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Experimental and analytical study on heat generation characteristics of a lithium-ion power battery

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Abstract: In this article, a combined experimental and analytical study has been performed to 12 13 investigate the transient heat generation characteristics of the lithium-ion power battery. An experimental apparatus is newly built and the investigations on the charge/discharge 14 characteristics and temperature rise behavior are carried out at the ambient temperatures of 28 °C, 15 35 °C and 42 °C over the period of 1C, 2C, 3C and 4C rates. The thermal conductivity of a single 16 17 battery cell is measured, which is 5.22 W/($m \cdot K$). A new model of the heat generation rate based on the battery air cooling system is proposed by the lumped parameter approach. Comparison 18 between the simulated battery temperatures with experimental data is performed and good 19 agreement is achieved. The impacts of the ambient temperature and charge/discharge rates on the 20 heat generation rate are further analyzed. It is found that both ambient temperature and 21 charge/discharge rates have significant influences on the voltage change and temperature rise as 22 well as heat generation rate. During charge/discharge, the larger the current rate, the larger the 23 heat generation rate. The effect of the ambient temperature on the heat generation shows an 24 25 obvious difference with different state of charge.

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Keywords: Lithium-ion battery; heat generation model; heat generation rate; temperature rise;thermal management system

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Nomenclature 30 В time constant, s 31 Biot number 32 Bi specific heat capacity, $J/(kg \cdot K)$ 33 С open-circuit potential, V 34 Ε convective heat transfer coefficient, $W/(m^2 \cdot K)$ 35 h Ι current, A 36 characteristic length, m l 37 heat generation rate of battery, W 38 qrate of heat generated or consumed, J Q 39 R thermal resistance, K/W 40 temperature, K Т 41 t time, s 42 terminal voltage, V 43 Uvolume, m³ V44 coordinate direction vector 45 *x*, *y*, *z* ΔT Temperature rise, K 46 47 Greek symbols 48 λ Thermal conductivity, $W/(m \cdot K)$ 49 Density, kg/m³ 50 ρ time step, s 51 τ 52 **Subscripts** 53 amb ambient 54 55 h convection heat transfer 56 J Joule heat maximum 57 max time 58 t volume 59 v

60	Acronyms	
61	DC	direct current
62	DOD	depth of discharge
63	EV	electric vehicle
64	HEV	hybrid electric vehicle
65	ITMS	integrate thermal management system
66	TMS	thermal management system
67	TPS	transient plane source
68	SOC	state of charge

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70 **1. Introduction**

Among the electrochemical energy storage systems, lithium-ion batteries, as a promising 71 candidate, have attracted considerable attention in many power demand applications due to their 72 73 advantages of large specific energy, high power density, charge/discharge cycle stability and long cycle lifetime [1, 2]. With rapid development of the electric vehicles (EVs) and hybrid electric 74 vehicles (HEVs), lithium-ion batteries have been widely used in recent years [3]. However, a 75 large amount of heat will be generated because of the electrochemical reactions and physical 76 77 changes inside the batteries, potentially bringing out capacity fade and thermal runaway [4]. Therefore, it is crucial to have insight into the heat generation characteristics for maintaining 78 safety and performance of the battery. 79

Many researches on the safety issues of the battery are finally ascribed to the heat generation and heat dissipation at each level of the battery system [5, 6]. In order to keep the battery within a reasonable temperature, an efficient thermal management system (TMS) will be needed to dissipate the heat generated. Furthermore, the heat generation rate is a necessary prerequisite for an efficient TMS design [7, 8]. Therefore, it is imperative to understand the mechanism of the battery heat generation characteristics and its effect on the battery performance.

A number of researchers have been devoted to dealing with the thermal models to determine the temperature distributions of the battery cell over the past three decades. Bernardi et al. [9] firstly developed a general thermal model on the basis of the energy balance for the battery systems. They considered that the cell temperature resulted from the interaction of the Joule heat,

heat of mixing, phase-change heat and electrochemical reaction heat with component-dependent 90 open-circuit potentials. The heat generation rate could be calculated as the temperature was 91 assumed to be uniform throughout and varied with time. Afterwards, Rao and Newman [10] 92 presented a simplified thermal model to determine the rate of the heat generation for insertion 93 battery systems. In their study, the effects of the mixing heat and phase-change heat were 94 95 neglected. Utilizing the thermal model proposed by Bernardi et al [9], the battery thermal behavior was studied by Dong and Baek [11]. It was found that the irreversible Joule heat 96 dominated under high-rate discharge conditions, but the reversible entropic heat from 97 electrochemical reactions account for the main part under low-rate discharge conditions. Forgez 98 99 et al. [12] developed a lumped parameter thermal model of a cylindrical lithium-ion battery considering the heat generated from resistive dissipation and the reversible entropic heat as the 100 heat generation of the battery. And the internal and external resistances of the battery were 101 calculated by a steady state method. For the heat generation, Sato [13] and Lai et al. [14] 102 103 considered three different heat, which were electrochemical reaction heat, polarization heat and 104 Joule heat. The level of the heat generated was a result of the attribution from each heat. They also investigated the variation of the irreversible and reversible heat production as a function of 105 the depth of discharge (DOD) [14]. For a prismatic lithium-ion battery cell, Greco et al. [13] 106 107 developed a simplified one-dimensional transient thermal network model using thermal circuit method linked with the thermal model of the heat pipe. In order to validate the model, they also 108 presented a special one-dimensional analytical model and a three-dimensional simulation model. 109 The heat generation rate in a battery cell was determined by adopting the model shown in Ref. 110 [14]. The results showed that the thermal network model was sufficient to predict the battery 111 temperature distribution. Combining an analytical solution of the lumped capacitance model and 112 thermography, Bazinski and Wang [15] calculated the rate of the heat generated inside a pouch 113 lithium-ion battery under different rates. The internal uniform heat generation was assumed and 114 115 expressed by a simple third order polynomial. However, some profile shapes of the heat would 116 defy being accurately modeled by a polynomial in despite of its order. Yildiz et al. [15] proposed a thermal model for a pouch lithium-ion battery only accounting for the irreversible Joule heat. 117 The battery temperature rises calculated by the model demonstrated an identical behavior with 118 experimental results. A simplified model of heat generation can be used to calculate the rate in 119

