tai is with the School of Mechanical, and Aerospace Engineering, Nanyang Technological University, Singapore 639798 (e-mail: mktai@ntu.edu.sg).

Michael Lau is with the Newcastle University in Singapore, Singapore 599493 (e-mail: michael.lau@newcastle.ac.uk).

Ahmed Abdelhakim is with the ABB Corporate Research, 722 26 Västerås, Sweden (e-mail: ahmed.abdelhakim@se.abb.com).

Ricky R. Chan is with the Marine and Ports, ABB Oy, 1 00980 Helsinki, Finland (e-mail: ricky.chan@fi.abb.com).

Alf Kåre Ådnanes is with the Marine and Ports, ABB Engineering (Shanghai) Ltd., Shanghai 1 00980, China (e-mail: alfkare.adnanes@cn.abb.com).

Tegoeh Tjahjowidodo is with the Department of Mechanical Engineering, KU Leuven, De Nayer Campus, 2860 Sint-Katelijne-Waver, Belgium (e-mail: tegoeh.tjahjowidodo@kuleuven.be).

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international maritime trade will expand at continuous annual 30 growth for years to come [1]. Recently, environmental sus-31 tainability has become a significant policy concern in global 32 maritime transport [2]. With this concern, the shipbuilding 33 industries are compelled to abide by rules on polluting emissions 34 imposed by International Maritime Organization (IMO) and 35 national legislation [3]. To achieve high energy efficiency and 36 low emission, it is believed that the all-electric ship (AES) will 37 be one of the most promising technologies to comply with the 38 environmental regulations [4]. In particular, vessel types such as 39 tug boats, river pushers, and ferries will be the early adopters as 40 they usually operate near coasts or in inner rivers, which belong 41 to emission control areas (ECAs). Other vessel types such as 42 container vessels may need more time before the AES design 43 can be adopted [5]. 44

With the development of energy storage technologies, new 45 energy sources can be integrated into the shipboard power 46 network. Batteries, as the most mature energy storage system 47 (ESS) device, have been widely utilized in different applications 48 in marine vessels. However, due to energy density limitation, 49 battery systems only function as a main power supply for 50 small-scale vessels in short distance shipping segment or as an 51 auxiliary power source onboard of large vessels to enhance the 52 dynamic performance or short-term zero-emission operation. In 53 order for clean energy sources to be a feasible solution for larger 54 ocean-going ship types, such as cruise ships and RoRo/RoPax 55 (the vessels built for freight vehicle transport with passenger 56 accommodation), fuel cell systems have been introduced. It is 57 expected that fuel cell systems would replace diesel engines as 58 the main power source in the future. 59

The hybrid shipboard power system integrated with different 60 types of power sources brings in a lot of benefits, but it also 61 increases the complexity of the system structure and power 62 management control. To get deep understanding of the hybrid 63 power system and improve the current control algorithms, a 64 comprehensive system-level hybrid power plant model is needed 65 as a foundation. The expected system model should be able 66 to perform the actual shipboard power plant responses under 67 different operating modes and loading profiles. 68

A few power system configurations and modeling methodologies have been published in the recent literature. In [6] 70 and [7], land-based hybrid dc microgrid configurations have 71

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been introduced. The authors in [8] have proposed a diesel-72 generator-based marine power network equipped with a battery 73 ESS, while a fuel cell-based marine system model has been 74 75 developed in [9], where the authors are mainly focusing on the fuel cell chemical reaction and fuel processing. The above 76 references focus only on certain parts of the power grid rather 77 than the observation of the dynamics and performance of the 78 complete system. 79

It is worth noting that shipboard power systems have their 80 81 own special configurations and requirements [10]. The main difference with land-based power system is that shipboard power 82 system is an isolated microgrid with short distances from gen-83 erated power to the electric propulsion load [11]. The average 84 short-circuit levels and forces are quite high so that it must be 85 dealt with some special manners to protect the power equipment. 86 87 During cruising, shipboard power system is impacted a lot by the environment, such as marine weather and unexpected thrusters 88 load variations, therefore the system stability and reliability is 89 90 crucial for marine vessels. Extra efforts in system reconfigurability and redundancy are required to prevent single point failure 91 92 according to the marine classification rules. Compared to EV power system, the power scale of the shipboard power network 93 is much bigger and complicated. Due to its particularity of the 94 shipboard power system [12], there is the urge to build its own 95 96 power plant model rather than reusing other existing models.

In addition, system-level power plant model is not only to inte-97 grate different power sources but also to implement primary and 98 secondary level power management to coordinate power load 99 sharing, frequency, and voltage control. A previous work by the 100 authors [13] modeled an ac-distributed shipboard hybrid power 101 102 system. However, in the past decade, dc-based distribution systems have gained popularity due to their advantages in many 103 104 aspects [14]. A system-level dc-based shipboard power model is necessary to simulate the vessel operating performances. The 105 comprehensive and reliable power plant model is the foundation 106 and precondition for system studies and further research. 107

Compared to the existing studies on hybrid power network
 modeling problems, the main contributions of this article are
 highlighted as follows.

- A dc-distributed system-level shipboard power system model is built, integrating the mathematical model of different power sources, as well as the primary and secondary power management control. All the power sources are resizable to configure the new shipboard systems according to the varied ship design specifications.
- A hardware-in-the-loop (HIL) platform is set up in lab
  environment as well. HIL helps to perform the system
  real-time states. It is a useful tool for prototyping the power
  and energy management system (PEMS) controller and
  communication interface validation without involving any
  hardware devices setup.
- 3) Both the mathematical and real-time HIL model have
  been validated against the real hardware full-scale hybrid
  shipboard power system.

The rest of this article is organized as follows: The hybrid
 shipboard power system configuration is discussed in Section II.
 A dc-based power distribution model and the simulation results



Fig. 1. ESS integration scheme for both dc and ac distribution system.

are presented in Section III. Section IV evaluates the system 129 plant model HIL setup. And the validation tests are performed 130 in Section V. Finally, Section VI concludes this article. 131

### II. SHIPBOARD POWER SYSTEM CONFIGURATION 132

In this section, the functions of several integration schemes 133 will be introduced in detail. The advantages and the system 134 configuration of dc-distributed shipboard power system will also be discussed. 136

## A. Advantages of DC-Based Shipboard Power System 137

Currently, the majority of commercial marine vessels have a 138 diesel or gas engine powered plant with ac distribution, while 139 the dc-distributed shipboard system has drawn much attention 140 over the past decade. In both ac and dc-distributed systems, ESS integration is a trend for different functionalities [15]. 142

Energy storage, such as batteries will help the slow power devices level out load variations from the thrusters and other heavy consumers. Besides, the clean energy sources are able to provide the main power supply of the ship operation in order to achieve zero-emission operation. There are several methods to integrate the ESS into the shipboard network [16], which is shown in Fig. 1.

According to this integration scheme, it can be seen that the 150 ESS is much easier to connect to a dc-distributed network than an 151 ac system. The storage devices can be directly connected to the 152 dc network. This direct-on-line (DOL) ESS gives an efficiency 153 increase compared to the ESS with dc/dc converter, but at the 154 cost of less control features to be achieved. On the other hand, 155 ESS is also possible to be extended to an ac-distributed system 156 through a dc/ac converter with LCL filter and transformer [17]. 157 The LCL filter is used herein to improve the power quality and 158 reduce the total harmonic distortion (THD) level of the main 159 power network. While the shielded transformer is utilized to 160 solve the electromagnetic interference (EMI) issue, it also blocks 161 the circulating current within the power electronic converters 162 such as IGBT or MOSFET. In addition, the dc/ac converters also 163 need to monitor the amplitude, frequency, and phase shift of the 164 power network voltage on ac side to achieve the synchronization 165 operation [13]. It is clear that the ac-based power configuration 166 is quite complex not only in system configuration but also in 167 power management control [14]. Furthermore, it also increases 168



Fig. 2. Typical dc-based shipboard power system single line diagram.

the dimensions of the equipment, where the space onboard aship is limited.

Safety is another important consideration for implementing 171 the dc-based distribution. A dc-configured system is inherently 172 simpler than an ac system, which means that it is easier to predict 173 fault scenarios and devise adequate protection against them. The 174 generators can be connected to the dc distribution system in a 175 176 short time because it is not necessary for synchronization. It has considerable potential to improve the stability, efficiency, and 177 performance of future dc-based ship power systems [18]. 178

In addition to the benefits described above, there are numerous
other benefits with dc distribution. Some of these are summarized as follows.

- *Voltage Distortion:* Harmonic distortion is inherent in ac systems with frequency converters, while being less of a concern with dc distribution.
- 2) *Electrical Efficiency:* In the process of going from ac-to-dc distribution, the system efficiency is improved by 0.5–1% [19].
- *Ease of Control:* It is not required to control the frequency
  and reactive power of the network. The control system is
  simplified and only needs to overlook the dc voltage.

Overall, the integration of a hybrid ac-distributed shipboard 191 power is complex and costly [14]. Multiple layers of the power 192 conversion and transmission increase the system losses and 193 probability of equipment failure. It is more suitable for some 194 retrofit projects, which are planned for extending a single ESS 195 from an existing ac distribution network. Due to the advantages 196 of dc-distribution power system, this study focuses on dc-based 197 shipboard power plant modeling. 198

## B. Hybrid Shipboard Power System Configuration

For a hybrid dc-distributed shipboard power system, the en-200 ergy storage devices can be connected to the system. A generator 201 set driven by a combustion diesel engine is possible to be 202 integrated into the dc power network. Usually, synchronous 203 generators are used and rectified (ac to dc converter) before the 204 power is transmitted to the dc bus. Propulsion and other ship 205 service loads are regulated by dc/ac inverters. The typical con-206 figuration of an all-electric dc hybrid ship power and propulsion 207 system is shown in Fig. 2. In this study, two fuel cell modules 208 are function as the main power supply to achieve zero emission 209 operation. Two battery banks handle the ship load variations. 210 And two diesel gen sets (DG) are the backup power in case the 211 fuel cell devices or the hydrogen fuel are not available under 212 emergency condition. 213

The main switchboards are usually split into two sections 214 or more to obtain the redundancy requirements of the vessel 215 according to the marine class rules and regulations. This kind of 216 structure is not only an intrinsic advantage of dc distribution but 217 it also has the ability to supply power to the load continuously 218 even under certain fault conditions [16], such as short-circuit. 219 During normal operation, the dc-grid switchboard are usually 220 connected (close bus tie), which gives the best flexibility in 221 the configuration of the power generation. The optimal num-222 ber of the power devices can be connected to the power net-223 work according to the load transients to achieve certain control 224 criteria. 225

