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# Detailed magnetic analysis and successful deep-neural-network-based conformational prediction for $[\text{VO}(\text{dmso})_5][\text{BPh}_4]_2$ †

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Pentakis(dimethylsulfoxide-κO)oxidovanadium(IV) bis(tetraphenylborate),  $[\text{VO}(\text{dmso})_5][\text{BPh}_4]_2$  (dmso: dimethylsulfoxide), was synthesized, and its pseudo- $C_4$   $\text{VO}_6$  coordination geometry was revealed by a single-crystal X-ray method. A novel equation set was obtained for magnetic susceptibility and magnetization of the  $d^1$  complexes, considering the axial distortion and the spin–orbit coupling for the  $^2D$  free-ion term. The equation set enabled magnetic simulation for significantly symmetry-lowered  $d^1$  complexes to obtain the anisotropic  $g$ -values and also the excitation energies. In addition, conformational prediction was conducted, using the enumeration results on the basis of the group theory. The dominant conformers were predicted on the basis of the density functional theory (DFT) method, and especially, the conformer in the crystal was successfully predicted by a deep neural network method.

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## Introduction

Magnetic susceptibility and magnetization are fundamental physicochemical properties that need to be interpreted based on an appropriate theoretical model. Magnetic data, however, are sometimes too difficult to be simulated, especially when the orbital angular momentum remains unquenched. In the case of metal complexes of cubic symmetry, the orbital angular momentum remains when the ground term belongs to the T irreducible representation. The magnetic theory was established for the T-ground-term complexes;<sup>1–3</sup> however, it doesn't work well when the distortion from the cubic symmetry is large. To solve this problem, the most important thing is to consider the excited terms that will influence when the

symmetry is lowered. In this study, a new theoretical equation set was obtained for the simplest T-term,  $^2T_2$  term, considering also the excited  $^2E$  term. The theoretical equation set is expected to work universally for any degree of distortion. Deriving such theoretical equations, considering the excited term, is expected to enable the magnetic analysis for all metal complexes in the future, clarifying the ground states experimentally.

Octahedral metal complexes with the T-term ground state are expected to exhibit significant magnetic anisotropy originate from small distortion, due to the spin–orbit coupling. On the other hand, too large distortion causes a split of the T-term to afford a non-T-term ground state, diminishing the significant magnetic anisotropy. The novel magnetic equation set, derived in this study, can be universally used for both large and small distortion for the  $^2T_2$ -ground-term complexes. Moreover, the novel equation set can relate the magnetic data, the electron spin resonance (ESR) data, and the electronic spectral data.

An octahedral vanadium(IV) complex is the simplest example of the T-ground-term complex, possessing the  $d^1$  electronic configuration. The  $^2D$  free-ion term splits into the ground  $^2T_2$  state and the excited  $^2E$  state in the  $O$  symmetry; however, the further splitting caused by the tetragonal distortion changes the ground state to the non-T-term ground state,  $^2B_2$ , in the  $C_4$  symmetry (Fig. 1).<sup>4</sup> In this case, since the orbital angular momentum is almost quenched, the first-order spin–orbit coupling is neglected and only the admixing effect by the second-order spin–orbit coupling is considered.<sup>4,5</sup> Hereafter, we

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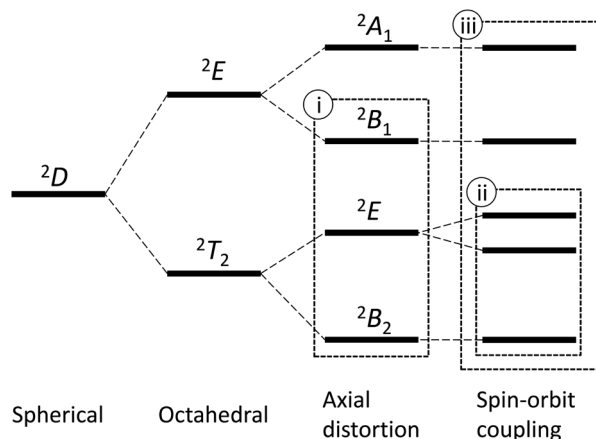


Fig. 1 The energy diagram for the  $d^1$  electronic configuration. A typical method without the consideration of the spin-orbit split (i), a typical method considering the spin-orbit split (ii), and a new full method (iii).

refer this approximation as method (i). This method is valid only when the first-order orbital angular momentum is practically quenched due to the large distortion.

On the other hand, when the distortion from the regular octahedron is not so large, the conventional T-term theory<sup>1–3,5</sup> is valid. In this case, since the orbital angular momentum remains unquenched, the first-order spin-orbit coupling plays an important role. Hereafter, we refer this as method (ii). This method considers the first-order spin-orbit coupling of the states originated from the  $^2T_2$  state, but the higher states from the  $^2E$  state are not considered. Thus, the method (ii) is valid only when the admixing of the higher states can be neglected. So far, these two methods have been applied for axially distorted octahedral  $d^1$  systems.<sup>5</sup>

In this study, in order to solve the problems of the limitation in the above two methods, new method (iii) is derived, considering both the first-order and the second-order spin-orbit coupling effects for all the states derived from the  $^2D$  free-ion term by symmetry-lowering. In addition, structure and magnetic properties are investigated for a newly prepared pentakis(dimethylsulfoxide- $\kappa$ O)oxidovanadium(IV) complex,  $[\text{VO}(\text{dmsO})_5][\text{BPh}_4]_2$  (**1**) (dmsO: dimethylsulfoxide), in order to evaluate the three methods.

