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AO1

Model Based Analysis of Lithium Batteries Considering Particle-Size Distribution

O10	3	E. R. Henquín ^[] and P. A. Aguirre
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AO4 12

Performance of lithium ion batteries whose electrodes are composed of particles of different sizes is studied. Simplified 11 model developed in (Henquín and Aguirre, AIChE J. 2015; 61:90–102) is extended and the simulations are compared 13 with experiments from the literature so as to validate this new model. The differences in current density observed in particles of different sizes, which are in contact, depend on particle size and state of charge. Internal particle to particle 14 discharge currents are observed during relaxation times. A parametric study of the applied current and particle sizes of 15 electrodes is performed to evaluate cell performance, with emphasis on cell voltage and final capacity measurement. 16 The evolution of reaction rates on the surface of electrode particles and their corresponding states of charge are 17 18 depicted. An analysis of relaxation times in terms of cell voltage, current density, equilibrium potentials, and overpotentials is included. © 2017 American Institute of Chemical Engineers AIChE J, 00: 000-000, 2017 19

20 *Keywords: lithium ion batteries, different particle size, simplified mathematical modeling*

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24 Introduction

High power lithium batteries manufacturing and use for 25 mobile applications (such as cars), or stationary (energy stor-26 age in homes and public buildings) have become very prom-27 ising due to their multiple advantages.¹ The market of high 28 energy density and power storage batteries is constantly 29 30 expanding.² However, for the proper operation of these units, a very thorough control of the variables involved in charge 31 and discharge processes must be taken. Therefore, it is neces-32 33 sary to count on phenomenological and predictive mathematical models (rigorous but simple to interpret and solve) that 34 are capable of predicting the phenomena produced in batter-35 ies. Thus, Doyle et al.³ developed a novel theoretical model 36 for uniform particle size batteries which was corroborated by 37 38 experimental points at charge and discharge of two different batteries. However the predictive capacity of this model 39 strongly depends on ad hoc parameters to achieve the adjust-40 ments with experimental results, as recognized by the authors 41 themselves, as they frequently have to resort to correlative 42 parameters to achieve the adjustments with experimental 43 data points. The model also has several coupled Partial Dif-44 ferential Algebraic Equations to be resolved. Thus, with the 45 46 aim of facilitating resolution and reducing calculation times,

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advantages of our model compared with other models mentioned above are that (i) currents balances are used correctly and properly (Eq. 6), which are integral equations instead as local one as is the case in the original work³ (ii) a theoretical based equation for the conductivity of electrolyte (Eq. 10) is used, with better adjustments to the experimental points compared to the original work, as shown in Figure 2 (iii) the model results in a set of ordinary differential and algebraic equations, very simple to solve (iv) no parametric adjustments as contact resistance are necessary (v) the model can be reduced to a simpler entirely algebraic system, which also fits with the experimental points. In summary the model is highly predictive and simple enough to be solved even in spreadsheet calculations. To achieve simple mathematical models and rapid resolution, some authors sacrifice predictive power, despising certain phenomena or including strong simplifications. In facilities

tion, some authors sacrifice predictive power, despising certain 69 phenomena or including strong simplifications. In facilities 70 where the use of large banks of lithium batteries is required, it 71 is not convenient to take extreme simplifications in mathemat-72 ical models because high-capacity batteries are used in cycles 73 and are subjected to different charge and discharge rates. In 74 this sense, many authors have shown a growing interest in 75 developing mathematical models, focusing their attention on 76

a series of model reformulations³ are presented in Ref. 4.

Other authors have worked on simplified mathematical mod-

els that are analogous to electric circuits,^{5,6} thus obtaining

very fast models involving lesser phenomenological predic-

tive capacity compared to the previously mentioned. In a pre-

vious paper, ' we presented a simplified mathematical model,

based on mass and energy balance equations. The main

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AO5

77 the phenomena produced in electrode particles. Thus, in Ref. 78 9, a model considering a single particle is developed by Zhang 79 et al. The results of three models of different complexities are 80 compared in Ref. 4. An early work describing a pseudo 2D 81 model that includes diffusion inside particles, diffusion in electrolyte phase, and that incorporates Butler-Volmer kinetics 82 was performed by Doyle et al.¹⁰ 83

84 The need for mathematical models to predict the phenom-85 ena occurring inside batteries becomes evident, taking into account particle-size distribution on electrodes. An extensive 86 review of mathematical models considering the number of 87 particles in electrodes was performed in Ref. 11. Experimen-88 89 tal work with X-ray studying the effect of electrode microstructure of batteries was performed in Ref. 12. In Ref. 13, 90 91 the amount of Li+ ion intercalated in natural carbon flakes whose particle size ranges from 2 to 40 μ m was experimen-92 tally studied. In others studies, $^{14-23}$ the close relationship 93 between particle size and electrode morphology, among 94 other variables, was confirmed for battery performance. In 95 96 Ref. 14, the improvement of the electrochemical properties 97 of particles by decreasing particle size was suggested. A mathematical model describing the effect of electrode micro-98 99 structure on galvanostatic discharge was performed in Ref. 100 17. The finite element method was used, and solidelectrolyte interface potential, equilibrium potential, and 101 ohmic drop were related. In Ref. 21, self-discharge rate is 102 related to electrode particle size and electrode surface area. 104 The authors of Ref. 22 focus their attention on conductive additives and the distinction between primary particle, 105 aggregate, and agglomerate. 106

Conversely, the performance of large storage systems can 108 be affected by the use of an improper technique for selecting particle size. Thus, in Ref. 23 the effect of particle size and 109 electrode thickness on the reaction rate is studied. A mathematical model and experiments are presented by the authors of 112 Ref. 24. They use an empirical expression that takes into 113 account the number of contacts between solid particles and the average contact resistance. In addition to calculating transport 114 properties, a discretization of the actual particle-size distribu-115 116 tion is used

In Ref. 25, the effect of particle size and speed of cycling, 117 among other variables, on the specific energy of batteries is 118 theoretically addressed. This issue has attracted the attention 119 of authors who attempted to study the consequences of this 120 problem in large units. So, Kenney et al.²⁶ extended the single particle model to study a system of batteries-used to supply power for a home-which had slight variations in electrode manufacturing. In Ref. 27, the problem of coexistence of dif-124 ferent particle sizes is also shown. Darling and Newman developed a mathematical model based on,¹⁰ which was applied to a cell whose positive electrode is LivMn₂O₄, and its 128 negative is a lithium foil. The work studies the influence of considering two different particle sizes on the states of charge 129 in cycles, temporary cell voltage responses, and relaxation 130 131 times. Unfortunately, and as it was mentioned in Ref. 7, these models have multiple differential equations coupled with their 133 contour conditions.

