# A guide to small-molecule structure assignment through computation of (<sup>1</sup>H and <sup>13</sup>C) NMR chemical shifts

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This protocol is intended to provide chemists who discover or make new organic compounds with a valuable tool for validating the structural assignments of those new chemical entities. Experimental <sup>1</sup>H and/or <sup>13</sup>C NMR spectral data and its proper interpretation for the compound of interest is required as a starting point. The approach involves the following steps: (i) using molecular mechanics calculations (with, e.g., MacroModel) to generate a library of conformers; (ii) using density functional theory (DFT) calculations (with, e.g., Gaussian 09) to determine optimal geometry, free energies and chemical shifts for each conformer; (iii) determining Boltzmann-weighted proton and carbon chemical shifts; and (iv) comparing the computed chemical shifts for two or more candidate structures with experimental data to determine the best fit. For a typical structure assignment of a small organic molecule (e.g., fewer than ~10 non-H atoms or up to ~180 a.m.u. and ~20 conformers), this protocol can be completed in ~2 h of active effort over a 2-d period; for more complex molecules (e.g., fewer than ~30 non-H atoms or up to ~500 a.m.u. and ~50 conformers), the protocol requires ~3–6 h of active effort over a 2-week period. To demonstrate the method, we have chosen the analysis of the *cis*- versus the *trans*-diastereoisomers of 3-methylcyclohexanol (1-*cis* versus 1-*trans*). The protocol is written in a manner that makes the computation of chemical shifts tractable for chemists who may otherwise have only rudimentary computational experience.

#### **INTRODUCTION**

NMR spectroscopy is the single most powerful and generally applicable spectroscopic tool for deducing the correct structure of newly isolated organic compounds. Of the three important classes of primary NMR data—chemical shifts, coupling constants and relative integrated signal intensity—the first is the most diagnostic of the local chemical and magnetic environment (i.e., the nuclei's structural surroundings) and, arguably, the most reliably addressable by computational methods<sup>1,2</sup>. Accordingly, this protocol deals only with computational aspects of chemical shifts, and only proton and carbon nuclei are considered.

The use of quantum chemical methods for predicting proton and carbon NMR chemical shifts has now evolved to the point where compounds of considerable (and ever-increasing) complexity and size are amenable for study. Over time, DFT<sup>3</sup> has emerged as the most attractive method for predicting NMR properties of organic molecules<sup>4</sup>. The advent of improved computational methods, the substantial increase in access to sufficiently powerful computational resources and the increase in computer literacy more generally have lowered the barriers that impede the use of computation in many areas of science.

In spite of these advances, novices often view the use of a seemingly sophisticated computational study with some degree of trepidation. We once did also—the task can be daunting. The goal of this tutorial is to break down this barrier by describing protocols for computing chemical shifts of a set of candidate structures and then comparing the resulting set of theoretical values for each of those structures with the experimental data in question. Many excellent reviews<sup>5,6</sup> exist that critically assess various theoretical aspects of the computation of NMR chemical shifts (e.g., improved functionals, improved basis sets, correction and scaling routines, multiple referencing); it is not our intent here to offer an in-depth discussion of those features. Instead, we

aim to provide the typical experimentalist (who is, frequently, an inexperienced computationalist) with the guidance required to initiate such a study.

Our target audience member is a bench chemist who routinely prepares and/or isolates new, discrete organic compounds. There are (only) two prerequisites we assumed as we decided the point of departure for this protocol: (i) the reader will have access to and rudimentary familiarity with an appropriate computational chemistry package (e.g., Jaguar, GAMESS, Spartan, PCModel, etc., but preferably Gaussian and MacroModel) and the command-line interface (e.g., Terminal (in Mac OS X or Linux) or Command Prompt (in Windows)), and (ii) the reader will also have in hand quality <sup>1</sup>H and/or <sup>13</sup>C NMR spectral data for the compound(s) whose structure(s) is(are) of interest.

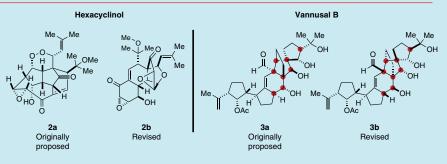
Both constitutional and configurational issues are central to correct structural assignments. Each of these features is high-lighted by the natural product-based case studies summarized in **Box 1**. Because the synthetic chemist typically knows the structure of each substrate or reactant, the question of structure assignment for each new product more often involves correctly deducing the relative configuration of newly introduced stereocenters in the product rather than its constitution. In contrast, because there is less structural history to inform the analysis of newly isolated natural product, isolation chemist<sup>7</sup>.

#### The need for something more sophisticated than an incrementbased additivity approach for predicting chemical shifts

Introductory texts typically (and justifiably) teach students to use a substituent-based approach, especially when more than one substituent is present, in which tabulated data are incrementally applied to estimate chemical shifts<sup>8</sup>. Although

# Box 1 | Two case studies: hexacyclinol (constitution) and vannusal B (relative configuration)

Given a reliable molecular formula assignment and ignoring absolute configuration, neither of which are addressable by routine NMR analysis, correct structure assignment reduces to the issues of constitution (i.e., the nature and sequence of bonding) and relative configuration (i.e., diastereomers). Hexacyclinol is a widely known example of a natural product in which a constitutional structural reassignment stemmed directly from a computational evaluation



of its <sup>13</sup>C NMR data. Structure **2a** was initially assigned to this antiproliferative metabolite<sup>36</sup>. A total synthesis of this structure was reported<sup>37</sup>. Rychnovsky<sup>28</sup>, spurred by his analysis of that "provocative synthesis" undertook a quantum mechanical computational study (using mPW1PW91/6-31G(d,p)//HF/3-21G) of the <sup>13</sup>C chemical shifts of **2a** and structure **2b**, the latter having a substantially altered constitution vis-à-vis the former. He concluded that the latter matched well with the experimental values associated with hexacyclinol. This conclusion ultimately was validated by synthesis and further supported by single-crystal X-ray analysis<sup>38,39</sup>.

A recent quantum mechanical computational study of relative configuration issues relevant to the structure of vannusal B shows the power of such an approach for distinguishing stereoisomers<sup>27</sup>. Structure **3a** was originally assigned to this natural product<sup>40,41</sup>. As is often the case in contemporary natural product isolation and structure determination campaigns, the quantity of sufficiently pure material for structural analysis was limited. It is also relevant that modern NMR technologies and methods have allowed structural studies to be undertaken with both smaller quantities and less-pure samples than was once possible. Moreover, advances in liquid chromatography have enabled the isolation of many inherently noncrystalline natural products. For these reasons, an increasingly smaller percentage of newly isolated natural products become available as crystalline samples suitable for X-ray diffraction studies. In these instances, researchers determining the structure rely to an increasing extent on extensive batteries of NMR data, including those from multidimensional measurements. Consequently and especially in view of the ever-increasing average level of structural complexity of newly isolated compounds, there is a growing frequency of incorrectly assigned structures<sup>7</sup>. Most often, this takes the form of improperly deduced relative configurations. Such was the case for the initially assigned structure of vannusal B, namely 3a. Subsequent (and extensive) synthetic efforts showed that structure 3a was not the same as the natural product; 3b was correctly deduced and then confirmed by synthesis to have the proper diastereomeric relationship of vannusal B<sup>42</sup>. The problem was revisited by computing the <sup>13</sup>C chemical shifts of both diastereomers and comparing them with each of the sets of experimental data, which were fully supportive of the reassigned structure (i.e., 3b). "Indeed, the structural revision of the originally assigned structure of vannusal B could have been greatly aided and simplified by a prior knowledge of the relevant NMR parameters, thereby allowing synthetic efforts to be concentrated on the most likely structures"27.

this method certainly has value, the example described next shows that when one moves to the consideration of molecules bearing more than one stereocenter, this approach is no longer adequate.

Consider the case of the *trans*- versus the *cis*-diastereomers of 3-methylcyclohexanol (1-*trans* and 1-*cis*, respectively). The experimental <sup>1</sup>H NMR spectra for 1-*trans* and 1-*cis* are shown in **Figure 1a,b** (see **Supplementary Data 1** for a full listing of actual chemical shift values). There are substantial differences in these two spectra, especially within the upfield 0.7–2.1 p.p.m. range. Clearly, it would be valuable if computational approaches could reproduce these sorts of differences sufficiently well to allow confident assignment of structure.

Common software packages that use empirical (often increment-based) compilations of chemical shift information (e.g., tabulated shift increments or databases of known spectral data) allow users to predict the chemical shifts of a given input structure. These include 'ChemNMR' within ChemBioDraw (also known as ChemDraw) and 'C+H NMR Predictor and DB' within the ACD/Labs software suite. These methods sometimes can be sufficient for the task of resolving constitutional structural assignments. However, when issues associated with relative configuration are considered, increment-based methods are decidedly ill-equipped. Analysis of structures **1**-*trans* and **1**-*cis* by each of these programs quickly reveals these limitations, even for these simple structures. Namely, because ChemDraw (via the 'Predict 1H-NMR Shifts' command) treats diastereomeric structures as if they were the same, it predicts identical spectra (not shown) for the two, and it is therefore of no use for distinguishing between or among diastereomers.