Another topic of this study is predicting the structure of flexible metal complexes. Even a simple  $[\text{VO}(\text{dmsO})_5]^{2+}$  type complex cation has more than 8000 conformers<sup>6</sup> with respect to the rotations around V–O(dmsO) and O–S bonds. In such a case, as we conducted previously for  $[\text{Mg}(\text{dmsO})_6]^{2+}$  complex cation,<sup>7</sup> one of the reliable methods in predicting structures is a conformational analysis considering all the possible conformers. In this study, conformational analysis was conducted, using the enumeration result<sup>7</sup> on the basis of the group theory, in order to find which conformers are stable. Moreover, conformational prediction was conducted by also a machine learning technique in artificial intelligence with a deep neural network model.<sup>8</sup>

## Results and discussion

### Synthesis and characterization of **1**

An oxidovanadium(IV) complex,  $[\text{VO}(\text{dmsO})_5][\text{BPh}_4]_2$  (**1**), was newly synthesized from oxidovanadium(IV) sulfate and sodium tetraphenylborate in dmsO solution. Synthetic details are described in Experimental section. The compound is stable in dmsO solution, and can be recrystallized from dmsO/2-propanol. Complex **1** was characterized by infrared spectra and elemental analysis. If the IR spectra of **1** are compared with its derivatives,  $[\text{Mg}(\text{dmsO})_6][\text{BPh}_4]_2$ ,<sup>7</sup>  $[\text{Co}(\text{dmsO})_6][\text{BPh}_4]_2$ ,<sup>9</sup> and  $[\text{Zn}(\text{dmsO})_6][\text{BPh}_4]_2$ ,<sup>10</sup> the band at around  $983\text{ cm}^{-1}$  is unique, and it can be reasonably assigned to the V=O stretching band ( $1000\text{--}970\text{ cm}^{-1}$ ).<sup>11</sup> The band at around  $952\text{ cm}^{-1}$  is common to the other derivatives, and can be assigned to the S=O stretching band of the dmsO- $\kappa$ O ligand ( $\sim 950\text{ cm}^{-1}$ ).<sup>12</sup> The intense bands at around  $735$  and  $708\text{ cm}^{-1}$  are assigned to tetraphenylborate anion.

### Crystal structure of **1**

Crystallographic data are summarized in Table 1, and the structure of the complex cation,  $[\text{VO}(\text{dmsO})_5]^{2+}$ , is shown in Fig. 2. The compound consists of the complex cations and the tetraphenylborate anions in 1 : 2 molar ratio. In the complex cation, the oxido and five dmsO ligands coordinate to the central vanadium(IV) ion through the oxygen atoms, forming an octahedral  $\text{VO}_6$  coordination geometry.

Although the disorder was observed around one of the dmsO moieties [S(5A), C(9A), C(10A)], we will discuss only the main structure, because the occupancy of the minor structure is small

Table 1 Crystallographic data and refinement parameters of **1**

Empirical formula	$\text{C}_{58}\text{H}_{70}\text{B}_2\text{O}_6\text{S}_5\text{V}$
Formula weight	1096.00
Crystal system	Monoclinic
Space group	$P2_1/c$
$a/\text{\AA}$	11.7605(7)
$b/\text{\AA}$	12.7062(8)
$c/\text{\AA}$	37.334(2)
$\beta/^\circ$	91.0600(10)
$V/\text{\AA}^3$	5578.0(6)
$Z$	4
Crystal dimensions/mm	$0.38 \times 0.26 \times 0.24$
$T/\text{K}$	90
$\lambda/\text{\AA}$	0.71073
$\rho_{\text{calcd}}/\text{g cm}^{-3}$	1.305
$\mu/\text{mm}^{-1}$	0.414
$F(000)$	2316
$2\theta_{\text{max}}/^\circ$	57.1
No. of reflections measured	36 379
No. of independent reflections	13 561 ( $r_{\text{int}} = 0.0541$ )
Data/restraints/parameters	13 561/4/668
$R_1^a$ ( $I > 2.00\sigma(I)$ )	0.0544
$wR_2^b$ (all reflections)	0.1289
Goodness of fit indicator	1.027
Highest peak, deepest hole/ $e \text{\AA}^{-3}$	0.450, $-0.376$

$$^a R_1 = \Sigma ||F_o| - |F_c|| / \Sigma |F_o|. \quad ^b wR_2 = [\Sigma (w(F_o^2 - F_c^2)^2) / \Sigma w(F_o^2)^2]^{1/2}.$$



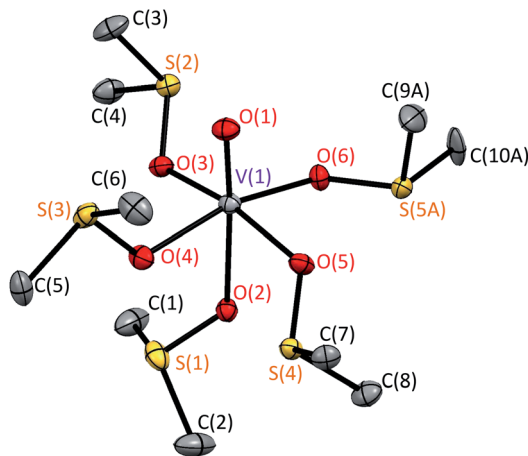


Fig. 2 Crystal structure of  $[\text{VO}(\text{dmsO})_5]^{2+}$  in **1** at 90 K. Hydrogen atoms and disordered minor structure are omitted for clarity.

[0.146(2)]. (Note: alert B in checkCIF is due to the missing hydrogen atoms that could not be handled well in the disordered minor moiety.) Selected bond distances and angles are summarized in Table 2. The  $\text{V}=\text{O}$  bond distance was found to be 1.5974(18) Å, and this is normal for the octahedral oxidovanadium(IV) complexes [1.57–1.61 Å].<sup>13</sup> The equatorial  $\text{V}-\text{O}$  distances fall in the range of 2.0009(17)–2.0270(18) Å, which is shorter than the axial  $\text{V}-\text{O}$  distance of 2.1841(17) Å. These distances are also normal for the octahedral oxidovanadium(IV) complexes [1.99–2.03 Å for equatorial  $\text{V}-\text{O}$  and 2.16–2.24 Å for axial  $\text{V}-\text{O}$ ].<sup>13</sup> The central  $\text{VO}_6\text{S}_5$  unit was found to take the defect  $S_6$  symmetry (conformer L5-B35\*<sup>6</sup>), which was thought to be stable. In the related  $[\text{Co}(\text{dmsO})_6]^{2+}$  and  $[\text{Zn}(\text{dmsO})_6]^{2+}$  complex cations, the  $S_6$  symmetry was found for the  $\text{MO}_6\text{S}_6$  unit [ $\text{M} = \text{Mg}(\text{II})$ ,  $\text{Co}(\text{II})$ , and  $\text{Zn}(\text{II})$ ].<sup>7,9,10</sup>

Comparing the structure of **1** with its perchlorate derivative,  $[\text{VO}(\text{dmsO})_5][\text{ClO}_4]_2$  (**2**),<sup>13</sup> the conformations of the cations are different from each other with respect to the orientation of the terminal methyl groups, although the central  $\text{VO}_6\text{S}_5$  units have

the same defect  $S_6$  symmetry. In **2**, oxido oxygen is hydrogen-bonded to a dmsO methyl group of the adjacent complex cation, forming a one-dimensional chain structure of the complex cations, while the cation is isolated from the others in **1**. This structural difference is thought to be one of the reasons of the conformational difference between **1** and **2**.