constant current discharge process. Birgersson et al. [16] developed a two-dimensional transient 120 mathematical model and studied the heat generation characteristics of 18650 cylinder lithium-ion 121 battery pack. It was reported that in normal discharge process the ohmic heat dominated at 122 low-rate discharge but the reversible electrochemical heat dominated at high-rate discharge. Lin 123 et al. [17] formulated a coupled electro-thermal model for cylindrical battery. The electrical 124 125 model calculated the battery state of the charge (SOC) and voltage. The heat generation was determined by the difference between the terminal voltage and open circuit voltage, along with 126 the current. A two-state model was used to capture the lumped thermal dynamics of the battery. 127 Among these above thermal models, accurately determining the heat generation of the battery 128 129 was crucial for accurate prediction of the temperature distribution.

In the aspect of studies on the heat generation rate, a comprehensive review was perfectly 130 performed by Bandhauer et al. [18]. In the literature, there are mainly three methods to determine 131 the rate of the heat generation, which are directly experimental measurement, prediction using 132 133 Bernardi model and relevant experimental data, as well as prediction using electro-thermal model. Some existing experimental measurements mainly focus on the heat generation by 134 accelerated-rate calorimetry and isothermal heat conduction calorimetry [18-21], or by 135 measuring the overpotential and entropic heat coefficient [22]. Hallaj et al. [18] studied the heat 136 137 generation characteristics of the commercial lithium-ion battery according to electrochemical calorimeter. The internal resistance and entropic change coefficient at different depth of 138 discharges (DODs) were measured. The results showed that there was obvious endothermic 139 phenomenon during the charge, owing to entropic heat more than Joule heat. However, the heat 140 generation rate was always positive in the discharge process. Balasundaram et al. [20] measured 141 the total heat generation of 18650 cell under different charge and discharge rates conditions by 142 accelerated-rate calorimetry. For the irreversible heat generation, the intermittent pulse technique 143 was used and the reversible heat generation was obtained from the determination of the entropic 144 145 coefficient at different SOC and DOD. They found that the reversible heat was primary at lower 146 current rates, which should be taken into account as building thermal model. Saito [21] carried out an experimental study on the thermal behaviors of the lithium-ion batteries during high-rate 147 pulse cycling and measured the rate of heat generation using calorimeter method. It was found 148 that the additional heat in high-rate pulse discharge process usually resulted from side reaction, 149

which changed the surface characteristics of the electrode and increased the impedance. Yasir et 150 al. [19] experimentally investigated the heat generation in high power prismatic lithium-ion 151 battery cell. The heat generation rate was calculated by measuring the overpotential resistances 152 with four different methods and entropic heat generated in the cell. Calorimeter tests were also 153 carried out to compare the calculated and measured heat generation. Bandhauer et al. [23] 154 155 measured the temperature-dependent electrochemical heat generation for a commercial lithium-ion battery. It was found that the total heat generation was a strong function of 156 temperature, current and DOD. The heat rate increased as the rate increased and the temperature 157 decreased simultaneously. The entropic heating in the dynamic simulation was significant, 158 especially in a charge depletion dynamic profile. Damay et al. [22] proposed thermal and heat 159 generation models for large prismatic lithium-ion cell. The model parameters were 160 experimentally determined and the irreversible Joule heat was measured by galvanostatic 161 intermittent titration technique. The reversible electrochemical reaction heat was obtained 162 through measuring the entropic coefficient. Panchal et al. [24] presented a method of measuring 163 heat generation rate based on the battery temperature and heat flux. The discharge rate was 1C, 164 2C, 3C and 4C and the ambient temperature was 5 °C, 15 °C, 25 °C and 35 °C, respectively. The 165 results showed that the heat generation rate increased as the discharge rates increased. The 166 167 variations of the ambient temperature and increase in discharge rate have a great impact on the discharge capacity. In addition, they [25] also developed a mathematical model to calculate the 168 transient temperature distributions for a large sized prismatic lithium-ion battery under different 169 current rates conditions. Infrared radiation images of the battery cooled by ambient air were 170 taken at 1C, 2C, 3C and 4C discharge rates. It was found that the increased current rates caused 171 the battery surface temperatures increasing. 172

