

¹¹B NMR Chemical Shift Predictions via Density Functional Theory and Gauge-Including Atomic Orbital Approach: Applications to Structural Elucidations of Boron-Containing Molecules

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S Supporting Information

ABSTRACT: ¹¹B nuclear magnetic resonance (NMR) spectroscopy is a useful tool for studies of boron-containing compounds in terms of structural analysis and reaction kinetics monitoring. A computational protocol, which is aimed at an accurate prediction of ¹¹B NMR chemical shifts via linear regression, was proposed based on the density functional theory and the gauge-including atomic orbital approach. Similar to the procedure used for carbon, hydrogen, and nitrogen chemical shift predictions, a database of boron-containing molecules was first compiled. Scaling factors for the linear regression between calculated isotropic shielding constants and experimental chemical shifts were then fitted using eight different levels of theory with both the solvation model based on density and conductorlike polarizable continuum model solvent models. The best method with the two solvent models yields a root-mean-square deviation of about 3.40 and 3.37 ppm, respectively. To



explore the capabilities and potential limitations of the developed protocols, classical boron-hydrogen compounds and molecules with representative boron bonding environments were chosen as test cases, and the consistency between experimental values and theoretical predictions was demonstrated.

1. INTRODUCTION

The electron deficiency of boron enables fascinating chemistry. The studies of the structure and reactivity of boron-containing molecules have formed the basis of many important chemical concepts.¹ Over the years, boron containing compounds have found a wide range of applications in metallomimetic chemistry,² materials science,³⁻⁵ and medicinal chemistry.^{6,7} The rapid development of boron chemistry is tightly coupled with the application of ¹¹B nuclear magnetic resonance (NMR) spectroscopy, which has been proved to be one of the most reliable and efficient methods for structural elucidation.⁸⁻¹⁰ Such an analysis enables effective elucidations of the chemical environment of boron within a molecule, structural assignments of possible intermediate states, as well as kinetics analysis of the reactions of interest.¹¹ ¹¹B NMR chemical shift analysis helps convincingly in structural assignment, particularly in the cases for which the X-ray crystallography study is challenging. For instance, Marwitz et al. reported the first isolation and characterization of 1,2-dihydro-1,2-azaborine, a hybrid organic/inorganic benzene isoelectronic structure through NMR analysis.¹² Recently, by monitoring the temperature-dependent ¹¹B chemical shifts, we have conclusively demonstrated that ammonium aminodiboranate, a long-sought isomer of diammoniate of diborane and ammonia borane dimer, is stable at -18 °C and decomposes at elevated temperatures.¹³

The development of various computational methods for chemical shift predictions further improves the capabilities of NMR spectroscopy in structural assignments.^{8,14–18} With the introduction of density functional theory $(DFT)^{19-23}$ and gauge-including atomic orbital (GIAO)-based approach,²⁴ the calculations of boron isotropic shielding constants become accessible. At the same time, the application of linear regression correlating calculated isotropic shielding constants and experimental NMR values has also proved effective to improve the prediction accuracy for ¹H, ¹³C, and ¹⁵N chemical shifts at relatively low computational costs.²⁵⁻³⁰ The linear regression between computed isotropic shielding constants (σ) and experimental chemical shifts (δ) was performed via the following equation

$$\delta = \frac{\text{intercept} - \sigma}{-\text{slope}} \tag{1}$$

There are two empirical scaling factors that need to be fitted: slope and intercept. The former is a correction to the systematic error (the ideal value is -1), whereas the latter corresponds to the choice of reference applied in the NMR measurement. Through these two scaling factors, the

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Table 1. The Eight Methods Adopted for Calculating	¹¹ B Isotropic Shielding	Constants and the	Fitted Empirical Scaling
Parameters (Slope and Intercept) in THF			

