# **1** Predicting Aqueous Free Energies of Solvation as Functions of Temperature

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This work introduces a model, solvation model 6 with temperature dependence (SM6T), to predict the temperature dependence of aqueous free energies of solvation for compounds containing H, C, and O in the range 273–373 K. In particular, we extend solvation model 6 (SM6), which was previously developed (Kelly, C. P.; Cramer, C. J.; Truhlar, D. G. *J. Chem. Theory Comput.* **2005**, *1*, 1133) for predicting aqueous free energies of solvation at 298 K, to predict the variation of the free energy of solvation relative to 298 K. Also, we describe the database of experimental aqueous free energies of solvation for compounds containing H, C, and O that was used to parametrize and test the new model. SM6T partitions the temperature dependence of the free energy of solvation into two components: the temperature dependence of the bulk electrostatic contribution to the free energy of solvation-shell effects which is modeled using a parametrized solvent-exposed surface-area-dependent term. We found that SM6T predicts the temperature dependence of aqueous free energies of solvation with a mean unsigned error of 0.08 kcal/mol over our entire database, whereas using the experimental value at 298 K produces a mean unsigned error of 0.53 kcal/mol.

#### 19 **1. Introduction**

Implicit solvation models<sup>1-4</sup> are widely used to predict a 20variety of solvent effects including free energies of solvation, 21solubilities, and vapor pressures. Often, as in industrial, 22environmental, and pharmacological applications, these quanti-23ties are needed over a range of temperatures; however, almost 24all implicit solvation models have been designed or tested only 25for predicting these quantities at room temperature. An exception 26is the work of Elcock and McCammon<sup>5</sup> who introduced an 27implicit solvation model for temperature-dependent hydration 2829 free energies of amino acids. There remains a need for models designed to treat a broad variety of solutes such as atmospheric 30 pollutants,6-8 drug leads,69 high-energy molecules,10 and re-31 agents for organic synthesis.11 32

In the present paper, we present a temperature-dependent 33 extension of our recent implicit solvation model, solvation model 34 6 (SM6).<sup>12</sup> We refer to this extension as solvation model 6 with 35 temperature dependence (SM6T). SM6T is designed to predict 36 37 changes in aqueous free energies of solvation as functions of temperature relative to the free energy of solvation at 298 K. 38 In the present study, it was parametrized for compounds 39 40 composed of H, C, and O in the temperature range 273–373 K (the range over which water is a liquid at 1 atm). SM6T is 41 42parametrized on the basis of the solute geometry and the atomic 43 numbers of the atoms in the solute.

The standard-state temperature dependence of the free energy of solvation is given by<sup>13,14</sup>

$$\Delta G_{\rm S}^{\rm o} = \Delta H_{\rm S}^{\rm o}(T) - T \Delta S_{\rm S}^{\rm o}(T) \tag{1}$$

46 where *T* is temperature and  $\Delta H_{\rm S}^{\circ}$  and  $\Delta S_{\rm S}^{\circ}$  are, respectively, the 47 standard-state enthalpy and entropy of solvation. Ignoring the temperature dependence of  $\Delta H_{\rm S}^{\circ}$  and  $\Delta S_{\rm S}^{\circ}$  yields a linear 48 dependence of  $\Delta G_{\rm S}^{\circ}$  in *T*; we call this the van't Hoff model. 49 The temperature dependence of both  $\Delta H_{\rm S}^{\circ}$  and  $\Delta S_{\rm S}^{\circ}$  can be 50 written in terms of the standard-state heat capacity of solvation, 51  $\Delta C_{\rm P,S}^{\circ}$ , which yields<sup>14</sup> 52

$$\Delta G_{\rm S}^{\circ}(T) = \Delta G_{\rm S}^{\circ}(T_0) - \Delta S_{\rm S}^{\circ}(T_0)[T - T_0] + \Delta C_{\rm P}^{\circ}{}_{\rm S}(T)[(T - T_0) - T\ln(T/T_0)]$$
(2)

where  $T_0$  is a reference temperature taken throughout as 298 53 K. Equation 2 with  $\Delta C_{P,S}^{\circ}$  taken as a constant will be the basis 54of our analysis. Experiment has shown that  $\Delta C_{P,S}^{\circ}$  is not 55necessarily a constant; for example, Bakk and Hoye<sup>15</sup> found 56 that it decreases by 12-35% for methane, ethane, and propane 57in water when T is increased from 273 to 323 K. One could of 58 course include the temperature dependence of  $\Delta C_{P,S}^{\circ}$  in the 59 model. However, such higher-order effects are probably beyond 60 the resolution of our model. In the method presented here, we 61 go beyond the van't Hoff model by including a nonzero heat 62 capacity, but we do not include the temperature dependence of 63 the heat capacity. 64

In section 2, we discuss the development of a database of 65 temperature-dependent free energies of solvation in water. 66 Section 3 presents the new model for predicting the temperature 67 dependence of the free energies of solvation. Section 4 summarizes our software plans. The final section discusses the 69 accuracy and applicability of the model. 70

### 2. Developing a Database

For a robust parametrization, it was necessary to obtain a 72 database consisting of free energies of solvation as functions 73 of temperature for a variety of compounds. First, we searched 74 the literature for experimental measurements that could be used 75 to obtain free energies of solvation. Next, we analyzed the data 76 and discarded those that failed to meet certain criteria. Finally, 77

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we recorded the data as free energies of solvation relative tothe experimental value at 298 K.

#### 2.A. Compilation of Free Energies of Solvation. We 80 81 obtained free energies of solvation from a variety of experimental sources including Henry's law constants,16-18 saturated 82 vapor pressures<sup>19-22</sup> of the solute over the pure liquid phase 83 combined with aqueous solubilities,23-27 and activity coefficients 84 at infinite dilution<sup>28-31</sup> for the solutes in water. As with all of 85 our prior models,<sup>32-34</sup> the free energies of solvation are tabulated 86 for the standard-state choices of 1 M ideal gas and 1 M ideal 87 solution, where the latter behaves as an infinitely dilute solution. 88 As discussed by Ben-Naim,35 such a choice of standard state, 89 involving the same concentration in the two phases, removes 90 91 the translational entropy of dilution.

To obtain the free energy of solvation, we considered the equilibrium between a solute (A) in the gas phase (g) and in aqueous solution (aq)

$$A(g) \rightarrow A(aq) \tag{3}$$

95 In the case of an infinitely dilute solution, the partition 96 coefficient for this process is the Henry's law constant,  $K_{\rm H}$ , 97 which is related to the standard-state free energy of solvation 98 by<sup>14,36</sup>

$$\Delta G_{\rm S}^{\rm o} = RT \ln(K_{\rm H}) \tag{4}$$

99where R is the gas constant  $^{14,37}$  (1.985 cal K $^{-1}$  mol $^{-1}$ ). Henry's100law constants are reported in a variety of units, and considerable101care must be exercised in converting the experimental data into102the appropriate units; Staudinger and Roberts<sup>38</sup> provide a useful103review on this subject. The Henry's law constant corresponding104to our choice of standard states has units of (M of solute in gas105phase/M of solute in solution).

Another widely measured quantity is the activity coefficient at infinite dilution. The activity coefficient is the constant of proportionality between the Henry's law constant and the Raoult's law<sup>14,37</sup> constant and is written as<sup>28,29,31,36</sup>

$$\gamma_{\rm A}^{\infty} = \frac{K_{\rm H}^{\rm X}}{P_{\rm A}^{\bullet}} \tag{5}$$

110 where  $K_{\rm H}^{\chi}$  is the Henry's law constant in units of mole 111 fractions in the gas and liquid phases and  $P_{\rm A}^{\bullet}$  is the saturated 112 vapor pressure of solute A over pure liquid solute A. The 113 standard-state free energy of solvation can be calculated from 114 the activity coefficient by

$$\Delta G_{\rm S}^{\circ} = RT \ln \left( \frac{\gamma_{\rm A}^{\circ} P_{\rm A}^{\bullet}}{RTM_{\rm w}^{\bullet}} \right) \tag{6}$$

115 where  $M_w^*$  is the molarity of pure water, which serves as the 116 unit conversion between mole fractions and molarity for the 117 solute concentration in dilute aqueous solution. Equation 6 is 118 derived in the appendix, which corrects an error in ref 36.