## Theory

Here we extend the conventional T-term theory<sup>1–3,5</sup> by considering also the excited E-term. We start with the conventional Hamiltonian,  $\mathbf{H} = \mathbf{V}_{\text{dis}} + \kappa\lambda\mathbf{L}\cdot\mathbf{S} + \beta[\kappa\mathbf{L}_u + g_e\mathbf{S}_u]\cdot\mathbf{H}_u$  ( $u = x, y, z$ ), for a slightly distorted octahedral structure with the  $d^1$  electronic configuration, where  $\Delta$  is the axial splitting parameter,  $\kappa$  is the orbital reduction factor,  $\lambda$  is the spin–orbit coupling parameter, and  $\mathbf{V}_{\text{dis}} = \Delta(2/3 - \mathbf{L}_z^2/3)$ .<sup>14</sup> It should be emphasized that not only the Hamiltonian but also the basis set is important. Now we introduce the following basis set (eqn (1)) for the  $d^1$  electronic configuration, using the  $|M_L, M_S\rangle$  functions ( $M_L = 0, \pm 1, \pm 2$  and  $M_S = \pm 1/2$ ). The functions  $\psi_{+1}$ ,  $\psi_{+2}$ ,  $\psi_{+3}$ ,  $\psi_{+4}$ , and  $\psi_{+5}$  correspond to  $-\text{id}_{xy}\alpha$ ,  $(\sqrt{2}/2)\{-\text{id}_{yz}\alpha - \text{d}_{xz}\alpha\}$ ,  $(\sqrt{2}/2)\{-\text{id}_{yz}\alpha + \text{d}_{xz}\alpha\}$ ,  $\text{d}_{x^2-y^2}\alpha$ , and  $\text{d}_{z^2}\alpha$ , respectively, and the functions  $\psi_{-1}$ ,  $\psi_{-2}$ ,  $\psi_{-3}$ ,  $\psi_{-4}$ , and  $\psi_{-5}$  correspond to  $\text{id}_{xy}\beta$ ,  $(\sqrt{2}/2)\{-\text{id}_{yz}\beta + \text{d}_{xz}\beta\}$ ,  $(\sqrt{2}/2)\{-\text{id}_{yz}\beta - \text{d}_{xz}\beta\}$ ,  $\text{d}_{x^2-y^2}\beta$ , and  $\text{d}_{z^2}\beta$ , respectively, where  $\alpha$  and  $\beta$  correspond to up and down spins, respectively.

$$\begin{cases} \psi_{\pm 1} = \mp \frac{\sqrt{2}}{2} \left| 2, \pm \frac{1}{2} \right\rangle \pm \frac{\sqrt{2}}{2} \left| -2, \pm \frac{1}{2} \right\rangle \\ \psi_{\pm 2} = \left| \pm 1, \pm \frac{1}{2} \right\rangle \\ \psi_{\pm 3} = \left| \mp 1, \pm \frac{1}{2} \right\rangle \\ \psi_{\pm 4} = \frac{\sqrt{2}}{2} \left| 2, \pm \frac{1}{2} \right\rangle + \frac{\sqrt{2}}{2} \left| -2, \pm \frac{1}{2} \right\rangle \\ \psi_{\pm 5} = \left| 0, \pm \frac{1}{2} \right\rangle \end{cases} \quad (1)$$

Here, the basis set  $\{\psi_{\pm 1}, \psi_{\mp 2}, \psi_{\mp 3}\}$  corresponds to the  $^2\text{T}_2$  state, and the basis set  $\{\psi_{\pm 4}, \psi_{\pm 5}\}$  corresponds to the  $^2\text{E}$  state. The secular matrix for the  $^2\text{T}_2$  term is obtained as shown in Table 3 from the Hamiltonian and the basis set. The resulting matrix corresponds to the Figgis matrix,<sup>1</sup> although the treatment of the orbital reduction factor is different.

If the  $^2\text{E}$  term is included to the matrix for the  $^2\text{T}_2$  term, the secular matrix for the  $^2\text{D}$  term is obtained as shown in Table 4. The parameters  $Q$  and  $P$  represent the energy separations from  $^2\text{B}_2$  to  $^2\text{B}_1$  and from  $^2\text{B}_2$  to  $^2\text{A}_1$ , respectively (Fig. 3).

Table 2 Selected bond distances and angles

Atom–atom	Distance/Å	Atom–atom	Distance/Å
V(1)–O(1)	1.5974(18)	V(1)–O(2)	2.1841(17)
V(1)–O(3)	2.0160(18)	V(1)–O(4)	2.0270(18)
V(1)–O(5)	2.0195(18)	V(1)–O(6)	2.0009(17)
Atom–atom–atom	Angle/°	Atom–atom–atom	Angle/°
O(1)–V(1)–O(2)	174.40(8)	O(1)–V(1)–O(3)	97.06(8)
O(1)–V(1)–O(4)	95.89(8)	O(1)–V(1)–O(5)	97.58(8)
O(1)–V(1)–O(6)	99.72(8)	O(2)–V(1)–O(3)	83.78(7)
O(2)–V(1)–O(4)	78.56(7)	O(2)–V(1)–O(5)	81.77(7)
O(2)–V(1)–O(6)	85.81(7)	O(3)–V(1)–O(4)	90.45(7)
O(3)–V(1)–O(5)	165.32(7)	O(3)–V(1)–O(6)	89.10(7)
O(4)–V(1)–O(5)	89.21(7)	O(4)–V(1)–O(6)	164.32(7)
O(5)–V(1)–O(6)	87.28(7)		