## III. FUEL CELL-FED DC DISTRIBUTION SYSTEM MODELING 226

In this section, a system-level dc-based hybrid shipboard 227 power plant will be modeled. The power network includes 228 the fuel cells, batteries, and DGs as the energy sources. The 229 essential components of the dc-grid power system are the power 230



Fig. 3. General block diagram of a diesel engine-driven synchronous generator.

electronics devices. An ESS dc/dc converter and a 6-pulse ac/dc 231 rectifier for DG integration will be modeled. The propulsion 232 load and ship hotel loads of the vessel will be represented with 233 controllable current sources. Power management, including load 234 power sharing, dc voltage coordination, and power regulation 235 will be achieved as well. 236

#### A. Energy Sources Modeling 237

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- 1) Diesel Gen-Set Model: Fig. 3 shows the general config-238 uration of a diesel engine-driven synchronous generator 239 system. The system consists of four main sections: Fuel 240 injection and diesel engine, governor, synchronous gen-241 erator (SG), and automatic voltage regulator (AVR) [20]. 242 The mathematical models of each part of diesel generator 243 are introduced as follows. 244
- a) Fuel injection and diesel engine can be presented by 245 a time delay and the coupling shaft model, as in [21] 246 and [22]. The simplified model is given by 247

$$\frac{T_m(s)}{u_\omega(s)} = \frac{K_{en} \cdot e^{-t_d \cdot s}}{t_e s + 1} \tag{1}$$

$$J_{eq} \cdot \frac{d\omega_m}{dt} = T_m - T_e - k_{f_{eq}} \cdot \omega_m \tag{2}$$

where  $\omega_m$  is the mechanical speed,  $u_{\omega}$  is the control signal from the speed governor,  $T_m$  is the mechanical torque developed by the engine,  $J_{eq}$  is the equivalent inertia of the entire system,  $k_{f_{eq}}$  is the equivalent friction coefficient,  $K_{en}$  is the engine gain,  $t_d$  is a delay 252 representing the time elapsed from the fuel injection until the torque is developed at the engine shaft, and  $t_e$ is the time constant of the fuel injection.

b) Governor is responsible for regulating the engine speed to maintain it within the allowable range during the different load conditions, resulting in constant output frequency or within the desired limits. This governor also has the structure of a PI controller with the droop function implemented. This model can be given by

$$u_{\omega} = \left(\omega_{en}^{*} - \omega_{en} - k_{dr, \text{freq}} \cdot u_{\omega}\right) \left(K_{P_{\omega}} + \frac{K_{I_{\omega}}}{s}\right)$$
(3)

where  $K_{P_{\omega}}$  and  $K_{I_{\omega}}$  are the proportional and integral 263 gains of the governor PI controller, and  $\omega_{en}$  is the 264 engine nominal speed and  $k_{dr,freq}$  is the speed droop 265

gain that equals  $(m_{dr} \cdot \omega_{en})$ , and  $m_{dr}$  is the static 266 droop slope. 267

c) Synchronous generator is considered without damper 268 windings for the sake of simplifying the model. And 269 its *d-q* rotating reference frame is given by 270

$$V_d = -r_s \cdot i_d + L_q \cdot \omega_e \cdot i_q + L_d \cdot \frac{di_d}{dt} + M_{sf} \cdot \frac{di_f}{dt}$$
(4)

$$V_q = -r_s \cdot i_q - L_d \cdot \omega_e \cdot i_d + L_q \cdot \frac{di_q}{dt} + M_{sf} \cdot \omega_e \cdot i_f$$
(5)

$$V_f = r_f \cdot i_f + L_f \cdot \frac{di_f}{dt} - M_{sf} \cdot \frac{di_d}{dt} \tag{6}$$

$$T_e = (L_d - L_q) \cdot i_d \cdot i_q + M_{sf} \cdot i_q \cdot i_f \tag{7}$$

where  $V_d$ ,  $V_q$ ,  $i_d$ , and  $i_q$  are the output voltages and cur-271 rents in the *d*-*q* rotating reference frame, respectively, 272  $V_f$  and  $i_f$  are the field excitation voltage and current, 273 respectively,  $r_s$  and  $r_f$  are the stator winding and 274 field winding internal resistances, respectively,  $L_d$  and 275  $L_q$  are the stator inductance in the *d*-axis and *q*-axis, 276 respectively,  $L_f$  is the inductance of the field,  $M_{sf}$  is 277 the mutual inductance between the field winding and 278 the *d*-axis stator winding, and  $T_e$  is the electromagnetic 279 torque. It is worth noting that, the following assump-280 tions have been considered: The stator windings are 281 symmetrical, a uniform sinusoidal distribution along 282 the air gap, the permanence of the magnetic paths on 283 the rotor is independent of the rotor positions, and the 284 saturation and the hysteresis effects are neglected. 285

d) Automatic voltage regulator has the responsibility of 286 controlling the terminal voltage of the synchronous 287 generator under different load conditions. This AVR is 288 modeled as a first-order system, representing a power 289 converter controlled by a PI controller [20], that is 290 given by 291

$$V_f = \frac{k_{\text{conv}}}{t_{\text{conv}}s + 1} \cdot (U_v - k_{dr,v}V_f)$$
(8)

$$U_v = \left(K_{Pv} + \frac{K_{Iv}}{s}\right) \cdot \left(V_t^* - V_t\right) \tag{9}$$

where  $K_{Pv}$  and  $K_{Iv}$  are the proportional and integral 292 gains of the AVR PI controller,  $k_{conv}$  and  $t_{conv}$  are the 293



Fig. 4. ESS power source modeling. (a) Proton-exchange membrane (PEM) fuel cell and its equivalent circuit. (b) Lithium-ion battery and its equivalent circuit.

294 converter gain and time constant, and  $V_t^*$  and  $V_t$  are 295 the reference and measured rms output line voltage. 296  $k_{dr,v}$  is the dc voltage droop rate for dc-distributed 297 power system.

2) Fuel Cell Model: There are a few different types of fuel 298 cell technologies. The proton-exchange membrane (PEM) 299 fuel cell is the most mature technology over other types of 300 fuel cell. With its relatively low cost and high energy effi-301 ciency features, PEMFC is the most widely used in marine 302 applications [23]. Fig. 4(a) shows a single PEM fuel cell 303 model and its equivalent circuit [24]. The fuel cell losses 304 are mainly divided into three categories: Activation loss 305  $R_{\text{act}}$ , concentration loss  $R_{\text{conc}}$ , and ohmic loss  $R_{\text{ohm}}$  [25]. 306 The voltage of a PEMFC elementary cell can be written 307 as follows [26]: 308

$$V_{\text{cell}} = E_{\text{nernst}} - V_{\text{act}} - V_{\text{conc}} - V_{\text{ohm}}$$
(10)

$$V_{fc} = N_{fc} \times V_{\text{cell}} \tag{11}$$

where  $V_{cell}$  is the voltage of a PEMFC elementary cell,  $E_{nernst}$  is the equilibrium voltage,  $V_{act}$  is the activation overpotential,  $V_{conc}$  is the concentration overpotential,  $V_{ohm}$  is the ohmic overpotential,  $V_{fc}$  is the voltage of PEMFC stack, and  $N_{fc}$  is the number of cells in series.

In this study, the PEMFC is configured with Matlab/Simulink Simscape library.

3) *Battery Model:* To balance the cost, energy density, power
density, safety performance, and life span, Li-ion battery
is the most applied battery type in marine ESS applications [27]. Simple models based on the equivalent circuit
of a resistor in series with a parallel *RC* circuit (polarization circuit) [28] have been used to determine the dynamic
characteristics of the battery, as shown in Fig. 4(b).

Open-circuit voltage (OCV) is defined differently for
discharging and charging at given state-of-charge (SoC)
due to the hysteresis effect [29]. The total voltage drop
from OCV is then modeled here based on the first-order
equivalent circuit to account for the internal resistance and
polarization (OCV relaxation).

$$V_{\text{term}} = V_{\text{OCV}} - IR_e - V_p \tag{12}$$

where  $V_{\text{term}}$  is the terminal voltage of the cell,  $V_{\text{OCV}}$  is the cell OCV, I is the current rate of the cell (positive for discharging and negative for charging),  $R_e$  is the electrical resistance (responsible for instantaneous voltage drop together with  $C_p$ , after the application of load) and  $V_p$  is the voltage drop across the polarization circuit. At any instant,  $V_p$  across the parallel *RC* circuit is represented by the voltage drop across  $R_p$  or  $C_p$ . So, the equation can be arranged by 337

$$\frac{V_p(t)}{R_p} + C_p \frac{dV_p(t)}{dt} = I(t)$$
(13)

where  $I_{Rp}$  is the current across polarization resistance, and338 $I_{Cp}$  is the current across polarization capacitance. The sum339of  $I_{Rp}$  and  $I_{Cp}$  gives the total circuit current I.340Then perform Laplace transform by341

$$V_p(s) = I(s) \frac{R_p}{1 + sR_pC_p} \tag{14}$$

so that the steady-state response of terminal voltage  $V_{\text{term } s-s}$  to a given current by 343

$$V_{\text{term}s-s} = V_{\text{OCV}} - I(R_e + R_p) = V_{\text{OCV}} - IR_{ti} \quad (15)$$

where  $R_{ti} = R_e + R_p$  is the total internal resistance of a 344 cell. 345

SoC is another critical parameter for the battery 346 system. SoC is intrinsically divided into two types: Instan-347 taneous SoC (SoC<sub>inst</sub>) and nominal SoC (SoC<sub>nom</sub>), both 348 based on Ah counting. Nominal SoC is derived from nom-349 inal capacity based on standard discharging conditions as 350 suggested by the manufacturer, while instantaneous SoC 351 is based on the available instantaneous discharge capacity 352 given by 353

$$\operatorname{SoC}_{\operatorname{nom}}(t_i) = \operatorname{SoC}_{\operatorname{nom}}(t_{i-1}) - \frac{I_{\operatorname{step}}(t_{i-1})t_{\operatorname{step}}}{C_{\operatorname{nom}}}$$
(16)

$$\operatorname{SoC}_{\operatorname{inst}}(t_{i}) = \frac{(1 - \operatorname{SoC}_{\operatorname{nom}}(t_{i-1}))C_{\operatorname{nom}}}{C_{\operatorname{step avail}}(t_{i-1})} - \frac{I_{\operatorname{step}}(t_{i-1})t_{\operatorname{step}}}{C_{\operatorname{step avail}}(t_{i-1})}$$
(17)

where,  $I_{\text{step}}$  is the current at a given time step,  $t_{\text{step}}$  is 354 the span of time under consideration (sampling time of 355 BMS/controller), and  $C_{\text{step avail}}$  is the capacity available for 356  $I_{\text{step}}$ . Instantaneous SoC is useful in indicating the capacity 357 available at a given time step and operating conditions, 358 especially higher discharge rates. 359 In this study, the Matlab/Simulink Simscape battery stack 360

In this study, the Matlab/Simulink Simscape battery stack model is utilized.