In thermal models, heat generation of the battery is usually considered as the sum of reversible and irreversible heat [10-12, 16, 23-27]. The related equation presented by Bernardi et al. [9] is mainly used to calculate the heat generation. The temperature rise of the battery is generally a transient behavior. To get the transient heat generation rate over the charge and discharge period will be very helpful for addressing the battery temperature rise behavior of each thermal management strategy. Despite numerous researches on thermal modeling have been carried out, to the best of author's knowledge, relatively few papers have dealt with the transient heat generation characteristics of the battery and the effects of such as ambient temperature, charge and discharge rates. Therefore, the current work was motivated by the requirement to develop a reliable and possibly simple approach to determine the transient rate of the heat generation for large pouch battery cell. Another main contribution could be to investigate the transient heat generation characteristics of the battery under high charge/discharge rate and wide temperature range conditions and the effects of different control factors such as ambient temperature, charge and discharge rates.

In this article, the heat generation characteristics of the lithium-ion power battery will be 187 investigated from both experimental and theoretical aspects. First, an experimental apparatus of 188 189 battery heat generation characteristics will be setup and the heat generation characteristics will be explored in detail. Second, both models of heat generation and heat dissipation are described 190 in terms of air cooling system and the expression for estimating the transient heat generation rate 191 is developed based on the energy balance and corresponding temperature data measured. Finally, 192 193 the impacts of the ambient temperature and charge/discharge rate on the battery charge/discharge 194 characteristics, temperature rise behavior and heat generation rate are discussed.

195 2. Experimental setup

A new experimental apparatus was set up at Human-Machine and Environmental Engineering
Laboratory at Beihang University, China to study the heat generation characteristics of the power
battery.

199 *2.1 Battery thermal conductivity test device*

Hot Disk Analyzer (TPS 1500) based on transient plane source (TPS) method was used to measure the thermal conductivity of the battery cell. The principle of the TPS method was to add the heat interference to the heat balance sample, and then recorded the temperature response of the sample to the heat interference [28]. Moreover, thermal property parameter values could be determined according to the transient temperature response of an infinite medium during step heating. Fig. 1 shows the test device including a constant current power supply, voltage test unit, Wheatstone bridge and the Hot Disk probe (model 4922).



207 208 Probe and sample holder

Fig. 1. Thermal conductivity of the battery test device.

In the current study, as the thickness of a single battery cell was 6.1 mm, four cells were stacked to meet the requirement of the sample size. The probe was placed in the middle of the cells to form a sandwich structure. In order to reduce the thermal contact resistance, the samples were compressed tightly. A seal cover was used to cover the samples to avoid the impact of the surroundings. The heating power was 0.5 W with 20 s heating duration at the room temperature of 24.0 °C. Repeat measurements were carried out and the arithmetic average value of the thermal conductivity was adopted.

216 2.2 Heat generation characteristics experimental apparatus

The schematic of the experimental apparatus and the sample of the battery cells are shown in 217 Fig. 2. The system mainly consists of the charge and discharge subsystem, the thermal 218 performance test subsystem and the data acquisition subsystem. In the thermal performance test 219 subsystem, the thermostatic chamber (QGT302P) with the temperature ± 0.5 °C was utilized to 220 simulate different ambient temperatures. Three different chamber temperatures of 28 °C, 35 °C 221 and 42 °C were selected in the experiment. The battery cells arranged inside the porous structure 222 223 frame were vertically placed in the thermostatic chamber and could be preheated prior to the 224 formal test. The data acquisition subsystem mainly included an Agilent 34970A, platinum temperature sensors (PT100, ±0.06 °C at 0 °C) and a computer. Two PT100 probes were affixed 225 on the surface of the cell and the temperatures were recorded every second by the Agilent 226 34970A. The arithmetic average of both PT100 was considered as the cell surface temperature. 227

The charge and discharge of the battery at rates of 1C/10A, 2C/20A, 3C/30A and 4C/40A were accomplished by the charge and discharge subsystem. During the charge period, the battery was first charged at constant current (1C, 2C, 3C and 4C) to a voltage of 2.8 V. Thereafter, the voltage was kept at 2.8 V and taper-charged to 0.05 A. While during the discharge period, the battery was discharged at constant (1C, 2C, 3C and 4C) to a voltage of 1.5 V. The basic parameters of the commercial battery cell properties are listed in Table 1.





234 235

(a) Schematic of the experimental apparatus





238

(b) The sample of battery cells



Specifications	Value (unit)	
Туре	Lithium-ion titanate battery	
Dimensions	0.0061 m×0.203 m×0. 127 m	
Nominal voltage	2.3 V	
Nominal capacity	10 A h	
Recommended operation temperature	-10 ~ +45 °C (charge)	
	$-25 \sim +55$ °C (discharge)	

Table 1 Parameters of commercial battery cell.