Alternatively, the solvation process can be considered to occurin two steps. The first is condensing the solute

$$A(g) \rightarrow A(l) \tag{7}$$

where l denotes the pure liquid solute. The standard-state free
energy associated with moving a solute from a 1 M concentration of solute A in the gas phase to a liquid solute A with ideal
behavior in both phases is<sup>33,34</sup>

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$$\Delta G_{\rm C}^{\circ} = RT \ln \left( \frac{P_{\rm A}^{\circ}}{RTM_{\rm A}^{1}} \right) \tag{8}$$

where  $M_A^l$  is the molarity of the solute in its pure liquid state. 125 The second step of the process is transferring solute A from its 126 pure liquid phase to aqueous solution 127

$$A(l) \to A(aq) \tag{9}$$

The standard-state free energy associated with this step is<sup>34</sup> 128

$$\Delta G_{\rm T}^{\circ} = -RT \ln \frac{M_{\rm A}^{\rm au}}{M_{\rm A}^{\rm l}} \tag{10}$$

where  $M_A^{aq}$  is the aqueous molar concentration of solute A in equilibrium with pure liquid; that is, it is the molarity of a saturated solution, which is easily calculated from the solubility. When eqs 8 and 10 are combined, the standard-state free energy of solvation is given by 133

$$\Delta G_{\rm S}^{\rm o} = RT \ln \frac{P_{\rm A}^{\rm o}}{RTM_{\rm A}^{\rm aq}} \tag{11}$$

where eq 11 assumes that the solute is an ideal gas in the vapor phase and that the solution of solute A behaves as though it is very dilute so that a solute molecule only interacts with the solvent. 137

In practice, several free energies of solvation were computed 138 from eq 11 for highly soluble compounds, for example, benzyl 139 alcohol, which has a solubility of 0.41 mol/L at 293 K.<sup>39</sup> 140 Equation 11 is not necessarily appropriate for such compounds; 141 however, we have shown in a previous paper<sup>34</sup> that the error 142 introduced by assuming ideal behavior for concentrated solutions 143 is smaller than the inherent error of our solvation models. 144

A separate issue is that experimental solute vapor pressures 145 and solubilities are rarely available at precisely the same 146 temperature; thus, to calculate free energies of solvation, it was 147 necessary to interpolate experimental vapor pressures to estimate 148 values at the temperatures for which experimental solubilities 149 were available. Fortunately, empirical fits of vapor pressures 150with accuracies comparable to the experimental errors of 151solubilities<sup>39-42</sup> are readily available in the literature.<sup>43,44</sup> 152

**2.B. Analysis and Removal of Data.** Once we obtained an 153 extensive body of experimental free energies of solvation, we 154 proceeded to analyze the data for each compound. We discarded 155 experimental data on the basis of five criteria: 156

(1) We discarded any source that provided experimental data 157at only a single temperature for a given compound, except for 158 the case of the free energies of solvation at 298 K obtained 159from the database used to parametrize SM6.12 We used this 160 particular criterion because combining such data with data at 161 other temperatures from other sources may lead to spurious 162 temperature dependence. We retained the data from the database 163 used to parametrize the SM6 model because we found these to 164 be reliable values of free energies of solvation at 298 K. 165

(2) We eliminated all experimental data from sources whose
 data points systematically deviated by 0.4 kcal/mol or more from
 values obtained from two or more other sources.

(3) We discarded any compound for which less than four
experimental points were available. To estimate the curvature
of the temperature dependence of the free energy, at least three
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points is larger, but for a few compounds, such as sparingly
soluble alkynes, we did actually use only four data points.
(4) We required that no data point deviate by more than two

(4) we required that no data point deviate by more than two
standard deviations from a fit, as described in section 2.C, to
all of the retained experimental data for a given compound. Once
a data point was removed, the fit was recalculated using the
remaining data. This process was iterated until none of the
remaining points deviated by more than two standard deviations
from the fit. This criterion was applied to eliminate nonsys-
tematic errors in the experimental data.

(5) In the process of assessing the data, we came to the
conclusion that some sources were unreliable either because
those sources often disagreed with other workers or because
they did not provide complete enough experimental details; data
from those sources were not used.

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 2.C. Evaluation of Experimental Temperature Dependence. With experimental free energies of solvation for a given compound in hand, we calculated the temperature dependence using the following equation

$$\Delta \Delta G_{\rm S}^{\circ} = \Delta G_{\rm S}^{\circ}(T) - \Delta G_{\rm S}^{\circ}(T_0) \tag{12}$$

192where  $\Delta G_{\rm S}^{\circ}$  is the experimental free energy of solvation at a 193 given temperature, T. To tabulate  $\Delta\Delta G_{\rm s}^{\circ}$ , one requires a value of  $\Delta G_{\rm S}^{\circ}(T_0)$  that is consistent with the  $\Delta G_{\rm S}^{\circ}(T)$  data. In some 194 cases, however, 298 K was not among the available temperatures 195 in the data set produced by the steps in sections 2.A and 2.B. 196 Furthermore, even when available,  $\Delta G_{\rm S}^{\circ}$  at any one tempera-197 198 ture such as  $T_0$  is subject to experimental noise. To make the data as consistent as possible, we always obtained  $\Delta G_{\rm S}^{\rm o}(T_0)$  by 199 fitting all of the retained experimental data for a given 200 201 compound, *i*, to

$$\Delta G^{\circ}_{\rm S}(T;i) = a_i + b_i(T - T_0) + c_i[(T - T_0) - T\ln(T/T_0)]$$
(13)

where  $a_i$ ,  $b_i$ , and  $c_i$  are fitting parameters. The form of eq 13 is motivated by eq 2, which yields

$$a_i = \Delta G^{\circ}_{\rm S}(T_0) \tag{14}$$

During the development of SM6T, we considered using a 204number of different functions instead of eq 13 including 205 polynomial fits, the van't Hoff model, and a commonly used 206 variant of the thermodynamic equation for the free energy of 207 solvation proposed by Clarke and Glew.45 We found that both 208 the equation proposed by Clarke and Glew<sup>45</sup> and a second-order 209 polynomial produced fits of equal accuracy to eq 13, but as 210211neither was *more* accurate, we retained the form of eq 13.

The overall product of this analysis is a database of evaluated data. A listing of the individual compounds, the number of experimental points used for each compound, the temperature range covered, and the sources for the data used in the database is available in the Supporting Information.