#### B. Power Electronic Converter Modeling

A dc/dc converter (for fuel cell and battery control), and an 363 ac/dc rectifier (for diesel generator control) are modeled in this 364 section. 365

 DC/DC Converter Model: Both of the fuel cells and the battery systems are powered by dc/dc converter. The dc/dc converter regulates the output voltage and power flow from the storage device [8]. Different from the battery bidirectional control [31], fuel cells only require a single direction power flow to provide the power to dc link. It can be represented as the following equation: 372

$$\frac{V_{dc}}{V_{\text{ESS}}} = \frac{1}{1-D} \tag{18}$$

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Fig. 5. DC/DC converter average model.



Fig. 6. Average model of 6-Pulse ac/dc rectifier, where  $V_d$ ,  $V_q$ ,  $I_d$ ,  $I_q$  are generator's output voltage and current in dq - axes,  $\delta$  is the angle between  $V_d$  and  $V_q$ , coefficient  $K_v$  is the ratio between the magnitude of rectifier output voltage  $V_{dc}$  and its input voltage  $V_d$ ,  $V_q$ , and  $\delta$ .

#### where D is the duty cycle of dc/dc converter.

There are two methods to model the power electronic 374 converters, i.e., electromagnetic transient (EMT) model 375 and average model. EMT model is straightforward and 376 can represent the modulation process of the power elec-377 tronic device. However, the simulation speed will be slow 378 379 down due to the usage of high-frequency carriers during pulsewidth modulation (PWM). EMT simulation method 380 is more suitable for system stability analysis studies, but 381 not suitable to evaluate system performance throughout 382 the operational profile which can last in the order minutes 383 384 or even hours. For that reason, the average model is selected to configure the shipboard power plant model here. 385 The dc/dc converter average model is shown in Fig. 5. 386

2) AC/DC Rectifier Model: The DGs are connected into dc bus via a 6-pulse diode rectifier. The average model of a diode bridge loaded synchronous generator was used here to simplify the calculation of the average values of generator *d-q* variables to the dc voltage and current at the bridge output [32], as shown in Fig. 6.

The voltage and current at the dc terminal can be defined as proportional to the amplitudes of the first harmonics of generator phase voltage and current, respectively [33]

$$V_{dc} = K_v \sqrt{V_d^2 + V_q^2} \tag{19}$$

$$i_{dc} = K_i \sqrt{i_d^2 + i_q^2}$$
 (20)

where  $V_{dc}$  is dc voltage output from the rectifier.  $V_d$ ,  $V_q$ ,  $i_d$ , and  $i_d$  are the voltage and current of generator in dqaxes.  $K_v$  is the generator voltage constant, and  $K_i$  is the generator current constant.

## 400 C. System Control Philosophy

For existing hybrid shipboard power management is usually
arranged in line with the hierarchical control framework. The
basic structure is shown in Fig. 7.



Fig. 7. Hierarchical control framework for shipboard power management, where the primary and secondary control have been applied.

In hierarchical control, the primary control level is to handle 404 the load sharing among the hybrid power sources. The secondary 405 control level includes the grid voltage coordination and to ensure 406 bus signals at their operating ranges. The tertiary control level 407 is used to achieve optimal operation with intentional objec-408 tives [34]. In this study, the primary and secondary level power 409 management control have been achieved, while the tertiary 410 control will be considered in future's research work. 411

The basic load sharing mechanism in dc-distributed power 412 network is dc voltage droop control. Basically, with the voltage 413 droop control, all the power sources share the load based on the 414 dc bus voltage in the similar way as with frequency droop control 415 in ac-distributed system. The load sharing function is realized 416 by adjusting the voltage droop rate. In Fig. 8, it shows the load 417 sharing results of a dc power network with three different droop 418 rate setting. A steeper droop angle will cause one consumer to 419 take less load than one with a more flat droop angle given the 420 same voltage set point. 421

DG system is integrated into the dc network via 6-pulse 422 diode rectifier, and the output voltage is controlled by AVR. 423 The dc voltage set point is defined as the nominal dc voltage of 424 the rectifier. Droop increases with increasing generator speed. 425 Usually, the dc voltage droop rate is not larger than 5% [35]. 426

For the energy storage power sources, such as fuel cells and 427 batteries, the dc voltage droop control is implemented in the 428 power electronic dc/dc converters. The block diagram of the 429 voltage control loop is as shown in Fig. 9. It is a dual control 430 loop, with the current control as the inner loop with the voltage 431 control as the outer loop.  $K_{dr,v}$  is the voltage droop rate for load 432 sharing with other power sources. 433

The dc voltage droop control is simple and reliable. But due 434 to the complexity of hybrid dc-grid system configuration, it is 435 difficult to fine-tune the whole power system with one single 436 parameter to maintain the performance of each power source, 437 and ensure the system stability at the same time. It is also not 438 possible to achieve strategy loading or even optimized operation. 439 Therefore, the power control of the ESS devices is expected. The 440 dc/dc converter power control loop with PI controllers is shown 441 in Fig. 10. It is a single current control loop, where the current 442 reference is given by the quotient of reference power and dc 443 voltage. 444

In this study, dc voltage droop combined with power control is implemented as primary power management scheme. The system voltage coordination rules and constrains have been set in power electronic converter models as the secondary level of 448



Fig. 8. Load sharing with 3 different droop curves. (a) Integrated dc-distributed system with three power sources and their droop rates. (b) System voltage and load sharing scheme.

TABLE I PARAMETERS FOR THE DC-BASED DEMO VESSEL

Diesel-generator		Fuel cell [30]		Batteries	
Rated power $(P_{gen})$	410 kW	Rated power $(P_{fc})$	2*100 kW	Capacity $(E_{batt})$	113 kWh
Nominal voltage $(V_{abc})$	400 VAC	Min. power $(P_{fc\_min})$	20 kW	Max. charge voltage $(V_{batt\_max})$	350VDC
Nominal current $(I_{abc})$	592 A	Operating voltage $(V_{fc})$	355-577 VDC	Nominal voltage $(V_{batt})$	300 VDC
Frequency $(F_n)$	50 Hz	Rated current $(I_{fc})$	2*257 A	Min. voltage $(V_{batt\_min})$	268 VDC
Speed (Spd)	1500 rpm	Max. Temperature $(T_{max})$	70°C	Max. discharge current $(I_{batt\_disch})$	250 A
Inertia $(J_{ge})$	10 kgm <sup>2</sup>	Fuel Type	Hydrogen	Max. charge current $(I_{batt\_ch})$	200 A
Power factor (pf)	0.9	$H_2$ pressure	3.5-5 Barg	Operating state of charge range $(SoC)$	20%-80%



Fig. 9. DC/DC converter control scheme I - Voltage control loop.



Fig. 10. DC/DC converter control scheme II - Power control loop.

power management. The ESS device output power or voltage
shall be regulated according to the reference command if the
corresponding control scheme is selected. Two different operation modes will be studied in this article: Zero-emission mode
and DG in-parallel mode.

## 454 D. System Simulation Results

A small-scaled tugboat power plant is configured as the target 455 vessel for simulation test. It is a typical hybrid shipboard dc-grid 456 system design, as shown in Fig. 2. It comprises two sets of 457 200-kW fuel cells, two battery arrays with capacity of 113 kWh 458 and two 410-kW DGs as the back-up power. The detailed 459 system configuration parameters for this dc-based demo vessel 460 are shown in Table I. The simulation tests are performed with 461 two operating modes, respectively: Zero-emission mode and DG 462 in-parallel mode. The test results are shown as follows. 463

464 1) *Zero-Emission Mode:* During the zero-emission mode 465 operation, there is no DG online. The battery units are working under the voltage control scheme to regulate the466system dc-grid voltage level. Two battery sets share the467load via voltage droop control. Fig. 11 shows the simula-468tion results for the dc-grid hybrid power plant performance469under zero-emission operation.470

- a) T = 3-15 s: The load power increases to 300 kW. The total load demands are supplied by two fuel cell modules and two battery units. Fuel cells follow the power references from the dc/dc converter, while batteries share the remaining required power equally when the voltage droop rate is set as the same value. In this test, voltage droop rate is set as 3%.
- b) T = 15-30 s: The propulsion load is dropped. The batteries switch to charging mode to absorb the remaining power from network for future usage. 480
- c) T = 30 *s*-*end*: the load is increased to peak, around 481 400 kW. The batteries discharge and provide the power 482 supply for the peak load demands. 483

It shows that the dynamic response of fuel cells is relatively 484 slow and it needs the battery systems' support to fulfill the 485 peak ship load. With voltage droop control, the system dc 486 voltage slightly varies according to the different loading 487 conditions. Two fuel cells are operated independently 488 according to their own reference profiles. Usually in real 489 practice, fuel cells can be set to provide the average load 490 demands [36], and the batteries are to enhance the system 491 dynamic performance and boost the power supply during 492 peak load. 493

2) *DG in-Parallel Mode:* When the system is under DG 494 in parallel mode, the DGs connect to dc network via a 495



Fig. 11. Simulation results for the dc-based shipboard power grid model for demo vessel. Zero-emission mode. (a) Power split of the hybrid shipboard power plant model. (b) Dynamic behavior of fuel cell devices and batteries.

6-pulsed passive rectifier. The online diesel generators 496 dominate the system dc voltage level naturally by its ter-497 minal ac voltage. In this case, battery systems are switched 498 to power control scheme which is similar to the fuel 499 500 cell control method to provide the output power flow as reference required to achieve an ideal loading strategy and 501 optimization control. Fig. 12 shows the simulation results 502 of the hybrid ship power system under DG in-parallel 503 mode. 504

- a) T = 3 15 s: The load power increases to peak 400 kW. The fuel cell modules follow the power reference commands from the dc/dc converter. The propulsion load variations are absorbed and equally shared between two battery units. The voltage droop rate here is set as 2% for both the DGs so that they are able to share equal 100-kW load throughout the simulation.
  - b) T = 15 30 s: The propulsion load is dropped. The batteries switch to charging mode to absorb the extra power for future usage.
  - c) T = 30 s end: The power of the load is shooting up to the peak again. The batteries discharge and boost the total power supply.