We then used the ACD/Labs software to produce the spectra (see **Supplementary Data 1** for the actual chemical shift values) for **1**-*trans* and **1**-*cis* presented in **Figure 1c,d**. One is struck by the high degree of similarity of these two empirically derived spectra in the aliphatic region of the spectrum of each ( $\delta$ =0.7–1.7 p.p.m.). Accordingly, neither is a particularly good match for the experimental spectrum of **1**-*trans* or **1**-*cis*. One commonly used method to quantitatively evaluate 'goodness of fit' is comparison of the

mean absolute error (MAE) between computed/modeled versus experimental data sets

$$MAE = \left| \Delta \delta_{ave} \right| = \frac{1}{N} \sum_{i=1}^{N} \left| \delta_i^{comp} - \delta_i^{exp} \right|$$
(1)

(where N is the number of unique chemical shifts used in the comparison).

The MAEs for the chemical shifts of the two computed ACD spectra versus each of the two experimental sets of proton shift values are tabulated in **Figure 1e**. For comparison, the DFT-based approach described below in the PROCEDURE typically gives MAEs of  $\leq 0.10$  p.p.m. for 'correct' fits and  $\geq 0.20$  p.p.m. for 'incorrect' structure matches (cf. **Fig. 1f**). None of the four MAE<sub>exp/ACD</sub> values in **Figure 1e** is a particularly good fit, and, more strikingly, the ACD-derived shifts for each of these diastereomers show a better match for the same (*trans*) structure. Thus, the ACD approach is also inadequate for reliably distinguishing even this relatively simple pair of diastereomers.

A more advanced strategy that uses more sophisticated computational methods is advantageous for successful analysis of most compounds of interest to the synthetic or natural product chemist. First, it is important and necessary to consider the conformational space to which the compound has access. A primer of fundamental concepts in conformational analysis is presented in Box 2. Second, the Boltzmann analysis of the relative contribution of each of the important conformers needs to be performed. The basic tenets of Boltzmann weighting to determine the mole fraction contribution to a multicomponent equilibrium are presented in Box 3. Third, superior computational methods need to be used for (i) defining the potential energy surface of the conformational space, (ii) determining high-quality energy values and geometries for all of the important conformers and (iii) computing reliable NMR chemical shift values. Although semiempirical computational approaches have been developed that have merit in this regard (e.g., CHARGE9, which is implemented in MestReNova or MNova), the use of quantum mechanics-based methods are generally accepted as the most reliable approach, especially so for characterizing new organic structures<sup>4</sup>.

As we have previously reported<sup>10</sup>, a DFT-based approach reliably provided a clear distinction between **1-cis** versus **1-trans** (as well as the remaining members of the family, *cis/trans*-2- and 4-methylcyclohexanol). In the course of that work we showed, among other things, the relative merits of using various functionals, including the hybrid variants WP04 and WC04, which we had previously developed specifically for computing proton and carbon chemical shifts<sup>11</sup>, to provide computed data that best distinguish the members of this family of albeit only modestly complex structures. We have chosen to present the details of this protocol in the context of the analysis of **1**-*cis* versus **1**-*trans*. Although the strategy is highly similar to that reported in 2006, we have made numerous improvements that have resulted in somewhat increased accuracy and, especially, greater convenience in implementation, and these are captured in the protocol below.

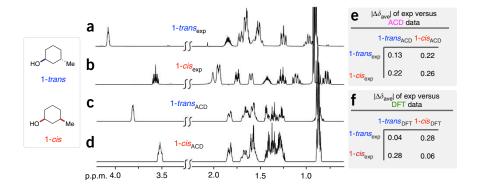
#### **Experimental overview**

The aim of this protocol is to serve as a practical guide for chemical shift computation by using DFT quantum mechanical calculations for comparison of the resulting shift values with experimental data and for drawing meaningful conclusions about structure assignment. Because often the most challenging aspect of small-molecule structure elucidation is assigning relative configuration, we have elected to demonstrate the method using (the relatively simple) *cis*- and *trans*-diastereomers of 3-methylcyclohexanol (**1**-*cis* and **1**-*trans*). We recommend that new users carry out this protocol on these prototypical trial compounds to ensure that they obtain similar results, thereby validating their ability to properly implement the methodology in their local setting.

The general strategy (Fig. 2) involves five operations (operations I-V):

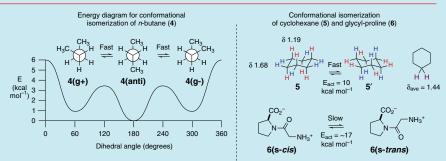
- Operation I: conformational search. For each candidate structure, an input geometry is first drawn in Maestro (see Equipment) and a library of conformers is then generated by using a molecular mechanics conformational search in MacroModel.
- Operation II: geometry optimization and frequency calculation. Each of these conformers is then subjected to geometry optimization and frequency calculation by using DFT in Gaussian 09.
- Operation III: NMR shielding tensor calculations. NMR shielding tensor values, from which chemical shifts are derived, are computed for each conformer by using DFT in Gaussian 09.
- Operation IV: Boltzmann-weighting of shielding tensors and conversion to chemical shifts. The computed shielding tensors for each nucleus in all conformers are Boltzmann-weighted and then converted to empirically scaled chemical shift values for each nucleus of the candidate structure.
- Operation V: comparison of experimental and computed chemical shifts and assessment of goodness of fit. Operations I–IV are repeated for each candidate structure that one chooses to consider. Each set of computed data is compared with the experimental data set to reach a conclusion about structure.

Figure 1 | Comparison of experimental with predicted (by ACD/Labs software) <sup>1</sup>H NMR spectra of the diastereomeric 3-methylcyclohexanols 1-*trans* versus 1-*cis*. (a,b) Experimental <sup>1</sup>H NMR spectra of 1-*trans* (a) and 1-*cis* (b) (CDCl<sub>3</sub>, 500 MHz). (c,d) Predicted <sup>1</sup>H NMR spectra for 1-*trans* (c) and 1-*cis* (d) (CHCl<sub>3</sub>, ACD/Labs, C+H NMR predictors and DB)<sup>9</sup>. (e,f) MAEs ( $|\Delta \delta_{ave}|$ ) for the proton (<sup>1</sup>H) chemical shifts between matched and mismatched pairs; experimental versus ACD-computed (e) or experimental versus DFT-computed (f).



### **Box 2** | The importance of considering conformations

Nearly all organic molecules have internal (bond) rotational degrees of freedom that allow them to adopt various conformations differing in the dihedral angles of those rotatable bonds. Most often, the energy barrier for bond rotation is sufficiently low that interconversion between any two conformers is fast on the NMR time scale. For example, the anti (4(anti) and gauche 4(g+) or 4(g-)) conformers of



*n*-butane (which, incidentally, differ in free energy by 0.9 kcal mol<sup>-1</sup>) have energies of activation for bond rotation of 3.6 (4(anti) to 4(g+) or 4(g+) or 4(g-)) and 5.1 (4(g+) to 4(g-)) kcal mol<sup>-1</sup> (ref. 35). For comparison, chair-chair conformational interconversion of cyclohexane (compare the degenerate 5 to 5') has a barrier of ~10 kcal mol<sup>-1</sup> and that of the amide rotamers of a tertiary amide such as that in glycyl-proline (compare 6(s-cis) to 6(s-trans)) of ~17 kcal mol<sup>-1</sup>. Unlike IR or UV spectroscopies, in which the excitation event is instantaneous, the NMR phenomenon is associated with a nonzero time constant—a shutter speed, if you like. Many molecular motions, if they are sufficiently fast, serve to average the environment of various nuclei during NMR data collection. Thus, for typical routine spectrometers operating at ambient temperature, geometries interconverting via processes with barriers of less than ~15 kcal mol<sup>-1</sup> occur sufficiently fast so as to give rise to time-averaged spectra. In other words, conformers 4(anti)/4(g+)/4(anti) and 5/5' interconvert so rapidly that a single chemical shift is observed for the resonances arising from the methyl or the methylene protons in 4 or the axial and equatorial protons in 5. In contrast, slow rotation about the amide bond gives rise to a distinct set of observable resonances for each of the protons in 6(s-cis) and 6(s-trans) (at ambient temperature).

Computation of the NMR chemical shifts is always, perforce, done on a single geometry (i.e., conformation). Thus, for the case of the chair conformer of cyclohexane, two distinct chemical shifts are computed for the six equivalent axial versus the six equatorial protons. Experimental chemical shifts for cyclohexane can be measured at sufficiently low temperature that the chair-chair interconversion is rendered slow relative to the NMR spectrometer's shutter speed. Under such conditions, the axial protons are observed at  $\delta = 1.19$  p.p.m. and the equatorial protons are observed at  $\delta = 1.68$  p.p.m. However, at ambient temperature, these protons interchange places rapidly, which gives rise to a single, time-averaged chemical shift of  $\delta = 1.44$  p.p.m., the average of the two individual values. This situation is handled by computing each chemical shift for each of the contributing conformers (degenerate, in this simple case) and weighting the computed shift values in each conformer according to its mole fraction contribution to the Boltzmann distribution (50% each in this case because of the degeneracy of **5** and **5**').

Operation I. Conformational search. MacroModel<sup>12</sup> (part of the Schrödinger suite) has emerged as a widely used molecular mechanics software application for conformational searching of small organic molecules (Spartan is another commonly available and used package that is convenient for performing conformational searches). The software allows the use of several molecular mechanics force fields and several methods of conformational searching. In this protocol, we have used the Monte Carlo multiple minimum<sup>13</sup> method, a stochastic approach to conformational searching that uses torsional sampling. We recommend that the value of the 'Energy window for saving structures' be kept at (the default value of) 5.02 kcal mol<sup>-1</sup> (i.e., the maximum energy difference between any single conformer and the most stable conformer, the global minimum). Although this value is higher than energy ranges suggested elsewhere<sup>14</sup>, it ensures that conformers whose relative energies are overestimated by molecular mechanics remain 'in play' during the subsequent DFT geometry optimization (operation II).