The database is composed of 2364 aqueous free energies of 217solvation with temperatures ranging from 273 to 373 K for 182 218compounds composed of H, C, and O. The database includes a 219 variety of types of compounds including alkanes, alkenes, 220 221alkynes, cyclic alkanes, aromatics, alcohols, alkenols, cyclic alcohols, phenols, ethers, cyclic ethers, esters, and carboxylic 222 acids. Table 1 shows that the database has a disproportionately 223224large number of alcohols in comparison to the number of 225alkynes. Due to the experimental difficulties associated with measuring the equilibria of some of these solutes, particularly 226 227 branched alkanes and unsaturated alkanes in aqueous solution, we often had to find compounds with combinations of func-228

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class of compound	no. of points	no. of compounds
unbranched alkanes	123	8
branched alkanes	49	6
cyclic alkanes	96	11
alkenes and alkynes	44	5
aromatics	459	22
alcohols, phenols, and water	702	47
aldehydes	142	13
ketones	236	18
ethers	115	12
esters	332	32
carboxylic acids	58	7
total	2356	181

tionalities that were more soluble. To ensure that the fit does 229 not suffer from this uneven availability of data, the database 230 was divided into 11 classes, based on functional groups, and a 231 weighted error function was used in the parametrization. This 232 will be described further in section 3.C. 233

#### 3. Model Development

We must first describe certain key aspects of SM6 so that a description of SM6T will be clear. Then, we will introduce the functional form used to predict the temperature dependence of the free energy of solvation. We will also discuss tentative parametrizations of the model. Finally, we will present the final choice of functional form and the parameters used to develop the model. 241

**3.A. SM6.** SM6 is the latest in a sequence of closely related 242 solvation models, with the original called SM1<sup>32,46</sup> and the 243 penultimate called SM5.43R;<sup>47,48</sup> collectively, the models are 244 referred to as SMx. SM6 is an implicit solvation model<sup>1,2,49,50</sup> 245used to calculate the free energy of solvation by approximating 246 the solvent medium as a dielectric continuum, approximating 247the solute charge density as a collection of atom-centered partial 248 atomic charges and approximating the solute cavity as a set of 249 overlapping atom-centered spheres. In SM6, the free energy of 250solvation is partitioned into two contributions 251

$$\Delta G_{\rm S}^{\circ} = \Delta G_{\rm ENP} + G_{\rm CDS} \tag{15}$$

where  $\Delta G_{\text{ENP}}$  is the contribution due to electrostatic interactions 252between the solute and the bulk solution and  $G_{\text{CDS}}$  is a 253parametrized term designed to account for first-solvation-shell 254effects and for approximations used in the calculation of  $\Delta G_{\text{ENP}}$ . 255As discussed elsewhere,<sup>2,50,51</sup> the decomposition of eq 15 is not 256well defined. However, a key working principle of the SMx 257 models is that we define  $\Delta G_{\text{ENP}}$  as the Coulombic contribution 258calculated by bulk electrostatics for a given choice of intrinsic 259atomic radii called the Coulomb radii, which are assumed to 260 be independent of atomic charge, hybridization state, and 261 solvent. The usefulness of this principle has been validated by 262 the success of the SMx models. To anticipate section 3.B, we 263 note that a key element of SM6T is that these Coulomb radii 264 are independent of temperature. 265

The bulk electrostatic component of the free energy of 266 solvation is calculated as the sum of two contributions 267

$$\Delta G_{\rm ENP} = \Delta E_{\rm EN} + G_{\rm P} \tag{16}$$

where  $\Delta E_{\rm EN}$  is the change in the solute's internal free energy 268 upon insertion into solution from the gas phase and  $G_{\rm P}$  is the 269 free energy of polarization. In practice, we usually retain only 270

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the electronic contribution to  $\Delta E_{\text{EN}}$ , assuming that the vibrationallibrational-rotational contributions are small enough to be neglected.

The free energy of polarization is the free energy change 274associated with a bulk electrostatic treatment of the favorable 275solute-solvent electrostatic interactions that form upon insertion 276 277of the solute into the solvent and the accompanying distortion 278of the solvent molecules and the solvent structure from the pure 279 solvent state. The electrostatic interactions between the partial 280 atomic charges of the solute and the surrounding dielectric medium are calculated using the generalized Born equation<sup>32,52-54</sup> 281

$$G_{\rm P} = -\frac{1}{2} \left( 1 - \frac{1}{\epsilon} \right) \sum_{k,k'} q_k q_{k'} \gamma_{kk'} \tag{17}$$

where the right-hand side of the equation is a double sum over all the atoms *k* and *k'* in the solute,  $q_k$  is the partial atomic charge of atom *k* computed using charge model 4 (CM4),<sup>12</sup>  $\epsilon$  is the temperature-dependent dielectric constant of the solvent, and  $\gamma_{kk'}$  is the Coulomb integral between atoms *k* and *k'*. The Coulomb integral is calculated as<sup>54</sup>

$$\gamma_{kk'} = \frac{1}{\sqrt{R_{kk'}^2 + \alpha_k \alpha_{k'} \exp(r_{kk'}^2/d_{kk'} \alpha_k \alpha_{k'})}}$$
(18)

where  $r_{kk'}$  is the distance between atoms k and k',  $d_{kk'}$  is a parameter,<sup>12</sup> and  $\alpha_k$  is an effective Born radius for atom k that depends on the solute geometry and the Coulomb radius of each atom in the solute. The Coulomb radii were determined in a prior paper.<sup>12</sup>

The change in internal energy upon insertion of the solute 293into liquid solution from the gas phase,  $\Delta E_{\rm EN}$ , has two 294 295contributions:  $\Delta E_{\rm E}$  which is the energy required to distort the 296 solute electronic structure from its gas-phase optimum and  $\Delta E_{\rm N}$ 297 which is the equivalent cost associated with distortion of the solute geometry from its gas-phase optimum. The total  $\Delta G_{\text{ENP}}$ 298 is minimized in a self-consistent reaction field (SCRF)<sup>2,55</sup> 299 calculation. The energy change associated with distortion of the 300 solute geometry,  $\Delta E_{\rm N}$ , can be calculated by optimizing the solute 301 geometry for the relaxed solute electronic structure. This latter 302 303 process can be relatively time-consuming, since the solute electronic structure is iteratively computed for each step in the 304 optimization of the solute geometry in solution. One option that 305 has been explored in previous work<sup>56</sup> is to use the solute gas-306 phase geometry and to allow only the electronic structure to 307 relax in solution. We have found that this approximation yields 308 309 reliable results for most cases; in particular, the effect of 310 optimization of the solute structure in solution on the overall free energy of solvation is relatively small for molecules used 311 in our parametrization databases.<sup>56</sup> 312

As mentioned above,  $G_{CDS}$  is an empirically derived term 313 designed to minimize the deviation between experiment and 314 $\Delta G_{\text{ENP}}$ . It is intended to account for solvation phenomena that 315are not included in the bulk electrostatic term. It includes the 316 free energy cost associated with forming a solute-shaped cavity 317 in the solvent, changes in solvent structure beyond those 318 included in  $\Delta E_{\rm EN}$ , nonelectrostatic phenomena such as dispersion 319 and Pauli exchange-repulsion, and any approximations used 320 in the calculation of  $\Delta G_{\text{ENP}}$ . Previous studies<sup>32,49,57-60</sup> have 321shown that these phenomena are proportional to the solvent 322accessible surface area $^{61-64}$  (SASA) of the solute cavity. Note 323 that the atomic radii used to define the SASA for the  $G_{CDS}$  term 324 are not in general the same as the Coulomb radii. In particular, 325 we use the radii of Bondi<sup>65</sup> for this purpose. 326

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The  $G_{\text{CDS}}$  term has the following form

$$G_{\rm CDS} = \sum_{k} \sigma_k A_k \tag{19}$$

where the sum is over all atoms k in the solute,  $A_k$  is the solvent 328 accessible surface area of atom k, and  $\sigma_k$  is a parametrized 329 functional which is written as 330

$$\sigma_k = \tilde{\sigma}_{Z_k} + \sum_{m \neq k} \sum_{\tau} \tilde{\sigma}_{Z_k Z_m \tau} F_{Z_k Z_m \tau}(\{r_{km}\})$$
(20)

where the sum is over all the atoms *m* in the molecule except 331 k, the sum over  $\tau$  is over one or two types of  $F_{Z_k Z_m \tau}$ ,  $\tilde{\sigma}_{Z_k}$  is a 332 coefficient that depends on the atomic number,  $Z_k$ , of atom k, 333  $\tilde{\sigma}_{Z_k Z_m \tau}$  is a coefficient that depends on the atomic numbers,  $Z_k$ 334and  $Z_m$ , of atoms k and m and the type,  $\tau$ , of geometric factor 335  $F_{Z_k Z_m \tau}$ . The function  $F_{Z_k Z_m \tau}$  is designed to account for the 336 dependence of atomic properties on the nature of the functional 337 group in which the atom appears.  $F_{Z_k Z_m \tau}$  depends on the set  $\{r_{km}\}$ 338 of all of the internuclear distances in the molecule. For 339 compounds containing H, C, and O, SM6 has three  $\sigma_Z$ 340 coefficients,  $\tilde{\sigma}_1$ ,  $\tilde{\sigma}_6$ , and  $\tilde{\sigma}_8$  corresponding respectively to H, C, 341 and O, and six  $\tilde{\sigma}_{ZZ'\tau}$  coefficients,  $\tilde{\sigma}_{161}$ ,  $\tilde{\sigma}_{181}$ ,  $\tilde{\sigma}_{661}$ ,  $\tilde{\sigma}_{662}$ ,  $\tilde{\sigma}_{861}$ , and 342 $\tilde{\sigma}_{881}$ . 343

