A Novel Method for Calculation of Molecular Energies and Charge Distributions by Thermodynamic Formalization

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The paper describes a new approach to the thermodynamic formalization for calculation of molecular energy and charge distribution in ground state by means of the variational equation of DFT. In order to thermodynamically formalize the molecular calculation, the pseudo chemical potential (PCP) is conceptualized, where a molecule is broken into multi-phase(atom) one-component(electron) systems and the energy of system is represented as PCP. Calculation of the molecular energy and atomic charge by PCP is put forward, thereafter the approach is proved to be valid and its efficiency (accuracy and calculation speed) is verified.

In quantum theory for calculating molecular energy, atomic charge, structures and properties, excellent successes were achieved in calculation for many projects by establishment to ab initio and semi-empirical method of wave function theory (WFT)1–6 in that electron wave function is variable quantity of energy minimization and density-function theory (DFT)7,8 in that electron density is variable quantity.

Of course, the ab initio method of WFT is widely used for calculating the properties of the molecules because of its high accuracy9–13. However, it is infeasible for calculating the molecules with a large quantity of atoms, because the more quantity of atoms is given, the longer it takes to calculate. Therefore, less accurate DFT based on electron density has been created and used14–20. Over the past decades, much effort has been made to improve the calculation accuracy of DFT17–15,21,22. WFT, DFT and its varieties are all different in calculation accuracy and velocity, but both formalization of the variable quantity of energy minimization and the solution of the variational equation are based on the quantum theoretical formalization.

The aim of this paper is to lay foundations for the principles and methods which could determine the energy of molecules and their atomic charges by thermodynamic formalization, rather than the quantum theory.

In the variational equation which gives the electron density corresponding to minimum energy in DFT, Euler-Lagrange (EL) equation, an undefined multiplier \( \mu \) is the energy per electron and electron migration measure.

\[
\mu = \frac{\partial E}{\partial N_{\nu(r)}}
\]

(\( \mu \): chemical potential, \( E \): the energy of an electron system, \( N \): number of electrons, \( \nu(r) \): external potential).

This \( \mu \) can be also defined in the ground state of a pure molecule equal to temperature zero limit state of finite temperature thermal equilibrium system. That is

\[
\mu = \left. \frac{\partial A}{\partial N} \right|_{\nu(r)} = \left. \frac{\partial E}{\partial N} \right|_{\nu(r)} - \theta \left. \frac{\partial S}{\partial N} \right|_{\nu(r)}
\]

\( \theta \): temperature.

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The function in proportion to logarithm of electron number, hereafter called PCP, which is formulated as follows:

\[
\mu = \frac{\partial E}{\partial N} = \lim_{\theta \rightarrow 0} \frac{\partial A}{\partial N}
\]

(3)

where \(\theta\) is finite temperature of the thermal equilibrium system, \(A\) is the free energy of \(\theta\), \(\nu(r)\) electron system and \(S\) is entropy of electron system under \(\theta\), \(\nu(r)\).

A pure state molecule electron system, not a mixed one, can be supposed to be a thermodynamic system. In this regard, the state density and the state sum depend on the energy level and degeneracy in formalization of the universally used statistical models of electron system (statistical model\(^{23}\) of atom, statistical model\(^{24}\) of 2-atom molecule, gas model\(^{25-30}\) of free electron, Thomas-Fermi model\(^{31,32}\) of DFT), and from the statistical viewpoint, the molecule can be regarded as the thermodynamic system, based on the fact that the property of the macroscopic system, thermodynamic property, can be obtained by means of the state sum.

From such viewpoint, to applicable the method of thermodynamic formalization, we taken undefined multiplier \(\mu\) in the EL equation as a function form proportional to the logarithm of the electron number and then defined it as the pseudo chemical potential (PCP). We divided the total energy, the quantum mechanical average value of molecule Hamilton operator, into atom sections and proposed a new molecule energy calculation model which is described as a PCP. Hence, the molecule energy is denoted by the function of electron number and electron number is made to become the variable quantity of energy minimization rather than wave function or electron density. The partial derivative value of the \(\alpha\)-th atom’s electron number for the total molecular energy is defined and formalized as a pseudo chemical potential of each phase (atom) (PCPP).

\[
\mu^M_\alpha = \left( \frac{\partial E^M}{\partial N_\alpha} \right)_{\nu^M_\alpha, N_{\alpha_{\text{const}}}}
\]

(4)

On the basis of the above definition, we proposed the thermodynamic model of multi-phase one component molecular system, in which atoms are regarded as phase and electrons are regarded as component. In addition, variation principle is put forward, which means the molecule formation process is the minimization process of energy and equalizing process of each phase's PCPP as well.

\[
E_\nu(N, \nu(r)) = \inf_\nu E(N)
\]

(5)

The molecule is formed when PCPP of each phase is equally formed. From thermodynamic viewpoint, it is similar to the Gibbs’ phase equilibrium condition where the chemical potentials of each phase and component are equal. From the PCPP equilibrium condition, the simultaneous equation (variational equation) where the electron number \(N\) is an undefined number is obtained. The number of electrons, the solution of simultaneous equation, is a stationary value that gives the minimum value of energy in the ground state of the molecule and the value that determines the atom charge in the ground state as well. The thermodynamic formalization has been evaluated through the calculation experiment. What is unique in this method is that a new thermodynamic model for molecular electron system is proposed and calculating system for the molecular system is established by using the method of thermodynamic formalization. To the best of our knowledge, in previous researches, there has been no research that described the energies of the molecular electron systems as chemical potentials and the charge distribution of atoms in molecules is realized by the method of the thermodynamic formalization.