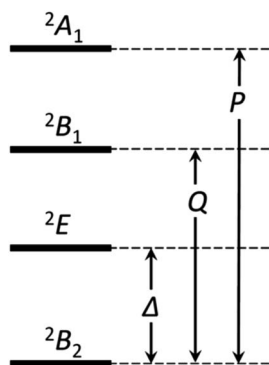
Table 3 Secular matrix for the  $^2\text{T}_2$  term

$\psi_{\pm 1}$	$\psi_{\mp 2}$	$\psi_{\mp 3}$
$-2\Delta/3$	$\sqrt{2}\kappa\lambda/2$	0
$\sqrt{2}\kappa\lambda/2$	$\Delta/3 + \kappa\lambda/2$	0
0	0	$\Delta/3 - \kappa\lambda/2$



Table 4 Secular matrix for the  $^2D$  term

$\psi_{\pm 4}$	$\psi_{\pm 1}$	$\psi_{\mp 2}$	$\psi_{\mp 3}$	$\psi_{\pm 5}$
$-2\Delta/3 + Q$	$-\kappa\lambda$	$\sqrt{2}\kappa\lambda/2$	0	0
$-\kappa\lambda$	$-2\Delta/3$	$\sqrt{2}\kappa\lambda/2$	0	0
$\sqrt{2}\kappa\lambda/2$	$\sqrt{2}\kappa\lambda/2$	$\Delta/3 + \kappa\lambda/2$	0	0
0	0	0	$\Delta/3 - \kappa\lambda/2$	$\sqrt{6}\kappa\lambda/2$
0	0	0	$\sqrt{6}\kappa\lambda/2$	$-2\Delta/3 + P$

Fig. 3 The energy separations under the  $C_{4v}$  symmetry.

Now, the basis set is converted to a new basis set (eqn (2)), then the secular matrix for the  $^2D$  term can be modified as shown in Table 5.

$$\begin{cases} \frac{\sqrt{2}}{2}\psi_{\pm 4} - \frac{\sqrt{2}}{2}\psi_{\pm 1} = \left| \pm 2, \pm \frac{1}{2} \right\rangle \\ \frac{\sqrt{2}}{2}\psi_{\pm 4} + \frac{\sqrt{2}}{2}\psi_{\pm 1} = \left| \mp 2, \pm \frac{1}{2} \right\rangle \\ \psi_{\mp 2} = \left| \mp 1, \mp \frac{1}{2} \right\rangle \\ \psi_{\mp 3} = \left| \pm 1, \mp \frac{1}{2} \right\rangle \\ \psi_{\pm 5} = \left| 0, \pm \frac{1}{2} \right\rangle \end{cases} \quad (2)$$

By solving the resulting secular matrix, the zero-field energies,  $E_n^{(0)}$ , and the first- and second-order Zeeman coefficients,  $E_{n,z}^{(1)}$ ,  $E_{n,x}^{(1)}$ ,  $E_{n,z}^{(2)}$  and  $E_{n,x}^{(2)}$ , can be obtained ( $n = \pm 1, \pm 2, \pm 3, \pm 4, \pm 5$ ). Fortunately, the matrix can be solved parametrically as

closed forms, and the exact solution can be obtained. The resulting equations are included in ESI.† As well as the zero-field energies and the Zeeman coefficients, the anisotropic  $g$ -values can be expressed (eqn (3)), using only three parameters, the orbital reduction factor  $\kappa$ , the parameter  $v$  [ $v = \Delta/(\kappa\lambda)$ ], and the parameter  $q$  [ $q = Q/(\kappa\lambda)$ ].

$$\begin{cases} g_z = g_e - \frac{16v^2q + 2q^2}{2v^2q^2 + 2v^2 - q^2} \kappa \\ g_x = g_e - \frac{2q}{v(q+1)} \kappa \end{cases} \quad (3)$$

### Electron spin resonance (ESR) and magnetic properties

The powder electron spin resonance (ESR) spectra were measured at room temperature and at liquid nitrogen temperature (Fig. 4). The spectra were essentially the same at both temperatures, showing axial pattern. From the simulation, the  $g$ -values were obtained as  $g_z = 1.933$  and  $g_x = 1.974$  at liquid nitrogen temperature. These values are close to those for the  $[\text{VO}(\text{H}_2\text{O})_5]^{2+}$  complex ( $g_z = 1.933$  and  $g_x = 1.981$ ), which were thoroughly discussed by Figgis and Hitchman.<sup>15</sup> They considered the ligand-field splitting under  $C_{4v}$  symmetry and the admixing from the excited  $^2B_1$  and  $^2E$  states to the ground  $B_2$  state. From the powder electronic spectra, the transition energies for  $^2B_2 \rightarrow ^2E$  ( $\Delta$ ) and  $^2B_2 \rightarrow ^2B_1$  ( $Q$ ) transitions were estimated as  $10\,000\text{ cm}^{-1}$  and  $16\,000\text{ cm}^{-1}$ , respectively for the  $[\text{VO}(\text{H}_2\text{O})_5]^{2+}$  complex.<sup>4</sup> Using the following approximation, the  $\kappa^2\lambda$  value was estimated as  $141\text{ cm}^{-1}$ , where  $\kappa$  and  $\lambda$  are the

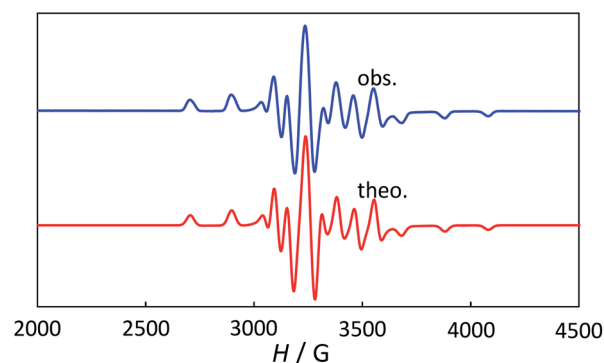


Fig. 4 The powder electron spin resonance spectra of **1** at liquid nitrogen temperature (above) and theoretical simulation with  $g_z = 1.933$ ,  $g_y = 1.974$ ,  $g_x = 1.974$ ,  $W_z = 20\text{ G}$ ,  $W_y = W_x = 18\text{ G}$ ,  $I = 7/2$ ,  $A_z = 195.5\text{ G}$ ,  $A_y = A_x = 70.7\text{ G}$  (below).