An important point to note is that calculated solute properties 344 depend on the choice of electronic structure theory and basis 345 set. It has been found<sup>12</sup> that the coefficients used to compute 346  $G_{\text{CDS}}$  vary somewhat depending on the choice of basis set, but 347 in SM6 and SM6T, we take them to be independent of other 348 aspects of the electronic structure theory chosen (for example, 349 they are independent of which density functional is used). 350

**3.B. SM6T.** Using the definition in eq 12 and motivated by eq 15, we partition the temperature dependence of the free energy of solvation as 353

$$\Delta \Delta G_{\rm S}^{\circ} = \Delta \Delta G_{\rm ENP}(T) + \Delta G_{\rm CDS}(T) \tag{21}$$

where  $\Delta\Delta G_{\rm ENP}$  is the temperature dependence associated with  $\Delta G_{\rm ENP}$  and  $\Delta G_{\rm CDS}$  is an empirically derived term designed to 355 account for the temperature dependence of first-solvation-shell 356 phenomena and other approximations associated with use of 357 the generalized Born equation and the way we use it. 358

The first term on the right-hand side of eq 21 is directly 359 calculated as 360

$$\Delta\Delta G_{\rm ENP}(T) = \Delta G_{\rm ENP}(T) - \Delta G_{\rm ENP}(T_0)$$
(22)

As described in section 3.A, the bulk electrostatic contribution 361 to the free energy of solvation depends on the partial atomic 362 charges of the solute, the Coulomb radii of the solute atoms, 363 the solute geometry, and the dielectric constant of the solvent, 364 all of which might, in principle, depend on temperature. Thus, 365 a strategic decision is required for how to model  $\Delta G_{\rm ENP}$ . 366

There has been some discussion<sup>5,36,66-70</sup> concerning the use 367 of temperature-dependent radii to describe the electrostatics of 368 the solute cavity. An argument<sup>69</sup> can be made in favor of such 369 an approach based on the observation from statistical mechanical 370 studies that the radial distribution of water around a solute 371 changes as a function of temperature.<sup>66</sup> There have also been 372 studies<sup>70,71</sup> that used the isothermal compressibility of the solvent 373to model the temperature dependence of the solute radii in 374solution. However, the idea that the radii used to define the 375 solute cavity describe a physical boundary is oversimplified. $^{1-3,50}$ 376 Therefore, on the basis of the principle discussed below eq 15. 377 we treat the Coulomb radii as constant (i.e., independent of *T*). 378

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**Figure 1.** Experimental ( $\blacklozenge$ ) free energy of solvation for benzene in water as a function of temperature compared to the corresponding computed values of  $\Delta G_{\text{ENP}}(T)$  ( $\blacksquare$ ) and  $G_{\text{CDS}}(T)$  ( $\blacktriangle$ ).

Furthermore, in keeping with the discussion above of  $\Delta E_{\rm N}$ , we 379 neglect, at least in the parametrization step, the temperature 380 dependence of the geometry of the solute because it is small. 381 (It can be included as desired but will have an effect smaller 382 than the reliability of the aqueous SM6T model.) The temper-383 ature dependence of the dielectric constant reflects the ability 384 of the bulk solvent to reorient and polarize in response to the 385 386 solute charge density. As such, it represents a clear physical phenomenon which can be accurately simulated by incorporating 387 a temperature-dependent dielectric constant into the model. For 388 water, the temperature dependence of the dielectric constant is 389 390 well approximated by a cubic polynomial.<sup>72</sup>

The dielectric constant of water changes from 87.90 at 273 391 K to 55.58 at 373 K; however,  $G_{\rm P}$  and consequently  $\Delta G_{\rm ENP}$ 392 depend on  $(1 - (1/\epsilon))$ , which changes much less than  $\epsilon$ . For 393 example,  $\Delta G_{\text{ENP}}$  for ethyl benzene in water changes from -1.68394 kcal/mol at 273 K to -1.66 kcal/mol at 373 K, while its 395experimental free energy of solvation varies by 2.24 kcal/mol 396 (see Figure 1) over this range. The temperature dependence of 397 the bulk electrostatic contribution to the aqueous free energy 398 of solvation remains small even for solutes with larger dipole 399 moments such as furfural (dipole moment of 3.97 D),<sup>73</sup> for 400 which the bulk electrostatic contribution to the aqueous free 401 energy of solvation changes from -5.79 at 277 K to -5.74 at 402 373 K. (The temperature dependence of the electrostatic 403interaction between the solute and bulk solvent becomes 404 considerably larger for less polar solvents such as octanol. For 405 example, octanol has a dielectric constant that varies from 11.92 406 to 5.32 over the temperature range 273-373 K,72 and the 407 computed value of  $\Delta G_{\text{ENP}}$  for ethyl benzene in octanol varies 408 409 by 0.19 kcal/mol. Thus, while  $\Delta\Delta G$  does not contribute significantly to the temperature dependence of the free energy 410 of solvation in aqueous solutions, it does in nonpolar solvents.) 411

Throughout the course of this project, the bulk electrostatic 412contribution to the free energy of solvation,  $\Delta G_{\text{ENP}}$ , both at the 413reference temperature,  $T_0$ , and at the temperature of interest, T, 414 was computed using SM6 as it is implemented in MN-GSM74 415(a locally developed code that we cannot distribute due to 416 Gaussian license restrictions), in SMXGAUSS<sup>75</sup> (a code that is 417 freely available to the general scientific community and that 418 was developed within our group to integrate our solvation 419 models with Gaussian 0376), and in HONDOPLUS.77 420

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Since the temperature dependence of the bulk electrostatic 421 contribution to the free energy of solvation in water is negligible, 422 the  $\Delta G$  term incorporates almost all of the temperature 423 dependence of the aqueous free energy of solvation in the SM6T 424 model. This term may be written as 425

$$\Delta G_{\rm CDS} = G_{\rm CDS}(T) - G_{\rm CDS}(T_0) \tag{23}$$

Comparing eq 23 to eq 2 suggests that we model this as

$$\Delta G_{\rm CDS} = B(T - T_0) + C[(T - T_0) - T\ln(T/T_0)] \quad (24)$$

where *B* and *C* are parameters of the model. As in the SM6 427 model for  $G_{\text{CDS}}$ , we model  $\Delta G_{\text{CDS}}$  as being proportional to 428 solvent-exposed surface areas.<sup>2,32,49–51,78</sup> We applied the same 429 functions and solvent accessible surface areas used in eqs 19 430 and 20 to calculate *B* and *C* 431

$$B = \sum_{k} \sigma_{k}^{B} A_{k} \tag{25}$$

$$C = \sum_{k} \sigma_{k}^{C} A_{k} \tag{26}$$

where  $\sigma_k^B$  and  $\sigma_k^C$  are parametrized as

$$\sigma_k^B = \tilde{\sigma}_{Z_k}^B + \sum_{m \neq k} \sum_{\tau} \tilde{\sigma}_{Z_k Z_m \tau}^B F_{Z_k Z_m \tau}(\{r_{km}\})$$
(27)

$$\sigma_k^C = \tilde{\sigma}_{Z_k}^C + \sum_{m \neq k} \sum_{\tau} \tilde{\sigma}_{Z_k Z_m \tau}^C F_{Z_k Z_m \tau}(\{r_{km}\})$$
(28)

where  $\tilde{\sigma}^{B}_{Z_{k}}, \tilde{\sigma}^{C}_{Z_{k}}, \tilde{\sigma}^{B}_{Z_{k}Z_{m}\tau}$ , and  $\tilde{\sigma}^{C}_{Z_{k}Z_{m}\tau}$  are coefficients that depend on 433 the atomic numbers of atoms k and m. Since  $F_{881}$  primarily 434 distinguishes peroxides from other oxygen-containing solutes 435 and since the database used here for SM6T has no peroxides, 436  $\tilde{\sigma}^{B}_{881}$  and  $\tilde{\sigma}^{C}_{881}$  were not used. Thus, there are potentially as 437many as 16 parameters in SM6T, 8 for B and 8 for C. However, 438 we will reduce the number of independent parameters during 439 the fit, which is discussed in section 3.D. 440