The testing procedure was as the following. The given ambient temperature was firstly simulated by the thermal performance test subsystem. After the steady state in the thermostatic chamber reached, the charge and discharge tests were carried out. Simultaneously, the data of temperatures, currents and voltages were collected and recorded by the data acquisition subsystem.

245 **3. Thermal model**

257

246 *3.1. Heat generation model*

The characteristics of the battery heat generated arise from the integrated effect of the internal 247 complex electrochemical reactions and the electrical-heat transformation. During the normal 248 operation of the battery, the total heat generation rate is mainly composed of reversible heat from 249 electrochemical reactions, irreversible Joule heat, heat from side reactions and heat of mixing [5, 250 29, 30]. As is always the case, for the high power battery under consideration in the current work, 251 252 the heat from side reactions and heat of mixing are small enough to be ignored [12, 23]. The temperature and SOC of the battery are assumed on only spatial variation. According to the 253 thermal model presented by Bernardi et al. [9], the simplified heat generation model inside the 254 battery can be described as follows: 255

256
$$q = I^2 R(I, \text{SOC}) - IT \frac{\partial E(\text{SOC})}{\partial T}$$
(1)

$$q_{\rm J} = I^2 R(I, {\rm SOC}) = I(E({\rm SOC}) - U(I, t))$$
⁽²⁾

where q is the heat generation rate, I is the charge or discharge current, which is negative in charge process and positive in discharge process, R is the direct current (DC) resistance in the battery, T is the battery temperature, E is the open-circuit potential, U is the terminal voltage, q_I is the irreversible Joule heat, SOC is the state of charge, $TT \frac{\partial E}{\partial T}$ is the reversible electrochemical reactions heat. According to Eq. (1), the battery heat generation rate is the function of the ambient temperature, charge/discharge rates and DC resistance.

The irreversible Joule heat is dependent on the battery DC resistance which is not a constant. The DC resistance primarily comprises ohmic and polarization resistance [31]. The former obeying ohm's law is dependent on the material property and geometry structure of the battery but has no relationship with the SOC. The latter is caused by the polarization between the positive and negative electrode during the electrochemical reactions in the battery. Its value is dependent on the SOC and increases with the increase of the current density.

270 In general, during the period of high charge/discharge rates, the irreversible Joule heat dominates among the total heat generation and the reversible heat is small compared to the Joule 271 heat [16]. Therefore, the reversible heat is often negligible and the irreversible Joule heat is 272 considered as the heat generation rate. Obviously, such treatment will lead to the deviation from 273 the actual value. Moreover, in order to obtain the terminal voltage variations at transient 274 conditions as measuring the DC resistance, the data in a reasonable time interval should be 275 selected in accordance with experience. The selection of time interval also results in errors. As a 276 consequence, this method is not accurate as well [32]. 277

278 *3.2. Heat dissipation model*

For the rate of heat generated in a battery, one of them is stored in the battery, also known as 279 sensible heat. The primary heat is removed to the TMS through three kinds of well-known heat 280 281 transfer mechanisms: conduction, convection and radiation. Generally, the operating temperature 282 of most of the batteries is less than 60 °C under normal operation. Therefore, the amount of the heat radiation was small that can be ignored [33-35]. The heat dissipation of the battery is 283 dependent on the type of the TMS. For example, in the TMS based on the liquid cooling, the heat 284 of the battery is first conducted to the heat exchange unit and then transferred to the working 285 286 fluid by convection. In the TMS, based on the heat pipes or phase change materials, the heat was removed to the working medium by conduction. However, the heat generation rate in the battery 287 is independent of heat emission mode provided by the TMS. 288

In this study, an air cooling TMS is selected to build the heat dissipation mode, in which the convection is primary. Thus, according to the energy balance, the total heat generation rate can 291 be expressed as follows:

292

$$\rho c V \left(T_{t} - T_{0}\right) = -\int \frac{T_{t} - T_{amb}}{R_{h}} + \Phi$$
(3)

where ρ is the density of the battery, *c* is the specific heat of the battery, *V* is the volume of the battery, T_t and T_0 are the battery temperature at the time of 0 and t, Φ is the total heat generation, R_h is the convective thermal resistance, T_{amb} is the ambient temperature.

296 *3.3. Determination of heat generation rate*

When taking the heat transfer inside the battery into consideration only, based on the assumptions of the uniform material, isotropic thermal properties as well as the specific heat and thermal conductivity independent of temperature, the governing thermal equation describing the battery conduction may be written:

301
$$\rho c \frac{\partial T}{\partial t} = \lambda \left(\frac{\partial}{\partial t} \left(\frac{\partial T}{\partial x} \right) + \frac{\partial}{\partial t} \left(\frac{\partial T}{\partial y} \right) + \frac{\partial}{\partial t} \left(\frac{\partial T}{\partial z} \right) \right) + q_v \tag{4}$$

where q_v is the heat generation rate per unit cell volume, λ is the thermal conductivity of the battery cell, *t* is the time.