			SMD ^c		$CPCM^d$	
method	geometry ^a (opt & freq)	NMR^{b} (GIAO)	slope	intercept	slope	intercept
1	B3LYP/6-31+G(d,p)	mPW1PW91/6-311+G(2d,p)	-1.0869	106.19	-1.0851	106.02
2	B3LYP/6-311+G(2d,p)	mPW1PW91/6-311+G(2d,p)	-1.0877	106.40	-1.0867	106.25
3	B3LYP/6-31+G(d,p)	PBE0/6-311+G(2d,p)	-1.0959	106.32	-1.0941	106.15
4	B3LYP/6-311+G(2d,p)	PBE0/6-311+G(2d,p)	-1.0967	106.53	-1.0956	106.37
5	M062X/6-31+G(d,p) ^g	mPW1PW91/6-311+G(2d,p)	-1.1050	106.67	-1.0903	106.65
5'	M062X/6-31+G(d,p) ^g	mPW1PW91/6-311+G(2d,p)	-1.1170^{e}	107.52 ^e	-1.1386^{f}	107.76 ^f
6	M062X/6-311+G(2d,p) ^g	mPW1PW91/6-311+G(2d,p)	-1.1014	106.94	-1.1003	106.79
7	B3LYP/cc-pVDZ	B3LYP/cc-pVDZ	-1.0104	110.96	-1.0078	110.79
7′	B3LYP/cc-pVDZ	B3LYP/cc-pVDZ	-1.0386^{e}	111.96 ^e	-1.0442^{f}	111.80 ^f
8	B3LYP/cc-pVTZ	B3LYP/cc-pVTZ	-1.0824	103.20	-1.0823	103.09

^{*a*}The geometry optimization and vibrational frequency calculations were performed with this method. ^{*b*}The GIAO calculations²⁴ were performed with this method together with the implicit solvent models in Gaussian 09. ^{*c*}The fitted empirical scaling factors (slope and intercept in eq 1) for the chemical shift calculations with the SMD model.³² The linear fitting is shown in Figure 1. ^{*d*}The fitted empirical scaling factors (slope and intercept in eq 1) for the chemical shift calculations with the CPCM model.³³ The linear fitting is shown in Figure S2 in the Supporting Information. ^{*e*}The fitted empirical scaling factors (slope and intercept in eq 1) for the chemical shift calculations with the SMD model.⁵¹ The chemical shift calculations with the SMD model.⁶¹ The fitted empirical scaling factors (slope and intercept in eq 1) for the chemical shift calculations with the SMD model.⁶¹ The fitted empirical scaling factors (slope and intercept in eq 1) for the chemical shift calculations with the CPCM model.⁶¹ The fitted empirical scaling factors (slope and intercept in eq 1) for the chemical shift calculations with the CPCM model information.^{*f*} The fitted empirical scaling factors (slope and intercept in eq 1) for the chemical shift calculations with the CPCM model included in the optimization step. The linear fitting can be seen in Figure S3 in the Supporting Information.^{*f*} The fitted empirical scaling factors (slope and intercept in eq 1) for the chemical shift calculations with the CPCM model included in the optimization step. The linear fitting can be seen in Figure S3 in the Supporting Information.^{*f*} The fitted empirical scaling factors (slope and intercept in eq 1) for the chemical shift calculations with the CPCM model included in the optimization step. The linear fitting can be seen in Figure S3 in the Supporting Information.^{*g*} The linear fitting can be seen in Figure S3 in the Supporting Information.^{*f*} The linear fitting can be seen in Figure S3 in the Supporting Inf

calculated isotropic shielding constants can be converted into chemical shifts with sufficient accuracy, for instance, to allow distinguishing between different stereoisomers.²⁹

In this work, effective predictions of ¹¹B NMR chemical shifts based on linear regression were investigated. First, a database of boron-containing molecules was constructed. Second, we conducted calculations of boron isotropic shielding constants via eight different levels of theory along with two implicit solvent models for comparison. To be consistent with the experimental data, tetrahydrofuran (THF) was included as the solvent in our calculations. Third, the corresponding linear regression scaling factors were derived, and the ones with the best performance were subjected to further tests on a diverse set of boron–containing molecules including a series of boron–hydrogen compounds. Together with the previous work on ¹H,^{25,26} ¹³C,^{26,30,31} and ¹⁵N,^{28,29,31} accurate NMR chemical shift predictions for molecules containing these elements can be achieved.