**Theoretical Foundation**

**Definition of PCP by thermodynamic method.**

EL Eq. (3)\(^{27,33}\) of DFT

\[
E_{\nu}[\rho] = T[\rho] + V_n[\rho] + V_{\nu}[\rho]
\]

(6)

\[
\int \rho(r) dr = N
\]

(7)

is obtained by variation of energy of electronic system (6) under constraint (7).

\[
\delta \left\{ E_{\nu}[\rho] - \mu \int \rho(r) dr - N \right\} = 0
\]

\[
\mu = \left. \frac{\delta E}{\delta \rho(r)} \right|_\nu \quad \text{or} \quad \mu = \left. \frac{\partial E}{\partial N} \right|_\nu
\]

(8)

As mentioned above, for the sake of thermodynamic formulation, the undetermined multiplier \(\mu\) is defined as the function in proportion to logarithm of electron number, hereafter called PCP, which is formulated as follows:

\[
\mu = \mu_0 + \gamma \ln \frac{N}{N_0}
\]

(9)

where \(N_0\) is electron number of neutral atom, \(N\) is electron number of composed atom of molecule, \(\mu_0\) is \(\mu\) value when \(N = N_0\), \(\gamma\) is parameter.
\[
E = \int \mu \, dN = N(\mu - \gamma) + c
\]

where \( c \) is integration constant, \( \gamma \) has dimension of energy. Integration constant is conditionally set as zero because it is related to reference point.

\( \gamma \) is obtained from energy of ionization \( I \) and electron affinity \( A \)

\[
I = E(N - 1) - E(N), \quad A = E(N) - E(N + 1)
\]

and Eq. (9) as follows

\[
\gamma = \frac{I - A}{(N - 1)\ln \frac{N - 1}{N} + (N + 1)\ln \frac{N + 1}{N}}
\]

\[
\mu_0 = -I + \gamma(N - 1)\ln \frac{N - 1}{N}
\]

**Model of total energy calculation of a molecule.** For a start, according to the PCP concept, the electrons are localized into atoms (domain) so that the molecules become the set of atoms with different number of electrons, in order to apply the thermodynamic formalization method by making molecules multi-phase one-component system where the localized atoms are deemed as phase and the electrons as component in temperature zero limit thermal equilibrium system.

In Born-Oppenheimer approximation, the total energy of molecules Hamiltonian is given as follows:

\[
\hat{H} = \hat{T}_e + \hat{V}_{ne} + \hat{V}_{ec} + \hat{V}_{na}
\]

To construct multi-phase one-component system model, the electron coordinates are replaced by nucleus ones by setting distance between electrons as \( r_{ij} \approx R_{\alpha\beta} \) in integral Equations. As a result, the total space integral values for the squared wave function are electron number \( N \), where

\[
\hat{T}_e = \sum_\alpha t_{e,\alpha}
\]

The nucleus-electron interaction energy in molecule \( V_{ne} \) is the sum of interaction terms of \( V_{ne,\alpha} \) in domains or those of domains.

\[
V_{ne} \approx \sum_\alpha V_{ne,\alpha} - \sum_\alpha \frac{Z_\alpha N_\beta}{R_{\alpha\beta}}
\]

where \( Z_\alpha \) is charge of \( \alpha \) atom, \( N_\beta \) is electron number of \( \beta \) atom domain, \( V_{ne,\alpha} \) is nucleus-electron interaction energy in \( \alpha \) atom domain.

If density matrix is approximated to \( \rho(r_1, r_2) \approx \rho(r_1) \rho(r_2) \), electron-electron interaction energy is also the sum of two term.

\[
V_{ee} \approx \sum_\alpha V_{ee,\alpha} + \frac{1}{2} \sum_\alpha \sum_{\beta \neq \alpha} \frac{N_\alpha N_\beta}{R_{\alpha\beta}}
\]

The nucleus-nucleus interaction term is

\[
V_{nn} = \frac{1}{2} \sum_\alpha \sum_{\beta \neq \alpha} \frac{Z_\alpha Z_\beta}{R_{\alpha\beta}}
\]

Therefore, from Eqs. 15–18, total energy allotted to atom domain is represented as follows.

\[
E \approx \sum_\alpha (t_{e,\alpha} + V_{ee,\alpha} + V_{ne,\alpha}) + \frac{1}{2} \sum_\alpha \left( -2Z_\alpha \sum_{\beta \neq \alpha} \frac{N_\beta}{R_{\alpha\beta}} + N_\alpha \sum_{\beta \neq \alpha} \frac{N_\beta}{R_{\alpha\beta}} + Z_\alpha \sum_{\beta \neq \alpha} \frac{Z_\beta}{R_{\alpha\beta}} \right)
\]

If introducing atom charge \( q_\alpha = Z_\alpha - N_\alpha \) and taking into account \( \sum_{\alpha} \sum_{\beta \neq \alpha} N_\alpha N_\beta Z_{\alpha\beta} = \sum_{\alpha} \sum_{\beta \neq \alpha} N_\beta Z_{\alpha\beta} \), the total energy of molecule \( E \) is given as follows, where the sum of the total energy in \( \alpha \) atom domain is represented by the sum of interaction term between \( E_n \) and atom domains;
Equation to calculate molecular energy by means of PCP. Total energy of molecule is approximately calculated, but it is based on quantum chemical average value of total energy operator. Therefore, total energy of molecule is represented by sum of energy per atom domain and electrostatic interaction energy between domains. By substituting Eq. (10) for Eq. (20), total energy of molecule, following Eq. is obtained.

\[ E^M \approx \sum_{\alpha} N_\alpha \left( \mu_\alpha^0 + \gamma_\alpha \ln \frac{N_\alpha}{N_\alpha^0} - \gamma_\alpha \right) + \frac{1}{2} \sum_{\alpha \neq \beta} \sum_{\gamma \alpha} \frac{q_\alpha q_\beta}{R_{\alpha \beta}} \]  

(21)

where \( E^M \) has no property to calculate the quantum chemical average value of operator, but the thermodynamic formulization only. In addition, \( E^M \) cannot be assumed to be the total energy of molecule like Eq. (20). Because PCP is energy to each electron numerically, it is not an absolute value of energy but a variation proportion. \( E^M \) in Eq. (21) is defined as molecular energy and used as initial equation. Regarding a pure-state molecule as a multi-phase one-component system demands complicate approximation, which means it would not be suitable for quantitative calculation. To obtain a correct value, correction factor (parameter) \( k_{\alpha \beta} \) is applied.

\[ \sum_{\alpha} \sum_{\beta \neq \alpha} \frac{q_\alpha q_\beta}{R_{\alpha \beta}} + \sum_{\alpha} p_{\alpha} = 0 \]

(22)

where \( k_{\alpha \beta} \) is an interaction parameter between \( \alpha \) atom and \( \beta \) atom. Parameter \( k_{\alpha \beta} \) of Eq. (22) is successfully estimated, and database is constructed.