134 Lithium Iron-Phosphate batteries are studied in Ref. 28, emphasizing the existence of diffusion areas in the solid phase. 136 In the same way, the authors propose the model with two-size electrode particles, but considering the same surface area and volume fraction as those of a single-size particle battery. The 138 139 authors of Ref. 29 emphasize the idea of diffusion directions in the solid phase and the idea of incorporating a distribution 140 of particle sizes to describe battery behavior. 141

Based on the study of these bibliographies, it is demon- 142 strated the importance of simplified mathematical modeling, 143 and the interest in studying the impact of particle-size distribu-144 tion in the electrodes on the performance of the battery. 145 Hence, in this article, the mathematical model presented in 146 Ref. 7 is extended and adapted to calculate cell voltage, reac- 147 tion rates, states of charge, equilibrium potentials, and other 148 ohmic drops inside the battery, considering that electrodes are 149 composed by particles of two different sizes. The model is val- 150 idated by comparing theoretical predictions with experimental 151 points of two batteries using different electrode materials. A 152 parametric study of battery variables is performed with the 153 aim of studying the temporal response to different discharge 154 conditions and considering different particle sizes. Internal 155 currents inside the battery along relaxation processes are 156 computed. 157

Theoretical Considerations

C

As previously stated, the mathematical model being used 159 has its bases published in Ref. 7 and is adjusted to a system 160 of more than one particle. Thus, the salt balance in the elec- 161 trolyte is 162

158

$$\frac{dC_{\rm e}^{\rm A}}{dt} = \sum_{\rm m} j_{\rm m}^{\rm A} \left(1 - t_{\rm +}^{\rm o}\right) \frac{a_{\rm e/s,m}^{\rm A}}{v_{\rm e}^{\rm A}} n_{\rm m} - K_{\rm l}^{\rm A} \left(C_{\rm e}^{\rm A} - C_{\rm e}^{\rm S}\right) \frac{a_{\rm tr.e}^{\rm A}}{v_{\rm e}^{\rm A}} \quad (1)$$

$$\frac{dC_{\rm e}^{\rm C}}{dt} = \sum_{\rm m} -j_{\rm m}^{\rm C} \left(1 - t_{\rm +}^{\rm o}\right) \frac{a_{\rm e/s,m}^{\rm C}}{v_{\rm e}^{\rm C}} n_{\rm m} + K_{\rm 1}^{\rm C} \left(C_{\rm e}^{\rm S} - C_{\rm e}^{\rm C}\right) \frac{a_{\rm tr.e}^{\rm C}}{v_{\rm e}^{\rm C}}$$
(2)

$$\frac{dC_{\rm e}^{\rm S}}{dt} = K_{\rm l}^{\rm A} \left(C_{\rm e}^{\rm A} - C_{\rm e}^{\rm S} \right) \frac{a_{\rm tr.e}^{\rm A}}{v_{\rm e}^{\rm S}} - K_{\rm l}^{\rm C} \left(C_{\rm e}^{\rm S} - C_{\rm e}^{\rm C} \right) \frac{a_{\rm tr.e}^{\rm C}}{v_{\rm e}^{\rm S}}$$
(3)

where K_1^A and K_1^C can be considered as a global mass-transfer 163 coefficient between anode and separator and separator and 164 cathode; and it can be calculated as 165

$$\frac{1}{K_{l}^{i}} = \frac{L^{i}/2}{D_{eff}^{i}} + \frac{L^{S}/2}{D_{eff}^{S}} \frac{(\varepsilon_{l}^{i} + \varepsilon_{p}^{i})}{(\varepsilon_{l}^{S} + \varepsilon_{p}^{S})}$$
(4)

where, by convention, i will be anode or cathode, in that order; 166 and m refers to particle size. It is important to emphasize that 167 this coefficient arises from the previous manipulation of the 168 written equations and is not a definition coming from a simpli- 169 fication. Conversely, 170

$$D_{\rm eff}^{\rm i} = D_{\rm e,o} \left(\epsilon_{\rm l}^{\rm i} + \epsilon_{\rm p}^{\rm i} \right)^{\gamma D, \rm i}$$
⁽⁵⁾

is the effective coefficient of electrolyte phase diffusion.

It is noteworthy that summations in Eqs. 1 and 2 are 172 extended for m particles.

The heretofore defined equations involve the volume frac- 174 tion of phase j in compartment i: ε_i^i is defined in the same 175 way as reported in Ref. 7. In this work, however, a study 176 where batteries are made up of different particle sizes is per- 177 formed. Consequently, it is necessary to redefine the frac-178 tions of the different phases that constitute the electrodes. 179 These definitions are explained below in the 'Multiparticle 180 Model' section. 181

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The contact area between spherical particles and electrolytephase, and the volume of different phases are expressed by

$$a_{e/s,m}^{i} = 4\pi R_{s,m}^{i^{2}}$$
 (6)

$$a_{\text{tr.e}}^{i} = a_{\text{t}} \left(\varepsilon_{\text{l}}^{i} + \varepsilon_{\text{p}}^{i} \right)$$
(7)

$$v_{\rm e}^{\rm i} = a_{\rm t} L^{\rm i} \left(\varepsilon_{\rm l}^{\rm i} + \varepsilon_{\rm p}^{\rm i} \right) \tag{8}$$

$$v_{\rm s}^{\rm i} = a_{\rm t} L^{\rm i} \varepsilon_{\rm s}^{\rm i} \tag{9}$$

Following this line of work Ref. 7, where particles are discretized into three parts (internal, external, and surface), mass
balance on electrode particles is

$$v_{m\,s,int}^{i} \frac{dC_{m\,s,int}^{i}}{dt} = \mp D_{m\,s}^{i} \frac{\left(C_{m\,s,int}^{i} - C_{m\,s,ext}^{i}\right)}{\left(\delta_{m,2}^{i} + \delta_{m,3}^{i}\right)} a_{m\,int}^{i}$$
(10)