**3.C. Error Function.** Several key classes of compounds are 441 under-represented in the database used to develop parameters 442 for the coefficients *B* and *C*. The disproportionate number of 443 alcohols versus unsaturated alkanes arose due to the scarcity of 444 experimental solubility data for the latter. To account for this, 445 a weighted error function was used. The error function is defined as 447

$$D = \sum_{t=1}^{11} \sum_{m=1}^{s_t} \sqrt{\frac{\sum_{i=1}^{n_m} (\Delta G_{\text{CDS}}(\text{exptl}; i) - \Delta G_{\text{CDS}}(\text{calcd}; i))^2}{n_m s_t^2 1 1^2}}$$
(29)

where the first sum is over all 11 classes, *t*, of compounds in 448 the database, the second sum is over all  $s_t$  compounds, *m*, in a 449 given class *t*, and the third sum is over all  $n_m$  experimental data, 450 *i*, for a given compound, *m*.  $\Delta G_{\text{CDS}}(\text{calcd};i)$  is calculated using 451 eqs 25–28, and  $\Delta G_{\text{CDS}}(\text{exptl};i)$  is the experimental value 452 obtained by 453

$$\Delta G_{\rm CDS}(\text{exptl}) = \Delta \Delta G_{\rm S}^{\circ}(T) - \Delta \Delta G_{\rm ENP}(T) \qquad (30)$$

where the first term on the right-hand side is obtained from eqs45412 and 13 and the second term is calculated by the generalized455Born approximation with temperature-independent radii.456

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The error function in eq 29 ensures that each class is weighted 457 equally and that each compound within the class is weighted 458equally with other compounds in the same class; this counteracts 459 the disproportionate number of alcohols and esters in the 460 database. The danger of this approach is that classes with fewer 461 compounds are more subject to the effects of random errors in 462 the experimental measurements for a given compound; this 463 concern has been addressed through the use of strict criteria in 464 selecting experimental data, as described in section 2.B. 465

The error function, *D*, was minimized using the generalized reduced gradient code (GRG2) of Lasdon et al.<sup>79</sup> as implemented in Microsoft Excel. The results produced by this code were compared to those produced by the NAG linear optimizer, and good agreement was found between the two.

**3.D. Parametrizations.** In this paper, all electronic structure calculations were performed using the 6-31+G(d,p)<sup>80,81</sup> basis set. Having chosen a basis set, a functional form for the predictive model, and an appropriate error function, we proceeded to determine which parameters,  $\tilde{\sigma}_{ZZ'\tau}^B$  and  $\tilde{\sigma}_{ZZ'\tau}^C$ , were necessary to accurately reproduce the experimental temperature dependence of the aqueous free energies of solvation.

478 As a first step, we considered the case where a unique pair 479 of values for B and C is determined for each individual 480 compound (we refer to this case as "molecular coefficients") 481 and the case where all of the parameters were set equal to zero 482 (we refer to this case as the "null hypothesis").

The use of molecular coefficients corresponds to the best case scenario for any model that uses eq 24 to calculate  $\Delta G_{\text{CDS}}$ , and it can also be considered to give a rough estimate of the nonsystematic experimental error in the temperature dependence of the free energies of solvation in our database. Table 2 shows that such nonsystematic errors produce a mean unsigned error of only 0.02 kcal/mol, on average.

The null hypothesis, in contrast, corresponds to assuming that 490  $G_{\text{CDS}}$  does not change as a function of temperature. Table 2 491 shows that this produces a mean unsigned error of 0.53 kcal/ 492 mol, which is considerably larger than 0.02 kcal/mol. Clearly 493 then, G<sub>CDS</sub> does exhibit temperature dependence. Since SM6 494 can reliably reproduce free energies of solvation to within an 495 average error of  $\sim 0.5$  kcal/mol,<sup>12</sup> a variation of the free energy 496 497 of solvation by 0.53 kcal/mol is quite significant.

The error in the temperature dependence of free energies of 498 solvation and the error in free energies of solvation, which we 499 estimate<sup>47</sup> to be around 0.2 kcal/mol, are two distinct properties. 500 The estimated experimental error in the temperature dependence 501 of the free energies of solvation using the molecular coefficients 502 (0.02 kcal/mol) is considerably smaller than the typical estimated 503error in the experimental determination of absolute free energies 504of solvation. 505

506 Next, we performed a parametrization against the entire database using the full set of 16 coefficients labeled  $\tilde{\sigma}_1^B$ ,  $\tilde{\sigma}_6^B$ ,  $\tilde{\sigma}_8^B$ , 507  $\tilde{\sigma}_{161}^{B}, \tilde{\sigma}_{181}^{B}, \tilde{\sigma}_{661}^{B}, \tilde{\sigma}_{662}^{B}, \tilde{\sigma}_{861}^{B}, \tilde{\sigma}_{1}^{C}, \tilde{\sigma}_{6}^{C}, \tilde{\sigma}_{8}^{C}, \tilde{\sigma}_{161}^{C}, \tilde{\sigma}_{181}^{C}, \tilde{\sigma}_{661}^{C}, \tilde{\sigma}_{662}^{C}, \text{and}$ 508  $\tilde{\sigma}_{861}^{C}$ . Analysis of the covariance between the various param-509eters indicated considerable redundancy in the parameters. The 510covariance between the parameters in the 16-parameter fit 511showed that  $\tilde{\sigma}_{\rm H}^{B}$  and  $\tilde{\sigma}_{\rm H}^{C}$  were highly correlated with the remaining parameters and thus could be discarded. This reduces 512513the number of parameters to 14; the resulting fit with 14 514parameters is called the "unrestricted" fit, and Table 2 shows 515516that the unrestricted fit produces a mean unsigned error of 0.07 kcal/mol. Table 3 shows the value for each coefficient obtained 517by parametrizing the unrestricted fit against the entire database. 518 Our next step was to determine how to further reduce the 519

TABLE 2: Mean Signed Error (MSE), Mean Unsigned Error (MUE), and Root Mean Squared Error (RMSE) for Each Class of Compounds (kcal/mol) for Various Parameterizations of SM6T