Pseudo chemical potential of each phase (atom) (PCP) in molecule. First, according to the common method in thermodynamics, pseudo chemical potential of each (atom) phase (PCPP) \( \mu_\alpha^M \) that composes molecules is determined by calculating partial derivative to Eq. 23.

\[ \left( \frac{\partial E^M}{\partial N_\alpha} \right)_{N, (\gamma, R)} = \mu_\alpha^M, \quad \mu_\alpha^M = \mu_\alpha^0 + \gamma_\alpha \ln \frac{N_\alpha}{N_\alpha^0} - \sum_{\beta \neq \alpha} \frac{q_\alpha q_\beta}{R_{\alpha \beta}} \]  

(23)

where \( \mu_\alpha^M \) is the PCPP of \( \alpha \)-th phase and the function of \( N \) and \( R_{\alpha \beta} \) as well.

How to form a molecule from atoms is interpreted by variable principle to variable quantity \( N \).

\[ E_\alpha = E(N_\alpha, \nu(\text{r})) \leq E(N, \nu(\text{r})) \]

The formation process of the molecules from atoms is a minimizing process of energy by migration of electrons between the phases (atoms), that is the equalizing process of \( \mu_\alpha^M \). Because state of minimum energy is a temperature zero limit thermoequilibrium state, in the closed system,

\[ dE^M = \sum_{\alpha} \mu_\alpha^M dN_\alpha = \mu_1^M dN_1 + \mu_2^M dN_2 + \cdots + \mu_p^M dN_p = 0 \]  

(24)

\[ N = \sum_{\alpha} N_\alpha = N_1 + N_2 + N_3 + \cdots + N_p = c \]  

(25)

\[ dN = d(\sum_{\alpha} N_\alpha) = dN_1 + dN_2 + dN_3 + \cdots + dN_p = 0, \]

\( (p: \text{number of phases (atoms)}, \alpha: \text{kind of phase (atom)}, N_\alpha: \text{electron number of} \ \alpha-\text{th phase (atom)}, N: \text{electron number of molecule}) \)

\[ (1) - (2) \times \mu_2^M = (\mu_2^M - \mu_1^M) dN_2 + (\mu_2^M - \mu_1^M) dN_3 + \cdots (\mu_2^M - \mu_1^M) dN_p = 0, \]  

(26)

from \( dN_\alpha = 0 \), relationship

\[ \mu_1^M = \mu_2^M = \cdots = \mu_p^M = \mu^M \]  

(27)

could be obtained.

According to the principle that charge or number of particles are also conserved in molecules as in the closed thermodynamic system, the following equation must be given;

\[ \sum_{\alpha=1}^{\alpha} q_\alpha = 0 \quad \text{or} \quad \sum_{\alpha=1}^{\alpha} N_\alpha = N \]  

(28)

The simultaneous Eq. (29) is defined as charge distribution equation, where the number of electrons is an undefined \( N_\alpha, (23, 27, 28) \).
**Results and Discussion**

**Efficiency of PCP method.** Total energy of some molecules calculated by PCP method and their calculation duration is shown in Table 1. Comparing against other methods, this method is fast in calculation speed and high in accuracy. For instance, in case of the ab initio method and DFT method, when each of them is given more than 130 and 30 atoms respectively, it is infeasible due to their prolonged calculation duration. Furthermore, the results of this method are very similar to the one of ab initio method and DFT method, indicating that it is higher in accuracy.

**Evaluation of accuracy.** To further evaluate its accuracy, it is compared to the ab initio method, calculating the total energies of some organic and inorganic molecules, as shown in Table 2 and Table 3, respectively. The results in their Tables clearly show that calculation results of the new method are approximate to one of ab initio methods, and on the other hand, the relative errors in calculating value of all organic and inorganic molecules are rare (lower than 0.0176), indicating that PCP method is accurate in calculation of total energy of the molecules.

**Conclusions**

In summary, we have proposed a novel method for calculation of the molecular electron system by thermodynamic formalization rather than quantum chemical method.

The molecular model of multiple-phase one-component system has been proposed which takes atoms as phase and electrons as component in the molecule. A model of molecular energy has been proposed based on a new concept of pseudo chemical potential (PCP) and pseudo chemical potential of component (electron) of each phase (atom) (PCPP) in multi-phase one-component have been defined. The simultaneous equation obtained from equilibrium condition of PCPP is just the variational equation. The validity of the thermodynamic formalization is verified through calculation experiment.

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Table 1. The total energies and calculation speeds of some molecules obtained by using different calculating methods. *Calculation time is the relative value.

| Molecules     | The Number of atoms | Total Energy/eV (Calculation Time†) |
|---------------|---------------------|-------------------------------------|
| C₅H₁₁ON       | 18                  | -8759.92 3                        |
| C₆H₁₁O₂N₁₂    | 28                  | -15 363.27 9                      |
| C₆H₁₆O₂N₂     | 63                  | -42 984.28 17                     |
| C₇H₁₆O₂N₁₁    | 129                 | -81 267.30 80                     |
| C₈H₁₆O₂N₁₃    | 202                 | -123 532.11 195                   |
| C₉H₁₈O₃N₁₅    | 303                 | -182 461.09 365                   |

| Method       | Our method | ab initio | DFT |
|--------------|------------|-----------|-----|
| Calculation time STO-3G | 17 | 1 | 7200 |
| Calculation time 6–31 G | 79 | 5441 | — |

Regression equations are expressed as follows, respectively:

\[ y = 0.9904x - 45.322 \]  

\[ y = 0.9909x - 38.809 \]

Their correlation coefficients \( R^2 \) are all 1 and the linearities are very good in both cases. These results also prove the accuracy of the new calculation method.

Tables 4 and 5 show comparison calculations of atomic charge distributions of some organic and inorganic molecules using 3 different methods. The results of Tables 4 and 5 are approximate to the results above, revealing that for calculation of the atomic charge distribution, the result of the new method is similar to one of the ab initio.