$$v_{\mathrm{m\,s,ext}}^{\mathrm{i}} \frac{dC_{\mathrm{m\,s,ext}}^{\mathrm{i}}}{dt} = \pm D_{\mathrm{m\,s}}^{\mathrm{i}} \frac{\left(C_{\mathrm{m\,s,int}}^{\mathrm{i}} - C_{\mathrm{m\,s,ext}}^{\mathrm{i}}\right)}{\left(\delta_{\mathrm{m,2}}^{\mathrm{i}} + \delta_{\mathrm{m,3}}^{\mathrm{i}}\right)} a_{\mathrm{m\,int}}^{\mathrm{i}} \mp j_{\mathrm{m}}^{\mathrm{i}} a_{\mathrm{m\,ext}}^{\mathrm{i}}$$

$$(11)$$

$$C_{\mathrm{m\,surf}}^{\mathrm{i}}(t) = C_{\mathrm{m\,s,ext}}^{\mathrm{i}}(t) \mp j_{\mathrm{m}\,\mathrm{s}}^{\mathrm{i}} \frac{\delta_{\mathrm{m},4}^{\mathrm{i}}}{D_{\mathrm{m\,s}}^{\mathrm{i}}}$$
(12)

where signs are consistent with the order of i. It is worth mentioning that $\delta_{m,j}^{i}$ are diffusion distances inside the particles, and their calculation may be consulted in Ref. 7 (Figure 4).

190 As can be seen, manipulation of the above equations has resulted in a mathematical model that should not be assumed to 191 be a simplification of a p2d or similar models, but rather a new 192 model arising entirely from an integral mass balance (in space) 193 194 and differential in time of averaged properties. In this way, the 195 set of equations that represent the evolution of concentrations (both in the compartments and in the particles), are equations 196 that retain the character of differential in the field of time, but 197 are integral equations in the space coordinates (both in the 198 thickness of the electrodes as in the radius of the particles). 199

Simplified diagram concentration profiles of both electrolyte and particle phase can be seen in Ref. 7, Figures 3, and 4.
Conduction electrolyte properties are evaluated with the
simplified expression A-2 of Ref. 3, used in Ref. 7 (Eq. 8)

$$\Delta \phi_{\rm e}^{\rm A} = -\frac{i_{\rm e}^{\rm A} L^{\rm A}}{\kappa_{\rm eff}^{\rm A}} + \frac{Rg T}{F} (1 - t_{+}^{\rm o}) 2 \frac{\left(C_{\rm e}^{\rm A} - C_{\rm e}^{\rm A,\rm S}\right)}{C_{\rm e}^{\rm A}}$$
(13)

204 being

$$\kappa_{\rm eff}^{\rm i} = \kappa_{\rm o}^{\rm i} \left(\epsilon_{\rm l}^{\rm i} + \epsilon_{\rm p}^{\rm i} \right)^{\gamma_{\rm K,i}} \tag{14}$$

²⁰⁵ the effective conductivity of electrolyte phase, and

$$\kappa_{o}^{i} = \left[\frac{\left(1+K0 \ C_{e}^{i}\right)^{2}}{\left(1-K1 \ C_{e}^{i}\right)^{2}+\left(1+K2 \ C_{e}^{i}\right)^{2}+K3}\right]\frac{1}{K4}$$
(15)

is conductivity of the salt solution. The parameters of Eq. 15
can be consulted in Table 2 of Ref. 7. This approach is preferred rather than the typical polynomial presented in Ref. 3 as
it presents only one maximum conductivity value at normal
working concentrations.

The potential drop in solid phase can be expressed as

$$\Delta \phi_{\rm ms}^{\rm i} = i_{\rm ms}^{\rm i} L^{\rm i} / \sigma_{\rm eff}^{\rm i} \tag{16}$$

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where effective conductivity σ_{eff}^{i} is expressed as

$$\sigma_{\rm eff}^{\rm i} = \sigma_{\rm o}^{\rm i} \left(\varepsilon_{\rm s}^{\rm i} + \varepsilon_{\rm f}^{\rm i} \right)^{\gamma_{\sigma,\rm i}} \tag{17}$$

Overpotentials are calculated by the Butler-Volmer equation 214

$$\eta_{\rm m}^{\rm i} = \frac{Rg}{0.5} \frac{T}{F} \sinh^{-1} \left(\frac{j_{\rm m}^{\rm i}}{2} \frac{F}{j0_{\rm m}^{\rm i}} \right), \text{ with}$$

$$j0_{\rm m}^{\rm i} = k^{\rm i} \left[C_{\rm m\,surf}^{\rm i} \ C_{\rm e}^{\rm i} \left(C_{\rm m\,max}^{\rm i} - C_{\rm m\,surf}^{\rm i} \right) \right]^{0.5}$$
(18)

and the total applied current, similarly to that shown in Ref. 7, 215 is calculated by 216

$$i_{app} = F 4 \pi \sum_{m} j_{m}^{i} n_{m}^{i} R_{s,m}^{i}^{2}$$
 (19)

As it will be seen later, it should be noted that, if the battery 217 is composed of particles of a single radius, the fraction of the 218 current drained by particles is equal to 1. However, if batter- 219 ies have electrode particles of different sizes, fraction is a 220 value between 0 and 1 for each different particle. Also, if the 221 battery being studied is at a stage of charge, relaxation, or 222 discharge, this fraction of current changes over time. Thus, it 223 is defined as 224

fraction¹_m =
$$j^{1}_{m} F 4 \pi n^{1}_{m} R^{1}_{s,m}^{2} / i_{app}$$
 (20)

Conversely, open circuit potentials vs. state of charge on both 225 electrodes are represented by the functionality 226

$$\theta_{\rm m}^{\rm i} = C_{\rm surf,\,m}^{\rm i} / C_{\rm max,\,m}^{\rm i} \tag{21}$$

As in this study we will compare the results of our models 227 against experimental data about batteries made of different 228 electrode materials which were extracted from works by other 229 authors, the equations used to represent the equilibrium potentials of different batteries are listed in the Appendix (Supporting Information).