Table 5 Modified secular matrix for the  $^2D$  term

$ \pm 2, \pm 1/2\rangle$	$ \mp 2, \pm 1/2\rangle$	$ \mp 1, \mp 1/2\rangle$	$ \pm 1, \mp 1/2\rangle$	$ 0, \pm 1/2\rangle$
$-2\Delta/3 + \kappa\lambda + Q/2$	$Q/2$	0	0	0
$Q/2$	$-2\Delta/3 - \kappa\lambda + Q/2$	$\kappa\lambda$	0	0
0	$\kappa\lambda$	$\Delta/3 + \kappa\lambda/2$	0	0
0	0	0	$\Delta/3 - \kappa\lambda/2$	$\sqrt{6}\kappa\lambda/2$
0	0	0	$\sqrt{6}\kappa\lambda/2$	$-2\Delta/3 + P$



orbital reduction factor and the spin-orbit coupling parameter, respectively.

$$\begin{cases} g_z = g_e - \frac{8\kappa^2\lambda}{Q} \\ g_x = g_e - \frac{2\kappa^2\lambda}{\Delta} \end{cases} \quad (4)$$

It should be emphasized that eqn (4) can be derived from eqn (3) by approximation, because of the relationship  $q > v > 1$ .

Magnetic susceptibility ( $\chi_A$ ) was measured in the temperature range of 2–300 K, and the  $\chi_A T$  versus  $T$  plot is shown in Fig. 5. The observed  $\chi_A T$  value at 300 K ( $0.396 \text{ cm}^3 \text{ K mol}^{-1}$ ) was close to the spin-only value ( $0.375 \text{ cm}^3 \text{ K mol}^{-1}$ ) for the  $S = 1/2$  spin state. When lowering the temperature, the observed  $\chi T$  value linearly decreased to 2 K ( $0.360 \text{ cm}^3 \text{ K mol}^{-1}$  at 2 K). The saturation behaviour of the magnetization (Fig. 5, insertion) is consistent with the  $S = 1/2$  ground state. For the magnetic data analysis, the symmetry was assumed to be axial because the ESR showed an axial pattern. The magnetic susceptibility data were analysed by the magnetic susceptibility equation (eqn (5)), including the newly derived zero-field energies and Zeeman coefficients in the Theory section above. For the magnetization, the powder average is calculated using the expanded equation<sup>16</sup> (eqn (6) and (7)) for the axial symmetry ( $n = \pm 1, \pm 2, \pm 3, \pm 4, \pm 5$ ;  $m = 90$ ), although the Brillouin function equation<sup>14</sup> is also valid for 1 with the averaged  $g$ -value, due to the small  $g$ -anisotropy.

$$\chi_{A,u} = \frac{N \sum_n \left( -E_{n,u}^{(1)} - 2E_{n,u}^{(2)} H_u \right) \exp \left( -E_{n,u} / kT \right)}{H_u \sum_n \exp \left( -E_{n,u} / kT \right)} \quad (u = z, x) \quad (5)$$

$$M_{av} = \sum_{j=1}^m M \left( \frac{\left( j - \frac{45}{m} \right) \pi}{180} \right) \left[ \cos \frac{(j-1)\pi}{180} - \cos \frac{j\pi}{180} \right] \quad (6)$$

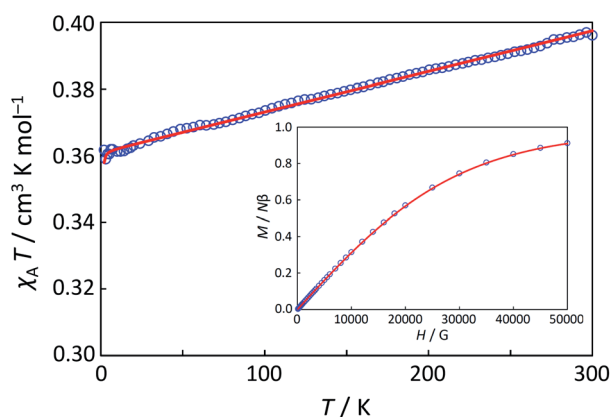


Fig. 5 The  $\chi_A T$  versus  $T$  plot at 5000 Oe and the  $M$  versus  $H$  plot of 1 at 2 K (insertion). The observed data ( $\circ$ ) and the theoretical curves ( $-$ ) with the best-fitting parameter set ( $\lambda, \kappa, \Delta, Q, \text{TIP}$ ) = ( $250 \text{ cm}^{-1}, 0.76, 12\,000 \text{ cm}^{-1}, 16\,000 \text{ cm}^{-1}, 80 \times 10^{-6} \text{ cm}^3 \text{ K mol}^{-1}$ ).

$$M(\theta) = \frac{N \sum_n \left( -E_{n,\theta}^{(1)} - 2E_{n,\theta}^{(2)} H_\theta \right) \exp \left( -E_{n,\theta} / kT \right)}{\sum_n \exp \left( -E_{n,\theta} / kT \right)} \quad (7)$$

The best-fitting parameter set was obtained as ( $\lambda, \kappa, \Delta, Q, \text{TIP}$ ) = ( $250 \text{ cm}^{-1}, 0.76, 12\,000 \text{ cm}^{-1}, 16\,000 \text{ cm}^{-1}, 80 \times 10^{-6} \text{ cm}^3 \text{ K mol}^{-1}$ ) with good discrepancy factors ( $R_\chi = 6.2 \times 10^{-5}$  and  $R_{\chi T} = 8.2 \times 10^{-6}$ ). The obtained  $\lambda$  value is consistent with the expected spin-orbit coupling parameter for vanadium(IV) ion ( $250 \text{ cm}^{-1}$ ).<sup>15</sup> The obtained  $\kappa$  value is smaller than the free-ion value, but it is normal because of the  $\pi$  orbital contribution. The obtained  $\Delta$  and  $Q$  values, corresponding to the  ${}^2\text{B}_2 \rightarrow {}^2\text{E}$  and  ${}^2\text{B}_2 \rightarrow {}^2\text{B}_1$  separations, respectively, are concordance with the electronic spectra (Fig. 6). The  $P$  value, corresponding to the  ${}^2\text{B}_2 \rightarrow {}^2\text{A}_1$  separation, could not be determined from the magnetic data fitting. From the obtained parameters, the anisotropic  $g$ -values were calculated, using eqn (3). The calculated  $g$ -values were  $g_z = 1.930$  and  $g_x = 1.977$ , which were in good agreement with the observed ESR result. Consequently, the magnetic analysis by method (iii) was successfully conducted to simulate the magnetic data, the electron spin resonance (ESR) data, and the electronic spectral data.