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\[ \begin{align*}
\mu_1^0 + \gamma_1 \ln \frac{N_1}{N_0^0} - \sum_{\alpha} k_{1,\beta} \frac{q_{1,\beta}}{R_{1,\beta}} &= \mu^M \\
\mu_2^0 + \gamma_2 \ln \frac{N_2}{N_0^0} - \sum_{\beta} k_{2,\beta} \frac{q_{2,\beta}}{R_{2,\beta}} &= \mu^M \\
\mu_n^0 + \gamma_n \ln \frac{N_n}{N_0^0} - \sum_{\beta} k_{n,\beta} \frac{q_{n,\beta}}{R_{n,\beta}} &= \mu^M \\
\sum_{\alpha=1}^{n} q_{\alpha} &= 0
\end{align*} \]  

Atom charge \( q_\alpha \) and \( N_\alpha \) in molecule are calculated and molecule energy is determined by solving Eq. (29) by Newton-Raphson method. The number of electrons, or the solution of simultaneous equation, is the stationary value that gives the minimum value of energy and also the one that determines atom charge in ground state.
The calculation results show that the new idea is valid and very efficient for calculating the molecular systems. It has potentials to be further developed and applied in some fields, such as some physicochemical properties, chemical reactions, and catalyst, etc.

**Methods**

**PCP method.** *Parameter Estimation.* Parameters of neutral atoms $\mu_0$, $\gamma$

They are experimentally determined by using electron affinity and ionization energy.

**Interaction parameters.** They are determined by least squares so that the atomic charges and energies of some sample molecules, using equation of atomic charge calculation, could reproduce result of calculation by ab initio (STO-3G).

**Calculation method of the atomic distribution and total energy of a molecule.** Since the molecular charge calculation Eq. (29) is a nonlinear spline equation, it can be solved by using the typical Newton-Raphson method.

For this purpose, Eq. (29) is rewritten into the following form.

$$\begin{align*}
\mu_1(N) &= 0 \\
\mu_2(N) &= 0 \\
\vdots \\
\mu_N(N) &= 0 \\
\mu_{N+1}(N) &= 0
\end{align*}$$

(32)

where $N = (N_1, N_2, \cdots, N_m, \mu_M)$

$$\begin{align*}
\mu_j(N) &= -\mu^M + \mu_0 + \gamma \ln \frac{N_j}{N_i} - \sum_{j=1}^{m} \frac{q_j}{R_{ij}} (i = \Gamma, \pi) \\
\mu_{N+1}(N) &= \sum_{j=1}^{m} q_j
\end{align*}$$

(33)

However, when the molecular charge calculation Eq. (33) is repeated because of the logarithms in the equation, if the values are negative in the iteration process, they would not converge and thus the calculation would go wrong. In order to overcome this problem, Eq. (33) is rewritten as follows.

First, let $\ln \frac{N_j}{N_i} = Na_j$, then the following Eq. (34) is given:

$$N_j = N_0^i \exp(Na_j), \quad q_j = N_0^i - N_j = N_0^i [1 - \exp(Na_i)]$$

(34)

Thus, Eq. (34) can be rewritten as follows;

| Molecules       | Our method/eV | Ab initio/eV | Absolute error/eV | Relative error |
|-----------------|---------------|--------------|-------------------|---------------|
| i-C₄H₉OH       | −6 254.015    | −6 239.385   | −14.630           | 0.002 3       |
| C₂H₆CHO        | −5 182.359    | −5 157.137   | −25.221           | 0.004 9       |
| C₂H₆NC₂H₄      | −6 750.746    | −6 758.033   | 7.287             | −0.001 1      |
| a-C₄H₉C₂H₇OH   | −10 328.641   | −10 309.678  | 18.963            | 0.001 8       |
| i-C₄H₉COOH     | −9 304.506    | −9 266.696   | −37.810           | 0.004 1       |
| C₂H₁₂          | −5 267.672    | −5 280.168   | 12.495            | −0.002 4      |
| C₃H₆C≡CH       | −4 174.285    | −4 164.064   | −10.221           | 0.002 4       |
| C₂H₆CN         | −4 614.964    | −4 594.626   | −20.337           | 0.004 4       |
| i-C₄H₉CH₃      | −7 326.771    | −7 348.678   | 21.915            | −0.003 0      |
| C₂H₆COOC₂H₅    | −12 433.411   | −12 416.240  | −17.173           | 0.001 4       |
| C₂H₆OC₂H₅      | −7 294.404    | −7 289.192   | −5.211            | 0.000 7       |
| CF₃            | −11 863.122   | −11 689.321  | −173.801          | 0.014 7       |
| CH₃COC₂H₅      | −8 321.452    | −8 306.837   | −14.615           | 0.001 8       |
| C₂H₆NO₂        | −9 738.860    | −9 691.735   | −47.124           | 0.004 8       |
| CH₂=CHCH₂SH    | −13 933.442   | −13 845.659  | −87.782           | 0.006 3       |
| Molecules     | Our method/eV | Ab initio/eV | Absolute error/eV | Relative error |
|---------------|---------------|--------------|-------------------|----------------|
| H₂CO₃         | −7 155.095    | −7 076.963   | −78.132           | 0.011          |
| H₂CrO₄        | −36 446.291   | −36 163.705  | −282.585          | 0.007          |
| H₂O           | −2 078.832    | −2 039.895   | −38.936           | 0.019          |
| H₂SO₄         | −16 909.148   | −16 753.253  | −155.892          | 0.009          |
| H₂SO₃         | −18 948.070   | −18 757.919  | −190.150          | 0.010          |
| H₃AsO₃        | −66 805.531   | −66 185.507  | −620.024          | 0.009          |
| H₃AsO₄        | −68 782.011   | −68 198.005  | −584.006          | 0.008          |
| H₃BO₃         | −6 820.142    | −6 742.656   | −77.486           | 0.011          |
| H₃PO₄         | −17 519.650   | −17 248.984  | −270.666          | 0.015          |
| H₃P₂O₇        | −33 028.464   | −32 458.767  | −569.697          | 0.017          |
| HClO₂         | −16 517.937   | −16 342.648  | −219.289          | 0.013          |
| HClO           | −14 524.665   | −14 392.737  | −131.928          | 0.009          |
| H₂MnO₄        | −39 347.431   | −39 005.056  | −342.374          | 0.008          |
| HNO₂          | −5 562.993    | −5 494.318   | −68.675           | 0.012          |
| Ca(NO₃)₂       | −33 597.275   | −33 206.266  | −391.009          | 0.011          |
| Fe(NO₃)₃       | −49 507.850   | −48 953.044  | −554.806          | 0.013          |
| FeCl₂         | −59 291.348   | −58 719.101  | −572.247          | 0.009          |
| FeS₂O₄        | −53 244.442   | −52 705.067  | −539.374          | 0.010          |
| KMnO₄         | −55 600.162   | −55 128.824  | −471.338          | 0.008          |
| Mg(NO₃)₂       | −20 671.974   | −20 343.118  | −328.856          | 0.016          |
| MgSO₄         | −24 402.032   | −24 092.248  | −309.783          | 0.012          |
| Na₂SO₄        | −27 615.986   | −27 433.242  | −182.744          | 0.006          |
| NaNO₃         | −11 914.849   | −11 838.296  | −76.552           | 0.006          |
| ZnSO₄         | −67 241.239   | −66 545.293  | −695.945          | 0.010          |

Table 3. Calculation results of total energy of some inorganic molecules.