For studying molecules similar in structural complexity to 3-methylcyclohexanol, the MacroModel default settings for the conformational search (maximum number of steps and other minimization criteria) typically result in a satisfactorily exhaustive search of the potential energy surface. For more complex structures, increasing the maximum number of steps (i.e., separate iterations) is advisable. Additional suggestions for improving the quality of a conformational search are discussed in the MacroModel User Manual and Reference Manual.

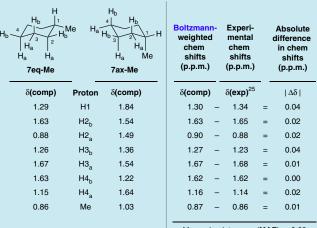
Operation II. Geometry optimization and frequency calculation. Although several software packages have been developed for quantum mechanical electronic structure calculations (e.g., Gaussian, GAMESS, Jaguar and Spartan), Gaussian is the most widely used software package for NMR computation. Thus, this protocol has been written using Gaussian 09 for all of the DFT calculations. These consist of geometry optimization and frequency calculation, the latter of which provides the free energies used in the Boltzmann analysis central to operation IV. We use the M06-2X functional (or the B3LYP functional if Gaussian 03 is used) with the 6-31+G(d,p) basis set for geometry optimization and frequency calculations because of its demonstrated ability to provide more accurate geometries and energetics<sup>15,16</sup>. We typically carry out geometry optimization by using the default parameters implemented in Gaussian 09 with the exception of specifying the use of a finer integration grid (i.e., Integral(UltraFineGrid)). Frequency calculations allow for structure validation by ensuring that each optimized geometry is not a local saddle point (i.e., transition structure) on the potential energy diagram, which, if present, is indicated by the presence of a negative (or imaginary)

# Box 3 | Boltzmann weighting of conformers

A single substituent on a cyclohexane ring breaks the degeneracy of the two chair conformers. A classic example is methylcyclohexane, which exists as the pair of rapidly interconverting conformers 7eq-Me and 7ax-Me. The relative geometric orientation of a C-H bond to a nearby substituent can have a marked effect on the chemical shift of that proton, even for nonpolar substituents such as an alkyl group.

This is readily seen from the impact of a methyl group on the chemical shifts of the protons elsewhere on the cyclohexane ring in **7eq-Me** and **7ax-Me**. In particular, the axial proton at C2 is remarkably sensitive to the dihedral relationship of its C-H bond to the vicinal C1-Me bond. This fact was highlighted, for example, by a study of a family of methylated cyclohexanes by Dalling et al.43. The resulting incremental chemical shift values, which we like to refer to as the 'Grant numbers,' are written beside each of the protons in 7eq-Me and 7ax-Me. As the boxed numbers in the structures of **7eq-Me** and **7ax-Me** show, the C2 axial proton differs by over 0.5 p.p.m. (shift increments of -0.31 versus +0.21, respectively) in the two different environs of these simple hydrocarbons. Clearly, the relative contributions of these two individual chair conformers must be properly taken into account in any computational approach that attempts to reproduce the experimental shifts of the time-averaged spectrum arising from a rapidly interconverting mixture of each.

H +0.13 +0.16+0.07 +0.300.0 H н 0.0 H 0.20 | Н́ Н 0.0 Ĥ -0.31 -0.04 0.0 +0.21 7eq-Me 7ax-Me

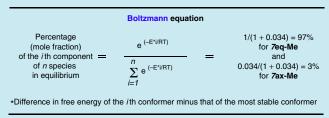


Mean absolute error (MAE) = 0.02

The free-energy difference between **7eq-Me** and **7ax-Me** has been reported (as deduced from an NMR experiment in CFCl<sub>3</sub>-CDCl<sub>3</sub> at -101 °C) to be 1.74 kcal mol<sup>-1</sup> (ref. 44). We have computed (using M06-2X/6-31+G(d,p)) a free-energy difference of 2.00 kcal mol<sup>-1</sup>. The experimental proton NMR chemical shifts for the rapidly equilibrating mixture (at ambient temperature) $^{45}$  are tabulated to the right (column 4), as are the computed proton  $\delta$  values for each of 7eq-Me and 7ax-Me (columns 1 and 2 using B3LYP/6-311+G(2d,p)). To predict the ambient temperature shift **Boltzmann equation** data, it is necessary to assign a weighting factor (mole fraction or percent contribution) to each of 7eq-Me and 7ax-Me Percentage e (-E\*i/RT) (mole fraction) through the use of the Boltzmann equation. The resulting of the ith component computed equilibrium ratio (of 97:3) was used to calculate the of n species  $\sum_{i=1}$ in equilibrium Boltzmann-weighted shifts (column 3). Finally, the MAE between the computed and experimental  $\Delta\delta$  values is, reassuringly, a mere 0.02 p.p.m.

frequency. In addition, zero point and thermodynamic correction factors to the total electronic energy are calculated, giving rise to a net free-energy value for each optimized geometry. As an aside, we note that precisely the same approach described to this point would perfectly well serve the needs of a user interested only in computing energetics of a system (e.g., to predict or rationalize an experimental equilibrium value) rather than in continuing with NMR chemical shift calculations.

**Operation III.** NMR shielding tensor calculations and conversion to chemical shift values. NMR shielding tensors are computed with the GIAO (gauge-independent (or including) atomic orbitals) method<sup>17,18</sup> in Gaussian. We typically use the B3LYP functional with the 6-311+G(2d,p) basis set. The simplest approach for converting the resulting set of tensor values to chemical shifts is to subtract the shielding tensor value of tetramethylsilane (TMS) (e.g., 31.88 for <sup>1</sup>H at this level of theory) from each of the computed tensor values (analogous to setting the chemical shift of



TMS to zero for the experimental data). A more reliable approach is to apply scaling and referencing factors (slope and intercept, respectively) that are derived from linear regression analysis of a test set of molecules19 to each of the computed tensor values. This has the effect of reducing some of the systematic error inherent in the theory used for the computation. After the use of scaling factors, the computed NMR shielding tensors are converted into referenced chemical shifts as defined by equation (2) below, where  $\delta$  is the referenced chemical shift and  $\sigma$  is the computed NMR shielding tensor5.

$$\delta = \frac{\sigma - \text{intercept}}{\text{slope}}$$
(2)

To address solvation, we typically use the integrated equation formalism polarized continuum model (IEFPCM)<sup>20</sup> during the DFT calculations for both operations II and III. Other approaches for the treatment of solvation effects have been summarized and

MAESTRO	Graphical user inte	erface (GUI)
МасвоМор	I Create input structure Molecular m	
	I Perform conformational search and create conformer library	lechanics
2 and 3 i		
4–9	I Create Gaussian input files (using script A)	
GAUSSIAN	Density functional t	heory (DFT)
	<ul> <li>Optimize conformer geometries and compute free energies (checked with script B)</li> <li>Perform NMR chemical shift calculations (aided, optionally, by script C)</li> </ul>	
15 and 16	I Assemble and Boltzmann-average the NMR and free energy d (using script D)	lata
22-24	Polish the computed data Compare the computed versus experimental chemical shift val Repeat Steps 1–24 for each candidate structure	Spreadsheet lues
26	Assign the structure from the best fit	
Figure 2   F	Flowchart of the PROCEDURE (Steps 1–26), Operation	I: Steps 1-9

**Figure 2** | Flowchart of the PROCEDURE (Steps 1–26). Operation I: Steps 1–9 (and script A). Operation II: Steps 10–12 (and script B). Operation III: Steps 13 and 14 (and script C). Operation IV: Steps 15–21 (and script D) and Steps 17–21. Operation V: Steps 22–26. Repeat for each candidate structure and then evaluate the results by comparison with the experimental data set.

discussed elsewhere<sup>5,10,19</sup>. Because experimental NMR data are most often recorded in CDCl<sub>3</sub>, chloroform solvation has been used as the default in the calculations, but this can be readily changed if the experimental spectral data have been recorded in a different solvent. Substrate solvation cavities are modeled by united-atomic radii (i.e., UA0)<sup>21</sup> for the geometry optimization/ frequency calculations and individual atomic radii (i.e., Bondi)<sup>22</sup> for the NMR calculations.

**Operation IV.** Boltzmann analysis of DFT NMR data. Energetic data resulting from operation II and NMR shielding tensor data from operation III are manipulated by the use of a script (nmr-data\_compilation.py, script D, **Fig. 2**). Boltzmann weighting factors (**Box 3**) for each conformer are determined at 25 °C by using the relative free energies obtained from the frequency calculations (i.e., the 'sum of the electronic and thermal free energy' values). The resulting weighting factors (mole fraction contributions) are applied to the computed NMR shielding tensors for each nucleus of each individual conformer. Summation of the weighted tensors across all conformers gives the Boltzmann-weighted average NMR shielding tensors for the candidate structure. En route, the user is asked to input a value for the linear

regression intercept and slope values to reference and scale (respectively) the computed shielding tensor data. Alternatively, the computed shielding tensor data of a single molecule (e.g., TMS) could be used in place of the linear regression intercept, and scaling could be omitted. Both the reference and scaling data need to have been computed at the same level of theory as used for the candidate structure (see Step 14 in the PROCEDURE). **Operation V.** *Comparison of experimental and computed chemical shifts.* Several methods can be used to compare the experimental and computed chemical shifts of a candidate structure to determine a goodness of fit. The procedure describes the use of MAE. Regression analysis (R<sup>2</sup>) and corrected MAE (CMAE) are popular alternatives. The recent review by Tantillo *et al.*<sup>5</sup> describes these and additional methods that have been used for judging the comparisons between experimental and computed NMR chemical shifts. In addition, other methods that deal more explicitly with the challenges associated with identifying the best fit<sup>14,23,24</sup> and that are complementary to the approach described here are presented below (under 'Alternatives').