Multiparticle model

In the first part of this work, the relationship between the 234 numbers of particles is fixed 235

$$n_{\rm m}^{\rm i}/n_{\rm n}^{\rm i}$$
 (22)

where i represents anode or cathode; and m and n identifies 236 particle size. 237

In case of only two different particle sizes, namely "size 1" 238 and "size 2," the following relations are used 239

$$\varepsilon_{s,m}^{i} = \frac{\varepsilon_{s}^{i}}{\left(R_{s,n}^{i}/R_{s,m}^{i}\right)^{3} n_{m}^{i}/n_{n}^{i} + 1}$$
(23)

$$\varepsilon_{s,n}^{i} = \varepsilon_{s}^{i} \left(R_{s,n}^{i} / R_{s,m}^{i} \right)^{3} n_{n}^{i} / n_{m}^{i}$$
(24)

and finally the number of each particle in electrodes is

$$n_{\rm n}^{\rm i} = \varepsilon_{\rm s,n}^{\rm i} \ a_{\rm t} \ L^{\rm i} / \left(4/3 \, \pi \ R_{\rm s,n}^{\rm i} \, ^3 \right)$$
 (25)

Electrolyte phase and solid phase currents are calculated as in 241 Ref. 7, where 242

$$i_{\rm e}^{\rm i} = \frac{i_{\rm app}/2}{\left(\epsilon_{\rm l}^{\rm i} + \epsilon_{\rm p}^{\rm i}\right)} \tag{26}$$

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Fable 1. Adjustable De	esign Parameters	Corresponding to	Battery 1:	LixC6 Liy	Mn ₂ O ₄
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		Anode	Cathode	
Parameter		Li_xC_6	$Li_yMn_2O_4$	Separator
ε _l		0.357	0.444	0.724
ε _p		0.146	0.186	0.276
ε _f		0.026	0.073	
L (cm)		0.01	0.0174	0.0052
γ_{κ}		3	3	
$D_{\rm s} ({\rm cm}^2{\rm s}^{-1})$		3.9×10^{-10}	1.0×10^{-9}	
$\sigma_0 (\text{S cm}^{-1})$		1.0	0.038	
$k (A \text{ cm}^{1/2} \text{ mol}^{-1})$	1/2)	0.18793	0.20803	
$R_{\rm s}$ (cm)	Particle 1	0.0013125	0.0008925	
	Particle 2	0.001	0.00068	
γσ		1	1.5	
γ _D		3	3	
$C_{\rm s}^{\rm max} \ ({\rm mol} \ {\rm cm}^{-3})$		0.02639	0.02286	
$C_{\rm s}^{0}$ (mol cm ⁻³)		0.01487	0.0039	
$C_{\rm e}^{0} ~({\rm mol}~{\rm cm}^{-3})$			0.002	
D_{e}^{r} (cm ² s ⁻¹)			1.51×10^{-6}	
Ntpte			0.363	

$$i_{\rm s,n}^{\rm i} = \frac{i_{\rm app}/2}{\left(n_{\rm n}^{\rm i} \ \pi \ R_{\rm s,n}^{\rm i} \,{}^2 + n_{\rm m}^{\rm i} \ \pi \ R_{\rm s,m}^{\rm i} \,{}^2\right)} \tag{27}$$

As it was discussed in Ref. 7, current density of electrolyte phase in the separator is expressed as

$$i_{\rm e}^{\rm S} = i_{\rm app} \ a_{\rm t}/a_{\rm tr.e}^{\rm S} \tag{28}$$

²⁴⁵ Taking into account the definition of overpotential and consid-

ering continuity of the electric field for particle "1" in contactwith particle "2," then

$$U^{i}_{\theta,1} \pm \eta^{i}_{1} = U^{i}_{\theta,2} \pm \eta^{i}_{2}$$
(29)

where (\pm) is function of the anode (+) or cathode (-).

Finally, the cell potential, considering that the battery consists of two-size particles, is calculated by

$$U_{\text{cell}} = \left(U_{\theta,1 \text{ or } 2}^{\text{C}} - \eta_{1 \text{ or } 2}^{\text{C}} \right) - \left(U_{\theta,1 \text{ or } 2}^{\text{A}} + \eta_{1 \text{ or } 2}^{\text{A}} \right)$$
$$-\Delta \phi_{\text{s}}^{\text{C}} - \Delta \phi_{\text{s}}^{\text{A}} - \Delta \phi_{\text{e}}^{\text{C}} - \Delta \phi_{\text{e}}^{\text{A}} - \Delta \phi_{\text{e}}^{\text{B}}$$
(30)

Resolution of the Equations System

Batteries considered in this article have insertion electrodes 252 253 whose particles can have different sizes. The general idea of resolution was developed considering that the batteries have 254 only two particle sizes, but the same analysis can be easily 255 extended to three or more different particle sizes. Likewise to 256 Ref. 7, the calculation scheme was developed by setting con-257 stant current value and calculating cell potential over time. 258 259 However, this scheme can be easily adapted for calculations in other conditions, for example, constant discharge power. 260

The calculus scheme was implemented in different program-261 ming environments to reduce errors. Gams,³⁰ was used to solve 262 the system of equations simultaneously. A sequential and itera-263 tive calculation was implemented in SciLab.34, Calculation 264 times varied depending on the simulated current. For smaller 265 currents (discharge times of about 40,000 s), normal computa-266 tion times using the sequential scheme were 300 s. For higher 267 currents, calculation times in discharge were 2 s on average. 268 However, when the battery is in relaxation mode, calculation 269 times were increased by 200 s. When the system was solved 270 simultaneously with Gams, the calculation time was 2 s.

Validation and Comparison with Experimental Data

For comparison with the experimental points, the developed 274 model is used considering particles of two different sizes in 275 each electrode. To achieve the results that best fit the experi-276 mental points, the following procedure was applied: one parti-277 cle was left in its original size (reported in the corresponding 278 paper), and the other particle size was varied. In some cases it 279 was necessary to vary both particle sizes, with respect to its 280 original size. In each of the cases treated, the corresponding 281 details are reported.