In this simulation test, fuel cells and battery systems provide 518 the power supply according to the power allocation reference, 519 and the remaining power demands from the network go to DGs 520 online. Similar to the zero-emission mode, the batteries function 521 as the dynamic enhancement to support the system dynamic 522 performance. To maintain system stability, the generators shall 523 remain stable outputs, and usually, it can be set as the average 524 525 load demands.

For both zero-emission mode and DG in-parallel mode sim-526 ulation test, the different power sources are integrated into the 527 common dc-distributed power network and able to satisfy the 528 load demands. The system power load sharing is under dc 529 voltage droop combined with power control scheme. During 530 both of the operation modes, the power reference profile for 531 the two fuel cells are set differently. This system-level hybrid 532 power plant model provides the control freedom to interface 533 with different tertiary level power management algorithms. 534

#### IV. HIL SETUP

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Control algorithm testing can be time-consuming, costly, and 536 potentially unsafe if the test is against a real hardware-based 537 system. Therefore, software-based plant model is considered 538 for replacing the real system and to generate the operational 539 profile of a vessel. A HIL setup is expected to provide real-time 540 simulation of the shipboard power system behavior and dynam-541 ics, as well as the hardwired interfaces with control signals and 542 communication protocols. HIL test is able to ensure high quality 543 of the control software. It is a reliable verification and validation 544 method to prototype the controller before implementing the 545 control algorithm into a real hardware environment [37]. 546

In this study, the shipboard power system plant model is successfully built and run on a real-time Speedgoat target machine, which provides real-time simulation of plant model behavior and dynamics as well as the communication interface with field-bus protocols. The power and energy optimization control algorithms are developed and downloaded to a B&R brand X20CP3586 programmable logic controller (PLC)-based

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Fig. 12. Simulation results for the dc-based shipboard power grid model for demo vessel. DG in-parallel mode. Frequency of the DG is 50 Hz. (a) Power split of the hybrid shipboard power plant model. (b) Dynamic behavior of fuel cell devices, batteries and DGs.



Fig. 13. HIL topology scheme.

embedded control system. The available real-time Fieldbus communication protocols between the plant model and controller are
Profinet and Profibus for this setup. In this study, the topology
diagram of the HIL test bed is shown in Fig. 13.

### 558 V. System Model Validation

In this study, the mathematical shipboard power system model and HIL plant are both validated against the full-scale hybrid power plant system. The actual power grid facilities are located 561 at ABB collaborated hybrid power laboratory in MARINTEK, 562 at Norwegian University of Science and Technology, in Trond-563 heim, Norway. The main objective of this experimental valida-564 tion test is to verify that the response of the modeled shipboard 565 power system matches with the actual system response. The 566 DGs and fuel cells with battery energy storage will be validated, 567 respectively, according to the actual lab setup. 568

The system configuration of the MARINTEK laboratory is 569 based on a full-scale hybrid AES with ABB onboard dc-grid 570 system. The lab arrangement diagram is shown in Fig. 14. The 571 lab is equipped with two 410-kW diesel engines and variable 572 speed generator sets, two 30-kW fuel cell devices, plus one 573 55-kWh battery ESS. Power sources are connected to the dc-bus, 574 and system loading conditions are simulated with two control-575 lable electric motors. Fig. 15 shows the equipment setup in 576 MARINTEK lab. 577

In the first validation test, one DG and one 55-kWh battery system are in use. The validation test results are shown in Fig. 16. The load profile is designed as four ramp-up cycles The dynamic response of a DG is limited by its mechanical characteristic, and so the battery banks are there to boost the system dynamic performance to achieve the load demands. In this test, the



Fig. 14. ABB MARINTEK lab setup diagram, where M1 & M2 are the propulsion motors, and Brake1 & 2 present the controllable thrusters load.



Fig. 15. ABB MARINTEK lab in Trondheim, Norway.



Fig. 16. Validation test I: To compare the system response between simulation model and HIL plant target in DG in-parallel mode.

simulated results from the Simulink model can match well with
the actual recorded test. The overall mean average percentage
error between the mathematical plant model and actual system
is around 0.51%, and the average error between HIL plant and
actual system is about 1.82%.

In the second validation test, two fuel cell modules and the 589 same battery system are configured. The test results are shown in 590 Fig. 17. During the first 100 s, the two fuel cells were powered up 591 with 9-kW output one after another. The power drawn from the 592 batteries was reduced with the increasing power supply from 593 the fuel cells. From the 120 s, the load demands are reduced 594 below the fuel cell power supply so that the batteries are charged 595 by the fuel cells. Between 100 to 480 s, the fuel cells provide 596 597 the constant power output, while the batteries absorb the load



Fig. 17. Validation test II: To compare the system response between simulation model and HIL plant target in Zero-emission mode.

variations. From the 480 s onward, the power references for fuel cells are altered so that the batteries provide the remaining power to the load. The mean average percentage error is about 1.98% between the mathematical model and the actual system, while it is about 1.47% between HIL plant and the actual system. 602

To compare the test results, it can be seen that the system 603 simulation and HIL results compare well with the experimental 604 values recorded from the site. In addition, the transient rise time 605 and steady-state power output for all DG, fuel cells, and battery 606 power sources for both mathematical model and HIL plant can be 607 in line with the actual system responses. Therefore, the proposed 608 hybrid shipboard power plant model can be used to represent the 609 physical system behavior. 610

### VI. CONCLUSION 611

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In this article, adc-distributed hybrid shipboard power system 612 configuration has been studied. A system-level fuel cell-fed 613 hybrid shipboard power grid system with dc distribution has 614 been modeled. In addition, an HIL plant model platform has 615 been set up and tested in a lab environment. Finally, both 616 the system mathematical model and the HIL plant have been 617 validated against a full-scale hybrid shipboard power system. 618 This research work provides an essential platform and solid 619 foundation to apply optimization control of power and energy 620 management strategy in future work. 621

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Wenjie Chen (Student Member, IEEE) received the 746 B.Sc. degree in automation from Shanghai Maritime 747 University, Shanghai, China, in 2007, the M.Sc. de-748 grees in electrical engineering from Ecole Polytech-749 nique de l'Université de Nantes, France, in 2009. 750 She is currently working toward the Ph.D. degree 751 in optimization control for power system under the 752 supervision of Prof. K. Tai with Nanyang Technolog-753 ical University, Singapore, and Prof. T. Tjahjowidodo 754 with Katholieke Universiteit Leuven, Leuven, Bel-755 gium, since January 2019. 756 757

She firstly joined ABB China (Shanghai) in 2010, and then transferred to ABB Singapore in 2011. Currently, she is based in Singapore as a Research Specialist.



works.

Kang Tai received the B.Eng. degree in mechanical engineering from the National University of Singapore, Singapore, and the Ph.D. degree from Imperial College, London, U.K.

He is currently an Associate Professor with the 765 School of Mechanical and Aerospace Engineering, 766 Nanyang Technological University, Singapore. His 767 research interests include optimization, evolutionary 768 computation, mathematical/empirical modeling of in-769 dustrial processes, and analysis of interdependencies, 770 risks and vulnerabilities in critical infrastructure net-771

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Michael Lau received the Ph.D. degree in mechanical engineering from Aston University, Aston, U.K. and the C.Eng. degree from Institution of Mechanical Engineers, London, U.K.

He was a Control and Instrument Engineer with Ministry of Defence, Singapore, and later with an oil and gas industry for about four years, before spending the next 35 years as an academician, first with Nanyang Technological University, Singapore, until 2010, and then with Newcastle University in Singapore (NUiS), Singapore till current. He is cur-

rently an Associate Professor with NUiS. His research interests include control, mechatronics system designs and energy systems.



Ricky R. Chan received the Ph.D. degree in electrical 808 engineering from Purdue University, West Lafayette, 809 IN, USA, in 2009. 810

He is currently a Research and Development Man-811 ager with ABB Marine & Ports in Helsinki, Finland, 812 where he leads a team of specialists in the devel-813 opment of advanced electric solutions for marine 814 applications. 815 816



for Marine & Ports.



Alf Kåre Ådnanes received the M.Sc. and Ph.D. 817 degrees in electrical engineering from the Norwegian 818 University of Science and Technology, Trondheim, 819 Norway. 820

He heads the regional division in AMEA of ABB 821 Marine & Ports. He joined ABB in 1991, and among 822 previous positions with ABB, he has worked within 823 corporate research, and various positions within Ma-824 rine, including delivery projects, engineering, and in 825 product management and development, and technol-826 ogy management for the global marine business unit 827 828

Tegoeh Tjahjowidodo received the Ph.D. degree in mechanical engineering and automation from KU Leuven, Belgium in 2006.

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He is currently an Associate Professor with the Department of Mechanical Engineering, KU Leuven. From 2009 until 2019, he has been with the School of Mechanical & Aerospace Engineering, Nanyang Technological University, Singapore, as an Associate Professor. His research interests include nonlinear dynamics, modeling, identification and control, with more focus in monitoring for manufacturing.



Ahmed Abdelhakim (Senior Member, IEEE) was born in Egypt on April 1, 1990. He received the B.Sc. and the M.Sc. degrees (with hons.) in electrical engineering from Alexandria University, Alexandria, Egypt, in 2011 and 2013 respectively, and the Ph.D. degree from the University of Padova, Vicenza, Italy, in 2019. He is currently with ABB Research Sweden as a

Principal Scientist Scientist and R&D Project Manager. His research interests include power electronics converters and their applications for fuel cells and

energy storage systems, investigation of new power converter topologies, and application of wide-bandgap semiconductor devices (GaN/SiC) for high frequency and high-power density power converters.

Dr. Abdelhakim was the recipient of the classified excellent Ph.D. dissertation award from Societá Italiana di Electronica (SIE'19) among Italian Universities, in 2019. He serves as an Associate Editor for the IEEE TRANSACTION ON INDUSTRIAL ELECTRONICS and IEEE TRANSACTION ON TRANSPORTATION ELECTRIFICATION.



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# DC-Distributed Power System Modeling and Hardware-in-the-Loop (HIL) Evaluation of Fuel Cell-Powered Marine Vessel

Wenjie Chen<sup>®</sup>, *Student Member, IEEE*, Kang Tai, Michael Lau, Ahmed Abdelhakim<sup>®</sup>, *Senior Member, IEEE*, Ricky R. Chan, Alf Kåre Ådnanes, and Tegoeh Tjahjowidodo

Abstract—Environmentally driven regulations are significantly 6 affecting shipping in recent years, where the shipbuilding industry 7 8 is required to comply with upcoming restrictions concerning polluting emissions. The all-electric ship (AES) is one of the 9 10 most promising technologies for complying with the increasingly 11 strict environmental regulations, improving fuel efficiency, and enhancing system dynamic performance. In this study, the 12 dc-distributed power grid of an AES integrated with fuel cells 13 and batteries has been configured using extensive electrification 14 15 technology, where the system-level shipboard power plant has 16 been modeled with the average modeling method. The model not 17 only incorporates the hybrid power source integration but also the primary and secondary power management as a whole. In addition, 18 a hardware-in-the-loop (HIL) has been set up to replicate the 19 real-time system behavior, which is essential for the verification of 20 21 any optimal power management control algorithms to be developed in future work. Finally, both the mathematical and real-time models 22 23 are validated against the full-scale hybrid shipboard power system.