Under above assumptions, the battery cell will have a uniform internal temperature at a fixed time and can be considered as a mass point. Therefore, the lumped parameter method is efficient for solving the transient heat transfer problem of the battery [12]. In addition, the charging and discharging duration can be separated into many small time steps. If the time step size is small enough, the heat generation rate can be considered constant during this period. In the current work, the time step equals the data acquisition interval. For the air cooling TMS, the energy balance equation with its analytic solution can be described as follows:

311
$$\rho c V \frac{\partial T}{\partial t} = q_t - \frac{T_t - T_{amb}}{R_h}, \quad t \le \tau$$
(5)

312

$$t=0, T=T_0$$
 (6)

313
$$\frac{q_{t}R_{h} - (T - T_{amb})}{q_{t}R_{h} - (T_{0} - T_{amb})} = \exp\left(-\frac{1}{\rho c V R_{h}}t\right) = \exp\left(-\frac{1}{B}t\right)$$
(7)

where τ is the time step, *B* is the time constant that represents the response speed of the temperature variation of the battery, $B = \rho c V R_h$. When the rate of the heat generated is equal to 0, it can be calculated by the following equations:

317
$$\frac{T - T_{\text{amb}}}{T_0 - T_{\text{amb}}} = \exp\left(-\frac{1}{B}t\right)$$
(8)

318
$$B = t / \ln \left(\frac{T_0 - T_{\text{amb}}}{T - T_{\text{amb}}} \right)$$

(9)

For the calculation of the convective thermal resistance, the steady state method is usually used. In other words, through measuring the surface temperature of heat source, ambient temperature and heating power at steady state, the convective thermal resistance can be obtained by Eq. (10):

323
$$R_{\rm h} = \frac{T_{\rm max} - T_{\rm amb}}{Q} \tag{10}$$

where Q is the heating power and T_{max} is the surface temperature of heat source at steady state.

The Biot number (*Bi*) is a dimensionless quantity, $Bi=hl/\lambda$, which denotes the ratio of the internal heat transfer resistance to the external heat transfer resistance for a body. For the lithium-ion battery, the internal heat transfer resistance is determined by its thermal conductivity. The convection thermal resistance is dependent on the convective heat transfer coefficient. As *Bi*<0.1, the temperature inside the battery is approximately uniform and is only dependent on the time. Therefore, the heat generation rate can be calculated by Eq. (11):

331
$$q = \frac{1}{R_{\rm h}} \left(\frac{T - T_0}{1 - \exp\left(-\frac{t}{B}\right)} + T_0 - T_{\rm amb} \right)$$
(11)

When the battery initial temperature, ambient temperature, the battery temperature, convective thermal resistance and physical properties of the battery are all known, the heat generation rate are also known under different SOC conditions.

Based on the battery thermal conductivity test device, the measured value of the thermal conductivity is 5.22 W/(m•K). Utilizing the relevant experimental data presented in the literature [36], the steady state temperatures of the heat source at different heating power are obtained under the natural and forced convection cooling conditions. For the forced convection cooling, the air flow rate is 18 m³/h. The ambient temperature is set as 20 °C. According to Eq. (10), the average values of the convective resistance (R_h) can be achieved, which are 13.87 K/W and 2.03 K/W under the natural and forced convection cooling conditions, respectively. Consequently, *Bi* 342 can be calculated assuming that the thermal properties of the cooling air are constant in the 343 temperature range from 20 °C to 55 °C. For the natural convection cooling, Bi equals 0.0043, 344 while for the forced convection cooling, Bi is equal to 0.0271. This indicates that the internal 345 heat transfer resistance of the battery can be negligible. In addition, according to the temperature 346 drop of the battery shown in Fig. 3, the time constant can thus be calculated in terms of Eq. (9), 347 which is approximate 6944.44 s under the natural convection at 28 °C and is approximate 348 1052.63 s, 1075.27 s, 1030.93 s under the forced convection with air flow rate of 18 m³/h at 28 349 °C, 35 °C, 42 °C, respectively.







Fig. 3. Temperature drop of the battery under the natural and forced convection.

As a consequence, the calculating equations of the transient heat generation rate under the natural convection cooling and forced convection cooling at 35 °C are expressed as Eq. (12) and Eq. (13), respectively.

355
$$q = 0.072 \left(\frac{T - T_0}{1 - \exp(-0.000144t)} + T_0 - T_{\text{amb}} \right)$$
(12)

356
$$q = 0.493 \left(\frac{T - T_0}{1 - \exp(-0.00093t)} + T_0 - T_{\text{amb}} \right)$$
(13)

357 Fig. 4 presents the calculated value of the heat generation rate in the 4C discharge process at 358 ambient temperature of 35 °C under natural convection and forced convection with air flow rate 359 of 18 m³/h. As can be seen from Fig. 4, both curves show a nearly same trend of change, which 360 indicates that the cooling way has little influence on the heat generation rate of the battery. The 361 deviation from each other during the period of 600 s to 800 s may be caused by the difference of 362 the battery temperature between under natural convection and forced convection. The same 363 conclusion can be obtained by Eq. (1), that is, the heat generation rate is only dependent on the 364 battery temperature, DC resistance and charge/discharge rates.





Fig. 4. Comparison of heat generation rate under the natural and forced convection.