We have created (and provided in **Supplementary Data 2**) four Python scripts, A–D, which are helpful in automating aspects of the procedure that are otherwise laborious and tedious. These are used to do the following:

- *Script A.* Write a Gaussian input file for each structure (local minimum) obtained from operation I (write-g09-inputs.py and variants thereof that use different functional and basis set combinations).
- *Script B.* Check for redundant conformers or any that has an imaginary frequency (duplicate\_conf\_and\_imag\_freq-check.py).
- *Script C.* Extract the NMR shielding tensor for a DFT-computed reference compound of interest (get-ref-shifts.py).
- *Script D*. Perform the Boltzmann analysis to generate the weightedaveraged, referenced chemical shifts for each proton and carbon in the candidate structure (nmr-data\_compilation.py).

#### Practical considerations

This protocol is applicable to structures that have a considerable breadth of complexity, but, inevitably, there are limitations. Molecular size, the number of degrees of freedom inherent to the candidate structures (which directly affects the number of conformers) and the level of computational horsepower to which one has access are three important issues that affect the feasibility of tackling a given problem in a given setting. Representative structures that we have studied with this protocol are shown in Figure 3. All have proven to be accessible in our setting; some of these studies have been published (e.g., 8 (refs. 11,25) and 11 (ref. 26)). These serve as indicators of the types of structures that can be addressed. In instances when the structural complexity of the molecule of interest becomes intractable, there are recourses. These include (i) the use of only the global minimum from a molecular mechanics conformational search to proceed with the more computationally intensive ab initio phases of the calculations<sup>5,27</sup>, (ii) the use of a judiciously chosen small subset of structures from the conformer library generated in a molecular mechanics search<sup>28,29</sup> or (iii) the use of a judiciously chosen

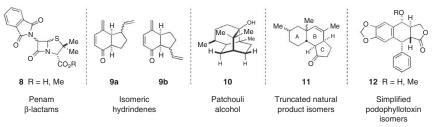


Figure 3 | Structures that we have studied by computing their chemical shifts with DFT.

substructure (e.g., through truncation) as a model for the chemical shifts in question in the structurally ambiguous portion of the molecule (e.g., **3**, **Box 1** and **11**, **Fig. 3**)<sup>26,27</sup>.

A final caveat should be emphasized. It is important to use only those protons (or carbons) for which the experimental chemical shift values have been unambiguously established. One does not need to know the experimental chemical shift of every nucleus in the structure under study; however, it is imperative to use in the analysis only nuclei for which the chemical shifts have been interpreted and assigned with absolute certainty.

#### Alternatives

Alternative approaches, especially those describing other strategies for comparison of experimental with computed data sets (operation V), have been reported. Goodman and co-workers have developed highly effective statistical treatments for use in such comparisons<sup>14,23</sup>. Their parameters are called CP3 (when experimental data are available for more than one isomeric candidate structure)<sup>23</sup> and DP4 (when experimental data are available for a single isomeric candidate structure)<sup>14</sup>. These allow the assignment of a specific numerical probability to the goodness-of-fit question. Sarotti<sup>24</sup> has advanced the use of a training set as an artificial neural network and a pattern recognition protocol for distinguishing good from poor fits between the computed and experimental data<sup>25</sup>. These approaches use molecular mechanics (MM) to identify conformer geometries and then either MM or semiempirical theory (Austin model 1; AM1) to compute energies. DFT [B3LYP/6-31+g(d) or mPW1PW91/6-31G(d)] is then used to compute the GIAO NMR chemical shifts. Overall, this reduces the demands on computational power.

For the protocol detailed here, we have described the use of the following software: MacroModel and Maestro for molecular mechanics calculations, Gaussian 09 for the subsequent *ab initio* computations and Python scripts for managing the output data. Alternative packages and modules certainly could be substituted according to availability, familiarity and so on. Similarly, the choice of basis set and DFT functional (i.e., the level of theory) could be modified from what is specified here, which in some cases might better serve some users' needs (e.g., speed or expense versus quality considerations). We have written complementary Python scripts to accommodate the use of (the earlier) Gaussian 03. Each script is a '.py' file that has been archived within the '.zip' file named **Supplementary Data 2**.

#### MATERIALS EQUIPMENT

Spectral data

- <sup>1</sup>H and/or <sup>13</sup>C NMR spectral data for the compound under study Software requirements for calculations
- Structure generation program. This should be capable of providing file types that can be read by Maestro<sup>30</sup> (e.g., '.sdf'). This could be Maestro itself or, e.g., ChemBio3D
- X-ray structure conversion program. For example, Mercury CSD<sup>31</sup>, for converting a '.cif' into a '.sdf' file format (for (optional) Step 1C, freely downloadable; e.g., at: http://www.ccdc.cam.ac.uk/products/mercury/)
- Molecular mechanics program. We use MacroModel (version 10.0)<sup>13</sup> and Maestro (version 9.4) within the Schrödinger package of software (Schrödinger Suite 2011), and we have written the procedure below accordingly. Maestro is a graphical interface that communicates with MacroModel. It is freely available to academic users https://www.schrodinger.com/downloadcenter/10/)
- Quantum mechanics software capable of performing DFT geometry optimizations, thermochemistry (frequency) and NMR shielding tensor calculations. We use Gaussian 09 (ref. 32), and we have written the procedure below accordingly ▲ CRITICAL The PROCEDURE provides considerable information that will guide those using earlier versions of MacroModel, Maestro and Gaussian (e.g., Gaussian 03).

- **Software requirements for use of scripts and final processing of NMR data** • Command-line interface application (Terminal (in Mac OS X or Linux) or
- Command Prompt (in Windows))
- $\bullet$  Python, version 2 or 3 (included with Mac OS X and Linux operating systems)
- IDLE Python script editor (freely downloadable; e.g., at: http://www. python.org/download/)
- GaussView 5 (ref. 33) (or equivalent molecular visualization application)
- Microsoft Excel (or equivalent spreadsheet application)
- Hardware requirements for calculations
- A computer (or supercomputing node) having at least 4 GB of RAM and a dual-core processor is readily sufficient to perform the conformational searches, geometry optimizations, frequency calculations and NMR chemical shift calculations on the 3-methylcyclohexanol trial compounds 1-*cis* and 1-*trans*. Of course, the power and speed of the computational resources to which the user has access will affect the timing estimates provided for some of the steps in the PROCEDURE. Alternatively, as the structural complexity of the molecules under study increases, access to more powerful computing hardware will be advantageous
- Hardware requirements for the use of scripts and final processing of NMR data
- Execution of Python scripts for data processing and manipulation can be carried out on any standard personal computer having the necessary software.

#### PROCEDURE

**Create input geometry and carry out a conformational search with molecular mechanics in MacroModel** • TIMING 30 min 1 *Creation of an input structure*. Choose one of the following options to input a structure into Maestro: (option A) draw the structure with the structure editor native to Maestro; (option B) import a set of atomic coordinates created with a different structure editor (e.g., ChemBio3D, GaussView, PCModel or MacMolPlt) in a format readable by Maestro; or (option C) import coordinates from a relevant crystal structure data file (e.g., '.cif' from the Cambridge Crystallographic Data Centre (CCDC)).

#### (A) Draw the structure in Maestro

- (i) Launch Maestro.
- (ii) Create and set the working directory. We recommend creating a master directory (e.g., entitled '3-methylcyclohexanol-master\_dir') within which to store the subdirectories that contain the computational files associated with each candidate structure (e.g., 'cis-3-methylcyclohexanol-sub\_dir'). Select Project → Change Directory to open a file chooser

window. Click the Create New Folder button and change the directory label to '3-methylcyclohexanolmaster dir.' Open the 3-methylcyclohexanol master directory and again click the Create New Folder button and change the directory label to 'cis-3-methylcyclohexanolsub\_dir.' Select the 'cis-3-methylcyclohexanol-sub\_dir' directory and click choose to set the working directory for computational files associated with the cis-diastereomer of 3-methylcyclohexanol.

**Figure 4** | The window and toolbars used to create a structure in Maestro version 9.2 (and later). (**a**-**f**) The sequence of **a**-**f** represents a logical order in which to carry out the operations: use **a** to create the heavy atom skeleton, **b** to define which atoms are not carbon, **c** to fill the remaining open valencies with hydrogen atoms, **d** to adjust the bond order, **e** to neaten the structure and **f** to isomerize stereocenters, if needed. These operations are described in further detail in Steps 1A(iii-v) and 19.