The conventional magnetic analysis by method (i) was also successfully conducted to simulate the magnetic data with the parameters ( $g_{\text{iso}}, \text{TIP}$ ) = ( $1.96, 125 \times 10^{-6} \text{ cm}^3 \text{ K mol}^{-1}$ ) with good discrepancy factors ( $R_\chi = 2.3 \times 10^{-5}$  and  $R_{\chi T} = 9.8 \times 10^{-6}$ ). The obtained isotropic  $g$ -value ( $g_{\text{iso}} = 1.96$ ) was consistent with the averaged  $g$ -value ( $g_{\text{av}} = 1.962$ ) obtained by method (iii); however, the further analysis was unable to determine the anisotropic  $g$ -values by method (i).

The magnetic analysis by method (ii), considering the  $T$ -term, was also conducted, and the magnetic data seemed to be simulated with the parameters ( $\lambda, \kappa, \Delta$ ) = ( $83 \text{ cm}^{-1}, 0.85, 2150 \text{ cm}^{-1}$ ) with good discrepancy factors ( $R_\chi = 4.3 \times 10^{-5}$  and  $R_{\chi T} = 6.3 \times 10^{-6}$ ). However, the  $\Delta$  value obtained by method (ii) was not consistent with the electronic spectra. Worse, the calculated anisotropic  $g$ -values ( $g_z = 1.999, g_x = 1.946, g_{\text{av}} = 1.964$ ) by method (ii) were completely different from the ESR data except for the averaged value.

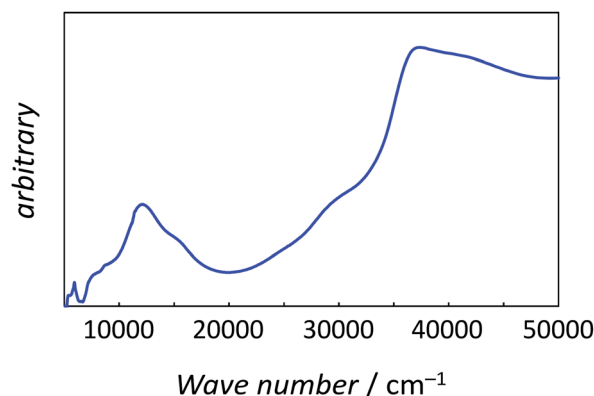


Fig. 6 The powder electronic spectra of 1.





In conclusion, in the case of the  $[\text{VO}(\text{dmsO})_5][\text{BPh}_4]_2$  complex (1), the octahedral coordination geometry was significantly symmetry-lowered by the oxido ligand. Thus, the T-term based analysis [method(ii)] was no longer useful, because the excited E-term was completely neglected in this method. Conventional spin-only method [method(i)] worked well to obtain reasonable isotropic  $g$ -value, because the orbital angular momentum was practically quenched. The novel method [method(iii)], considering both the T-term and the excited E-term, worked quite well to obtain the consistent anisotropic  $g$ -values and also the excitation energies for 1. Method (iii) is of course effective not only for the large distortion case, but also the small distortion case. Moreover, the method is expected to be effective for the intermediate case and to be able to be expanded for the symmetries that are not subgroups of octahedral symmetry.

### Conformational analysis for $[\text{VO}(\text{dmsO})_5]^{2+}$ complex cation

A lot of conformers are possible for the octahedral pentakis-dmsO oxidovanadium(IV) complex cation, because it is flexible with respect to the rotation around the V–O(dmsO) and O–S bonds. Therefore, in order to find which conformers are stable, conformational analysis was conducted for the  $[\text{VO}(\text{dmsO})_5]^{2+}$  complex cation. Enumeration of this type of conformers was previously conducted on the basis of group theory,<sup>6</sup> and the result was described using the conformer codes. Since the defect  $S_6$  conformation is stable for the central  $\text{VO}_6\text{S}_5$  unit and only this conformation is practically possible, 243 conformers, possessing the defect- $S_6$ - $\text{VO}_6\text{S}_5$  unit (code name: L5-B35), were considered in conformational analysis.

The resulting top six conformers and typical conformers are listed in Table 6. When we previously conducted the conformational analysis of the  $[\text{Mg}(\text{dmsO})_6]^{2+}$  complex cation,<sup>7</sup> the three typical dmsO-arms are named as  $\alpha$ ,  $\beta$ , and  $\gamma$ . The nature of the each arm conformation is as follows. The  $\alpha$ -arm conformation is generally suitable for reducing the inter-ligand steric repulsions, and is often found in related dmsO complexes,  $[\text{Zn}(\text{dmsO})_6][\text{ClO}_4]_2$ ,  $[\text{Mn}(\text{dmsO})_6]\text{I}_2$ ,  $[\text{Fe}(\text{dmsO})_6][\text{SnCl}_6]_2$ ,  $[\text{Co}(\text{dmsO})_6][\text{SnCl}_6]_2$ , and  $[\text{Ni}(\text{dmsO})_6][\text{SnCl}_6]_2$ ;<sup>17</sup> the  $\beta$ -arm conformation is less suitable in reducing the inter-ligand steric repulsions, but is possible to be stabilized to some extent by

$\text{CH}\cdots\pi$  interaction with surroundings; the  $\gamma$ -arm conformation is not suitable in reducing the inter-ligand steric repulsions, but is suitable for reducing the size of the complex cation.<sup>7</sup> In the case of the present  $[\text{VO}(\text{dmsO})_5]^{2+}$  complex cation, three typical conformers possessing  $\alpha_5$ -,  $\beta_5$ -, and  $\gamma_5$ -arms are shown in Fig. 7. As expected, the  $\alpha_5$  conformer is the most stable among them, while the  $\gamma_5$  conformer is the most unstable. Judging from the energy differences between conformers (Table 6) and the thermal energy value ( $kT = 0.60 \text{ kcal mol}^{-1}$  at 300 K), several conformers, are thought to be mixed in solution.