2. RESULTS AND DISCUSSIONS

2.1. The Performance of the Adopted Methods. The fitted empirical scaling factors are listed in Table 1, and their performances are summarized in Table 2. The linear regressions are shown in Figure 1. For all eight methods with implicit solvent models, the values of R^2 were close to 1.0 (Table 1), indicating that the applied data are suitable for linear regression. At the same time, the deviation of the slope from -1 indicates the existence of systematic errors in the adopted DFT/GIAO-based calculations.²⁶ From the rootmean-square deviation (RMSD) values, we can see that all eight methods performed reasonably well. By the linear regression, they predicted ¹¹B chemical shifts with errors of 3.40-3.50 and 3.37-3.50 ppm with respect to the experimental data using the solvation model based on density (SMD) and conductor-like polarizable continuum model (CPCM) solvent models, respectively (Table 2 and Figure S2 in the Supporting Information). In contrast, the corresponding errors of the results obtained without linear regression are substantially larger (>18 ppm) (Table 2),

Table 2. The Performance of the Fitted Empirical ScalingFactors for the Eight Methods in Table 1

method	R^{2a}	RMSD ^b	RMSD ^c	R^{2a}	RMSD ^b	RMSD ^c
S	MD		CP	СМ		
1	0.9812	3.40	19.52	0.9813	3.38	19.41
2	0.9811	3.40	19.18	0.9812	3.40	19.07
3	0.9812	3.40	19.57	0.9813	3.39	19.45
4	0.9811	3.41	19.22	0.9812	3.40	19.11
5	0.9807	3.45	18.35	0.9803	3.48	18.32
5′ ^d	0.9796	3.55	18.11	0.9818	3.34	18.49
6	0.9801	3.50	18.10	0.9800	3.50	17.99
7	0.9811	3.41	20.17	0.9815	3.37	20.06
7′ ^d	0.9821	3.31	19.51	0.9832	3.21	19.45
8	0.9807	3.45	22.38	0.9808	3.44	22.30

 ${}^{a}R^{2}$ is the coefficient of determination for the linear regression. ${}^{b}RMSD$ for the predicted chemical shifts of the boron-containing molecules in the database (see Table S1 in the Supporting Information) with respect to their respective experimental values (in ppm) with linear regression. ${}^{c}RMSD$ for the predicted chemical shifts of the boron-containing molecules in the database (see Table S1 in the Supporting Information) with respect to their respective experimental values (in ppm) without linear regression (using BF₃OEt₂ as reference). d Implicit solvent models (CPCM or SMD) were included in the optimization step.

demonstrating the effectiveness of the fitted scaling factors in improving prediction accuracy. It is worth noting that the boron atoms bonded with halogen atoms have a large error, which has also been noted in ¹³C chemical shift predictions and is likely due to the deficiency in the adopted DFT method for this class of compounds.²⁶

Based on the above results, it can be seen that all of the eight methods display comparably good performances. PBE0 and mPW1PW91 provide similar accuracy for ¹¹B NMR chemical shift predictions (method 1 vs 3 and 2 vs 4). Method 5 and 7, with geometry optimization at M062X/6-31+G(d,p) or B3LYP/cc-pVDZ in the gas phase and NMR GIAO calculations at mPW1PW91/6-311+G(2d,p) or B3LYP/cc-pVDZ, were proved to be effective for not only ¹¹B, but also for



Figure 1. Linear regression between the experimental ¹¹B chemical shifts and calculated isotropic shielding constants with method 1-8 with the SMD solvent model for NMR GIAO calculations. (a) Method 1; (b) method 2; (c) method 3; (d) method 4; (e) method 5; (f) method 6; (g) method 7; and (h) method 8. See Figure S2 in the Supporting Information for more details for the linear regression with the CPCM solvent model for NMR GIAO calculations.



Figure 2. Boron-hydrogen compounds included in the application study.