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*Index Terms*—All-electric ship, fuel cell system (AES),
 hardware-in-the-loop (HIL), hybrid shipboard power microgrid,
 renewable energy sources.

## I. INTRODUCTION

ARITIME transport has played a dominant role in the global trade system for centuries, and it is expected that

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Wenjie Chen is with the School of Mechanical and Aerospace Engineering, Nanyang Technological University, Singapore 639798, and also with the ABB Pte. Ltd., Singapore 139935 (e-mail: wenjie003@e.ntu.edu.sg).

Kang Tai is with the School of Mechanical, and Aerospace Engineering, Nanyang Technological University, Singapore 639798 (e-mail: mktai@ntu.edu.sg).

Michael Lau is with the Newcastle University in Singapore, Singapore 599493 (e-mail: michael.lau@newcastle.ac.uk).

Ahmed Abdelhakim is with the ABB Corporate Research, 722 26 Västerås, Sweden (e-mail: ahmed.abdelhakim@se.abb.com).

Ricky R. Chan is with the Marine and Ports, ABB Oy, 1 00980 Helsinki, Finland (e-mail: ricky.chan@fi.abb.com).

Alf Kåre Ådnanes is with the Marine and Ports, ABB Engineering (Shanghai) Ltd., Shanghai 1 00980, China (e-mail: alfkare.adnanes@cn.abb.com).

Tegoeh Tjahjowidodo is with the Department of Mechanical Engineering, KU Leuven, De Nayer Campus, 2860 Sint-Katelijne-Waver, Belgium (e-mail: tegoeh.tjahjowidodo@kuleuven.be).

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international maritime trade will expand at continuous annual 30 growth for years to come [1]. Recently, environmental sus-31 tainability has become a significant policy concern in global 32 maritime transport [2]. With this concern, the shipbuilding 33 industries are compelled to abide by rules on polluting emissions 34 imposed by International Maritime Organization (IMO) and 35 national legislation [3]. To achieve high energy efficiency and 36 low emission, it is believed that the all-electric ship (AES) will 37 be one of the most promising technologies to comply with the 38 environmental regulations [4]. In particular, vessel types such as 39 tug boats, river pushers, and ferries will be the early adopters as 40 they usually operate near coasts or in inner rivers, which belong 41 to emission control areas (ECAs). Other vessel types such as 42 container vessels may need more time before the AES design 43 can be adopted [5]. 44

With the development of energy storage technologies, new 45 energy sources can be integrated into the shipboard power 46 network. Batteries, as the most mature energy storage system 47 (ESS) device, have been widely utilized in different applications 48 in marine vessels. However, due to energy density limitation, 49 battery systems only function as a main power supply for 50 small-scale vessels in short distance shipping segment or as an 51 auxiliary power source onboard of large vessels to enhance the 52 dynamic performance or short-term zero-emission operation. In 53 order for clean energy sources to be a feasible solution for larger 54 ocean-going ship types, such as cruise ships and RoRo/RoPax 55 (the vessels built for freight vehicle transport with passenger 56 accommodation), fuel cell systems have been introduced. It is 57 expected that fuel cell systems would replace diesel engines as 58 the main power source in the future. 59

The hybrid shipboard power system integrated with different 60 types of power sources brings in a lot of benefits, but it also 61 increases the complexity of the system structure and power 62 management control. To get deep understanding of the hybrid 63 power system and improve the current control algorithms, a 64 comprehensive system-level hybrid power plant model is needed 65 as a foundation. The expected system model should be able 66 to perform the actual shipboard power plant responses under 67 different operating modes and loading profiles. 68

A few power system configurations and modeling methodologies have been published in the recent literature. In [6] 70 and [7], land-based hybrid dc microgrid configurations have 71

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been introduced. The authors in [8] have proposed a diesel-72 generator-based marine power network equipped with a battery 73 ESS, while a fuel cell-based marine system model has been 74 75 developed in [9], where the authors are mainly focusing on the fuel cell chemical reaction and fuel processing. The above 76 references focus only on certain parts of the power grid rather 77 than the observation of the dynamics and performance of the 78 complete system. 79

It is worth noting that shipboard power systems have their 80 81 own special configurations and requirements [10]. The main difference with land-based power system is that shipboard power 82 system is an isolated microgrid with short distances from gen-83 erated power to the electric propulsion load [11]. The average 84 short-circuit levels and forces are quite high so that it must be 85 dealt with some special manners to protect the power equipment. 86 During cruising, shipboard power system is impacted a lot by the 87 environment, such as marine weather and unexpected thrusters 88 load variations, therefore the system stability and reliability is 89 90 crucial for marine vessels. Extra efforts in system reconfigurability and redundancy are required to prevent single point failure 91 92 according to the marine classification rules. Compared to EV power system, the power scale of the shipboard power network 93 is much bigger and complicated. Due to its particularity of the 94 shipboard power system [12], there is the urge to build its own 95 96 power plant model rather than reusing other existing models.

In addition, system-level power plant model is not only to inte-97 grate different power sources but also to implement primary and 98 secondary level power management to coordinate power load 99 sharing, frequency, and voltage control. A previous work by the 100 authors [13] modeled an ac-distributed shipboard hybrid power 101 system. However, in the past decade, dc-based distribution sys-102 tems have gained popularity due to their advantages in many 103 104 aspects [14]. A system-level dc-based shipboard power model is necessary to simulate the vessel operating performances. The 105 comprehensive and reliable power plant model is the foundation 106 and precondition for system studies and further research. 107

Compared to the existing studies on hybrid power network
 modeling problems, the main contributions of this article are
 highlighted as follows.

- A dc-distributed system-level shipboard power system model is built, integrating the mathematical model of different power sources, as well as the primary and secondary power management control. All the power sources are resizable to configure the new shipboard systems according to the varied ship design specifications.
- A hardware-in-the-loop (HIL) platform is set up in lab
  environment as well. HIL helps to perform the system
  real-time states. It is a useful tool for prototyping the power
  and energy management system (PEMS) controller and
  communication interface validation without involving any
  hardware devices setup.
- 3) Both the mathematical and real-time HIL model have
  been validated against the real hardware full-scale hybrid
  shipboard power system.

The rest of this article is organized as follows: The hybrid
shipboard power system configuration is discussed in Section II.
A dc-based power distribution model and the simulation results



Fig. 1. ESS integration scheme for both dc and ac distribution system.

are presented in Section III. Section IV evaluates the system 129 plant model HIL setup. And the validation tests are performed 130 in Section V. Finally, Section VI concludes this article. 131

### II. SHIPBOARD POWER SYSTEM CONFIGURATION 132

In this section, the functions of several integration schemes 133 will be introduced in detail. The advantages and the system 134 configuration of dc-distributed shipboard power system will also be discussed. 136

## A. Advantages of DC-Based Shipboard Power System 137

Currently, the majority of commercial marine vessels have a 138 diesel or gas engine powered plant with ac distribution, while 139 the dc-distributed shipboard system has drawn much attention 140 over the past decade. In both ac and dc-distributed systems, ESS integration is a trend for different functionalities [15]. 142

Energy storage, such as batteries will help the slow power devices level out load variations from the thrusters and other heavy consumers. Besides, the clean energy sources are able to provide the main power supply of the ship operation in order to achieve zero-emission operation. There are several methods to integrate the ESS into the shipboard network [16], which is shown in Fig. 1.

According to this integration scheme, it can be seen that the 150 ESS is much easier to connect to a dc-distributed network than an 151 ac system. The storage devices can be directly connected to the 152 dc network. This direct-on-line (DOL) ESS gives an efficiency 153 increase compared to the ESS with dc/dc converter, but at the 154 cost of less control features to be achieved. On the other hand, 155 ESS is also possible to be extended to an ac-distributed system 156 through a dc/ac converter with LCL filter and transformer [17]. 157 The LCL filter is used herein to improve the power quality and 158 reduce the total harmonic distortion (THD) level of the main 159 power network. While the shielded transformer is utilized to 160 solve the electromagnetic interference (EMI) issue, it also blocks 161 the circulating current within the power electronic converters 162 such as IGBT or MOSFET. In addition, the dc/ac converters also 163 need to monitor the amplitude, frequency, and phase shift of the 164 power network voltage on ac side to achieve the synchronization 165 operation [13]. It is clear that the ac-based power configuration 166 is quite complex not only in system configuration but also in 167 power management control [14]. Furthermore, it also increases 168



Fig. 2. Typical dc-based shipboard power system single line diagram.

the dimensions of the equipment, where the space onboard aship is limited.

Safety is another important consideration for implementing 171 the dc-based distribution. A dc-configured system is inherently 172 simpler than an ac system, which means that it is easier to predict 173 fault scenarios and devise adequate protection against them. The 174 generators can be connected to the dc distribution system in a 175 176 short time because it is not necessary for synchronization. It has considerable potential to improve the stability, efficiency, and 177 performance of future dc-based ship power systems [18]. 178

In addition to the benefits described above, there are numerousother benefits with dc distribution. Some of these are summa-rized as follows.

- *Voltage Distortion:* Harmonic distortion is inherent in ac systems with frequency converters, while being less of a concern with dc distribution.
- 2) *Electrical Efficiency:* In the process of going from ac-to-dc distribution, the system efficiency is improved by 0.5–1% [19].
- *Ease of Control:* It is not required to control the frequency
  and reactive power of the network. The control system is
  simplified and only needs to overlook the dc voltage.