Figure 1. The result of correlation analysis for total energies of some molecules. (a) organic molecules. (b) inorganic molecules.
| Molecule | Atom | Charge \( \text{ab initio} \) | Our method | PM3 |
|----------|------|----------------|-------------|------|
| \( \text{C}_2\text{H}_5\text{OH} \) | \( \text{C}^1 \) | \(-0.178\ 8\) | \(-0.158\ 2\) | \(-0.106\ 5\) |
| | \( \text{C}^2 \) | \(-0.099\ 3\) | \(-0.088\ 9\) | \(-0.113\ 8\) |
| | \( \text{O}^\circ \) | \(-0.288\ 4\) | \(-0.325\ 3\) | \(-0.311\ 6\) |
| | \( \text{H}^1 \) | \(0.061\ 4\) | \(0.051\ 9\) | \(0.039\ 5\) |
| | \( \text{H}^2 \) | \(0.057\ 5\) | \(0.052\ 3\) | \(0.036\ 9\) |
| | \( \text{H}^3 \) | \(0.061\ 2\) | \(0.062\ 3\) | \(0.060\ 1\) |
| | \( \text{H}^4 \) | \(0.061\ 2\) | \(0.062\ 3\) | \(0.060\ 1\) |
| | \( \text{H}^5 \) | \(0.044\ 6\) | \(0.052\ 3\) | \(0.020\ 3\) |
| | \( \text{H}^6 \) | \(0.044\ 6\) | \(0.052\ 3\) | \(0.020\ 3\) |
| | \( \text{H}^7 \) | \(0.170\ 5\) | \(0.169\ 2\) | \(0.184\ 1\) |
| | \( \text{R}^2 \) | \(0.988\ 9\) | \(0.926\ 9\) |  |
| \( \text{C}_2\text{H}_6 \) | \( \text{C}^1 \) | \(-0.174\ 8\) | \(-0.161\ 3\) | \(-0.105\ 6\) |
| | \( \text{H}^1 \) | \(0.058\ 3\) | \(0.053\ 8\) | \(0.035\ 2\) |
| | \( \text{Cs} \) | \(-0.174\ 8\) | \(-0.161\ 3\) | \(-0.105\ 6\) |
| | \( \text{H}^2 \) | \(0.058\ 3\) | \(0.053\ 8\) | \(0.035\ 2\) |
| | \( \text{H}^3 \) | \(0.058\ 3\) | \(0.053\ 8\) | \(0.035\ 2\) |
| | \( \text{H}^4 \) | \(0.058\ 3\) | \(0.053\ 8\) | \(0.035\ 2\) |
| | \( \text{R}^2 \) | \(1.000\ 0\) | \(1.000\ 0\) |  |
| \( \text{C}_2\text{H}_5\text{NH}_2 \) | \( \text{C}^1 \) | \(-0.178\ 8\) | \(-0.168\ 5\) | \(-0.111\ 4\) |
| | \( \text{C}^2 \) | \(-0.015\ 5\) | \(-0.083\ 7\) | \(-0.098\ 0\) |
| | \( \text{N}^\circ \) | \(-0.379\ 9\) | \(-0.285\ 7\) | \(-0.037\ 6\) |
| | \( \text{H}^1 \) | \(0.060\ 0\) | \(0.044\ 9\) | \(0.038\ 7\) |
| | \( \text{H}^2 \) | \(0.069\ 4\) | \(0.061\ 7\) | \(0.050\ 0\) |
| | \( \text{H}^3 \) | \(0.056\ 4\) | \(0.058\ 0\) | \(0.036\ 3\) |
| | \( \text{H}^4 \) | \(0.060\ 5\) | \(0.072\ 9\) | \(0.053\ 0\) |
| | \( \text{H}^5 \) | \(0.041\ 5\) | \(0.068\ 3\) | \(0.023\ 5\) |
| | \( \text{H}^6 \) | \(0.143\ 8\) | \(0.113\ 7\) | \(0.023\ 0\) |
| | \( \text{H}^7 \) | \(0.142\ 6\) | \(0.118\ 3\) | \(0.022\ 5\) |
| | \( \text{R}^2 \) | \(0.950\ 4\) | \(0.378\ 8\) |  |
| \( \text{i--C}_2\text{H}_3\text{CHO} \) | \( \text{C}^1 \) | \(-0.014\ 1\) | \(-0.031\ 3\) | \(-0.065\ 9\) |
| | \( \text{C}^2 \) | \(-0.129\ 1\) | \(-0.131\ 2\) | \(-0.185\ 6\) |
| | \( \text{C}^3 \) | \(0.138\ 2\) | \(0.132\ 5\) | \(0.271\ 3\) |
| | \( \text{O}^\circ \) | \(-0.211\ 5\) | \(-0.292\ 0\) | \(-0.316\ 7\) |
| | \( \text{H}^1 \) | \(0.062\ 4\) | \(0.059\ 9\) | \(0.076\ 1\) |
| | \( \text{H}^2 \) | \(0.066\ 8\) | \(0.071\ 5\) | \(0.081\ 1\) |
| | \( \text{H}^3 \) | \(0.045\ 0\) | \(0.056\ 6\) | \(0.053\ 7\) |
| | \( \text{H}^4 \) | \(0.054\ 1\) | \(0.061\ 7\) | \(0.063\ 5\) |
| | \( \text{C}^7 \) | \(-0.182\ 1\) | \(-0.136\ 8\) | \(-0.116\ 7\) |
| | \( \text{H}^8 \) | \(0.059\ 5\) | \(0.056\ 7\) | \(0.043\ 8\) |
| | \( \text{H}^9 \) | \(0.060\ 9\) | \(0.062\ 3\) | \(0.044\ 6\) |
| | \( \text{H}^{10} \) | \(0.057\ 6\) | \(0.066\ 5\) | \(0.040\ 7\) |
| | \( \text{C}^{11} \) | \(-0.182\ 5\) | \(-0.149\ 8\) | \(-0.122\ 8\) |
| | \( \text{H}^{12} \) | \(0.060\ 5\) | \(0.056\ 9\) | \(0.047\ 2\) |
| | \( \text{H}^{13} \) | \(0.056\ 7\) | \(0.059\ 6\) | \(0.043\ 7\) |
| | \( \text{H}^{14} \) | \(0.057\ 6\) | \(0.056\ 8\) | \(0.041\ 9\) |
| | \( \text{H}^{15} \) | \(0.949\ 0\) | \(0.847\ 6\) |  |