¹H, ¹³C, and ¹⁵N chemical shift predictions as discussed before.^{26,28–30} In particular, the important advantage of method 5 (with the SMD solvent model) is that it could provide chemical shift predictions for ¹H, ¹³C, ¹⁵N, and ¹¹B with a consistent accuracy in one set of calculation via the corresponding changes of the applied solvents.^{27,29}

For the two implicit solvent models (SMD and CPCM), we found that their prediction errors of ¹¹B NMR chemical shifts are very similar (Table 2). Moreover, we investigated the potential benefit of including the implicit solvent models in the

geometry optimization (method 5' and 7' in Table 2 and Figure S3 in the Supporting Information) in contrast to those in vacuo (method 5 and 7). Only minor changes were observed (RMSD changes less than 0.15 ppm), indicating that the inclusion of implicit solvent models in geometry optimization may not improve the result significantly. Specifically, for the SMD model, the prediction error for method 5' increases slightly from 3.45 to 3.55 ppm, whereas the error decreases from 3.41 to 3.31 ppm with method 7'. The result obtained with the CPCM model shows a slight

Table 3. Experimental and Predicted	¹¹ B NMR Chemical Shifts	(in ppm) for Selected	Boron–Hydrogen Compounds"
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			$\delta_{ m pred.}$			
	Pos. ^b	Exp. ^c	5 ^d	7 ^e	5 ^f	7 ^g
BH ₃	$\delta_{ ext{B-1}}$	86.0	84.22	83.16	85.34	83.20
B_2H_6	$\delta_{ ext{B-1.2}}$	16.6	17.84	15.98	18.06	15.85
$B_2H_7^-$	$\delta_{ ext{B-1,2}}$	-24.6	-24.51	-23.48	-24.86	-23.71
$B_3H_8^-$	$\delta_{ ext{B-1}-3}$	-30.4	-26.99^{h}	-28.16^{h}	27.37 ^h	28.40 ^h
$B_4H_9^-$	$\delta(1)_{ ext{B-1}}$	-54.5	-54.41	-56.46	-55.16	-56.77
	$\delta(2)_{ ext{B-2,4}}$	-10.2	-11.65	-12.72	-11.83	-12.92
	$\delta(3)_{ m B-3}$	0.8	0.06	-1.41	0.05	-1.58
$B_{4}H_{10}$	$\delta(1)_{ ext{B-6,7}}$	-6.9	-6.85	-7.51	-6.97	-7.70
	$\delta(2)_{ ext{B-12}}$	-41.8	-40.18	-42.75	-40.74	-43.03
B ₅ H ₉	$\delta(1)_{ ext{B-1}}$	-13.4	-14.17	-15.47	-14.38	-15.68
	$\delta(2)_{ ext{B-2-5}}$	-53.1	-50.65	-55.75	-51.35	-56.06
B_5H_{11}	$\delta_{ ext{B-1-5}}$	-55.3	-51.38	-53.43	-52.09	-53.74
$B_{6}H_{10}$	$\delta(1)_{ ext{B-3-6}}$	18.6	14.77	14.98	14.95	14.85
	$\delta(2)_{ ext{B-2}}$	-6.5	-8.23	-11.13	-8.36	-11.33
	$\delta(3)_{ ext{B-1}}$	-51.8	-48.95	-51.64	-49.63	-51.94
$B_{6}H_{12}$	$\delta(1)_{ ext{B-1,4}}$	22.6	22.56	20.43	22.85	20.32
	$\delta(2)_{ ext{B-3,6}}$	7.9	11.04	10.15	11.17	10.01
B ₈ H ₈ ²⁻	$\delta_{ ext{B-1-8}}$	-6.8	-1.55	-3.60	-1.59	-3.78
B ₉ H ₉ ²⁻	$\delta(1)_{ ext{B-3,4,9}}$	-2.9	-3.60	-6.40	-3.67	-6.59
	$\delta(2)_{ ext{B-1,2,5-8}}$	-20.5	-21.98	-22.22	-22.30	-22.45
$B_{10}H_{10}^{2-}$	$\delta(1)_{ ext{B-1,3-8,10}}$	-30.9	-28.38	-28.85	-28.78	-29.10
	$\delta(2)_{ ext{B-2,9}}$	0.9	-2.47	-3.18	-2.52	-3.36
$B_{10}H_{14}$	$\delta(1)_{ ext{B-5,6}}$	13.5	12.66	12.20	12.81	12.06
	$\delta(2)_{ ext{B-1,10}}$	10.7	8.18	7.62	8.27	7.47
	$\delta(3)_{ ext{B-3,4,8,9}}$	1.6	0.65	0.42	0.64	0.25
	$\delta(4)_{ ext{B-2,7}}$	-35.2	-33.14	-34.95	-33.60	-35.21
$B_{11}H_{11}^{2-}$	$\delta_{ ext{B-1}-11}$	-16.9	-17.10	-17.63	-17.35	-17.85
$B_{12}H_{12}^{2-}$	$\delta_{ ext{B-1}-12}$	-15.6	-13.82	-14.62	-14.03	-14.83