Overall, the integration of a hybrid ac-distributed shipboard 191 power is complex and costly [14]. Multiple layers of the power 192 conversion and transmission increase the system losses and 193 probability of equipment failure. It is more suitable for some 194 retrofit projects, which are planned for extending a single ESS 195 from an existing ac distribution network. Due to the advantages 196 of dc-distribution power system, this study focuses on dc-based 197 shipboard power plant modeling. 198

## B. Hybrid Shipboard Power System Configuration

For a hybrid dc-distributed shipboard power system, the en-200 ergy storage devices can be connected to the system. A generator 201 set driven by a combustion diesel engine is possible to be 202 integrated into the dc power network. Usually, synchronous 203 generators are used and rectified (ac to dc converter) before the 204 power is transmitted to the dc bus. Propulsion and other ship 205 service loads are regulated by dc/ac inverters. The typical con-206 figuration of an all-electric dc hybrid ship power and propulsion 207 system is shown in Fig. 2. In this study, two fuel cell modules 208 are function as the main power supply to achieve zero emission 209 operation. Two battery banks handle the ship load variations. 210 And two diesel gen sets (DG) are the backup power in case the 211 fuel cell devices or the hydrogen fuel are not available under 212 emergency condition. 213

The main switchboards are usually split into two sections 214 or more to obtain the redundancy requirements of the vessel 215 according to the marine class rules and regulations. This kind of 216 structure is not only an intrinsic advantage of dc distribution but 217 it also has the ability to supply power to the load continuously 218 even under certain fault conditions [16], such as short-circuit. 219 During normal operation, the dc-grid switchboard are usually 220 connected (close bus tie), which gives the best flexibility in 221 the configuration of the power generation. The optimal num-222 ber of the power devices can be connected to the power net-223 work according to the load transients to achieve certain control 224 criteria. 225

## III. FUEL CELL-FED DC DISTRIBUTION SYSTEM MODELING 226

In this section, a system-level dc-based hybrid shipboard 227 power plant will be modeled. The power network includes 228 the fuel cells, batteries, and DGs as the energy sources. The 229 essential components of the dc-grid power system are the power 230



Fig. 3. General block diagram of a diesel engine-driven synchronous generator.

electronics devices. An ESS dc/dc converter and a 6-pulse ac/dc
rectifier for DG integration will be modeled. The propulsion
load and ship hotel loads of the vessel will be represented with
controllable current sources. Power management, including load
power sharing, dc voltage coordination, and power regulation
will be achieved as well.

## 237 A. Energy Sources Modeling

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- Diesel Gen-Set Model: Fig. 3 shows the general configuration of a diesel engine-driven synchronous generator system. The system consists of four main sections: Fuel injection and diesel engine, governor, synchronous generator (SG), and automatic voltage regulator (AVR) [20].
   The mathematical models of each part of diesel generator are introduced as follows.
- a) *Fuel injection and diesel engine* can be presented by
  a time delay and the coupling shaft model, as in [21]
  and [22]. The simplified model is given by

$$\frac{T_m(s)}{u_\omega(s)} = \frac{K_{en} \cdot e^{-t_d \cdot s}}{t_e s + 1} \tag{1}$$

$$J_{eq} \cdot \frac{d\omega_m}{dt} = T_m - T_e - k_{f_{eq}} \cdot \omega_m \tag{2}$$

where  $\omega_m$  is the mechanical speed,  $u_{\omega}$  is the control signal from the speed governor,  $T_m$  is the mechanical torque developed by the engine,  $J_{eq}$  is the equivalent inertia of the entire system,  $k_{feq}$  is the equivalent friction coefficient,  $K_{en}$  is the engine gain,  $t_d$  is a delay representing the time elapsed from the fuel injection until the torque is developed at the engine shaft, and  $t_e$ is the time constant of the fuel injection.

b) Governor is responsible for regulating the engine speed to maintain it within the allowable range during the different load conditions, resulting in constant output frequency or within the desired limits. This governor also has the structure of a PI controller with the droop function implemented. This model can be given by

$$u_{\omega} = \left(\omega_{en}^{*} - \omega_{en} - k_{dr, \text{freq}} \cdot u_{\omega}\right) \left(K_{P_{\omega}} + \frac{K_{I_{\omega}}}{s}\right)$$
(3)

where  $K_{P_{\omega}}$  and  $K_{I_{\omega}}$  are the proportional and integral gains of the governor PI controller, and  $\omega_{en}$  is the engine nominal speed and  $k_{dr,\text{freq}}$  is the speed droop gain that equals  $(m_{dr} \cdot \omega_{en})$ , and  $m_{dr}$  is the static 266 droop slope. 267

c) Synchronous generator is considered without damper
 windings for the sake of simplifying the model. And
 its *d-q* rotating reference frame is given by
 270

$$V_d = -r_s \cdot i_d + L_q \cdot \omega_e \cdot i_q + L_d \cdot \frac{di_d}{dt} + M_{sf} \cdot \frac{di_f}{dt}$$
(4)

$$V_q = -r_s \cdot i_q - L_d \cdot \omega_e \cdot i_d + L_q \cdot \frac{di_q}{dt} + M_{sf} \cdot \omega_e \cdot i_f$$
(5)

$$V_f = r_f \cdot i_f + L_f \cdot \frac{di_f}{dt} - M_{sf} \cdot \frac{di_d}{dt} \tag{6}$$

$$T_e = (L_d - L_q) \cdot i_d \cdot i_q + M_{sf} \cdot i_q \cdot i_f \tag{7}$$

where  $V_d$ ,  $V_q$ ,  $i_d$ , and  $i_q$  are the output voltages and cur-271 rents in the *d*-*q* rotating reference frame, respectively, 272  $V_f$  and  $i_f$  are the field excitation voltage and current, 273 respectively,  $r_s$  and  $r_f$  are the stator winding and 274 field winding internal resistances, respectively,  $L_d$  and 275  $L_q$  are the stator inductance in the *d*-axis and *q*-axis, 276 respectively,  $L_f$  is the inductance of the field,  $M_{sf}$  is 277 the mutual inductance between the field winding and 278 the *d*-axis stator winding, and  $T_e$  is the electromagnetic 279 torque. It is worth noting that, the following assump-280 tions have been considered: The stator windings are 281 symmetrical, a uniform sinusoidal distribution along 282 the air gap, the permanence of the magnetic paths on 283 the rotor is independent of the rotor positions, and the 284 saturation and the hysteresis effects are neglected. 285

d) Automatic voltage regulator has the responsibility of controlling the terminal voltage of the synchronous generator under different load conditions. This AVR is modeled as a first-order system, representing a power converter controlled by a PI controller [20], that is given by 291

$$V_f = \frac{k_{\text{conv}}}{t_{\text{conv}}s + 1} \cdot (U_v - k_{dr,v}V_f)$$
(8)

$$U_v = \left(K_{Pv} + \frac{K_{Iv}}{s}\right) \cdot \left(V_t^* - V_t\right) \tag{9}$$

where  $K_{Pv}$  and  $K_{Iv}$  are the proportional and integral 292 gains of the AVR PI controller,  $k_{conv}$  and  $t_{conv}$  are the 293



Fig. 4. ESS power source modeling. (a) Proton-exchange membrane (PEM) fuel cell and its equivalent circuit. (b) Lithium-ion battery and its equivalent circuit.

294 converter gain and time constant, and  $V_t^*$  and  $V_t$  are 295 the reference and measured rms output line voltage. 296  $k_{dr,v}$  is the dc voltage droop rate for dc-distributed 297 power system.

2) Fuel Cell Model: There are a few different types of fuel 298 cell technologies. The proton-exchange membrane (PEM) 299 fuel cell is the most mature technology over other types of 300 fuel cell. With its relatively low cost and high energy effi-301 ciency features, PEMFC is the most widely used in marine 302 applications [23]. Fig. 4(a) shows a single PEM fuel cell 303 model and its equivalent circuit [24]. The fuel cell losses 304 are mainly divided into three categories: Activation loss 305  $R_{\text{act}}$ , concentration loss  $R_{\text{conc}}$ , and ohmic loss  $R_{\text{ohm}}$  [25]. 306 The voltage of a PEMFC elementary cell can be written 307 as follows [26]: 308

$$V_{\text{cell}} = E_{\text{nernst}} - V_{\text{act}} - V_{\text{conc}} - V_{\text{ohm}}$$
(10)

$$V_{fc} = N_{fc} \times V_{\text{cell}} \tag{11}$$

where  $V_{cell}$  is the voltage of a PEMFC elementary cell,  $E_{nernst}$  is the equilibrium voltage,  $V_{act}$  is the activation overpotential,  $V_{conc}$  is the concentration overpotential,  $V_{ohm}$  is the ohmic overpotential,  $V_{fc}$  is the voltage of PEMFC stack, and  $N_{fc}$  is the number of cells in series.

In this study, the PEMFC is configured with Matlab/Simulink Simscape library.

3) *Battery Model:* To balance the cost, energy density, power
density, safety performance, and life span, Li-ion battery
is the most applied battery type in marine ESS applications [27]. Simple models based on the equivalent circuit
of a resistor in series with a parallel *RC* circuit (polarization circuit) [28] have been used to determine the dynamic
characteristics of the battery, as shown in Fig. 4(b).

Open-circuit voltage (OCV) is defined differently for
discharging and charging at given state-of-charge (SoC)
due to the hysteresis effect [29]. The total voltage drop
from OCV is then modeled here based on the first-order
equivalent circuit to account for the internal resistance and
polarization (OCV relaxation).

$$V_{\text{term}} = V_{\text{OCV}} - IR_e - V_p \tag{12}$$

where  $V_{\text{term}}$  is the terminal voltage of the cell,  $V_{\text{OCV}}$  is the cell OCV, I is the current rate of the cell (positive for discharging and negative for charging),  $R_e$  is the electrical resistance (responsible for instantaneous voltage drop together with  $C_p$ , after the application of load) and  $V_p$  is the voltage drop across the polarization circuit. At any instant,  $V_p$  across the parallel *RC* circuit is represented by the voltage drop across  $R_p$  or  $C_p$ . So, the equation can be arranged by 337

$$\frac{V_p(t)}{R_p} + C_p \frac{dV_p(t)}{dt} = I(t)$$
(13)

where  $I_{Rp}$  is the current across polarization resistance, and338 $I_{Cp}$  is the current across polarization capacitance. The sum339of  $I_{Rp}$  and  $I_{Cp}$  gives the total circuit current I.340Then perform Laplace transform by341

$$V_p(s) = I(s) \frac{R_p}{1 + sR_pC_p} \tag{14}$$

so that the steady-state response of terminal voltage  $V_{\text{term s}-s}$  to a given current by 343

$$V_{\text{term}s-s} = V_{\text{OCV}} - I(R_e + R_p) = V_{\text{OCV}} - IR_{ti} \quad (15)$$

where  $R_{ti} = R_e + R_p$  is the total internal resistance of a 344 cell. 345

SoC is another critical parameter for the battery 346 system. SoC is intrinsically divided into two types: Instan-347 taneous SoC (SoC<sub>inst</sub>) and nominal SoC (SoC<sub>nom</sub>), both 348 based on Ah counting. Nominal SoC is derived from nom-349 inal capacity based on standard discharging conditions as 350 suggested by the manufacturer, while instantaneous SoC 351 is based on the available instantaneous discharge capacity 352 given by 353

$$\operatorname{SoC}_{\operatorname{nom}}(t_i) = \operatorname{SoC}_{\operatorname{nom}}(t_{i-1}) - \frac{I_{\operatorname{step}}(t_{i-1})t_{\operatorname{step}}}{C_{\operatorname{nom}}}$$
(16)

$$\operatorname{SoC}_{\operatorname{inst}}(t_{i}) = \frac{(1 - \operatorname{SoC}_{\operatorname{nom}}(t_{i-1}))C_{\operatorname{nom}}}{C_{\operatorname{step avail}}(t_{i-1})} - \frac{I_{\operatorname{step}}(t_{i-1})t_{\operatorname{step}}}{C_{\operatorname{step avail}}(t_{i-1})}$$
(17)

where,  $I_{\text{step}}$  is the current at a given time step,  $t_{\text{step}}$  is 354 the span of time under consideration (sampling time of 355 BMS/controller), and  $C_{\text{step avail}}$  is the capacity available for 356  $I_{\text{step}}$ . Instantaneous SoC is useful in indicating the capacity 357 available at a given time step and operating conditions, 358 especially higher discharge rates. 359 In this study, the Matlab/Simulink Simscape battery stack 360

In this study, the Matlab/Simulink Simscape battery stack model is utilized.