367 3.4 Model validation

For the purpose of validating the model, an integrated thermal management system (ITMS) with paraffin phase change material and air cooling is designed for the lithium-ion battery. Experimental and simulating investigations on the performance of the ITMS are carried out. The details of the ITMS of the battery can be referred to the literature [36]. Furthermore, the simulation model of the battery with the ITMS is set up and the temperature of the battery is simulated based on the commercial FLUENT software. Fig. 5 shows the comparison between the simulated and experimental battery temperatures for the case of 4C charge/discharge processes under ambient temperature of 35 °C condition. As shown in Fig. 5, it can be clearly seen that the battery temperatures simulated is in good agreement with those measured. The maximum error is 2.1% in charge process and is 1.3% in discharge process. The results demonstrate that the heat generation rate model is robust and accuracy.



- 380
- 381 382

Fig. 5. Comparison of simulated and experimental battery temperatures at 4C charge/discharge rate and ambient temperature of 35 °C.

383 **4. Results and discussion**

According to Eq. (1), the ambient temperature and charge/discharge rate have significant effect on the heat generation rate, the charge/discharge characteristics and temperature rise behavior of single cell. Therefore, in this section, the impact on the charge/discharge characteristics is analyzed firstly. Then the impact on the temperature rise of a single cell and the heat generation rate are discussed in detail.

- 389 4.1. Impact on battery charge/discharge characteristics
- Fig. 6 depicts the terminal voltage profiles of the battery under the discharge rates of 2C, 3C

and 4C at ambient temperature of 28 °C as well as at ambient temperatures of 28 °C, 35 °C and 42 °C during 2C discharge. As can be seen from Fig. 6, the higher the discharge rate, the larger the descent rate of the terminal voltage of the battery. As the ambient temperature is higher, the descent rate of the terminal voltage is smaller, but the discharge time is longer.

In Fig. 6(a), the battery terminal voltage decreases with the increase of DOD. As DOD exceeds 0.9, the terminal voltage drops rapidly. The irreversible Joule heat is proportional to the descent rate of the terminal voltage and discharge rate in terms of Eqs. (1) and (2). Therefore, a larger amount of heat is generated in the battery under high-rate discharge conditions. Moreover, the battery temperature is larger in the discharge process when the ambient temperature is higher.



(a) Under 2C, 3C and 4C discharge rates at 28 °C

400 401



- 402
- 403

(b) Under 28 °C, 35 °C and 42 °C at 2C discharge rate

Fig. 6. Terminal voltage profiles under 2C, 3C and 4C discharge rates as well as 28 °C, 35 °C and
405 42 °C ambient temperature.

As shown in Fig. 6(b), it can be found that the terminal voltage has no obvious change under 406 407 different ambient temperature for 2C discharge rate when the discharge time is less than 1000 s. The main reason could be that there is a very small difference among the battery temperatures 408 under 28 °C, 35 °C, and 42 °C conditions during these periods. As the discharge time is more than 409 1000 s, the effect of the ambient temperature on the discharge characteristics starts to be 410 411 remarkable. What's more, the discharge time is longer when the ambient temperature is higher. It could be explained by the fact that the electrochemical reactions are improved by the higher 412 battery temperature. At the same time, the DC resistance decreases and this further decreases the 413 electrical loss. As a consequence, the heat generation rate is small as the ambient temperature is 414 high. 415

In addition, it is worth noting that there are similar behaviors under 2C charge rate with those under 2C discharge rate, that is, the higher the charge rate, the larger the ascent rate of the terminal voltage of the battery. As the ambient temperature is higher, the ascent rate of the terminal voltage is smaller, but the time for charging is longer.

420 *4.2. Impact on battery temperature rise behavior*

Considering the temperature rise behavior of the single cell is due to its heat generation, the 421 experimental investigations on the temperature rise behavior are carried out under the room 422 temperature of 24.1 °C during the period of 1C, 2C, 3C and 4C charge/discharge, as shown in 423 Fig. 7. It can be seen from Fig. 7 that the curves of the temperature rise demonstrate obvious 424 425 differences between the charge process and discharge process. As is expected, two peaks are observed for temperature rise curves during the period of low-rates charge (1C and 2C). It is also 426 noted that the temperature rise in the charge process is less than that in the discharge process. As 427 428 a consequence, the charge/discharge rates have remarkable influences on the temperature rise of 429 the battery cell. Moreover, it should be stress here that the temperature rise infers the battery 430 temperature beyond the ambient temperature.

In Fig. 7(a), the slopes of the curves of the battery temperature rise are significantly different from each other under different discharge rates conditions. If the initial temperatures are same, the higher the discharge rate after the battery begins to discharge, the higher the rate of the temperature rise, which indicates that the heat generation rate increases along with the increase of the discharge rate. During the period of 1C, 2C 3C and 4C discharge, the maximum values of the temperature rise are 7.3 °C, 9.6 °C, 13.0 °C and 15.5 °C, respectively.

Compared with the results shown in Fig. 7(a), the rates of the temperature rise in Fig. 7(b) are obviously lower than those corresponding values under the same charge/discharge rate conditions. The maximum temperature rises in the processes of 1C, 2C, 3C and 4C charge rates are 2.7 °C, 4.1 °C, 6.8 °C and 9.4 °C, respectively. This indicates that the heat generation rate for the charge process is much lower than that in the discharge process. Furthermore, during the period of the charge there are obvious fluctuations for the curves of the temperature rise, especially at low charge rates.