The crystal structure of  $[\text{VO}(\text{dmsO})_5]^{2+}$  and several stable conformers are shown in Fig. 8. It is noted that the crystal structure (Fig. 8a) is the mirror image of that in Fig. 2. Judging from the energy differences, conformer L5-B35-123 possessing  $\alpha\alpha\alpha\beta\alpha$ -arms and conformer L5-B35-126 possessing  $\alpha\alpha\beta\beta\alpha$ -arms are the dominant species in solution.

### Conformational prediction by deep neural network method

In this study, conformational prediction for the  $[\text{VO}(\text{dmsO})_5]^{2+}$  complex cation was conducted by also a machine learning technique in artificial intelligence with a deep neural network model,<sup>8</sup> trained on a magnesium derivative data. Previously, we conducted conformational analysis of  $[\text{Mg}(\text{dmsO})_6]^{2+}$  complex cation, considering 130 conformers possessing the  $S_6$ - $\text{MgO}_6\text{S}_6$  cores.<sup>7</sup> By learning the resulting structure-energy pairs, a trained neural-network-model was successfully constructed. This model can successfully indicate whether the conformation is energetically stable with a five-point scale for  $[\text{Mg}(\text{dmsO})_6]^{2+}$ . Prediction for the present  $[\text{VO}(\text{dmsO})_5]^{2+}$  complex cation became possible by adding a scaling factor to input data and a processing program for output data. As the result, the most probable conformer was predicted as L5-B35-126, and all of the 243 conformers were categorized in a five-point scale (A: the most probable 25 conformers; B: 66 conformers; C: 91 conformers; D: 47 conformers; E: 14 conformers). The predicted conformer L5-B35-126 was incidentally the conformer found in the crystal structure. The top six conformers discussed in the above section were included in the most probable category A. Therefore, the 243 candidates of the conformers were successfully narrowed down to one tenth. Generally, full conformation search with structure optimization calculation is a time-consuming task. Therefore, narrowing down candidates by machine learning is expected to be useful in timesaving in future structural prediction. It should be also emphasized that the prediction by machine learning completes at once, using

Table 6 Top six and some other conformers of  $[\text{VO}(\text{dmsO})_5]^{2+}$  in dmsO solvent

Conformer <sup>a</sup>	Point group	Arms <sup>b</sup>	$\Delta E^c$
L5-B35-123	$C_1$	$\alpha\alpha\alpha\beta\alpha$	0.00
L5-B35-126	$C_1$	$\alpha\alpha\beta\beta\alpha$	0.06
L5-B35-162	$C_1$	$\alpha\alpha\beta\alpha\beta$	0.29
L5-B35-135	$C_1$	$\alpha\alpha\beta\alpha\alpha$	0.31
L5-B35-132	$C_1$	$\alpha\alpha\alpha\alpha\alpha$	0.51
L5-B35-153	$C_1$	$\alpha\alpha\beta\beta\beta$	1.05
L5-B35-233	$C_1$	$\beta\beta\beta\beta\beta$	4.67
L5-B35-1	$C_1$	$\gamma\gamma\gamma\gamma\gamma$	13.45

<sup>a</sup> Conformer codes are listed in Table S1. <sup>b</sup> Counterclockwise order in Fig. 7. <sup>c</sup> Energy difference ( $\text{kcal mol}^{-1}$ ).

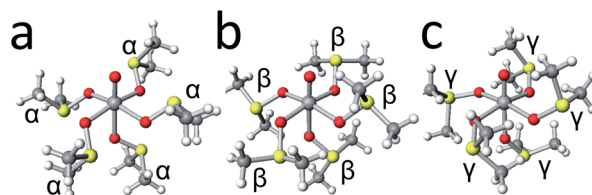


Fig. 7 The structures of conformers L5-B35-132 (a), L5-B35-233 (b), and L5-B35-1 (c).



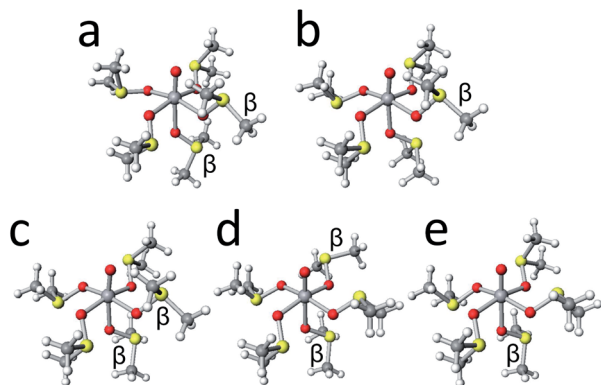


Fig. 8 The crystal structures of  $[\text{VO}(\text{dmsO})_5]^{2+}$  cation (a) and the structures of conformers L5-B35-123 (b), L5-B35-126 (c), L5-B35-162 (d), and L5-B35-135 (e).

unoptimized structures immediately generated on the basis of the group theory, as long as the trained model exists. Anyhow, the deep neural network model, trained on the more symmetric  $[\text{Mg}(\text{dmsO})_6]^{2+}$  data, was found to be quite useful in predicting the conformer of symmetry-lowered  $[\text{VO}(\text{dmsO})_5]^{2+}$ .

## Experimental

### Materials and methods

All the chemicals were commercial products and were used as supplied. Elemental analyses (C, H, and N) were obtained at the Elemental Analysis Service Centre of Kyushu University. IR spectra were recorded on a JASCO FT/IR-4100 FT-IR spectrometer. Magnetic susceptibility measurements were made on a Quantum Design MPMS-XL5 susceptometer with scan rates of  $1 \text{ K min}^{-1}$  for 2–20 K and  $2 \text{ K min}^{-1}$  for 20–300 K at 5 kOe. The isothermal magnetization was measured on a Quantum Design MPMS-XL5 susceptometer at 2 K in an applied field up to 50 kOe. The magnetic correction for the sample holder was performed by measurement for the empty polyethylene film inside a plastic straw. The susceptibilities were corrected for the diamagnetism of the constituent atoms using Pascal's constants. X-band ESR spectra were recorded at room temperature (rt) and 77 K on JEOL JES-TE300 ESR spectrometer. Experimental conditions:  $\nu = 9.44790$  (rt) and  $9.19431$  (77 K) GHz; microwave power = 4.0 mW; modulation frequency = 100 kHz; modulation width = 10.0 G. The powder electronic spectra were recorded on Shimadzu UV-3100 spectrometer that was equipped with an integrating sphere in the 200–2000 nm region.