#### B. Power Electronic Converter Modeling

A dc/dc converter (for fuel cell and battery control), and an ac/dc rectifier (for diesel generator control) are modeled in this section. 363

 DC/DC Converter Model: Both of the fuel cells and the battery systems are powered by dc/dc converter. The dc/dc converter regulates the output voltage and power flow from the storage device [8]. Different from the battery bidirectional control [31], fuel cells only require a single direction power flow to provide the power to dc link. It can be represented as the following equation: 372

$$\frac{V_{dc}}{V_{\text{ESS}}} = \frac{1}{1-D} \tag{18}$$

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Fig. 5. DC/DC converter average model.



Fig. 6. Average model of 6-Pulse ac/dc rectifier, where  $V_d$ ,  $V_q$ ,  $I_d$ ,  $I_q$  are generator's output voltage and current in dq - axes,  $\delta$  is the angle between  $V_d$  and  $V_q$ , coefficient  $K_v$  is the ratio between the magnitude of rectifier output voltage  $V_{dc}$  and its input voltage  $V_d$ ,  $V_q$ , and  $\delta$ .

#### where D is the duty cycle of dc/dc converter.

There are two methods to model the power electronic 374 converters, i.e., electromagnetic transient (EMT) model 375 and average model. EMT model is straightforward and 376 can represent the modulation process of the power elec-377 tronic device. However, the simulation speed will be slow 378 379 down due to the usage of high-frequency carriers during pulsewidth modulation (PWM). EMT simulation method 380 is more suitable for system stability analysis studies, but 381 not suitable to evaluate system performance throughout 382 the operational profile which can last in the order minutes 383 384 or even hours. For that reason, the average model is selected to configure the shipboard power plant model here. 385 The dc/dc converter average model is shown in Fig. 5. 386

2) AC/DC Rectifier Model: The DGs are connected into dc bus via a 6-pulse diode rectifier. The average model of a diode bridge loaded synchronous generator was used here to simplify the calculation of the average values of generator *d-q* variables to the dc voltage and current at the bridge output [32], as shown in Fig. 6.

The voltage and current at the dc terminal can be defined as proportional to the amplitudes of the first harmonics of generator phase voltage and current, respectively [33]

$$V_{dc} = K_v \sqrt{V_d^2 + V_q^2} \tag{19}$$

$$i_{dc} = K_i \sqrt{i_d^2 + i_q^2} \tag{20}$$

where  $V_{dc}$  is dc voltage output from the rectifier.  $V_d$ ,  $V_q$ ,  $i_d$ , and  $i_d$  are the voltage and current of generator in dqaxes.  $K_v$  is the generator voltage constant, and  $K_i$  is the generator current constant.

## 400 C. System Control Philosophy

For existing hybrid shipboard power management is usually
arranged in line with the hierarchical control framework. The
basic structure is shown in Fig. 7.



Fig. 7. Hierarchical control framework for shipboard power management, where the primary and secondary control have been applied.

In hierarchical control, the primary control level is to handle 404 the load sharing among the hybrid power sources. The secondary 405 control level includes the grid voltage coordination and to ensure 406 bus signals at their operating ranges. The tertiary control level 407 is used to achieve optimal operation with intentional objec-408 tives [34]. In this study, the primary and secondary level power 409 management control have been achieved, while the tertiary 410 control will be considered in future's research work. 411

The basic load sharing mechanism in dc-distributed power 412 network is dc voltage droop control. Basically, with the voltage 413 droop control, all the power sources share the load based on the 414 dc bus voltage in the similar way as with frequency droop control 415 in ac-distributed system. The load sharing function is realized 416 by adjusting the voltage droop rate. In Fig. 8, it shows the load 417 sharing results of a dc power network with three different droop 418 rate setting. A steeper droop angle will cause one consumer to 419 take less load than one with a more flat droop angle given the 420 same voltage set point. 421

DG system is integrated into the dc network via 6-pulse 422 diode rectifier, and the output voltage is controlled by AVR. 423 The dc voltage set point is defined as the nominal dc voltage of 424 the rectifier. Droop increases with increasing generator speed. 425 Usually, the dc voltage droop rate is not larger than 5% [35]. 426

For the energy storage power sources, such as fuel cells and 427 batteries, the dc voltage droop control is implemented in the 428 power electronic dc/dc converters. The block diagram of the 429 voltage control loop is as shown in Fig. 9. It is a dual control 430 loop, with the current control as the inner loop with the voltage 431 control as the outer loop.  $K_{dr,v}$  is the voltage droop rate for load 432 sharing with other power sources. 433

The dc voltage droop control is simple and reliable. But due 434 to the complexity of hybrid dc-grid system configuration, it is 435 difficult to fine-tune the whole power system with one single 436 parameter to maintain the performance of each power source, 437 and ensure the system stability at the same time. It is also not 438 possible to achieve strategy loading or even optimized operation. 439 Therefore, the power control of the ESS devices is expected. The 440 dc/dc converter power control loop with PI controllers is shown 441 in Fig. 10. It is a single current control loop, where the current 442 reference is given by the quotient of reference power and dc 443 voltage. 444

In this study, dc voltage droop combined with power control is implemented as primary power management scheme. The system voltage coordination rules and constrains have been set in power electronic converter models as the secondary level of 448



Fig. 8. Load sharing with 3 different droop curves. (a) Integrated dc-distributed system with three power sources and their droop rates. (b) System voltage and load sharing scheme.

TABLE I PARAMETERS FOR THE DC-BASED DEMO VESSEL

Diesel-generator		Fuel cell [30]		Batteries	
Rated power $(P_{gen})$	410 kW	Rated power $(P_{fc})$	2*100 kW	Capacity $(E_{batt})$	113 kWh
Nominal voltage $(V_{abc})$	400 VAC	Min. power $(P_{fc\_min})$	20 kW	Max. charge voltage $(V_{batt\_max})$	350VDC
Nominal current $(I_{abc})$	592 A	Operating voltage $(V_{fc})$	355-577 VDC	Nominal voltage $(V_{batt})$	300 VDC
Frequency $(F_n)$	50 Hz	Rated current $(I_{fc})$	2*257 A	Min. voltage $(V_{batt\_min})$	268 VDC
Speed (Spd)	1500 rpm	Max. Temperature $(T_{max})$	70°C	Max. discharge current $(I_{batt\_disch})$	250 A
Inertia $(J_{ge})$	$10 \text{ kgm}^2$	Fuel Type	Hydrogen	Max. charge current $(I_{batt\_ch})$	200 A
Power factor (pf)	0.9	$H_2$ pressure	3.5-5 Barg	Operating state of charge range $(SoC)$	20%-80%



Fig. 9. DC/DC converter control scheme I - Voltage control loop.



Fig. 10. DC/DC converter control scheme II - Power control loop.

power management. The ESS device output power or voltage
shall be regulated according to the reference command if the
corresponding control scheme is selected. Two different operation modes will be studied in this article: Zero-emission mode
and DG in-parallel mode.

### 454 D. System Simulation Results

A small-scaled tugboat power plant is configured as the target 455 vessel for simulation test. It is a typical hybrid shipboard dc-grid 456 system design, as shown in Fig. 2. It comprises two sets of 457 200-kW fuel cells, two battery arrays with capacity of 113 kWh 458 and two 410-kW DGs as the back-up power. The detailed 459 system configuration parameters for this dc-based demo vessel 460 are shown in Table I. The simulation tests are performed with 461 two operating modes, respectively: Zero-emission mode and DG 462 in-parallel mode. The test results are shown as follows. 463

464 1) *Zero-Emission Mode:* During the zero-emission mode 465 operation, there is no DG online. The battery units are working under the voltage control scheme to regulate the466system dc-grid voltage level. Two battery sets share the467load via voltage droop control. Fig. 11 shows the simula-468tion results for the dc-grid hybrid power plant performance469under zero-emission operation.470

- a) T = 3-15 s: The load power increases to 300 kW. The total load demands are supplied by two fuel cell modules and two battery units. Fuel cells follow the power references from the dc/dc converter, while batteries share the remaining required power equally when the voltage droop rate is set as the same value. In this test, voltage droop rate is set as 3%.
- b) T = 15-30 s: The propulsion load is dropped. The batteries switch to charging mode to absorb the remaining power from network for future usage. 480
- c) T = 30 *s*-*end*: the load is increased to peak, around 481 400 kW. The batteries discharge and provide the power 482 supply for the peak load demands. 483

It shows that the dynamic response of fuel cells is relatively 484 slow and it needs the battery systems' support to fulfill the 485 peak ship load. With voltage droop control, the system dc 486 voltage slightly varies according to the different loading 487 conditions. Two fuel cells are operated independently 488 according to their own reference profiles. Usually in real 489 practice, fuel cells can be set to provide the average load 490 demands [36], and the batteries are to enhance the system 491 dynamic performance and boost the power supply during 492 peak load. 493

2) *DG in-Parallel Mode:* When the system is under DG 494 in parallel mode, the DGs connect to dc network via a 495



Fig. 11. Simulation results for the dc-based shipboard power grid model for demo vessel. Zero-emission mode. (a) Power split of the hybrid shipboard power plant model. (b) Dynamic behavior of fuel cell devices and batteries.

6-pulsed passive rectifier. The online diesel generators 496 dominate the system dc voltage level naturally by its ter-497 minal ac voltage. In this case, battery systems are switched 498 to power control scheme which is similar to the fuel 499 500 cell control method to provide the output power flow as reference required to achieve an ideal loading strategy and 501 optimization control. Fig. 12 shows the simulation results 502 of the hybrid ship power system under DG in-parallel 503 504 mode.