This methodology can be extended to a distribution of particle sizes. 284

Battery 1: $Li_xC_6|Li_yMn_2O_4$

In Ref. 7, the comparison with experimental data (Doyle 286 et al.³) for two different cell types was presented, using a 287 model that considers only a single particle size. 288

The experimental points were collected by the authors of 289 Ref. 3 by performing constant current discharges. The two bat-290 teries used by the authors, differed mainly in the thickness of 291 the electrodes, and the type of electrolyte used. Also in the 292 original work, charging experiments were performed. How-293 ever, they were not taken into account in our work.⁷ In this 294 article, we choose for our simulations, battery called as Cell 1 295 by the authors of.³ Table 1 shows the physical parameters and 296 T1 the physicochemical properties representative for this battery. 297 In addition, as we explain below, the particle sizes used in our simulations are detailed. 299

The particular focus of this section is to improve the quality 300 of the comparison that we made in Ref. 7, considering this 301 model, which takes into account two different particle sizes. 302

In all simulations performed with this model considering 303 two particles sizes, the same amount of active material and the 304 same fraction of solids in each electrode were fixed. Also the 305 number of small particles was set equal to the number of large 306 particles. 307

Comparisons with experimental results of battery discharge 308 were slightly improved compared to the results presented in 309 Ref. 7. To do that, a parametric sensitivity analysis was per-310 formed by varying the particle sizes in the simulations to 311 achieve the best results. The chosen strategy was increasing 312

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Figure 1. Comparison of results considering one and two particle sizes. Battery 1: $\text{Li}_x\text{C}_6|\text{Li}_y\text{Mn}_2\text{O}_4$. Particle 1: increased 5% and particle 2: decreased 20% from the original size (a) States of charge. $i_{app} = 0.0035 \text{ Acm}^{-2}$ (b) Dimensionless electrochemical reaction rate. $i_{app} = 0.007 \text{ Acm}^{-2}$.

5% of the original size of the particle called "1," and reducing 313 by 20% the size of the particle called "2," from its original 314 315 size. These comparisons are not shown in this article as they F6 316 are very similar to those shown in Ref. 7 (Figure 6a). How-317 ever, the behavior of others physicochemical variables of these batteries can be analyzed, considering these two different par-318 F1 319 ticles sizes. Thus, in Figure 1a, the results of the evolution of the states of charge $(Soc_{1 \text{ or } 2}^{i})$ for a given discharge current of 320 anodic and cathodic particles compared to those produced con-321 sidering a single particle size (Soc¹) are shown. Current densities and states of charge in cathodic particles are clearly 323 324 affected by the particle-size distribution. However, the average 325 value of the states of charge approaches the value of state of charge of the battery considering a single particle size. Also, 327 in Figure 1b, the evolutions of dimensionless reaction rates are displayed. These evolutions are affected significantly when 328 329 different particle sizes are considered. At the beginning of discharge, reaction rates change significantly, ranging from 330 5% to 12% in a short time. Then the battery begins a period of 331 relatively little change in reaction rates, and the discharge is 332 controlled by ohmic losses. Finally, in the last stage of discharge, a zone of great change in the variables is noticed. 334 These variations are most apparent for cathode particles and 335 are associated with shape potential equilibrium curve, as discussed below. 337

Battery 2: $Li_xC_6|Li_yCoO_2$

Experimental data of this kind of battery were extracted from 339 Ref. 8 The authors of this paper have used a Sony battery 340 18,650 With 1.8 Ah rated capacity. Experiments were conducted 341 similar to the case described above. The battery was charged to 342 an approximate voltage of 4.2 volts, and then it was discharged 343 at constant current conditions, to voltages near 2 volts. 344

338

In this article, the evolution of the performance of the battery with the number of cycles (*N*) at two different temperadeveloped a mathematical model to fit the experimental points, proposing semiempirical equations, which describe: the change in state of charge, the change of film resistance, and the change of the solid phase diffusion coefficient, as a function of number of cycles, for two different temperatures.

All parameters used to simulate this battery, were adopted 353 from Ref. 8, except: 354

- i. A model of the separator, which has the same potential 355 drop as the one informed in the original work. 356
- ii. The initial state of charges. For anodic particles is ³⁵⁷ 0.838 and for cathodic particles is 0.375. ³⁵⁸

For comparison with experimental points of battery discharge, the following strategy was selected: particles "2" are larger than particles "1"; in the anode particle "2" is 80% 361 larger than the particle "1," and in the cathode particle "2" is 362 20% larger than the particle "1." Sizes of particle "1" was set 363 to the same value as in the original paper. These values, and all the parameters used in the simulations for this battery, are reported in Table 2. 366 T2

The three empirical equations described in the original 367 paper (state of charge, particle diffusivity, and resistance) are 368 not used in our model. Instead, we simulated performance 369 loss, by decreasing the amount of particles as function on the 370 number of cycles. 371

Physically this loss of performance may be due to, electrical 372 contacts between some particles no longer exists, or due to the 373 formation of an extra resistance on the surfaces of the par-374 ticles. This issue was widely discussed in the literature (e.g.³). 375

In our simulations, the number of particles "2" both in 376 anode and cathode diminishes as function of number of cycles. 377 Figures 2a, c shows the agreement between the experimental 378 F2 points and the results of our model, at 25 and 50°C, respec- 379 tively. The larger particles in both anode and cathode, 380 decreases according to number of cycle, as it is shown in Fig- 381 ures 2b, 2d, for 25 and 50°C. 382

Therefore, in these simulations the total amount of active 383 material of the cell decreases as the number of cycles 384 increases. We assume that the active material lost, corresponds 385 to particles that lose electrical contact with neighbors 386 particles. 387

Parametric Study using Two Particle Sizes

A parametric study is performance to identify the model 389 response under different discharge conditions. The simulated 390

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Parameter		Anode Li _x C ₆	Cathode Li _y CoO ₂	Separator
ε ₁		0.485	0.385	1
L(cm)		0.0088	0.008	0.008
$D_{\rm s} ({\rm cm}^2{\rm s}^{-1})$		3.9×10^{-10}	1.0×10^{-9}	
$\sigma_{\rm eff}$ (S cm ⁻¹)		0.005766	0.1211	
$k (A \text{ cm}^{5/2} \text{ mol}^{-3/2})$		0.2045	0.0981	
$R_{\rm s}$ (cm)	Particle 1	0.0020	0.0020	
	Particle 2	0.0036	0.0024	
$C_{\rm s}^{\rm max}$ (mol cm ⁻³)		0.030555	0.051555	
$C_{\rm s}^{0} ({\rm mol} {\rm cm}^{-3})$		0.02563 ^a	0.01933 ^b	
$C_{\rm e}^{0} ({\rm mol} {\rm cm}^{-3})$			0.001	
$D_{\rm e}^{\rm c} ({\rm cm}^2 {\rm s}^{-1})$			7.5×10^{-6}	
Area (m^2)			0.0796	
ntpte			0.363	

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^aBased on Data of Table 1⁸: $\theta_{\text{initial}}^{\text{A}} = 0.838$. ^bAdopted from Table 1⁸: $\theta_{\text{initial}}^{\text{C}} = 0.375$.

battery, in this section, (considering only one particle size) is
detailed in Ref. 7, identified as cell A, and is the same battery
mentioned in the 4th section. In each section discussed below,
we detail the parameters changed, and the conditions these
changes were made.