Continued
Based on the spline equation above, the algorithm for calculating the atomic charge was constructed as follows;

Read the value of the neutral atom parameter $\mu_{\gamma}$ and the number of electrons in the neutral atom $N_{\text{i0}}$, and set the initial value $\mu_{\text{-Na}}$, $\mu_{\text{M(k-1)}}$.

\[
\begin{align*}
\mu_{\text{i}}(\text{Na}) &= -\mu_{\text{M}} + \mu_{\text{0}} + \gamma_{\text{i}} N_{\text{a}} - \sum_{j} k_{\text{ij}} N_{\text{j0}} \left[1 - \exp(N_{\text{aj}})\right] \\
\mu_{\text{M(k-1)}} &= \frac{1}{N_{\text{a}} \sum_{\text{i}} \mu_{\text{i0}}} \\
N_{\text{a}}^{(k-1)} &= 0 \quad (i = 1, n) \\
\mu_{\text{M(k-1)}} &= \frac{1}{N_{\text{a}} \sum_{\text{i}} \mu_{\text{i0}}}
\end{align*}
\]

(36)

And then, solve the following equation by using solve method of MATLAB function library;

\[
\begin{align*}
\mu_{\text{i}}(\text{N}) &= -\mu_{\text{M}} + \mu_{\text{0}} + \gamma_{\text{i}} N_{\text{a}} - \sum_{j} k_{\text{ij}} N_{\text{j0}} \left[1 - \exp(N_{\text{aj}})\right] \\
\mu_{\text{M(k-1)}} &= \frac{1}{N_{\text{a}} \sum_{\text{i}} \mu_{\text{i0}}} \\
N_{\text{a}}^{(k-1)} &= 0 \quad (i = 1, n) \\
\mu_{\text{M(k-1)}} &= \frac{1}{N_{\text{a}} \sum_{\text{i}} \mu_{\text{i0}}}
\end{align*}
\]

(37)

Thereafter, the function values of each atom can be calculated;

\[
\mu_{\text{i}}^{(k-1)} = \mu_{\text{i}}(\text{Na}) \right|_{\text{Na}=N_{\text{a}}^{(k-1)}} \quad (i = 1, n+1)
\]

(38)

At this time, the inter-nucleus distances are calculated from molecular structure data obtained by molecular-dynamics method as follows;

\[
R_{\text{ij}} = \sqrt{((x_{\text{i}} - x_{\text{j}})^2 + (y_{\text{i}} - y_{\text{j}})^2 + (z_{\text{i}} - z_{\text{j}})^2)}
\]

(39)

Atomic charge $q_{i} (i = 1, n)$ is calculated from $N_{\text{j}} = N_{\text{j0}} \exp(N_{\text{aj}})$ and

$\sum_{\text{j}} q_{\text{j}} = N_{\text{j0}} - N_{\text{j}} = N_{\text{j0}} \left[1 - \exp(N_{\text{aj}})\right]$

On the other hand, according to the atomic charge calculated by using the method above, total energy of the molecule can be calculated as follows;

\[
E^{\text{M}} = \sum_{\alpha} N_{\text{a}} \left(\mu_{\text{a0}} + \gamma_{\text{a}} \ln \frac{N_{\text{a}}}{N_{\text{a0}}} - \gamma_{\text{a}}\right) - \sum_{\alpha} \sum_{\beta=\alpha} q_{\text{a}} q_{\text{b}} R_{\text{ab}}
\]

(40)

In addition, PCPs of the molecules are also calculated in the calculation process.

| Molecule | Atom | Charge | ab initio | Our method | PM3 |
|----------|------|--------|-----------|------------|-----|
| C2H5CH3 | C1   | -0.141 | -0.149 4 | -0.172 1   |     |
|         | H1   | 0.060 2| 0.060 1  | 0.079 6    |     |
|         | C2   | -0.047 1| -0.042 8| -0.134 4   |     |
|         | H2   | 0.057 7| 0.064 2  | 0.080 6    |     |
|         | C3   | -0.186 4| -0.170 5| -0.078 1   |     |
|         | H3   | 0.058 1| 0.058 8  | 0.094 5    |     |
|         | H4   | 0.063 8| 0.057 3  | 0.038 9    |     |
|         | H5   | 0.067 4| 0.061 2  | 0.045 4    |     |
|         | H6   | 0.067 4| 0.061 2  | 0.045 4    |     |
|         | R1   | 0.994 7| 0.723 7  |     |     |
| CH2Cl2  | C1   | -0.027 9| -0.023 1| -0.106 1   |     |
|         | Cl1  | -0.117 8| -0.121 2| -0.021 7   |     |
|         | Cl2  | -0.117 8| -0.121 2| -0.021 7   |     |
|         | Cl3  | 0.131 8| 0.132 8  | 0.074 7    |     |
|         | H4   | 0.131 8| 0.132 8  | 0.074 7    |     |
|         | R2   | 0.999 5| 0.521 5  |     |     |

Table 4. Comparison of calculation results for atomic charge distribution of some organic molecules.