- a) T = 3 15 s: The load power increases to peak 400 kW. The fuel cell modules follow the power reference commands from the dc/dc converter. The propulsion load variations are absorbed and equally shared between two battery units. The voltage droop rate here is set as 2% for both the DGs so that they are able to share equal 100-kW load throughout the simulation.
  - b) T = 15 30 s: The propulsion load is dropped. The batteries switch to charging mode to absorb the extra power for future usage.
  - c)  $T = 30 \text{ s} \cdot \text{end}$ : The power of the load is shooting up to the peak again. The batteries discharge and boost the total power supply.

In this simulation test, fuel cells and battery systems provide 518 the power supply according to the power allocation reference, 519 and the remaining power demands from the network go to DGs 520 online. Similar to the zero-emission mode, the batteries function 521 as the dynamic enhancement to support the system dynamic 522 performance. To maintain system stability, the generators shall 523 remain stable outputs, and usually, it can be set as the average 524 525 load demands.

For both zero-emission mode and DG in-parallel mode sim-526 ulation test, the different power sources are integrated into the 527 common dc-distributed power network and able to satisfy the 528 load demands. The system power load sharing is under dc 529 voltage droop combined with power control scheme. During 530 both of the operation modes, the power reference profile for 531 the two fuel cells are set differently. This system-level hybrid 532 power plant model provides the control freedom to interface 533 with different tertiary level power management algorithms. 534

#### IV. HIL SETUP

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Control algorithm testing can be time-consuming, costly, and 536 potentially unsafe if the test is against a real hardware-based 537 system. Therefore, software-based plant model is considered 538 for replacing the real system and to generate the operational 539 profile of a vessel. A HIL setup is expected to provide real-time 540 simulation of the shipboard power system behavior and dynam-541 ics, as well as the hardwired interfaces with control signals and 542 communication protocols. HIL test is able to ensure high quality 543 of the control software. It is a reliable verification and validation 544 method to prototype the controller before implementing the 545 control algorithm into a real hardware environment [37]. 546

In this study, the shipboard power system plant model is successfully built and run on a real-time Speedgoat target machine, which provides real-time simulation of plant model behavior and dynamics as well as the communication interface with field-bus protocols. The power and energy optimization control algorithms are developed and downloaded to a B&R brand X20CP3586 programmable logic controller (PLC)-based

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Fig. 12. Simulation results for the dc-based shipboard power grid model for demo vessel. DG in-parallel mode. Frequency of the DG is 50 Hz. (a) Power split of the hybrid shipboard power plant model. (b) Dynamic behavior of fuel cell devices, batteries and DGs.



Fig. 13. HIL topology scheme.

embedded control system. The available real-time Fieldbus communication protocols between the plant model and controller are
Profinet and Profibus for this setup. In this study, the topology
diagram of the HIL test bed is shown in Fig. 13.

### 558 V. System Model Validation

In this study, the mathematical shipboard power system model and HIL plant are both validated against the full-scale hybrid power plant system. The actual power grid facilities are located 561 at ABB collaborated hybrid power laboratory in MARINTEK, 562 at Norwegian University of Science and Technology, in Trond-563 heim, Norway. The main objective of this experimental valida-564 tion test is to verify that the response of the modeled shipboard 565 power system matches with the actual system response. The 566 DGs and fuel cells with battery energy storage will be validated, 567 respectively, according to the actual lab setup. 568

The system configuration of the MARINTEK laboratory is 569 based on a full-scale hybrid AES with ABB onboard dc-grid 570 system. The lab arrangement diagram is shown in Fig. 14. The 571 lab is equipped with two 410-kW diesel engines and variable 572 speed generator sets, two 30-kW fuel cell devices, plus one 573 55-kWh battery ESS. Power sources are connected to the dc-bus, 574 and system loading conditions are simulated with two control-575 lable electric motors. Fig. 15 shows the equipment setup in 576 MARINTEK lab. 577

In the first validation test, one DG and one 55-kWh battery system are in use. The validation test results are shown in Fig. 16. The load profile is designed as four ramp-up cycles The dynamic response of a DG is limited by its mechanical characteristic, and so the battery banks are there to boost the system dynamic performance to achieve the load demands. In this test, the



Fig. 14. ABB MARINTEK lab setup diagram, where M1 & M2 are the propulsion motors, and Brake1 & 2 present the controllable thrusters load.



Fig. 15. ABB MARINTEK lab in Trondheim, Norway.



Fig. 16. Validation test I: To compare the system response between simulation model and HIL plant target in DG in-parallel mode.

simulated results from the Simulink model can match well with
the actual recorded test. The overall mean average percentage
error between the mathematical plant model and actual system
is around 0.51%, and the average error between HIL plant and
actual system is about 1.82%.

In the second validation test, two fuel cell modules and the 589 same battery system are configured. The test results are shown in 590 Fig. 17. During the first 100 s, the two fuel cells were powered up 591 with 9-kW output one after another. The power drawn from the 592 batteries was reduced with the increasing power supply from 593 the fuel cells. From the 120 s, the load demands are reduced 594 below the fuel cell power supply so that the batteries are charged 595 by the fuel cells. Between 100 to 480 s, the fuel cells provide 596 597 the constant power output, while the batteries absorb the load



Fig. 17. Validation test II: To compare the system response between simulation model and HIL plant target in Zero-emission mode.

variations. From the 480 s onward, the power references for fuel cells are altered so that the batteries provide the remaining power to the load. The mean average percentage error is about 1.98% between the mathematical model and the actual system, while it is about 1.47% between HIL plant and the actual system. 602

To compare the test results, it can be seen that the system 603 simulation and HIL results compare well with the experimental 604 values recorded from the site. In addition, the transient rise time 605 and steady-state power output for all DG, fuel cells, and battery 606 power sources for both mathematical model and HIL plant can be 607 in line with the actual system responses. Therefore, the proposed 608 hybrid shipboard power plant model can be used to represent the 609 physical system behavior. 610

#### VI. CONCLUSION 611

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In this article, adc-distributed hybrid shipboard power system 612 configuration has been studied. A system-level fuel cell-fed 613 hybrid shipboard power grid system with dc distribution has 614 been modeled. In addition, an HIL plant model platform has 615 been set up and tested in a lab environment. Finally, both 616 the system mathematical model and the HIL plant have been 617 validated against a full-scale hybrid shipboard power system. 618 This research work provides an essential platform and solid 619 foundation to apply optimization control of power and energy 620 management strategy in future work. 621

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Wenjie Chen (Student Member, IEEE) received the 746 B.Sc. degree in automation from Shanghai Maritime 747 University, Shanghai, China, in 2007, the M.Sc. de-748 grees in electrical engineering from Ecole Polytech-749 nique de l'Université de Nantes, France, in 2009. 750 She is currently working toward the Ph.D. degree 751 in optimization control for power system under the 752 supervision of Prof. K. Tai with Nanyang Technolog-753 ical University, Singapore, and Prof. T. Tjahjowidodo 754 with Katholieke Universiteit Leuven, Leuven, Bel-755 gium, since January 2019. 756 757

She firstly joined ABB China (Shanghai) in 2010, and then transferred to ABB Singapore in 2011. Currently, she is based in Singapore as a Research Specialist.



works.

Kang Tai received the B.Eng. degree in mechanical engineering from the National University of Singapore, Singapore, and the Ph.D. degree from Imperial College, London, U.K.

He is currently an Associate Professor with the 765 School of Mechanical and Aerospace Engineering, 766 Nanyang Technological University, Singapore. His 767 research interests include optimization, evolutionary 768 computation, mathematical/empirical modeling of industrial processes, and analysis of interdependencies, 770 risks and vulnerabilities in critical infrastructure net-771

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Michael Lau received the Ph.D. degree in mechanical engineering from Aston University, Aston, U.K. and the C.Eng. degree from Institution of Mechanical Engineers, London, U.K.

He was a Control and Instrument Engineer with Ministry of Defence, Singapore, and later with an oil and gas industry for about four years, before spending the next 35 years as an academician, first with Nanyang Technological University, Singapore, until 2010, and then with Newcastle University in Singapore (NUiS), Singapore till current. He is cur-

rently an Associate Professor with NUiS. His research interests include control, mechatronics system designs and energy systems.



Ricky R. Chan received the Ph.D. degree in electrical<br/>engineering from Purdue University, West Lafayette,<br/>IN, USA, in 2009.808<br/>809810

He is currently a Research and Development Manager with ABB Marine & Ports in Helsinki, Finland, where he leads a team of specialists in the development of advanced electric solutions for marine applications. 814 815 816



for Marine & Ports.



Alf Kåre Ådnanes received the M.Sc. and Ph.D.817degrees in electrical engineering from the Norwegian818University of Science and Technology, Trondheim,819Norway.820

He heads the regional division in AMEA of ABB821Marine & Ports. He joined ABB in 1991, and among<br/>previous positions with ABB, he has worked within<br/>corporate research, and various positions within Ma-<br/>rine, including delivery projects, engineering, and in<br/>product management and development, and technol-<br/>ogy management for the global marine business unit<br/>828821<br/>823829<br/>827828

**Tegoeh Tjahjowidodo** received the Ph.D. degree in mechanical engineering and automation from KU Leuven, Belgium in 2006.

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He is currently an Associate Professor with the Department of Mechanical Engineering, KU Leuven. From 2009 until 2019, he has been with the School of Mechanical & Aerospace Engineering, Nanyang Technological University, Singapore, as an Associate Professor. His research interests include nonlinear dynamics, modeling, identification and control, with more focus in monitoring for manufacturing.



Ahmed Abdelhakim (Senior Member, IEEE) was born in Egypt on April 1, 1990. He received the B.Sc. and the M.Sc. degrees (with hons.) in electrical engineering from Alexandria University, Alexandria, Egypt, in 2011 and 2013 respectively, and the Ph.D. degree from the University of Padova, Vicenza, Italy, in 2019. He is currently with ABB Research Sweden as a

Principal Scientist Scientist and R&D Project Manager. His research interests include power electronics converters and their applications for fuel cells and

energy storage systems, investigation of new power converter topologies, and application of wide-bandgap semiconductor devices (GaN/SiC) for high frequency and high-power density power converters.

Dr. Abdelhakim was the recipient of the classified excellent Ph.D. dissertation award from Societá Italiana di Electronica (SIE'19) among Italian Universities, in 2019. He serves as an Associate Editor for the IEEE TRANSACTION ON INDUSTRIAL ELECTRONICS and IEEE TRANSACTION ON TRANSPORTATION ELECTRIFICATION.

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