### Synthetic procedures

$[\text{VO}(\text{dmsO})_5][\text{BPh}_4]_2$  (**1**). Oxidovanadium(IV) sulfate  $n$  hydrate (0.33 g, 2.0 mmol) was dissolved in dmsO (4 mL), and stirred for 12 h. To this was added 2-propanol solution (4 mL) of sodium tetraphenylborate (1.37 g, 4.0 mmol), and refluxed for 20 min. The addition of 2-propanol (4 mL) resulted the precipitation of blue microcrystals. Yield: 1.23 g (56%). Recrystallized from hot dmsO/2-propanol. Yield: 0.50 g (23%) (Found: C, 63.35; H,

6.45; V, 4.60%. Calc. for  $\text{C}_{58}\text{H}_{70}\text{B}_2\text{O}_6\text{S}_5\text{V}$  (**1**): C, 63.55; H, 6.45; V, 4.65%). Selected IR data  $[\tilde{\nu}/\text{cm}^{-1}]$  using a KBr disk: 3055–2985, 2915, 1580, 1478, 1424, 1319, 1135, 1032, 983, 952, 931, 749, 735, 708, 612.

### Crystallography

Single-crystals suitable for X-ray analysis were obtained by slow diffusion of 2-propanol to a dmsO solution of **1**. Single-crystal diffraction data were measured on a Bruker Smart APEX CCD diffractometer. The structure was solved by intrinsic phasing methods and expanded using Fourier techniques. The non-hydrogen atoms were refined anisotropically except for the disordered minor dmsO domain, and hydrogen atoms were refined using the riding model. In the minor domain, hydrogen atoms were not considered because the hydrogen atoms in the major domain failed to converge. The final cycle of full-matrix least squares refinement on  $F_2$  was let to satisfactory converge with  $R_1 = 0.0544$  [ $I > 2\sigma(I)$ ]. Final  $R(F)$ ,  $wR(F_2)$ , and goodness of fit agreement factors, as well as details on data collection and analysis are in Table 1.

### Computations

Magnetic analyses and magnetic simulation were conducted using MagSaki(VIV)0.1.1 and MagSaki(B)0.7.4 programs of MagSaki series. ESR simulation was conducted using “Hyperfine Spectrum” program with the spin Hamiltonian,  $\mathbf{H}_s = \beta \mathbf{B} \mathbf{g} \mathbf{S} + \text{SAI}$ .<sup>18</sup> DFT computations were performed using GAMESS program<sup>19</sup> on FUJITSU PRIMERGY CX400 (TATARA computer) at Kyushu University. Structural optimizations were performed with LC-BOP/6-31G.<sup>20</sup>

### Deep neural network method

Machine learning and conformational prediction using deep neural network models were conducted by Keras<sup>21</sup> and TensorFlow<sup>22</sup> under Jupyter<sup>23</sup> and Anaconda<sup>24</sup> on a Windows 8 computer. A deep neural network was adopted as a model, and supervised learning was performed to classify conformer structures into five classes of energy. For the learning, the previously obtained 130 optimized structures of  $[\text{Mg}(\text{dmsO})_6]^{2+}$  conformers and energy values were used. The 130 data were increased to 390 by symmetry operations ( $C_3$  and  $C_3^2$ ). For each structure, 216 S...H distances were extracted, obtaining a 216-dimensional feature vector, and the resulting  $216 \times 390$  tensor was prepared as input data. This input data was split into training and test data in a 7 : 3 ratio. In the model, the ReLU function<sup>22</sup> was used for the activation function of the hidden layer, and the softmax function<sup>22</sup> was used for the output layer. Finally, a four-layer model with 128 units was adopted as the minimum model. To avoid overfitting, the training was rounded up in 2000 cycles before the scores (accuracy and loss) worsened. As the result, eight weight tensors were successfully obtained for the  $[\text{Mg}(\text{dmsO})_6]^{2+}$  conformers. To predict the  $[\text{VO}(\text{dmsO})_5]^{2+}$  conformers, the trained  $[\text{Mg}(\text{dmsO})_6]^{2+}$  model was used with an additional scaling factor for input and summing program for output. Without the scaling factor, the output values showed no difference in conformers; however, the



scaling factor was found to change the magnitude in the output without changing the order of the conformers. By controlling the scaling factor, the program can be used for both most probable structure prediction and energy classification. Instead of the lacking S...H distances in the  $[\text{VO}(\text{dmsO})_5]^{2+}$  conformer, extremely large values were used in the input, assuming fictitious atoms at infinite distance. In this way, the effects of fictitious atoms can be eliminated. Initial structures of the conformers were generated by ConfDatMaker software.<sup>25</sup>

## Conclusions

In this study, a universal magnetic equation set was newly obtained for metal complexes with  $d^1$  electronic configuration, considering the axial ligand-field splitting and the spin-orbit coupling to the  $^2D$  free-ion term. The magnetic analysis using the equation set was successfully conducted for a newly prepared oxidovanadium(IV) complex,  $[\text{VO}(\text{dmsO})_5][\text{BPh}_4]_2$  (**1**), to obtain the anisotropic  $g$ -values and the excitation energies reasonably. The equation set was found to be universally useful for octahedral metal complexes with large and small distortion, and the method was expected to be expanded for the symmetries that are not subgroups of octahedral symmetry. The single-crystal X-ray method revealed that the complex cation,  $[\text{VO}(\text{dmsO})_5]^{2+}$ , in **1** was found to take conformer L5-B35-126 by a single-crystal X-ray method. The DFT-based conformational analysis predicted two dominant conformers, L5-B35-123 and L5-B35-126, in dmsO solution. The deep-neural-network-based conformational prediction was also conducted and conformer L5-B35-126 was successfully predicted for the  $[\text{VO}(\text{dmsO})_5]^{2+}$  complex cation, using the deep neural network model, trained on the more symmetric  $[\text{Mg}(\text{dmsO})_6]^{2+}$  derivative data.

## Conflicts of interest

There are no conflicts to declare.

## Acknowledgements

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