^{*a*}All of the NMR calculations were conducted in vacuo. ^{*b*}Positions for the boron of interest, more details can be seen in Table S6 in Supporting Information. ^{*c*}Experimental data were taken from refs.^{37,41,46–49} ^{*d*}The predicted chemical shifts via the linear regression model by method 5 (the SMD set). ^{*e*}The predicted chemical shifts via the linear regression model by method 7 (the SMD set). ^{*f*}The predicted chemical shifts via the linear regression model by method 7 (the CPCM set). ^{*g*}The predicted chemical shifts via the linear regression model by method 7 (the CPCM set). ^{*b*}For B₃H₈⁻, our calculations predicted two different chemical shifts for boron atoms, and the averaged value was used to compare with the experimental value.

difference, where the errors for both method 5 and 7 decrease. Considering their increased computational costs and the corresponding gain in accuracy, we recommend to use gas phase geometry optimization and only include the solvent model for the NMR calculation step.

2.2. Applications of ¹¹**B Chemical Shift Predictions for Boron–Hydrogen Compounds.** We applied the developed protocol to illustrate its possible assistance for experimental work in the field of hydrogen storage. In recent years, because of the high content of hydrogen,^{34,35} the studies of boron–hydrogen compounds have attracted increasing interest from the community of hydrogen storage. Nevertheless, effective identification of the intermediates during hydrogen evolution remains a challenge. From the perspective of the NMR analysis, merely relying on ¹H NMR spectroscopy is not sufficient.³⁶ Combining ¹H and ¹¹B NMR spectroscopies can be a powerful strategy in resolving the structure of boron–hydrogen compounds.

In this study, we tested 16 classical boron-hydrogen compounds (Figure 2), for which experimental data are available (Table 3). We conducted the NMR GIAO calculations via method 5 and 7 in vacuo following the same procedure as above. Table 3 and Figure 3 show an excellent agreement between the predicted values and experimental

data.³⁷ For both method 5 and 7, scaling factors derived from both SMD and CPCM models work equally well, and most of the prediction errors are within 1.0 RMSD.

The diborane, B_2H_{6i} which has two bridging hydrogen atoms and features a ring structure (structure 2 in Figure 2), is a highly reactive reagent that has versatile applications. As can be seen from Figure 2, the optimized structure shows a planar ring of diborane with the dihedral angle between H_b-B-H_b-B at 0°, matching well with the experimental measurement^{38,39} and previous computational work.³⁷ The deviations of the predicted values from the experimental data are within 1.5 ppm. The anion $B_3 H_8^-$ (structure 4 in Figure 2) has attracted a lot of attention due to its stability and high content of hydrogen.^{40,41} This anion may adopt different structures in solution.⁴² Indeed, solution NMR studies have shown that the transformation between possible structures can happen via the migration of hydrogen.^{43–45} Considering the fluxional behavior of $B_3H_8^{-}$, we applied the same procedure by Sethio et al.³⁷ to average the two predicted values of ¹¹B NMR chemical shifts, and then compare the average with experimental data. From Table 3, we found that the deviations are within 3.4 and 2.2 ppm for method 5 and 7, respectively, which is in a reasonable agreement with the experimental data. In contrast, Sethio et al.