- (iii) Create an input geometry for
  - *cis-3-methylcyclohexanol* (1-*cis*). Draw *cis*-3-methylcyclohexanol in the Maestro workspace (Fig. 4) by using the build and edit toolbars. For Maestro version 9.2 (and later), display the build toolbar by clicking the *Build* button and display the edit toolbar by clicking the *Edit* button. For Maestro version 9.1 or earlier, display the build toolbar by clicking the *build toolbar* by clicking the *Edit* button. Draw the carbon skeleton with the *Draw structures* button (Fig. 4a) on the *Build* toolbar. Add nonhydrogen (non-H) atoms by clicking the drop-down arrow on the *pencil* button or the *Set element* button (Fig. 4b) on the build toolbar. Add all implicit hydrogen atoms by double-clicking the *Add hydrogens* button on the edit toolbar (Fig. 4c) (located on the main toolbar in Maestro version 9.1 or earlier).
- (iv) (Optional) Use the following tools to draw more advanced structures. Change the explicit bond order with the *Increment/Decrement bond order* buttons (Fig. 4d) on the build toolbar. Buttons for predrawn functional groups and cyclic hydrocarbon templates are located on the fragment toolbar, which can be displayed by clicking the *Fragment* button. In addition, the *invert chirality* button (Fig. 4f) is useful for quickly drawing other (diastereomeric) candidate structures.
- (v) Neaten this initial (and perhaps crudely drawn) structure by clicking the *Clean Up Geometry* button on the build toolbar (Fig. 4e). The geometry of the input structure will be quickly minimized with a molecular mechanics routine, and then it will be redrawn in the workspace.
- (vi) Select Workspace → Create Project Entry. A window will open. Change the title to 'cis-3-methylcyclohexanolinitial\_geometry' and click Create to add the drawn geometry to the Project Table.
- (B) Import the atomic coordinates into Maestro as an .sdf file
  - (i) Import a set of atomic coordinates for *cis*-3-methylcyclohexanol (1-*cis*) that were created in, for example, ChemBio3D Ultra (also known as Chem3D). Maestro reliably handles '.sdf' files, so we recommend creating this input file type. This can be accomplished in most software packages capable of producing a chemical structure. In ChemBio3D, draw *cis*-3-methylcyclohexanol and select *File* → *Save As* to open a save as window. Enter 'cis-3-methylcyclohexanol\_Chem3D' as the filename, change the file type to *SDFile* (\*.*sdf*) and select *Save*.
  - (ii) Launch Maestro and create a working directory as described in Step 1A(i,ii).
  - (iii) Select Project → Import Structures to open a file chooser window. Change the Files of type: to Any (\*.\*). Locate and select the file 'cis-3-methylcyclohexanol\_Chem3D.sdf' created in Step 1B(i).
- (iv) Perform Step 1A(vi) to finish inputting the geometry to Maestro.
- (C) Import the atomic coordinates from an X-ray crystal structure (e.g., a .cif file)
  - (i) For more complex structures, we recommend using this method, if possible, because the risk of error in drawing the input geometry is reduced. In this example, we will demonstrate how to input the crystal structure geometry from a .cif file of maoecrystal V into Maestro.
  - (ii) Go to the CCDC homepage (http://www.ccdc.cam.ac.uk/products/mercury/) and click the *Request Structure* link.
     Request the crystal structure of maoecrystal V (its CCDC deposition number is 249099). A .txt file that contains coordinates for the crystal structure of maoecrystal V will be attached to (or embedded in) an e-mail from the CCDC. Save the attachment as 'maoecrystal-V.cif' to a local hard drive.
  - (iii) Start Mercury.
- (iv) Locate and open the 'maoecrystal-V.cif' file within Mercury. Select File → Save As, change the file format to PDB files (\*.pdb \*.ent) and click OK. A save as window will open; change the filename to 'maoecrystal-V\_Xray.pdb', specify a directory and Save.



- (v) Launch Maestro and create a working directory as described in Step 1A(i and ii).
- (vi) Select  $Project \rightarrow Import Structures$  to open a file chooser window. Change the *Files of type:* to *Any* (\*.\*). Locate and select the 'maoecrystal-V\_Xray.pdb' file created in Step 1C(iv).
- (vii) Perform Step 1A(vi) to finish inputting the geometry to Maestro.

   CRITICAL STEP Carefully check that both the constitution and relative configuration of the input structure are correct.

2] (Optional) *Force-field evaluation*. To determine the molecular mechanics force field best parameterized for the structure of interest, submit the input geometry to a molecular mechanics 'current energy calculation' (i.e., no energy minimization is necessary) by selecting *Applications*  $\rightarrow$  *MacroModel*  $\rightarrow$  *Current Energy*. A window will open that displays the possible choices of force field for the energy calculation. Change the force field to OPLS\_2005, append 'OPLS\_2005' to the job name and click *Run*. Click the *Jobs*  $\rightarrow$  *Monitor* buttons, which are located in the lower left corner of the workspace. A monitor window will open that logs information related to the energy calculation. Double-click on the *JobID* associated with the energy calculation and scroll through the logs. Note the number of 'medium- and low-quality' stretch, bend and torsion parameters. Repeat this step by using the Merck molecular force field (MMMF). In general, the force field that is parameterized with the greatest number of high-quality parameters should be used for the subsequent conformational search (Step 3). We find that the OPLS\_2005 force field (versus, e.g., MMFFs) has fewer than or an equal number of low- and/or medium-quality parameters for CHNO-containing molecules, and we typically use OPLS\_2005. **? TROUBLESHOOTING** 

**3**| *Conformational search*. Choose from the following two options to run a conformational search of the input geometry, either interactively within Maestro (option A) or from the command-line interface (option B). The choice of either option depends on the user's computational resources.

#### (A) Conformational search interactively within Maestro

- (i) While in Maestro, select Applications → MacroModel → Conformational Search. A window will open that displays the possible options that can be modified for the conformational search.
   ? TROUBLESHOOTING
- (ii) Select the *Potential* tab, select OPLS\_2005 (or the most well-parameterized force field from Step 2) and change the solvent from *Water* to *CHCl*<sub>3</sub>.
- (iii) Select the *CSearch* tab. Change the method to *Torsional Sampling* (*MCMM*). Uncheck the *Multiligand* box and the *Perform automatic setup during calculation* box. Click the *Perform Automatic Setup* button. Change the torsional sampling options to *Extended*.
- (iv) Delete the default name and enter 'cis-3-methylcyclohexanol-csearch'. Do not use spaces, back-slashes or forward slashes in file names. Select *Run* to begin the conformational search.
- (v) Click the Jobs → Monitor buttons (located in the lower left corner of the workspace), and a monitor window will open that displays the progress of the conformational search. When the conformational search is finished, the monitor window will read 'BatchMin: normal termination' and display the date and time of completion. A conformational search in Maestro that has completed successfully will result in the generation of an output file with '-out.maegz' ending the filename. This file contains data for all conformers generated in the conformational search, and it can be accessed at anytime within Maestro. Ideally, there will be no medium- or low-quality parameters for the MM force field used for the conformational search. MacroModel reports these values as 'the number of high-, medium-, low-quality stretch/bend/ torsion parameters = x y z' in the monitor window (also reported in the '.log' file).
- (vi) View the structures of the family of unique conformers by selecting  $Project \rightarrow Show Table$  to display the Project Table window. The Project Table window displays all structures that have been inputted into Maestro during the current session as rows in a table. To display the structures in the workspace, check the box in the *In* column for the row(s) of the Project Table. Multiple structures can be displayed at once.
- (vii) In the Project Table, select Show → All to display information from the conformational search. For each conformer in the Project Table, inspect the column named 'Minimization Converged-(force field)' to ensure that each conformer has converged, as evidenced by a checked box for each conformer.
   ? TROUBLESHOOTING
- (viii) For each conformer reported in the Project Table, inspect the column named 'Times Found-(force field)' to ensure that each conformer was found at least ten times.
   **? TROUBLESHOOTING**
- (ix) (Optional) If the conformational search yields a tractable number of local minima, we recommend examining the geometry and energy of each structure to ensure that there are no redundant conformers and that all logically anticipated conformers (rotamers and invertamers) have been located.

#### (B) Conformational search within the (Unix or Windows) command-line interface

(i) Perform Step 3A(i-iii) to input the preferences for the conformational search.

- (ii) Click the settings button to the right of the *Job name:* input box and a window will open. Change 'Append new entries as a new group' setting to 'Do not incorporate.' Change the filename to 'cis-3-methylcyclohexanol-csearch.' Avoid using spaces, back-slashes or forward slashes in file names. Select *Save* to save the job input file for the conformational search.
- (iii) Open the command-line interface (Terminal in Mac OS X or Linux or Command Prompt in Windows). Load the module that contains MacroModel (e.g., Schrödinger). Navigate to the directory that contains the input file for the conformational search.
- (iv) Run the conformational search from the command-line interface by entering the following command:
  - > bmin cis-3-methylcyclohexanol-csearch
- (v) Check for completion of the conformational search job by entering the following command (replace 'ls' with 'dir' in the following command if Command Prompt in Windows is used):
  - > ls \*.log

If the conformational search job was executed successfully, the following will be displayed:

> cis-3-methylcyclohexanol-csearch.log

(vi) Check for completion of the conformational search job by opening the log file by using the following command:

> less cis-3-methylcyclohexanol-csearch.log

Scroll to the end of the file by using the *Shift+Page down* key combination. If the conformational search job has been completed, the following will be displayed:

BatchMin: normal termination

A conformational search in the Command-line interface that has completed successfully will also result in the generation of an output file with '-out.maegz' ending the filename. This file contains data for all conformers generated in the conformational search, and it can be accessed at anytime within Maestro.

(vii) In Maestro, import the structures resulting from the conformational search by selecting  $Project \rightarrow Import Structures$ and locating the 'cis-3-methylcyclohexanol-csearch-out.maegz' file.

(viii) Perform Step 3A(vi-ix) to check the results of the conformational search.

#### Create Gaussian input files for each conformer • TIMING 15 min

**4** Download to a local hard drive those Python scripts from **Supplementary Data 2** that correspond to the version of Python being used. Move the 'write-g09-inputs.py' (for Gaussian 03, use 'write-g03-inputs.py') script to the directory named 'cis-3-methylcylohexanol-sub\_dir' (created in Step 1A(ii)), which contains the output file resulting from the conformational search (i.e., 'cis-3-methylcylohexanol-csearch-out.maegz').