Fig. 7. Temperature rise profiles during 1C, 2C, 3C and 4C discharge/charge rates at 24.1 °C.
In the early stage of the charge, the battery is heated up quickly because the battery
temperature and ambient temperature are close and the convective heat dissipation is small. In

the middle stage of the charge, the battery temperature is significantly reduced during 1C and 2C charge rates, because the heat generation rate of the battery is less than the heat dissipation rate. While in 3C and 4C charge processes, the battery heat generating rate is close to dissipation rate, resulting in a non-obvious temperature increase. At the end stage of the charge, the battery DC resistance increases under the large SOC conditions, leading to an increase in the irreversible Joule heat. Therefore, the battery temperature rises again.

For the influence of ambient temperature on the temperature rise of the single cell, Table 2 457 illustrates the maximum temperature rises at the ambient temperatures of 28 °C, 35 °C, 42 °C in 458 the 2C, 3C and 4C discharge processes, respectively. As can be seen clearly from Table 2, at a 459 fixed ambient temperature, the larger the discharge rate, the larger the maximum temperature rise 460 of the battery. Moreover, for a fixed discharge rate, the higher the ambient temperature, the 461 lower the maximum temperature rise of the battery. The primary reason for this result is the 462 difference of the battery temperature under different ambient temperature conditions. 463 464 Consequently, the ambient temperature has a remarkable impact on the heat generation rate, which decreases with increased ambient temperature. For the 4C discharge process, the 465 maximum temperature rise of the battery is approximate 16.5 °C at the ambient temperature of 466 28 °C and around 12.7 °C at the ambient temperature of 42 °C. 467

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468 Table 2 Maximum temperature rise under different ambient temperatures and discharge rates

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_	Ambient temperature (°C)	28	35	42
_	ΔT_{max} at 2C discharge rate	11.3	10.2	9.8
	$\Delta T_{\rm max}$ at 3C discharge rate	13.6	12.8	11.7
	ΔT_{max} at 4C discharge rate	16.5	13.3	12.7

conditions.

470 *4.3. Impact of charge/discharge rate on heat generation rate*

Fig. 8 depicts the profiles of the heat generation rate under the ambient temperature of 35 °C and the charge/discharge rates of 2C, 3C and 4C. It can be found that there is a great difference for the heat generation rate in the 2C, 3C and 4C charge/discharge processes. A greater charge/discharge rate gives rise to a greater heat generation rate, which matches the analytic results in Section 4.1 and Eq. (1).







can be divided into five different stages. When DOD is equal to 0.05, 0.55 and 1.0, respectively, 482 the heat generation experiences three obvious peaks. When the discharge process begins, the heat 483 generation rate increases rapidly, and it reaches a peak value at DOD=0.05. Meanwhile the peak 484 rates for the 4C, 3C and 2C discharge are 9.3 W, 5.8 W and 3.4 W, respectively. When 485 0.05<DOD<0.55, the heat generation rate slightly decreases at first, then gradually increases and 486 487 reaches the second peak at DOD=0.55. At this time, the peak rates are 13.1W, 8.7W and 5.4W during the 4C, 3C and 2C discharge, respectively. As DOD ranges from 0.6 to 0.9, the heat 488 generation rate gradually decreases. When the discharge process is nearly completed (DOD>0.9), 489 490 the heat generation rate rises sharply, and reaches the maximum at the end of the discharge 491 process. The maximum rates during the 4C, 3C and 2C discharge are 18.9 W, 15.0 W and 10.1 W, respectively. Consequently, the sharp increase of heat generation rate easily caused the battery 492 beyond its allowable temperature potentially. Thus the overdischarge (DOD>0.9) should be 493 avoided in the actual applications. 494

As can be seen from Fig. 8(b), there is an obvious distinction for the heat generation rate in the charge process in comparison with that in the discharge process. Under different charge/discharge rates, the battery heat generated exhibits a M-shaped curve in general. The average heat generation rate for charge process is lower than that for discharge process under the same current rate conditions. When SOC= 0.05 and SOC= 0.9, the battery has two obvious peak rates, and they are close to each other. When SOC is between 0.05 and 0.3, the heat generation rate change in the charge process is relatively small.

When SOC = 0.55, the heat generation curve has obvious valley. At this moment, the minimum 502 heat generation rate for the 4C, 3C, and 2C charge rates are 0.1 W, -0.9 W, and -1.6 W, 503 respectively. The heat generation rate includes irreversible Joule heat and reversible reaction heat. 504 The irreversible Joule heat depends on the charge rate and the DC resistance, which is constantly 505 positive, whereas the reaction heat during charge process is constantly negative. The heat 506 507 generation rate appears as negative for charge process of 2C and 3C, indicating that at this stage 508 the heat absorption of electrochemical reaction is greater than irreversible Joule heat. However, the heat generation rate for 4C rate is not negative, indicating that the greater charge rate can lead 509 to a larger proportion of irreversible Joule heat in total heat generated. When SOC is greater than 510 0.9, the heat generation rate is rapidly reduced, mainly due to the conversion from constant 511

current charging to constant voltage charging, resulting in the battery charge current rapidlyreduced.