	MSE	MUE	RMSE	MSE	MUE	RMSE
	Molecular Coefficients			Null Hypothesis		
unbranched alkanes	0.00	0.05	0.06	-0.39	0.61	0.80
branched alkanes	0.00	0.02	0.02	-0.26	0.62	0.79
cyclic alkanes	0.00	0.01	0.01	-0.04	0.38	0.47
alkenes and alkynes	0.00	0.01	0.01	-0.19	0.28	0.37
aromatics	0.00	0.02	0.03	-0.03	0.31	0.39
alcohols, phenols, and water	0.00	0.03	0.03	-0.58	0.83	1.00
aldehydes	0.00	0.03	0.03	-0.16	0.38	0.46
ketones	0.00	0.03	0.04	-0.36	0.63	0.76
ethers	0.00	0.02	0.03	-0.23	0.58	0.70
esters	0.00	0.02	0.03	-0.39	0.69	0.81
carboxylic acids	0.00	0.02	0.03	-0.22	0.50	0.59
average	0.00	0.02	0.03	-0.26	0.53	0.65
	U	nrestric	ted	van't Hoff		
unbranched alkanes	-0.01	0.07	0.08	0.03	0.10	0.13
branched alkanes	-0.04	0.13	0.15	0.01	0.16	0.21
cyclic alkanes	-0.01	0.03	0.04	0.02	0.06	0.08
alkenes and alkynes	0.03	0.06	0.08	0.01	0.06	0.09
aromatics	0.01	0.06	0.07	0.04	0.07	0.10
alcohols, pahenols,	0.03	0.09	0.11	0.04	0.11	0.14
aldebydes	-0.01	0.07	0.08	0.00	0.10	0.12
kotonos	-0.01	0.07	0.03	0.00	0.10	0.12
others	-0.01	0.00	0.07	0.02	0.09	0.11
ectors	0.04	0.08	0.09	0.00	0.09	0.11
carboxylic acide	-0.01	0.09	0.01	0.07	0.11	0.15
average	0.01	0.00	0.00	0.00	0.07	0.09
average	0.00	0.07	0.09	0.02	0.09	0.12
	0.01	Final	0.00			
unbranched alkanes	-0.01	0.08	0.09			
branched alkanes	-0.04	0.13	0.15			
cyclic alkanes	-0.02	0.04	0.05			
alkenes and alkynes	0.02	0.07	0.09			
aromatics	0.00	0.07	0.09			
alcohols, phenols, and water	0.02	0.10	0.11			
aldehydes	-0.01	0.08	0.09			
ketones	-0.01	0.06	0.07			
ethers	-0.04	0.08	0.10			
esters	0.02	0.08	0.10			
carboxylic acids	-0.01	0.06	0.07			
average	-0.01	0.08	0.09			

TABLE 3: Coefficients Used for Each Parametrization (cal  $\mathring{A}^{-2}\ mol^{-1}\ K^{-1})$ 

	6	8	161	181	661	662	861
	Paramet	ers Used i	in Calc	ulation c	of <i>B</i> Coeffi	cient	
unrestricted	38.52	1.96	25.85	73.26	-24.36	-12.51	-8.54
van't Hoff	22.49	17.53	22.34	54.76	-13.07	4.25	-26.23
final SM6T	2.18	2.18	29.47	71.95	2.18	2.18	2.18
Parameters Used in Calculation of C Coefficient							
unrestricted	247.79	-200.07	43.70	294.55	-155.43	-370.03	246.44
final SM6T	-84.45	-84.45	78.59	166.23	78.59	-266.91	166.23

number of parameters without appreciably increasing the error 520 of the model. 521

For the purpose of testing whether the coefficient C was 522necessary, we parametrized the model using just the coefficient 523B. Calculations employing only the coefficient B involved seven 524parameters, five corresponding to the C, O, H-O, H-C, and 525O-C bonds and two corresponding to C-C bonds (these 526 parameters are also given in Table 3). Table 2 shows that this 527 "van't Hoff" fit is reasonably accurate, with a mean unsigned 528error of 0.09 kcal/mol. However, if one inspects the predicted 529 temperature dependence of the aqueous free energies of solva-530



**Figure 2.** Experimental ( $\blacklozenge$ ) value of  $\Delta G_{\text{CDS}}$  for benzene compared to various possible parametrizations of SM6T: unrestricted (- + -); van't Hoff (-); final  $(- \times -)$ 

tion and compares those values to the experimental data for 531532 some representative compounds such as benzene (see Figure 2), one immediately sees that the van't Hoff fit fails to capture 533the obvious curvature in the experimental data. 534

We also considered combining parameters into a single 535 general parameter. We found after a careful analysis of the 536 covariance matrices, observing the values of the different 537parameters, and through trial and error that  $\tilde{\sigma}_6^B$ ,  $\tilde{\sigma}_8^B$ ,  $\tilde{\sigma}_{661}^B$ ,  $\tilde{\sigma}_{662}^B$ , and  $\tilde{\sigma}_{861}^B$  could be set equal to a single "general" parameter, 538 539 $\tilde{\sigma}_{b1}^{B}$ , with relatively little effect on the accuracy or apparent 540physicality of the model. However, we found that combination 541of either  $\tilde{\sigma}_{181}^B$  or  $\tilde{\sigma}_{161}^B$  with  $\tilde{\sigma}_{b1}^B$  or removal of either of these coefficients significantly reduced the accuracy of the model. 542543 We also observed that  $\tilde{\sigma}_{b1}^{B}$  was quite small and that removal of 544 this parameter introduced relatively little additional error into 545546 the model.

547 We also considered combining parameters for the C coef-548ficient. The approach which sacrificed the least accuracy involved setting  $\tilde{\sigma}_{6}^{C}$  and  $\tilde{\sigma}_{8}^{C}$  equal to a single parameter,  $\tilde{\sigma}_{c1}^{C}$ ,  $\tilde{\sigma}_{161}^{C}$  and  $\tilde{\sigma}_{661}^{C}$  equal to a single parameter,  $\tilde{\sigma}_{c2}^{C}$ , and  $\tilde{\sigma}_{181}^{C}$  and  $\tilde{\sigma}_{861}^{C}$ 549 550 equal to a single parameter,  $\tilde{\sigma}_{c3}^{C}$  (see "final" parametrization in 551 Table 2). With these restrictions, the mean unsigned error of 552the model changed by less than 0.02 kcal/mol relative to the 553 unrestricted parametrization. 554

Our final model uses a total of seven parameters to predict 555the temperature dependence of the free energy of solvation; three 556 parameters,  $\tilde{\sigma}_{161}^B$ ,  $\tilde{\sigma}_{181}^B$ , and  $\tilde{\sigma}_{b1}^B$ , are used to predict the *B* coefficient, and four parameters,  $\tilde{\sigma}_{662}^C$ ,  $\tilde{\sigma}_{c1}^C$ ,  $\tilde{\sigma}_{c2}^C$ , and  $\tilde{\sigma}_{c3}^C$ , are used to predict the *C* coefficient. This model is the most 557 558 559 attractive because it introduces parameters with relatively small 560 561 values as opposed to those for the unrestricted parametrization 562(as is shown in Table 3). Parametrizations with smaller values of the parameters are less likely to predict unphysical values 563 when applied to problems outside its applicable range, for 564example, if the model were to be applied to functional groups 565



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**Figure 3.** Experimental ( $\blacklozenge$ ) value of  $\Delta G_{\text{CDS}}$  for ethoxyethane compared to various possible parametrizations of SM6T: unrestricted (-+-); van't Hoff (-); final (-  $\times$  -).

that were not included in the data set. The choice of four 566 parameters,  $\tilde{\sigma}_{662}^C$ ,  $\tilde{\sigma}_{c1}^C$ ,  $\tilde{\sigma}_{c2}^C$ , and  $\tilde{\sigma}_{c3}^C$ , for the prediction of the C 567 coefficient is based on the empirical observation that the errors 568 in the model do not change significantly relative to the 569 unrestricted model. 570

The predictions of the final parametrization do not vary significantly from those of the unrestricted parametrization. Figures 2-4 show each parametrization compared to the experimental temperature dependence of the free energy of 574solvation for benzene, ethoxyethane, and furfural, and one sees 575relatively good agreement between the results of the various 576 parametrizations. Even at high temperatures around 373 K, both 577 the final parametrization and the unrestricted parametrization 578predict very similar values for  $\Delta\Delta G_{\rm S}^{\circ}$ . The final parametriza-579 tion reproduces the temperature dependence of the free energy 580of solvation with more accuracy than the fit using just the B581 coefficient with an equal number of parameters (seven param-582 eters). 583