**5** (Optional) Allocation of the number of core processors and the amount of memory used for a given job has a substantial effect on the computational run time of DFT calculations. The default settings in the above scripts are 8 processors and 8 GB of RAM. To change these settings, open the 'write-g09-inputs.py' (or 'write-g03-inputs.py') Python script within the Python script editor (i.e., IDLE). Edit the memory allocation values ('%mem=8gb') on lines 111 and 138 and/or the number of core processors ('%nproc=8') on lines 112 and 139 of the script.

**6** In Maestro, clear the contents of the Project Table by selecting  $Project \rightarrow Close$ . (You will be asked if you would like to *Save* in the window that opens, and you can choose to do so or not; if so, a '.prj' file will be created). Select  $Project \rightarrow Import Structures$  and locate the 'cis-3-methylcyclohexanol-csearch-out.maegz' file. This will import only the structures from the conformational search. This step is necessary because the 'write-g09-inputs.py' Python script extracts all contents of the Maestro Workspace and Project Table when executed (Step 8); it is necessary that no extraneous structures be present in the Table or Workspace.

7| Conformer name standardization (optional here, but necessary for earlier versions of Maestro). In the Project Table, provide a name for each conformer by clicking in the title cell of the lowest-energy conformer. Change the entry name to 'cis-3-methylcyclohexanol' and hold the control key while pressing the enter key, which will enter this name for all of the conformers in the Project Table. ▲ CRITICAL STEP All conformers need to have the same name; otherwise, the 'write-g09-inputs.py' Python script will not sort the Gaussian input files properly.

**8**| *Creation of Gaussian input files for geometry optimization, frequency calculation and NMR shielding tensor calculation.* In Maestro, select *Window* and ensure that the *Command Input Area* is checked. To execute the script, enter the command 'pythonimport write-g09-inputs' in the dialog box to the right of *Commands*. For each conformer, the script will automatically create two Gaussian input files—the geometry optimization and frequency calculation input file (named '*filename*-opt\_freq-conf\_#.com') and the NMR magnetic shielding tensor calculation file (named '*filename*-nmr-conf\_#.com'). The script will also automatically create a new directory (named '*filename*-gaussian\_files') and move the Gaussian input files to that directory.

**9** Select  $Project \rightarrow Import Structures$  to open a file chooser window. Change the *Files of type:* to *Any* (\*.\*). Open the 'cis-3-methylcyclohexanol-gaussian\_files' directory that was created in Step 8. Verify that the number of 'cis-3-methylcyclohexanol-opt\_freq-conf\_#.com' and 'cis-3-methylcyclohexanol-nmr-conf\_#.com' files is equal to the number of unique conformers found in the molecular mechanics conformational search (Step 3).

**PAUSE POINT** After the 'write-g09-inputs.py' Python script has been run, all Gaussian input files are saved, and they can be submitted to Gaussian at any later time.

# Carry out DFT geometry optimization and frequency calculations for each conformation in Gaussian 09 • TIMING variable, depending on the molecule under study

**10** *Geometry optimization and frequency calculation in Gaussian.* Submit each optimization and frequency Gaussian '.com' input file to be run in Gaussian. A frequency and geometry calculation will be run simultaneously, and it will generate a single '.out' Gaussian output file. There are a number of ways in which this can be done (individually, batch and so on) depending on factors such as the operating system of the host computer, parallelization protocols or local administrative protocols. Discussion of many of these issues can be found at the Gaussian website (http://www.gaussian.com/g\_tech/g\_ur/g09help.htm). The files resulting from the Maestro, MacroModel and Gaussian jobs (including '.chk' and '.out') are included in **Supplementary Data 3** and **4** for **1**-*cis* and **1**-*trans*, respectively.

#### **? TROUBLESHOOTING**

**PAUSE POINT** The '.out' and '.chk' files can be accessed any time after the Gaussian jobs are completed.

**11** Validation of the DFT geometry-optimized (and energy-minimized) conformers. Check for duplicate conformers or for saddle-point geometries (as evidenced by the presence of a negative (or imaginary) frequency) by moving the 'duplicate\_conf\_ and\_imag\_freq-check.py' Python script to the directory containing the Gaussian '.out' files (e.g., 'cis-3-methylcyclohexanol'). Execute the 'duplicate\_conf\_and\_imag\_freq-check.py' Python script in the command-line interface (e.g., with Terminal (for Linux or Mac OS X) or with Command Prompt (for Windows)) by entering the following command:

> python duplicate\_conf\_and\_imag\_freq-check.py

The script will request the name of the candidate structure by displaying the following prompt:

Enter the name of the candidate structure:

Enter 'cis-3-methylcyclohexanol,' and if the script then executes successfully, the following message will be displayed in the command-line interface:

```
The script successfully performed the task of creating the cis-3-
methylcyclohexanol-conf_energy_and_imag_freq.csv file that shows the
conformer number, conformer filename, total electronic energy, free energy,
and total number of imaginary frequencies for each conformer.
```

#### ? TROUBLESHOOTING

**12** Open the 'cis-3-methylcyclhexanol-conf\_energy\_and\_imag\_freq.csv' file (a .csv file is a simple, Microsoft Excel-readable text file that uses a 'comma separated values' format) in Excel (or equivalent spreadsheet application). Verify that there are no imaginary frequencies in any of the conformer structures by viewing the column labeled 'Number of Imaginary Frequencies.' Compare the energies of the conformers by viewing the column labeled 'Relative Energy.' If any conformers have nearly the same energy (e.g., within 0.01 kcal mol<sup>-1</sup> of one another), open the corresponding '.out' files of each in GaussView. If the geometries are the same, then remove all but one from the 'cis-3-methylcyclohexanol-gaussian\_files' directory to ensure that the conformer is not double-counted during the Boltzmann weighting of the computed NMR chemical shifts. **? TROUBLESHOOTING** 

# Compute NMR chemical shift data in Gaussian • TIMING <10 min of active effort and ~30 min of computational wall time per conformer for the 3-methylcyclohexanols

**13** *NMR shielding tensor calculations in Gaussian*. Submit each 'cis-3-methylcyclohexanol-nmr-conf-#.com' input file to be run in Gaussian. See comment in Step 10 (and http://www.gaussian.com/g\_tech/g\_ur/k\_nmr.htm). A GIAO magnetic shielding tensor calculation will be run and a '.out' output file will be created for each conformer.

**14** (Optional) *Computation of the NMR shielding tensors of TMS for use as a single reference compound.* We have provided reference and scaling parameters for use with this protocol, but if a different level of theory is implemented, then the user must calculate new reference and scaling parameters. Application of scaling factors will reduce the systematic error, but they

are cumbersome and tedious to calculate. Instead, we recommend that the user compute the NMR shielding tensors of TMS to reference the computed chemical shifts without scaling. Download the 'tms\_std-g09.com' (or '...g03.com' for Gaussian 03) input file from **Supplementary Data 2**, modify the functional and/or basis set and submit it to be run in Gaussian. For guidance on submitting Gaussian input files, see Step 10 (and http://www.gaussian.com/g\_tech/g\_ur/k\_nmr.htm). A geometry optimization, frequency and NMR shielding tensor calculation will be run and the 'tms\_std-g09.out' (or '...g03.com' for Gaussian 03) file will be created. Move the 'get-ref-shifts.py' Python script to the directory containing the 'tms\_std-g09.out' file. In the command-line interface (e.g., with Terminal for Linux or Mac OS X or with Command Prompt for Windows), execute the script to extract the computed carbon and proton NMR shielding tensors of TMS by entering the following command:

> python get-ref-shifts.py tms-std-g09.out

This script reads the '.out' Gaussian output file and extracts the carbon and proton NMR shielding tensors and prints the data in.csv files. If the Pyton script has been executed successfully, the following command will be printed in the output window (actual numbers represent those using the level of theory recommended in this protocol):

The average NMR shielding tensor of the hydrogen atoms = 31.8819 The average NMR shielding tensor of the carbon atoms = 183.7949 Additionally, the script has performed the task of creating the following files, which contain the NMR shielding tensors of the individual proton and carbon atoms of the reference standard: tms\_std-nmr-protons.csv tms std-nmr-carbons.csv

Compile the NMR magnetic shielding tensor and free-energy data for each conformer, determine the Boltzmannweighted average magnetic shielding tensors for each proton and carbon atom and reference the tensor data to create the chemical shift values for the candidate structure under study • TIMING <5 min

**15** Assembling the NMR and free-energy data by using the 'nmr-data\_compilation.py' Python script. Move the 'nmr-data\_compilation.py' script to the directory containing the Gaussian '.out' files (e.g., 'cis-3-methylcyclohexanol-sub\_dir'). Execute the 'nmr-data\_compilation.py' script in the command-line interface (e.g., with Terminal (for Linux or Mac OS X) or with Command Prompt (for Windows)) by entering the following command:

> python nmr-data\_compilation.py

This command will run the 'nmr-data\_compilation.py' script in Python and analyze all '.out' files in the current working directory. The script will then prompt for scaling and/or reference parameters by displaying the following list of options:

A. Enter reference and scaling factor data from regression analysis of a test set of molecules.

B. Enter reference data from computation of a reference standard (e.g., TMS) NMR shielding tensors.

C. Do not reference or scale NMR shielding tensor data.

Select one of these options to scale and/or reference the computed chemical shifts by entering the corresponding letter: scale and reference chemical shifts by using regression analysis parameters (option A), reference chemical shifts to a reference standard (e.g., TMS) without applying empirical scaling (option B) or omit reference and scaling entirely (option C). We have provided referencing and scaling factor data below. See Step 14 for generating alternative referencing and scaling factor parameters. **(A) Scale and reference chemical shifts using regression analysis parameters** 

# (i) Select option A by entering A (not case-sensitive) in the option list.

(ii) The script will then prompt for computed and experimental data of the reference standard by displaying the following messages one at a time:

Enter the 1H scaling factor INTERCEPT: Enter the 1H scaling factor SLOPE: Enter the 13C scaling factor INTERCEPT: Enter the 13C scaling factor SLOPE:

Enter the desired input in response to each of these four commands. Enter the linear regression scaling parameters (i.e., scaling factors) provided in the table below. These are needed for scaling and referencing the computed NMR data for the level of theory described in this protocol (i.e., B3LYP/6-311+G(2d,p)//M06-2X/6-31+G(d,p)). These scaling parameters were created by the method of Tantillo *et al.*<sup>5</sup>. These values are unique to this specific functional and basis set combination, but they are independent of the structure under study. In other words, these values should be used for any compound, not just for 3-methylcyclohexanol.