514 In addition, the variation curves of the heat generation rate in the charge/discharge processes are basically consistent with the trend of the battery temperature change shown in Fig. 7. As the 515 charge/discharge rates are large, the slope of the temperature rise curve is large and the rate of 516 517 the temperature rise is high. For the cases of 1C and 2C discharge processes, the temperature rise is very small during the initial period due to the small heat generation rate, as shown in Fig. 7(a) 518 and Fig. 8(a). Along with the increase of the discharge time, the increasing heat generation rate 519 520 leads to a larger temperature rise. For the 3C and 4C discharge processes, the temperature rise is 521 obviously larger due to the higher heat generation rate. However, for the case of charge process, 522 the rapid increase of the heat generation rate can result in the larger temperature rise in the initial period of the charge compared with the discharge process, as shown in Fig. 7(b) and Fig. 8(b). 523 During the middle stage, the notable decrease of the heat generation rate could result in the 524 525 temperature rise obviously changing, especially at 1C and 2C charge rates.

526 *4.4. Impact of ambient temperature on heat generation rate*

The impact of the ambient temperature on the heat generation rate is mainly reflected in three 527 aspects, i.e. in addition to the battery temperature and DC resistance, the heat generated by 528 529 electrochemical reactions in the battery during the period of charge/discharge. In order to evaluate the heat generation rate under different ambient temperatures, the heat generation rates 530 are calculated in terms of Eq. (12) for 3C charge/discharge processes and ambient temperature of 531 28 °C, 35 °C and 42 °C, as shown in Fig. 9. It can be seen clearly that the curves of the heat 532 generated show the same change trend for the charge or discharge process under different 533 ambient temperatures. The average heat generation rate in the 3C charge process is smaller than 534 that in 3C discharge process. 535

For the 3C discharge process, as shown in Fig. 9(a), as the DOD is less than 0.65, the change of the heat generation rate under different ambient temperatures show a nearly same trend and a very small difference of the heat generated is presented. The heat generated at 28 °C is slightly larger than that at 35 °C and 42 °C. Conversely, when the DOD is more than 0.65, the heat generation rate presents an obvious distinction from each other. Moreover, the heat generation rate decreases as the ambient temperature increases. The results are consistent with the battery temperature rise shown in Table 2. In addition, the curves of the heat generation rate also show
three peaks under different ambient temperatures. It is at the nearly same DOD that the peak
appears for every ambient temperature.

For the 3C charge process, it can be concluded from Fig. 9(b) that the higher the ambient 545 temperature, the smaller the battery heat generation rate. Under different ambient temperatures 546 conditions the battery heat generated exhibits generally a M-shaped curve. During the initial 547 period of charging, the heat generation rate sharply increases and reaches a peak value. At the 548 intermediate states of the charge, the heat generated has a great depression and the minimal value 549 of -3 W reached as SOC is approximate 0.53. It is approximately at SOC=0.9 that a peak power 550 551 reaches again. Furthermore, under different ambient temperatures, the difference in heat generation rate mainly appears near the peak and valley regions, while in the SOC intervals of 552 0.2 to 0.4 and 0.6 to 0.8, the heat generation rate only appears a small difference. 553



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Fig. 9. Comparison of heat generation rate at 3C discharge/charge under different ambient temperatures.

560 **5. Conclusions**

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561 In this study, the transient heat generation characteristics of the lithium-ion power battery are investigated experimentally and analytically. The lumped parameter model for the heat 562 generation rate is newly developed based on the air cooling TMS. The heat generation 563 characteristics experimental setup is built. The model is validated by comparing the simulated 564 565 battery temperatures with experimental results and good agreement is achieved. The impacts of the ambient temperatures and charge/discharge rates on the charge/discharge characteristics, the 566 temperature rise behavior and the heat generation rate are analyzed in a systemic manner. The 567 main conclusions can be stated as follows: 568

569 (1) The measured thermal conductivity for single cell is 5.22 W/(m•K). The expression of the 570 transient heat generation rate is presented.

(2) Over the period of charge and discharge, the higher the charge/discharge rate, the larger the
heat generation rate. High charge/discharge rate (4C) has great influence on the terminal voltage
change.

(3) The heat generation curves show an obvious difference between in the charge/discharge process. The heat generation rate reaches the maximum value at DOD=1.0 and rises sharply caused by overdischarge. The rate of heat generated for the charge process exhibits a M-shaped curve. The negative heat generation rate appears at the intermediate state and results in the battery temperature rapid decrease.

(4) As DOD is less than 0.55, the ambient temperature has no obvious impact on the heat
generation rate, while DOD is more than 0.55, the higher the ambient temperature, the lower the
heat generation rate. In the charge process, the heat generation rate shows small distinctions for
SOC ranged from 0.2 to 0.4 and from 0.6 to 0.8. Moreover, the higher the ambient temperature,

583 the longer the charge/discharge time.

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