The final parametrization uses unique values for the  $\tilde{\sigma}_{161}^B$ 584and the  $\tilde{\sigma}^{B}_{181}$  parameters. This is physically reasonable because 585it suggests that the hydrophobic effect, which is proportional 586 to the number of CH groups exposed to the surrounding water, 587 and the formation of hydrogen bonds with OH groups contribute 588 in different ways to the entropy of solvation. The single general 589 parameter,  $\tilde{\sigma}_{b1}^{B}$ , is retained; while the main contributions to the 590 entropy of solvation in water may arise from the OH and CH 591 groups, this may not necessarily be the case in nonaqueous 592 solvents in which case the general parameter may contribute 593 significantly to the accuracy of SM6T. 594

3.E. Predicting Thermodynamic Properties. In section 3.D., 595 we showed that a parametrized model based on solvent 596 accessible surface areas can reproduce the temperature depen-597 dence of aqueous free energies of solvation quite well. This 598 model predicts two coefficients, B and C, which for the case of 599 aqueous solutions correspond respectively to the entropy and 600 heat capacity of solvation (compare eq 24 to eq 2). Table 4 601

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**Figure 4.** Experimental ( $\blacklozenge$ ) value of  $\Delta G_{\text{CDS}}$  for furfural compared to various possible parametrizations of SM6T: unrestricted (- + -); van't Hoff (-); final (- × -).

compares the predicted values of B using the various param-602 etrizations discussed above to experimental<sup>82-85</sup> and theoretical 603 estimates of the entropy of solvation, such as those based on 604 explicit solvent models by Gallichio et al.,<sup>86</sup> Cui et al.,<sup>87,88</sup> 605 Schravendijk et al.,89 and Rick.90 Table 5 compares the predicted 606 values of C to estimates of the heat capacity of solvation 607 obtained from experimental work<sup>15,91-101</sup> and from the theoreti-608 cal work of Graziano.<sup>102</sup> Previous estimates of these thermo-609 dynamic properties vary quite considerably between authors. 610 For instance, note the large difference between the values for 611 the entropy of solvation reported by Abraham et al.<sup>84</sup> and 612 Wilhelm et al.<sup>85</sup> in Table 4. Furthermore, the values we obtained 613 from a direct fit of the experimental data for each compound in 614615 our database (in the column labeled "molecular coefficients" in Tables 4 and 5) can vary quite considerably from other 616 experimental sources. Franks et al.<sup>92</sup> pointed out that the entropy 617 and heat capacity of solvation are difficult to obtain experi-618 mentally and require a considerable number of measurements-619 they estimated at least 40-over a relatively broad temperature 620 621 range to accurately obtain such information. In some cases, our 622 final choice of parameters for SM6T produces estimates of the entropy and heat capacity of solvation that agree better with 623 the literature than our molecular coefficients. This may indicate 624 that the final fit is more reliable than fitting each individual 625 molecule because the considerable noise due to the sparsity of 626 data for some compounds is averaged out to some extent when 627 fitting the whole data set. 628

We emphasized in sections 3.A and 3.B that the partitioning 629 of solvent effects between the two terms of eq 15,  $\Delta G_{\text{ENP}}$  and 630  $G_{\text{CDS}}$ , or the two terms of eq 21,  $\Delta\Delta G_{\text{ENP}}$  and  $\Delta G_{\text{CDS}}$ , is 631 somewhat arbitrary. We use a fixed cavity size (i.e., our radii 632 are independent of temperature). The extent that the electrostatic 633 634 terms would change in either of these equations if the temperature dependence of the "true" Coulomb radii were included 635 is, to first order, associated with the region at the solute-solvent 636 637 boundary, and hence, it is equally well treated by the firstsolvation-shell terms. However, changing the Coulomb radii has 638

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the second-order effect that it would also change the calculated 639 partial atomic charges of the solute, which would affect the long-640 range electrostatic interactions. This effect is not as obviously 641 related to the solvent accessible surface area, but the success 642 of our model argues that either the effect is small or it can be 643 modeled well using surface tensions. We have observed this 644 effect numerous times with our prior models.<sup>12,51,103</sup> That is, 645 the choice of Coulomb radii has little effect on the accuracy of 646 the SMx models for neutral compounds provided that the surface 647 tensions are reoptimized as well, indicating that surface tensions 648 can account for the differences in  $\Delta G_{\rm ENP}$  due to different 649 Coulomb radii. In our model, since  $\Delta\Delta G_{\text{ENP}}$  is small, it was 650 not necessary to partition it into enthalpic and entropic contribu-651 tions (it is essentially all enthalpic, with negligible entropy and 652 heat capacity). An alternative approach, first implemented by 653 Bonnaccorsi et al.,<sup>71</sup> is to compute the change in  $\Delta G_{\text{ENP}}$  due to 654the temperature dependence of the electrostatic cavity using the 655 coefficient of thermal expansion.<sup>70,71</sup> 656

SM6T does not account for the temperature dependence of 657 the heat capacity of solvation, which can be significant.<sup>15,102</sup> 658 To test the effect of the variation of the heat capacity on the 659 free energy of solvation we compared the free energy of 660 solvation for benzene in water at 373 K computed using a 661 temperature-independent heat capacity obtained from the fit of 662 our experimental data using eq 13 to a temperature-dependent 663 heat capacity predicted using a model reported by Bakk and 664 Hoye.<sup>15</sup> We used the same SM6 free energies and SM6T 665 entropies of solvation at 298 K for both types of heat capacities. 666 First, we compared the temperature-independent heat capacity 667 of solvation ( $\Delta C_{P,S}^{\circ} \approx 70.3$  cal mol<sup>-1</sup> K<sup>-1</sup>) to the heat capacity 668 at 298 K obtained from the model of Bakk and Hoye15 669  $(\Delta C_{PS}^{\circ}(298 \text{ K}) \approx 68.8 \text{ cal mol}^{-1} \text{ K}^{-1})$ . We found that a 670 difference of 1.5 cal mol<sup>-1</sup> K<sup>-1</sup> between the two heat capacities 671 produces a difference of 0.01 kcal/mol in the aqueous free 672 energy of solvation for benzene at 373 K, which is well within 673 the error of SM6T. Then, we compared free energies of solvation 674 computed using the temperature-independent heat capacity and 675 the temperature-dependent heat capacity at 373 K ( $\Delta C_{PS}^{\circ}(373)$ 676 K)  $\approx$  54.4 cal mol<sup>-1</sup> K<sup>-1</sup>), and we found a difference of 0.14 677 kcal/mol between the two calculations. Such an error is 678 comparable to the deviation of SM6T from the experimental 679 temperature dependence of the free energy of solvation of 680 benzene at 373 K, but it is much smaller than the absolute error 681 of SM6. In the interest of minimizing the number of parameters 682 in our model and to avoid including poorly determined small 683 terms, we do not include the temperature dependence of the 684 heat capacity of solvation, but it is evident that the assumption 685 of a temperature-independent heat capacity of solvation does 686 introduce some error. 687

From the standpoint of our model, which was simultaneously 688 parametrized to predict both linear and logarithmic terms in the 689 temperature dependence of the free energy of solvation, the 690 computation of the entropy and heat capacity of solvation is 691 further complicated because contributions from the linear and 692 logarithmic terms may partially cancel one another to produce 693 reliable and accurate free energies of solvation without neces-694 sarily producing a model suitable for predicting the entropy and 695 heat capacity of solvation. In particular, one should note that 696 in Table 3 some of the coefficients for the heat capacity of 697 solvation are negative while experimental heat capacities of 698 solvation are positive. This in itself need not be meaningful 699 because one adds environmentally dependent contributions from 700 all of the atoms in a molecule to obtain the net C coefficient 701 for the molecule. Application of SM6T to the database yields 702