_	Scaling factors		
	Slope Intercept		
$^{1}\mathrm{H}$	-1.0767	31.9477	
<sup>13</sup> C	-1.0522	181.2412	

#### (B) Reference chemical shifts to a reference standard (e.g., TMS) without applying empirical scaling

- (i) Select option B by entering B (not case-sensitive) in the option list.
- (ii) The script will then prompt for computed and experimental data of the reference standard by displaying the following messages one at a time:

Enter the computed 1H NMR shielding tensor of the reference standard:	
Enter the experimental 1H chemical shift of the reference standard:	
Enter the computed 13C NMR shielding tensor of the reference standard	
Enter the experimental 13C chemical shift of the reference standard:	

Enter the desired input after each message has been displayed. If the recommended level of theory has been used, then enter the TMS NMR shielding tensors in the table below. See Step 14 to obtain NMR shielding tensors of TMS at a different level of theory.

Tensors	
31.8819	
183.7949	
	31.8819

#### (C) Omit reference and scaling

(i) Select option C by entering C (not case-sensitive) in the option list to omit application of any scaling and referencing factors. This would provide one with the unscaled and unreferenced Boltzmann-weighted NMR shielding tensors, which could be of value to someone developing a new method for scaling or referencing.
 The script will request the name of the candidate structure by displaying the following prompt:

Enter the name of the candidate structure:

If acceptable values have been entered after and the python script has executed successfully, the following message will be displayed in the command-line interface:

The script successfully performed the Boltzmann weighting, compiled the results of the NMR computation, assembled, scaled, and/or referenced these data in the following `.csv' files:

```
cis-3-methylcyclohexanol-nmr_data_compilation-master_proton.csv
```

```
cis-3-methylcyclohexanol-nmr_data_compilation-avg_proton.csv
```

```
cis-3-methylcyclohexanol-nmr_data_compilation-master_carbon.csv
```

```
\verb"cis-3-methylcyclohexanol-nmr_data_compilation-avg_carbon.csv"
```

This script parses NMR shielding tensor and free-energy data, calculates the Boltzmann-weighted average shielding tensor data set, converts tensor data into scaled and/or referenced chemical shifts and exports these data to several different Excel-readable files (.csv) for the candidate structure (e.g., *cis*-3-methylcyclohexanol). The *'filename*-nmr\_data\_compilation-master\_*nucleus*.csv' file includes the Boltzmann analysis of the set of conformers and the scaled and/or referenced computed NMR chemical shift values for all nuclei of each conformer. The *'filename*-nmr\_data\_compilation-avg\_*nucleus*.csv' file includes the Boltzmann-weighted average chemical shifts for the respective nuclei of the candidate structure, scaled and/or referenced. **? TROUBLESHOOTING** 

**16** Verify that the script has worked properly by entering the following command in the command-line interface (replace 'ls' with 'dir' in the following command if Command Prompt in Windows is used):

> ls \*nmr\_data\_compilation\*.csv

This command will search the current directory for .csv files that contain 'nmr\_data\_compilation' in their title. If the script executed successfully, the four files named in Step 15 will be listed. **? TROUBLESHOOTING** 

Compare computed chemical shifts for the candidate structure with the available experimental data for the compound(s) under study • TIMING 30–60 min per candidate structure

**17** *Correlating the (often non-intuitive) atom numbers assigned in the Gaussian output structures with conventional (and more convenient) atom numbering.* Start GaussView and then open any one of the Gaussian NMR output files (e.g., 'cis-3-methylcyclohexanol-nmr-conf-1.out').

**18** Select *View*  $\rightarrow$  *Labels* in GaussView to display the atom numbers (automatically assigned during structure creation in Maestro) on the structure. These atom numbers are those present in the .csv files created in Step 15, and they are displayed in column A, labeled as 'Gaussian atom numbers' when opened in Excel.

**19** Start Excel and use it to open the 'cis-3-methylcyclohexanol-nmr\_data\_compilation-avg\_proton.csv' file. Column B bears the header 'logical atom numbers,' but the cells below are empty. Enter an atom number, label or name (e.g., H1, H2ax or Me; and C1, C2, etc.) for each nucleus. For maximal logic and convenience, these entries should follow the same labeling scheme used for the experimental chemical shift assignments. Save the file as, e.g., 'cis-3-methylcyclohexanol\_comp-vs-exp\_proton.xlsx'. **A CRITICAL STEP** Each conformer of a single candidate structure will be labeled with the same Gaussian atom numbers, but atom numbers of different candidate structures might be different, depending on how the input structure was created. One trick for minimizing the complications that can arise from inconsistent numbering schemes for different diastereomeric isomers is to open the structure in Maestro of any conformer resulting from the conformational search of one candidate structure (i.e., a '-out.maegz' file, Step 3A(v)), and use the *R/S* button (**Fig. 4f**) to invert the configuration of a stereocenter in the existing structure. Use that newly created structure to begin the conformational search of the new (diastereomeric) candidate structure. This will ensure that the same (albeit still nonintuitive) atom numbering scheme is applied to each candidate structure.

**20** Averaging the individual shifts of chemically equivalent (and rapidly interconverting) nuclei in relevant structures. The need for this step is encountered most often in structures containing a methyl group. It is necessary because the three methyl protons in any single conformer/rotamer of, e.g., *cis*-3-methylcyclohexanol are inequivalent. That is, methyl group rotation is fixed, of course, during the computation. However, rapid rotation averages the experimentally observed shift to a single value. In the Excel spreadsheet created in Step 19, identify the three methyl proton shift values (column C, labeled 'chemical shift'). Average the chemical shift of the three individual methyl protons and enter that new value in a separate/new row as a replacement for the three individual protons of that methyl group.

▲ CRITICAL STEP Do not include the three individual degenerate shift values during the data analysis described next (Steps 21–26). These must be averaged as described immediately above in order to take into account the chemical equivalence of the three methyl protons on the NMR time scale. (Other somewhat common substituents that warrant analogous treatment because of their symmetry properties include the 2,6- and 3,5-protons and carbons in symmetrically substituted arenes, methylene protons in achiral candidate structures or methyl carbons in *t*-butyl or trimethylsilyl groups.)

21 Repeat Steps 19 and 20 for the computed carbon NMR data.

**22** *MAE*. There is no universally accepted best practice for carrying out the evaluation of the computed versus experimental data for determining the goodness of fit. Nonetheless, comparison of the MAE, which is simply the error between  $\delta_{DFT}$  and  $\delta_{exp'}$  averaged across all nuclei for which an experimental value is unequivocally known, is the most commonly used criterion. This comparison is most easily carried out by spreadsheet analysis. A spreadsheet will have been created at the end of Step 20 (or 21) that contains all of the computed (and conformationally averaged) chemical shifts for the candidate structure. Again, there are many different ways to manipulate the data to yield the MAE value, but all methods involve entering the experimental chemical shift values into a spreadsheet file. An example file ('cis-3-methylcyclohexanol\_comp-vs-exp\_proton.xlsx') is provided in **Supplementary Data 2**. This file allows one to compare the computed with experimental chemical shifts, and it shows the resulting MAE values. By using the keyboard shortcut toggle–Ctrl-~ (Ctrl-tilde) in Excel, one is able to view the underlying mathematical formulas for the entire spreadsheet. This is an instructive way to learn the logic used to create files such as 'MAE-analysis-3-methylcyclohexanol.xlsx'.



23 Repeat Step 22 for the carbon nuclei.

**24** (Optional) *Other methods for data analysis:* Alternative approaches for analyzing the goodness of fit include regression analysis and evaluation of R<sup>2</sup> (coefficient of determination); the determination of the corrected MAE could also be used at this point. The recent methods of Smith and Goodman<sup>14,23</sup> and of Sarotti<sup>24</sup> are particularly notable. Each uses a sophisticated statistical treatment of NMR shift data that has been computed at lower levels of theory than described here to arrive at the best fit for structure assignment. It is beyond the scope of this protocol to present these alternative methods in detail, but readers should be aware of those approaches. Suffice it to say that these approaches, although less demanding of computational time (roughly half), require a comparable amount of active effort by the researcher to the procedure described in detail here.

**25** Repeat Steps 1–24 for each candidate structure (i.e., diastereomer or constitutional isomer).

**26** Decide which computed structure shows the best correlation(s) (e.g., lowest MAE) with the available experimental spectral data for the compound under study.