In this article we consider that each electrode contains particles of two different sizes: Particles of size "1" called particles "1" and particles of size "2" called particles "2."

The methodology used in this study consists of setting particle

400 size "1" for both anodic and cathodic electrodes, in its original

size (shown in Table 1, according with the experiments and sim- 401 ulation of the original paper), and varying particle size "2." The 402 total amount of solid material is maintained constant in both 403 anode and cathode. This condition is imposed from the above 404 Eqs. 22–29, in which the total solid fraction remains constant in 405 each electrode. Furthermore, the number of particles "1" is set 406 equal to the number of particles "2." As a consequence, the total 407 number of particles diminishes as the size of particles "2" 408 increases. According to these constraints, all following compari-409 sons involve batteries with the same amount of active material.



Figure 2. Comparison between experimental points⁸ and the model developed in this article Battery 2: $Li_xC_6|Li_{y-}CoO_2$.



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Figure 3. Evolution of reaction rates at constant discharge current, considering two particle sizes. $i_{app} = 0.0035$ Acm⁻².

(a) Particle 1 in anode. (b) Particle 2 in anode. (c) Particle 1 in cathode. (d) Particle 2 in cathode. Square: $R_{s,2}/R_{s,1} = 2.00$. Rhombus: $R_{s,2}/R_{s,1} = 1.75$. Triangle: $R_{s,2}/R_{s,1} = 1.50$. Circle: $R_{s,2}/R_{s,1} = 1.25$. Line: $R_{s,2}/R_{s,1} = 1.00$. Cross: $R_{s,2}/R_{s,1} = 0.75$. Star: $R_{s,2}/R_{s,1} = 0.50$. Plus sign: $R_{s,2}/R_{s,1} = 0.25$.

411 Cell voltage

Cell voltage was calculated at a representative constant dis-412 charge current of 0.000875 Acm^{-2,} until it reaches a value 413 below 1.5 V, and considering different particle-size ratios 414 $(R_{s,2}/R_{s,1} = 3.00; 2.00; 1.75; 1.50; 1.25; 1.00; 0.75; 0.5)$. As 415 the ratio of sizes is greater, the battery performance is nega-416 417 tively affected. For example, battery which has particle-size relation equal to 2, reduces its final capacity in nearly 10% 418 against a battery with uniform particle sizes, which implies an 419 approximate reduction time of 12 min, for this cell configura-420 tion (discharging times of a battery, considering a single parti-421 cle size can be corroborated in Ref. 7 Table 4). And another 422 whose particle-size relation is equal to 3, worsens its perfor-423 mance by almost 27% compared to that has no size distribu-424 tion, which it involves 34 min less on operation. If the battery 425 is discharged to intermediate discharge rate $(0.0035 \text{ Acm}^{-2})$ 426 the final capacity would decrease by about 50% comparing 427 $R_{s,2}/R_{s,1} = 2.00$ vs. $R_{s,2}/R_{s,1} = 1.00$ cases. And if the battery is 428 discharged to the higher simulated current (0.007 Acm^{-2}), the 429 reduction of performance, would be around 60%, analyzing 430 the same aforementioned case. 431

432 *Reaction rate*

 $F3 \ {\tt 433}$

Figure 3 shows the evolution of anodic and cathodic electrochemical reaction rates which are parametric to the relations between particle sizes. Figures 3a, b corresponds to anodic particles 1 and 2, respectively. Figures 3c, d corresponds to 436 the cathodic particles. The lines that appear with no variation 437 correspond to simulations that consider both particles of the 438 same size. The scheme of particle-size variation is similar to 439 that previously described. Particle size 1 remained constant 440 and particle size 2 was varied.

Figure 3a shows that the higher the quotient size—greater 442 than 1—, the higher the initial rate on particle 1 and the reac- 443 tion rate over time on particle 1. Consequently, there is a 444 greater amount of converted lithium inside particles at the ini- 445 tial instants; and the battery is discharged faster. When the 446 relationship between sizes is lower than one, initial velocities 447 become smaller and the battery capacity is increased. In the 448 latter cases, however, it is initially observed that the trend is 449 not as expected as there is an apparent crossing of initial reac- 450 tion rates and reaction rates over time. In Figure 3b, the same 451 trends can be seen. On the contrary to what happens with parti- 452 cle 1, velocities increase over time for ratios greater than 1 453 and decrease for ratios lower than 1. Here, it can be observed 454 the importance of having a simplified model with phenomeno- 455 logical significance to analyze the behavior of these variables. 456 In the same compartment, while some particles increase their 457 electrochemical lithium conversion rate, others decrease. It 458 can be seen on the left-hand scale of Figures 3a, b that the 459 reaction rates of both particles are cross linked when the bat-460 tery is about 25% of its discharge, considering the largest dis-461 persion between the sizes. 462

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Figure 4. Evolution of reaction rates at constant discharge current, considering Eq. 35. $i_{app} = 0.00175 \text{ Acm}^{-2}$. (a) Particle 1 in anode. (b) Particle 2 in anode. (c) Particle 1 in cathode. (d) Particle 2 in cathode. Square: $R_{s,2}/R_{s,1} = 2.00$. Triangle: $R_{s,2}/R_{s,1} = 1.50$. Line: $R_{s,2}/R_{s,1} = 1.00$. Star: $R_{s,2}/R_{s,1} = 0.50$. Plus sign: $R_{s,2}/R_{s,1} = 0.25$.