*STO—3G.
| molecule  | atom | charge | ab initio* | PCP  | PM3  |
|----------|------|--------|------------|------|------|
| H₂CO₃    | C²   | 0.420 3| 0.307 3    | 0.492 2|
|          | O²   | −0.279 7| −0.249 8 | −0.244 0|
|          | O³   | −0.278 7| −0.200 1 | −0.387 7|
|          | O⁴   | −0.304 2| −0.265 5 | −0.327 4|
|          | H²   | 0.221 1| 0.202 8   | 0.224 8|
|          | H³   | 0.221 2| 0.205 2   | 0.242 1|
| H₂SO₄   | S⁴   | 0.810 4| 1.219 0   | 2.508 3|
|          | O²   | −0.304 6| −0.434 7 | −0.656 3|
|          | O³   | −0.322 4| −0.410 9 | −0.862 5|
|          | O⁴   | −0.304 5| −0.434 4 | −0.656 3|
|          | H²   | 0.221 2| 0.235 9   | 0.264 7|
|          | O⁶   | −0.321 5| −0.410 8 | −0.862 5|
|          | H³   | 0.221 3| 0.235 9   | 0.264 6|
| H₃P₂O₇  | P⁴   | 1.255 2| 1.182 3   | 2.271 8|
|          | O²   | −0.561 8| −0.475 8 | −1.035 5|
|          | P⁵   | 1.255 7| 1.183 4   | 2.271 9|
|          | O⁴   | −0.524 7| −0.477 8 | −0.901 3|
|          | O⁵   | −0.524 5| −0.477 3 | −0.901 3|
|          | O⁶   | −0.419 4| −0.428 0 | −0.657 1|
|          | O⁷   | −0.419 5| −0.428 1 | −0.657 1|
|          | O⁸   | −0.419 3| −0.427 9 | −0.657 0|
|          | H⁹   | 0.194 4| 0.194 4   | 0.230 7|
|          | H¹⁰  | 0.194 5| 0.194 3   | 0.230 7|
|          | H¹¹  | 0.194 5| 0.194 3   | 0.230 7|
|          | H¹²  | 0.194 4| 0.194 3   | 0.230 6|
| KOH     | K¹   | 0.402 0| 0.369 6   | —     |
|          | O²   | −0.423 5| −0.395 4 | —     |
|          | H³   | 0.021 4| 0.025 8   | —     |
| ZnSO₄   | S⁴   | 0.865 2| 0.647 9   | 2.460 6|
|          | O²   | −0.498 5| −0.480 4 | −0.727 9|
|          | O³   | −0.454 9| −0.480 5 | −0.728 0|
|          | O⁴   | −0.338 6| −0.247 3 | −0.853 6|
|          | O⁵   | −0.338 7| −0.247 3 | −0.853 6|
|          | Zn⁶  | 0.765 4| 0.807 5   | 0.702 5|
| H₃AsO₄  | O¹   | −0.426 7| −0.456 2 | −0.690 8|
|          | O²   | −0.426 8| −0.456 4 | −0.691 6|
|          | As¹  | 1.245 5| 1.397 2   | 2.086 9|
|          | O³   | −0.510 0| −0.555 3 | −0.775 0|
|          | O⁴   | −0.426 9| −0.456 4 | −0.690 4|
|          | H¹   | 0.181 7| 0.175 6   | 0.253 8|
|          | H²   | 0.181 5| 0.175 7   | 0.253 6|
|          | H³   | 0.181 7| 0.175 7   | 0.253 6|
| H₃CrO₄  | Cr¹  | 1.326 4| 1.326 4   | −0.698 2|
|          | O²   | −0.398 3| −0.396 0 | 0.141 3|
|          | O³   | −0.409 1| −0.411 5 | 0.126 1|
|          | O⁴   | −0.469 3| −0.469 3 | −0.019 2|
|          | O⁵   | −0.469 3| −0.469 3 | −0.019 3|
|          | H⁶   | 0.209 7| 0.209 8   | 0.234 7|
|          | H⁷   | 0.209 8| 0.209 8   | 0.234 7|
|          | H⁸   | 0.209 8| 0.209 8   | 0.234 7|
| Be(OH)₂ | Be¹  | 0.404 3| 0.406 5   | 0.614 2|
|          | O²   | −0.416 3| −0.401 4 | −0.499 9|
|          | O³   | −0.416 3| −0.401 4 | −0.499 9|
|          | H⁴   | 0.214 2| 0.198 2   | 0.192 8|
|          | H⁵   | 0.214 2| 0.198 1   | 0.192 8|

Continued
Quantum chemical methods. Quantum chemical calculations have been carried out by using the ab initio (STO-3G, 6–31G**), DFT (STO-3G, 6–31G**) in “Gaussian 09 W” and semi-empirical PM3 in “Hyperchem 8.0.3”.