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	SM	16T parametrizatio				
	molecular coefficients	unrestricted	van't Hoff	final	experimental literature	theoretical literature
methane	-18	-16	-12	-11	$-32^{a}, -16^{b}$	$-15^{c}, -13^{d}$
ethane	-22	-18	-15	-16	$-36^{a}, -20^{b}$	$-19^{c}, -25^{d}$
propane	-24	-22	-18	-21	$-39^{a}, -23^{b}$	$-40^{d}$
butane	-28	-26	-22	-25	$-42^{a}$	$-26^{\circ}$
hexane	-35	-34	-28	-34	$-11^{e}$	$-32^{c}$
cyclohexane	-28	-27	-23	-30	$-11^{e}$	$-30^{\circ}$
benzene	-21	-18	-15	-19	$-21^{f}$	$-19^{g}$ $-15^{h}$ $-8.7^{h}$

TABLE 4: Theoretical and Experimental Entropies of Solvation (cal  $mol^{-1} K^{-1}$ ) from the Literature Compared to Predictions Based on Various Parametrizations

<sup>*a*</sup> Abraham et al.<sup>84</sup> <sup>*b*</sup> Wilhelm et al.<sup>85</sup> <sup>*c*</sup> Gallichio et al.<sup>86</sup> <sup>*d*</sup> Cui et al.<sup>87,88</sup> <sup>*e*</sup> Ben-Naim et al.<sup>82</sup> <sup>*f*</sup> Makhatadze and Privalov.<sup>83</sup> <sup>*g*</sup> Schravendijk et al.<sup>89</sup> <sup>*h*</sup> Rick.<sup>90</sup>

TABLE 5: Experimental Heat Capacities of Solvation (cal  $mol^{-1} K^{-1}$ ) from the Literature Compared to Predictions Based on Various Parameterizations

	SM6T pa	arameterizatio		
	molecular coefficients	unrestricted	final	literature
ethane	68	54	34	70, <sup>a</sup> 67, <sup>b</sup> 95, <sup>c</sup> 65 <sup>d</sup>
propane	73	60	47	81, <sup>a</sup> 78, <sup>b</sup> 76 <sup>d</sup>
butane	84	68	59	$102^{a}, 95^{b}$
pentane	70	76	70	108 <sup>a</sup>
hexane	104	84	82	119 <sup>a</sup>
cyclohexane	42	56	79	$100^{e}$
benzene	70	49	55	$69,^{d} 67,^{e} 72,^{f} 84,^{g} 70^{h}$
methanol	21	30	11	32 <sup>i</sup>
ethanol	117	33	30	$48^{i}$
<i>n</i> -propanol	2	40	42	64 <sup>i</sup>
butanol	70	48	54	79 <sup>i</sup>
2-butanol	92	56	53	83 <sup>i</sup>
pentanol	89	52	63	89 <sup>i</sup>

<sup>*a*</sup> Olofsson et al.<sup>96</sup> <sup>*b*</sup> Dec et al.<sup>95,97,98</sup> <sup>*c*</sup> Naghibi et al.<sup>99,100</sup> <sup>*d*</sup> Bakk and Hoye.<sup>15</sup> <sup>*e*</sup> Gill et al.<sup>94</sup> <sup>*f*</sup> Arnold et al.<sup>101</sup> <sup>*g*</sup> Franks et al.<sup>92</sup> <sup>*h*</sup> Graziano.<sup>102</sup> <sup>*i*</sup> Arnett et al.<sup>93</sup>

two instances (namely, ethyne and propyne) within the database 703 704 where the C coefficient for a molecule is negative. Also, there 705are numerous instances within the set where the sum of 706 contributions to the C coefficient from all carbon atoms is negative but is counterbalanced by a positive contribution from 707 708 the H atoms. This reflects the fact that the coefficients used to 709 compute C were chosen to best reproduce experimental free energies of solvation with a minimum of parameters and that 710 independent physical meaning cannot be assigned to the value 711712of each coefficient. This is confirmed by a study of the covariance matrices of these parameters, which shows that they 713 are not entirely independent. Noting this, and that we neglected 714 715 the temperature dependence of the heat capacity of solvation, that we assumed temperature-independent radii, and that an 716 average of only 12 experimental points per compound was used 717 718 to develop the model, we conclude that, despite the encouraging 719 agreement with data from other groups, the division of the free 720 energy of solvation predicted by SM6T into entropy and heat 721 capacity should be interpreted with caution.

#### 722 4. Software

New versions of HONDOPLUS,<sup>77,104</sup> GAMESSPLUS,<sup>105,106</sup>
 SMXGAUSS,<sup>75</sup> NWChem,<sup>107,108</sup> and Jaguar<sup>109</sup> containing SM6T
 are planned for the near future.

### 726 5. Concluding Remarks

We have developed a model for calculating the temperature
dependence of the aqueous free energy of solvation of compounds composed of H, C, and O over the temperature range

273-373 K. This involved creating an extensive database of 730 experimental free energies of solvation, selecting an appropriate 731 functional form for the model, and parametrizing the model 732 against experiment. We found that an accurate model requires 733 a heat-capacity-like term to capture the curvature of the 734temperature dependence of the free energy of solvation, that a 735 parametrized model based on solvent accessible surface areas 736 produces quite accurate results, and that the temperature 737 dependence of the dielectric constant produces relatively little 738 effect in aqueous solutions, although it is much more significant 739 in organic solutions. The model reduces the mean unsigned error 740 in the temperature dependence of the solvation free energy by 741a factor of 6.5 relative to the null hypothesis. The next step 742 will be to extend the model to broader classes of compounds 743 and to organic solvents. In future work, it would also be 744 interesting to extend the SM6T model to predict free energies 745 of solvation in near-critical and supercritical water which is the 746subject of considerable theoretical research.110-121 747

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#### Appendix 1. Derivation of eq 6

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We start with the standard thermodynamic equation relating 755 the concentration of the solute in the gas phase to the 756 concentration of the solute in solution at equilibrium<sup>28,29,37</sup> 757

$$\gamma_a^{g,x} y_a P = \gamma_a^{\infty,x} x_a P_a^{\bullet} \tag{31}$$

where  $y_a$  is the mole fraction of compound *a* in the gas phase, 758 *P* is the total vapor pressure,  $\gamma_a^{g,x}$  is the activity coefficient of *a* 759 in the gas phase,  $x_a$  is the mole fraction of *a* in solution,  $P_a^{\bullet}$  is 760 the vapor pressure of the pure liquid solute, and  $\gamma_a^{\infty,x}$  is the 761 infinite dilution activity coefficient. Assuming that the solute 762 behaves as an ideal gas, eq 31 can be rewritten as 763

$$\frac{\gamma_a^{\infty x} P_a^{\bullet}}{P} = \frac{y_a}{x_a} \tag{32}$$

The free energy of solvation for a standard state of 1 M in the gas phase and 1 M in solution equates to 765

$$\Delta G_{\rm S}^{\circ} = RT \ln(K_{\rm H}) = RT \ln\left(\frac{c_a}{S_a}\right) \tag{33}$$

where  $K_{\rm H}$  is the Henry's law constant,  $c_a$  is the molar 766

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#### concentration of the solute in the gas phase, and $S_a$ is the molar concentration of the solute in solution. Assuming ideality of the solute in the gas phase, we find

 $y_a = c_a \frac{RT}{P} \tag{34}$ 

Assuming that the solute is infinitely dilute in the solution yields

$$x_a = \frac{S_a}{M_{\rm w}} \tag{35}$$

where  $M_w$  is the molarity of the solvent, which in this case is water. Combining eqs 34 and 35 with eq 32 and rearranging yields

$$\frac{\gamma_a^{\infty,x} P_a^{\bullet}}{RTM_{\rm w}} = \frac{c_a}{S_a} \tag{36}$$

which, when combined with eq 33, results in eq 6.

Supporting Information Available: Tables listing the
individual compounds, the number of experimental points used
for each compound, and the references for the experimental data.
This material is available free of charge via the Internet at http://
pubs.acs.org.

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