Reaction rates of cathodic particles are more complex to be
analyzed, as, as shown in Figures 3c, d, there is a temporal
evolution crossing. These crossings are due to the Plateau
shape of the cathodic equilibrium potential (Eq. A2). To avoid
this masking caused by the oscillations of these Plateaus, Eq.
A2 is replaced by an equation arising from a logarithmic fit of
these points without inflexion points

$$U_{\theta}^{\rm C} = -0.153 \, {\rm LN}(\theta^{\rm C}) + 3.955 \tag{31}$$

470 The dimensionless reaction rate for a typical value of intermedi-F4 ate current for some values of radius ratio is shown in Figure 4. 471 Dimensionless reaction rate refers to a cell working with par-472 ticles of the same size. With this modification in the U_{θ} equa-473 474 tion, cathodic behavior becomes similar to anodic one. Reaction rates for particle 1 both in cathode and anode show unexpected 475 crossing for radius ratios lower than 1. This situation is related 476 to the difference in external surface area of electrodes. In fact, 477 comparisons performed up to this point involve batteries with 478 the same active material volume and the same number of par-479 ticles. Analysis of batteries with the same active material vol-480 ume and the same electrode surface area is presented forward. 481

482 Capacity

Comparisons performed in the last section correspond to batteries with different particle sizes and the same amount of active electrode volume. A further condition was imposed by defining the number of particles "1" equal to the number of particles "2." To assess the impact of particle-size difference, batteries with the same electrode surface area will be com- 488 pared instead of batteries with equal number of particles. 489 Under this new frame, particle-size distribution becomes a 490 variable. The problem can be defined as: Given the batteries 491 showing the same dimensions and the same volume of active 492 material and the same external surface area of electrodes, 493 capacity will be computed for different particle sizes and, con- 494 sequently, for different number of particles. Figures 5a, b, 495 F5 show battery capacities discharging at constant current for dif- 496 ferent number of particles "1" and "2" which are parametric 497 with the number of the other particle. In this study, radius "1" 498 are lower than radius "2" but the number of particles "1" are 499 not necessarily greater than number of particles "2." Figure 5a 500 shows two different regions depending on the value of n_1^A . For 501 values greater than 6e⁵, the greater the number of particles 502 "2," the higher the capacity, while for values lower than 6e⁵, 503 the greater the number of particles "2," the lower the final 504 capacity. Conversely, Figure 5b depicts a different behavior, 505 the higher the number of particles "1" for a given number of 506 particles "2," the lower the capacity. These tendencies can be 507 easily explained resorting to the computation of a parameter 508 defined as: difference in particle radius divided by the average 509 particle radius. Figure 5c shows this parameter as function of 510 number of particles computed in the simulations of Figures 5a, 511 b. This parameter is a measure of the impact of particle-size 512 distribution for batteries with the same amount of active mate-513 rial and the same electrode surface area. The greater the radius 514 difference, the worse the battery performance. 515

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Figure 5. Battery final capacities as a function of.

(a) the number of particle "1" with the number of particle "2" as a parameter. Square: $n_2^A = 3,00,000$. Rhombus: $n_2^A = 2,00,000$. Triangle: $n_2^A = 1,00,000$. Circle: $n_2^A = 50,000$. Cross: $n_2^A = 25,000$. Star: $n_2^A = 12500$. (b) the number of particle "2" with the number of particle "1" as a parameter. Square: $n_1^A = 54,00,00$. Rhombus: $n_1^A = 66,00,00$. Triangle: $n_1^A = 7,80,000$. Circle: $n_1^A = 90,0000$. Cross: $n_1^A = 1,020,000$. Star: $n_1^A = 1,50,0000$. (c) Level curves of abs $(R_{s,1}^A - R_{s,2}^A)^*$ $(R_{s,1}^A + R_{s,2}^A)$. $i_{app} = 0.00175$ Acm⁻².





(a): $R_{s,2}/R_{s,1} = 2.00$. (b): $R_{s,2}/R_{s,1} = 1.50$.

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516 Results of the Model Considering Relaxation

As it was discussed in Ref. 7, relaxation times in the process of discharge of a battery are very important due to the physicochemical phenomena that influence the next batteries cycles (charges or discharges). If the electrodes of a battery have particles of different sizes, it is expected that these phenomena are more radically affected.

To study the characteristic variables of the battery, constant current discharges up to 2.7 volts were simulated. Batteries involve particles "1" and "2" with the same amount of active material and the same number of particles "1" and "2." Once discharge was turned off, variables involved in the simulations were computed as a time function.

The simulation results in cell voltage, indicate that the higher the relationship between particle radius, the lower the battery final capacity. Furthermore, voltage restitution after relaxation time is smaller when the ratio of particle size is smaller.

For example, for a typical low current discharge (0.000175 534 Acm^{-2}), a battery with uniform particle size, would be dis-535 charged at 637 min, while a battery with $R_{s,2}/R_{s,1}=2$ is dis-536 charged in 622 min. Likewise relaxation times in battery with 537 uniform particle size, would be relatively short, approximately 538 7 min. And 48 min for the case $R_{s,2}/R_{s,1} = 2$. If the same calcu-539 540 lation is performed for a discharge current slightly higher, 0.00175 Acm^{-2} , the discharge times are 3400 and 2600 s and 541 the relaxation times are 450 and 2200 s, respectively $(R_{s,2}/$ 542 $R_{s,1} = 1$ and $R_{s,2}/R_{s,1} = 2$). 543

544 Once again, the importance of having a model such as the one presented in this paper is evident, to predict these phenom-545 546 ena. This model, differential in time, integral in space, allows 547 us to evaluate this dramatic change in the total duration of the charge of the battery, being subjected to a controlled discharge 548 at constant current. It can be inferred that if the discharge is 549 performed under nonideal conditions (e.g., with the discharge 550 and recharge cycles typical of an electric car) these discrepan-551 552 cies would be even greater.

This fact would indicate, once more, that battery performance is negatively affected by particle-size distribution in the electrodes. That is, even though the batteries with higher ratios between particle sizes reach a relative higher voltage at the relaxation stage, their delivered capacity was lower and they took longer to reach the new equilibrium state.