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References

1. Schrödinger, E. An Undulatory Theory of the Mechanics of Atoms and Molecules. Phys. Rev. 28, 1049–1070 (1926).
2. Hartree, D. R. The Calculation of Atomic Structures. Rep. Prog. Phys. 11, 113–143 (1947).
3. Slater, J. C. Quantum Theory of Matter, 2nd ed.; McGraw-Hill: New York, Chapter 16. (1968).
4. Miyajima, K., Yabushita, S., Knickelbein, M. B. & Nakajima, A. Stern-Gerlach Experiments of One-Dimensional Metal-Benzene Sandwich Clusters: Mat(C6H4)n(M Al, Sc, Ti, and V). J. Am. Chem. Soc. 129, 8473–8480 (2007).
5. Dibenedetto, S. A. et al. Structure Performance Correlations in Vapor Phase Deposited Self-Assembled Nanodevices for Organic Field-Effect Transistors. J. Am. Chem. Soc. 131, 11080–11090 (2009).
6. Prasad, V. K., Otero-de-la-Roza, A. & DiLabio, G. A. Atom-Centered Potentials with Dispersion-Corrected Minimal-Basis Set Hartree-Fock: An Efficient and Accurate Computational Approach for Large Molecular Systems. J. Chem. Theory Comput. 14, 726–738 (2018).
7. Kohn, W. & Sham, L. J. Self-Consistent Equations Including Exchange and Correlation Effects. Phys. Rev. 140, A1133–A1138 (1965).
8. Kohn, W. Nobel Lecture: Electronic Structure of Matter-Wave Functions and Density Functionals. Rev. Mod. Phys. 71, 1253–1266 (1999).
9. Halgren, T. A. et al. Speed and Accuracy in Molecular Orbital Calculations. A Comparison of CNDO/2, INDO, PRDDO, STO-3G, and Other Methods, Including AAMOM, VRDDO, and ESE MO. J. Am. Chem. Soc. 11, 6595–6608 (1978).
10. Sillar, K. & Sauer, J. Ab Initio Prediction of Adsorption Isotherms for Small Molecules in Metal-Organic Frameworks: The Effect of Lateral Interactions for Methane/CPO-27-Mg. J. Am. Chem. Soc. 134, 18354–18365 (2012).
11. Wang, L. P. et al. Discovering chemistry with an ab initio nanoreactor. Nature Chem. 6, 1044–1049 (2014).
12. Fan, G. H. et al. Ab initio investigation of pristine and doped single-walled boron nitride nanotubes as acetone sensor. Comput. Theor. Chem. 1115, 208–216 (2017).
13. Mui, T. V. T., Duong, M. V., Nguyen, H. T. & Huynh, L. K. Ab initio kinetics of the HO2+S+3O2 - SO3+3O2 reaction. Phys.Chem. Chem.Phys. 20, 6677–6687 (2018).
14. Viruela, P. M., Viruela, R. & Orti, E. & Bre’das, J. L. Geometric Structure and Torsional Potential of Bisothianaphthene. A Comparative DFT and ab Initio Study. J. Am. Chem. Soc. 119, 1360–1369 (1997).
15. Kuduk, B., Kowalczyk, T. & Voorhis, T. V. Constrained Density Functional Theory. Chem. Rev. 112, 321–370 (2012).
16. Prater, P. C., Sanhueza, I. A., Kalvet, I. & Schoenebeck, F. Computational Studies of Sufficiently Relevant Homogeneous Organometallic Catalysis Involving Ni, Pd, Ir, and Rh: An Overview of Commonly Employed DFT Methods and Mechanistic Insights. Chem. Rev. 115, 9532–9586 (2015).
17. Sutton, J. E., Guo, W., Katsoulakis, M. A. & Vlachos, D. G. Effects of correlated parameters and uncertainty in electronic-structure-based chemical kinetic modelling. Nature. Chemistry 8, 331–337 (2016).
18. Qi, K. Z. & Zheng, W. J. Morphology-controlled synthesis of inorganic nanocrystals by ionic liquid assistance. Green and Sustainable Chemistry 5, 17–23 (2017).
19. Sun, J. W. et al. Accurate first-principles structures and energies of diversely bonded systems from an efficient density functional. Nature Chem. 8, 831–836 (2016).
20. Ghosh, S. et al. Combining Wave Function Methods with Density Functional Theory for Excited States. Chem. Rev. 118, 7249–7292 (2018).
21. Wellendorff, J. et al. Density functionals for surface science: exchange-correlation model development with Bayesian error estimation. Phys. Rev. B 85, 235142 (2012).
22. Klimes, J. & Michaelides, A. Perspective: advances and challenges in treating van der Waals dispersion forces in density functional theory. J. Chem. Phys. 137, 120901 (2012).
23. Landsau, L. D. & Lifshitz, E. M. Quantum Mechanics, Pergamon Press Oxford, 261–266 (1977).
24. McCarrie, Statistical Mechanics, New York Haper & Row, 164–166 (1976).

Table 5. Comparison of calculation results for atomic charge distribution of some inorganic molecules.

| molecule     | atom | charge ab initio | PCP   | PM3   |
|--------------|------|------------------|-------|-------|
| Ca(OH)₂      | Ca²  | 0.668 8          | 0.743 4 | —     |
|              | O²   | −0.410 4         | −0.440 8 | —     |
|              | O²   | −0.410 4         | −0.440 8 | —     |
|              | H²   | 0.076 0          | 0.069 1 | —     |
| Mg(NO₃)₂     | N²+  | 0.201 1          | 0.330 7 | 1.379 0 |
|              | O²   | −0.104 6         | −0.212 6 | −0.530 3 |
|              | O²   | −0.312 6         | −0.309 0 | −0.641 2 |
|              | O²   | −0.312 5         | −0.360 0 | −0.640 9 |
|              | Mg²  | 1.057 3          | 1.102 1 | 0.866 9 |
|              | N²   | 0.201 1          | 0.330 7 | 1.379 0 |
|              | O²   | −0.104 6         | −0.212 6 | −0.530 3 |
|              | O²   | −0.312 6         | −0.309 0 | −0.641 2 |
|              | O²   | −0.312 5         | −0.360 0 | −0.640 9 |
|              | R²   | 0.964            | 0.846  |
25. Rose, H. & Shore, H. B. Elastic constants of the transition metals from a uniform electron gas. Phys. Rev. B 49, 11588 (1994).
26. Ohtomo, A. & Hwang, H. Y. A high-mobility electron gas at the LaAlO3/SrTiO3 heterointerface. Nature 427, 423–426 (2004).
27. Nazir, B. A. & Schwingerenschloegl, U. Suppression of the two-dimensional electron gas in LaGaO3/SrTiO3 by cation intermixing. Sci. Rep. 3, 3409 (2013).
28. Liu, Y. & Wu, J. Z. A bridge-functional-based classical mapping method for predicting the correlation functions of uniform electron gases at finite temperature. J. Chem. Phys. 140, 084103 (2014).
29. Chang, Y. J. et al. Layer-by-Layer Evolution of a Two-Dimensional Electron Gas Near an Oxide Interface. Phys. Rev. Lett. 111, 126401 (2013).
30. Bringuier, E. The thermodynamical foundation of electronic conduction in solids. Eur. J. Phys. 39, 025101 (2018).
31. Gross, E. K. U. & Dreizler, R. M. Thomas-Fermi approach to diatomic system. Phys. Rev. A 20, 1798–1807 (1979).
32. Parr, R. G. & Yang, W. T. Density-Functional Theory of Atoms and Molecules, Oxford University Press,3th. 55–59 (1989).

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Author contributions
Y. Jon conceived the project. Y. Jon and T.I. Kim designed the project. C.I. Ri, R.N. An, H.S. Yun and G.C. Jong established the mathematical model and carried out computational investigation. G.B. Han, S.I. Chae and G. N. Kim provided theoretical analysis. T.I. Kim and C.I. Ri co-wrote manuscript with inputs from all authors. All the authors participated in preparing the manuscript and contributed to the discussion and analysis.

Competing interests
The authors declare no competing interests.

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