Figure 3. The deviations between the predicted and experimental ¹¹B NMR chemical shifts of molecules listed in Table 3. (a) The isotropic shielding constants were calculated with method 5 and 7 with the SMD model, and were converted to chemical shifts with the scaling factors of the SMD set listed in Table 1. The RMSD value is marked by the dashed line. (b) The isotropic shielding constants were calculated with method 5 and 7 with the CPCM model, and were converted to chemical shifts with the scaling factors of the CPCM set listed in Table 1. The RMSD value is marked by the dashed line.

reported errors \sim 6–9 ppm for three different DFT methods without linear regressions.³⁷

2.3. Applications of ¹¹B Chemical Shift Predictions for Structural Elucidations of Boron Containing Molecules. We also applied our protocol to further test some other boron containing molecules with diverse bonding environments and investigate their overall applicability (Figure 4). From the results listed in Table 4 and deviations shown in Figure 5, we can see that the agreement between the predicted values and experimental data is excellent, indicating the robustness of our protocol for structural elucidations of boron containing molecules with different bonding features. It is worth pointing out that, some of these experimental ¹¹B chemical shift values were measured in pure liquids or solvents other than THF (Table 4). We infer that there exists a reasonable transferability for scaling factors among different solvents. This is consistent with our previous work on nitrogen NMR chemical shift predictions.²⁹

3. METHODOLOGY

3.1. Database of Boron-Containing Molecules. There are 36 molecules and 36 chemical shifts in total included in our database (see Table S1 in the Supporting Information for more details). The two criteria for selection of molecules include (a) reliable experimental data available, preferably in THF;⁵⁰ and



Figure 4. Boron containing molecules included in the application study.

(b) having relatively rigid boron skeletons. As discussed in ref 29, the reason for the second criterion is to avoid the potential challenges in dealing with flexible molecules when developing linear regression models, which require Boltzmann averaging of the calculated isotropic shielding constants on the basis of relative energies of all available conformers. However, the developed scaling factors are expected to be applicable for flexible molecules, provided that the relative energies of their relevant conformers can be calculated accurately.²⁶

3.2. Computational Details. To be consistent with the procedure proposed by Tantillo and co-workers^{26,27} and our previous study on ¹⁵N NMR chemical shifts,²⁹ we first carried out geometry optimization in vacuo to locate the minima on the potential energy surface. These optimized structures were verified by vibrational frequency calculations. Second, we conducted NMR single-point calculations in THF with both the SMD³² and CPCM³³ solvent models. It has been shown that the inclusion of the implicit solvent model in the NMR calculation step is crucial to improve the prediction accuracy of ¹H and ¹³C chemical shifts.^{25–27} Another study by Xin et al. focusing on ¹³C chemical shift predictions adopted the CPCM solvent model.³⁰ The inclusion of the explicit solvent model

Table 4. Experimental and Predicted ¹¹B NMR Chemical Shifts (in ppm) for Selected Boron Containing Molecules^a

	Exp. ^b	5 ^c	7 ^d	5 ^e	7 ^f
		$\delta_{ m pred.}$			
1	72.2	67.32	67.89	68.22	67.94
2	81.1	76.99	81.02	78.67	81.83
3	40.0	37.88	38.83	38.38	38.76
4	72.0	66.94	66.90	67.82	66.90
5	65.3	61.98	64.78	62.80	64.77
6	55.2	51.21	51.06	51.88	51.02
7	33.0	32.72	31.82	33.14	31.74
8	31.6	31.76	33.38	32.17	33.29
9	30.8	32.31	32.69	32.73	32.60
10	67.6	61.37	64.30	62.18	64.30
11	28.1	30.43	25.27	30.85	25.16
12	62.7	59.53	62.98	60.32	62.97
13	45.3	43.30	45.44	43.86	45.39
14	21.3	21.10	17.71	21.37	17.59
15	3.0	3.51	1.23	3.52	1.06
16	2.7	3.07	0.86	3.11	0.72
17	-17.5	-17.29	-17.03	-17.41	-17.07
18	-16.6	-18.08	-17.92	-18.25	-18.10
19	-16.1	-12.91	-12.52	-13.19	-12.79
20	84	79.37	80.94	80.591	81.29
21	82.3	80.70	77.75	82.17	78.24