559 Figure 6 depicts the evolution of reaction rates for an intermediate current and for two values of particle-size relation-560 ships before and after the discharge of the battery. Discharge 561 562 periods were analyzed in previous sections. At relaxation 563 moments, an abrupt reduction of current densities takes place 564 (note differences in the graph scales). Anode particles take 565 longer to reach the equilibrium; and this phenomenon is more evident for the battery of Figure 6a, wherein the dispersion 566 567 among particle sizes of electrodes is the greatest, again indi-568 cating the negative contribution of this size difference.

F7 569

Finally, Figure 7 shows, the values taken by the overpotential of the different particles of both electrodes, Figure 7a, and conversely, the difference in equilibrium potentials of both electrodes, Figure 7b. This analysis is performed for a typical current value and a typical size distribution value.

Figure 7 also depicts the behavior of the continuity of the electric field Eq. 29 both in discharge zone and relaxation zone. The abrupt jump in the values of variables is detected around 3000 s after discharge. Again, it becomes evident that relaxation of anode particles (thicker lines, Figure 7a) takes





longer than that of cathode particles. This effect can be 579 explained by taking into account the different shapes of equilibrium potentials, U_{θ} , and the fact that anode particles are 581 larger than cathode particles in these batteries. So, finally, 582 there is evidence to account not only for the size of particles 583 themselves, but also for the distribution of particle sizes in 584 electrodes. 585

The negative influence of particle-size distribution on the 586 electrodes of a lithium-ion battery has been demonstrated, 587 which is the attained objective of this study. 588

Furthermore, evidence has been provided for the importance 589 of addressing these factors in battery manufacturing. 590

Conclusions

 The performance of lithium ion was studied by solving a 592 novel mathematical model in two different scenarios: (i) 593 maintaining constant the amount of active electrode material and varying the particle size, (ii) maintaining constant 595 volume and the electrode surface area and varying the 596 number of each of the particles. 597

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- 598 2. This model has been validated by experimental points
 599 provided by other authors and using two different types
 600 of cells.
- 3. With this simplified model, large discrepancies in the final
 duration of a battery considering different particle sizes
 and batteries with a homogeneous particles sizes were
 found. This feature is much appreciated for predicting the
- ⁶⁰⁵ behavior of batteries in large facilities.
- 4. Some comparisons between the model and the experimental points were significantly improved by varying the particle sizes of the electrodes.
- 5. Plateaus existence in the cathode equilibrium potential
 impacts markedly in the current density distribution
 between particles of different sizes.

612 6. Differences between particles sizes of the electrodes, neg-

- atively affects the performance of the battery. At high discharge current, difference between the particle sizes of
 50%, reduces up to 35% battery capacity.
- 616 **7.** By maintaining constant the number of one particle type, 617 significant variations in battery capacity are obtained by
- varying the number of the other particle, keeping constant the total amount of material.
- 8. Relaxation times of a partially discharged battery are also
 affected by the fact of having particles with different

sizes. Relaxation occurs 25% faster on batteries with uni-

623 form particle size, comparing them against batteries that

have a dispersion size of 100%.

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632 Notation

- $a = area, cm^2$
- 639 Cap = capacity, mA h cm⁻² 640 C = concentration mol cm⁻³
- $C = \text{concentration, mol cm}^{-3}$
- i = current density, mA cm⁻²
- $\begin{array}{l} 648 \qquad D = \text{ diffusion coefficient, } \text{cm}^2 \text{ s}^{-1} \\ \end{array}$
- 659 $F = \text{Faraday's constant: 96485.34, C mol^{-1}}$
- 653 j = electrochemical reaction rate, mol s⁻¹ cm⁻²
- 655 $j_0 = \text{exchange current density, mA cm}^{-2}$ 659 K = constants in Eq. 15
- K = constants in Eq. 15
- $\begin{array}{ll} 661 \\ 664 \\ 664 \\ 666 \\ 668 \\ k = \text{constant rate of the electrochemical reaction} \end{array}$
 - k = constant rate of the electrochemical reaction
- 660 $k_i = (i = 1; 2; 3; 4) = \text{constants in Eqs. 31-33}$ 671 $L_i = \text{electrode length}$ cm
- $\begin{array}{ll} 671 & L = \text{ electrode length, cm} \\ 676 & n = \text{ number of solid particles} \end{array}$
- 679 ntpte = transport number
- N = usage cycle
- U = potential, V
- Rg = universal gas constant 8.314, J mol⁻¹ K⁻¹
- $\begin{array}{ll} 699 & R_{0}^{0} = \text{resistance between particles, Eq. 34} \\ 693 & P_{1}^{0} = \text{solid particle particle for the set of the$
- 693 $R_{s,m}^{i}$ = solid particle radius of the particle "m" on the electrode "i", cm 695 t = time, s 690 T = temperature, K
- $\begin{array}{l} \textbf{690} \qquad T = \text{ temperature, K} \\ \textbf{701} \qquad v = \text{ volume, cm}^3 \end{array}$

704 Specials and Greek letters

- 708 t_{+}^{o} = transport number
- 709 $f_{\pm} = \text{molar activity coefficient of the salt}$ 713 $\varepsilon = \text{volume fraction}$
- 713 ε = volume fraction 715 δ = diffusion distance, cr
- δ = diffusion distance, cm

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 $\kappa = \text{electrolyte conductivity, S cm}^{-1}$ $\Delta \phi = \text{potential drop, V}$ $\sigma = \text{solid conductivity, S cm}^{-1}$ $\theta = \text{state of charge}$ $\eta = \text{overpotential, V}$ fraction = fraction of the current drained by particles

Subscript

app =	applied	730
e =	electrolyte	743
eff =	effective	745
e/s =	electrolyte in contact with solid	749
n, m =	particle number	750
s =	solid	755
f =	filler	758
p =	polymer	769
1=	liquid	763
tr.e =	transversal area of electrolyte phase	768
tr.s =	transversal area of solid phase	760
t =	transversal	773
o =	pure	776
$\theta =$	open circuit potential	779
cell =	cell	780
diff =	diffusion	785
int =	interior	786
ext =	exterior	790
max =	maximum	793
surf =	surface	798

Superscript

- i = anode, cathode or separator800A = anode805C = cathode806S = separator809 γ = Bruggeman's exponent8130 = initial815
- o = pure 829

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