^{*a*}Details of the calculations can be found in Tables S9 and S10 in the Supporting Information. ^{*b*}Experimental data.⁵⁰ ^{*c*}The difference between experimental values and calculated chemical shifts with the linear regression model by method 5 (the SMD set). ^{*d*}The difference between experimental values and calculated chemical shifts with the linear regression model by method 7 (the SMD set). ^{*e*}The difference between experimental values and calculated chemical shifts with the linear regression model by method 5 (the CPCM set). ^{*f*}The difference between experimental values and calculated chemical shifts with the linear regression model by method 5 (the CPCM set).

may further improve the prediction accuracy of chemical shifts,^{51,52} with a substantial increase of the computational cost. For consistency with the previous studies, 2^{26-30} implicit solvent models were adopted in the current work. The GIAO approach was applied to calculate ¹¹B isotropic shielding constants.²⁴ All of the calculations were carried out with Gaussian 09.53 The first six levels of theory (Table 1, method 1-6) are to follow Tantillo and co-workers' work on ¹H and ¹³C chemical shifts^{26,27} and our previous study on ¹⁵N chemical shifts.²⁹ In addition, two methods (Table 1, method 7 and 8), which have been shown to provide accurate predictions for both ¹⁵N²⁸ and $^{13}\text{C}^{30}$ chemical shift calculations, were also included for comparison. To further investigate the solvent effects, additional calculations with an implicit solvent model included in the geometry optimization step were carried out for two levels of theory (method 5' and 7').

4. CONCLUSIONS

In this study, empirical scaling techniques for accurate prediction of 11 B NMR chemical shifts have been proposed by comparing eight different levels of theory with two solvent models, based on the calculated isotropic shielding constants in THF. The protocol of 11 B NMR chemical shift prediction is consistent with the procedure proposed by Tantillo and coworkers^{26,27} for 1 H and 13 C chemical shifts and our previous work for 15 N chemical shift.²⁹ The two sets of scaling factors for two different solvent models (SMD and CPCM) were



Figure 5. The deviations between the predicted and experimental ¹¹B NMR chemical shifts of molecules listed in Table 4. (a) Isotropic shielding constants were calculated with methods 5 and 7 with the SMD model and were converted to chemical shifts with the scaling factors of the SMD set listed in Table 1. The RMSD value is marked by the dash. (b) Isotropic shielding constants were calculated with method 5 and 7 with the CPCM model and were converted to chemical shifts with the scaling factors of the CPCM set listed in Table 1. The RMSD value is marked by the dash 1. The RMSD value is marked by the dash 1. The RMSD value is marked by the dash 1. The RMSD value is marked by the dash line.

compared. Among the eight levels of theory, method 5 and 7 show the best performance, with geometry optimization in the gas phase at M062X/6-31+G(d,p) or B3LYP/cc-pVDZ and NMR GIAO calculation at mPW1PW91/6-311+G(2d,p) or B3LYP/cc-pVDZ with an implicit solvent model. At the same time, the effect of including solvent model in the optimization step was also investigated. In summary, we recommend method 5 and 7 for ¹¹B chemical shift prediction together with those for ¹H, ¹³C, and ¹⁵N in one set of calculations. For boron-hydrogen compounds or other boron-containing molecules, the predicted ¹¹B chemical shifts with method 5 and 7 agree well with the experimental data, indicating the robustness and broad applicability of this protocol for structural elucidation. It is worth noting that the fitted scaling factors in THF can provide a reasonable prediction for ¹¹B chemical shifts measured in either pure liquids or in other solvents. This is consistent with the finding of our previous research on ¹⁵N chemical shift.²⁹ We expect that this work on ¹¹B chemical shift can serve as a useful tool for elucidating or confirming the structure of boron-containing compounds.

ASSOCIATED CONTENT

S Supporting Information

The Supporting Information is available free of charge on the ACS Publications website at DOI: 10.1021/acsome-ga.9b01566.

Experimental ¹¹B NMR chemical shifts used in this study and figures for linear regression between the experimental ¹¹B NMR chemical shifts and the calculated isotropic shielding constants with the CPCM solvent model (PDF)

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Notes

The authors declare no competing financial interest.

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