#### **? TROUBLESHOOTING**

Troubleshooting advice can be found in Table 1.

**TABLE 1** | Troubleshooting table.

Step	Problem	Possible reason	Solution
2, 3A(i)	<i>Applications</i> is not present on the menu bar in Maestro	Task view is selected by default	Select Tasks $\rightarrow$ Application View to switch to viewing a dropdown list of applications
3A(vii)	Not all conformers have converged in the conformational search	Minimization criteria are not sufficiently strict	In the conformational search preferences window, click the <i>Mini</i> tab and change <i>Maximum iterations:</i> to, e.g., '5,000' and <i>Convergence threshold:</i> to, e.g., '0.001'
3A(viii)	Not all output conformers have been found at least ten times	Not enough steps (iterations) were taken during the conformational search	In the conformational search preferences window, click the <i>CSearch</i> tab and increase the value of the <i>Maximum number of steps</i> by a factor of, e.g., 10 <sup>3</sup>
10	The Gaussian job did not finish in a timely manner or it terminated prematurely	Not enough computational resources were allocated for the job	See Step 5 for editing the 'write' Python script to increase the number of core processors and/or memory allocated for each job. Then repeat Steps 8 and 9 to recreate Gaussian input files. We typically use at least 4 GB of memory and four core processors for each job
11, 15	Various 'traceback'? errors in the Command-line interface when executing the script ('duplicate' in Step 11 and 'nmr-data' in Step 15)	No input files entered, irrelevant input files entered, input files incorrectly named, or Python not functioning properly	Check that the 'out' files are located in the working directory. Check that the 'out' filenames end with 'conf-#.out.' Otherwise the script will not read the output files
12	One or more structures contain imaginary frequencies	A transition state or saddle- point geometry was located during the geometry optimization	This indicates that the optimization convergence criteria may not be strict enough for the candidate structure. See the Gaussian 09 online manual for additional suggestions for changing the parameters for the geometry optimization
16	The created '.csv' files are missing data for certain conformers	Gaussian jobs did not successfully complete or '.out' files were damaged	Open the 'master_proton.csv' file created in Step 15. Inspect the list of conformers for missing energies or chemical shifts

#### • TIMING

Most of the operations that require active effort by the user have been automated with Python scripts. The computations themselves comprise the majority of total time required to complete the protocol, and they do not require active effort by the user.

The computational time (Steps 10–14) will vary with the molecular size, the number of degrees of freedom in the candidate structure and the level of computational horsepower available to the user. The times estimated below are active effort on the part of the researcher.

Steps 1-3: 30 min

Steps 4-9: 15 min

Steps 10–12: <10 min of active effort and ~1 h of computational wall time per conformer for the

3-methylcyclohexanols. The time for computation depends

а 0.000 0.014 0.196 3.39 3.52 4.82 b 37.0% 26.6% 36.1% 0.120% 0.0964% 0.0107%

Figure 5 | Energies and Boltzmann distribution of conformers of 1-cis that are within 5 kcal mol<sup>-1</sup> of the global minimum. (a) The relative Gibbs (or free) energy (in kcal mol<sup>-1</sup>) of each conformer with respect to the global minimum. (b) The Boltzmann mole fraction (in %) for each conformer.

on the complexity of the molecule under study; the demands scale nonlinearly with issues such as the number of atoms and the number of degrees of freedom (e.g., rotatable bonds)

Steps 13 and 14: <10 min of active effort (and ~30 min of computational wall time per conformer for the 3-methylcyclohexanols) Steps 15 and 16: <5 min

Steps 17-24: 30-60 min per candidate structure

#### **ANTICIPATED RESULTS**

We recommend that new users first reproduce this procedure and analyze cis-3-methylcyclohexanol (1-cis) at the level of theory recommended in this protocol. Specifically, we have (i) optimized the geometries and computed the free energies with the M06-2X functional and the 6-31+G(d,p) basis set and (ii) computed the NMR chemical shifts with the B3LYP functional and 6-311+G(2d,p) basis set. By convention, this is denoted as B3LYP/6-311+G(2d,p)//M06-2X/6-31+G(d,p). The expected outcomes after the conformational analysis, geometry optimizations and frequency calculations are shown in Figures 5 and 6. Six conformers are obtained from the conformational search, with 99.8% of the contribution coming from the three dieguatorial conformers, which are C–OH rotamers of one another.

The computed values (referenced and scaled) from the NMR chemical shift calculations and their comparisons with the experimental values for 1-cis are shown in Figure 6a. The computed <sup>1</sup>H and <sup>13</sup>C chemical shifts are all within 0.20 and 5.0 p.p.m., respectively, of the experimental values. The analogous data for 1-trans are provided in Supplementary Data 1. The MAEs for the <sup>1</sup>H and <sup>13</sup>C chemical shifts of the computed chemical shifts versus the experimental values for each of the two diastereomers are tabulated in **Figure 6b,c**. The <sup>1</sup>H-matched MAEs are <0.10 p.p.m. and the mismatched MAEs are >0.20 p.p.m. for both diastereomers of 3-methylcyclohexanol. These differences in MAEs clearly allow one to match each set of computed chemical shifts with the correct experimental data. The <sup>13</sup>C-matched MAEs are both <2.0 p.p.m. The <sup>13</sup>C-mismatched MAEs are both higher than the corresponding matched set of MAEs. Consistent with our previous observations, this indicates that <sup>1</sup>H are more effective than <sup>13</sup>C chemical shifts for discriminating stereochemical differences in these types of systems<sup>10,34</sup>.

It can be anticipated that once readers have successfully navigated this introductory example, they will be interested in extending their studies to compounds having somewhat more complex structures. New issues arise as the level of structural complexity increases (e.g., increased number of conformational minima that must be identified via the initial conformational

/		_
ſ	6 <sub>5</sub> 4	
L	HO CH <sub>3</sub>	
l	1 2 3	

а	<b>a</b> <sup>1</sup> H NMR chemical shift data		nical shift data <sup>13</sup> C NMF		R chemic	
Atom(s)	$\delta_{ m DFT*}$ (p.p.m.)	$\delta_{ m exp}$ (p.p.m.)	Absolute error	$\delta_{ m DFT}^{\#}$ (p.p.m.)	$\delta_{ m exp}$ (p.p.m.	
CH <sub>3</sub>	0.92	0.92	0.00	20.9	22.5	
1 <sub>ax</sub>	3.44	3.56	0.12	70.8	70.8	
2 <sub>ax</sub>	0.80	0.88	0.08	44.7	44.7	
2 <sub>eq</sub>	1.84	1.94	0.10	44.7	44.7	
3 <sub>ax</sub>	1.39	1.42	0.03	33.6	31.6	
4 <sub>ax</sub>	0.80	0.76	0.04	34.9	34.2	
4 <sub>eq</sub>	1.55	1.59	0.04	34.9		
5 <sub>ax</sub>	1.30	1.26	0.04	25.4	24.3	
5 <sub>eq</sub>	1.71	1.74	0.03	23.4	24.3	
6 <sub>ax</sub>	1.05	1.15	0.10	36.2	35.5	
6 <sub>eq</sub>	1.84	1.94	0.10	30.2	55.5	
		MAE = 0.0	6		MAE =	

<sup>3</sup> C NMF	R chemica	I shift data
DET#	δουρ	Absolute

error

1.6

0.0

0.0

20

0.7

1.1

0.7

0.9

b	MAE of exp versus DFT <sup>1</sup> H data
---	---

	1- <i>cis</i> <sub>DFT</sub>	1-trans <sub>DFT</sub>
1- <i>cis</i> <sub>exp</sub>	0.06	0.28
1- <i>trans</i> <sub>exp</sub>	0.28	0.04

C MAE of exp versus DFT <sup>13</sup>C data

	1- <i>cis</i> <sub>DFT</sub>	1- <i>trans</i> <sub>DFT</sub>
1- <i>cis</i> <sub>exp</sub>	0.9	2.5
1- <i>trans</i> exp	3.4	0.9

search, increased computational time required for the DFT geometry optimizations and NMR calculations, potential

Figure 6 | Comparison of computed and experimental NMR data for 1-cis versus 1-trans. (a) Computed (with B3LYP/6-311+G(2d,p)//M06-2X/6-31+G(d,p)) and experimental <sup>1</sup>H and <sup>13</sup>C chemical shift values of 1-cis (atom labels correspond to those shown in the diequatorial conformer shown at the top). (b,c) MAEs for the <sup>1</sup>H and <sup>13</sup>C chemical shifts, respectively, between matched and mismatched pairs of 1-cis versus 1-trans. \*Chemical shifts were derived from application of scaling factors (slope = -1.0767, intercept = 31.9477) to the <sup>1</sup>H NMR shielding tensors computed at the B3LYP/6-311+G(2d,p)// M06-2X/6-31+G(d,p) level of theory. #Chemical shifts were derived from application of scaling factors (slope = -1.0522, intercept = 181.2412) to the <sup>13</sup>C NMR shielding tensors computed at the B3LYP/6-311+G(2d,p)//M06-2X/6-31+G(d,p) level of theory.

for a greater number of (diastereomeric) candidate structures that must be considered and potential compression of the goodness-of-fit parameters). Dealing with these in a detailed manner is beyond the scope of this protocol. Many of these factors have been mentioned above in the introductory commentary and in the TROUBLESHOOTING table. In this regard, we also again call attention to our earlier studies of the tricyclic compounds **8** (refs. 26,35) and **11** (ref. 29) (cf. **Fig. 3**), from which useful guidance can be taken to assist users wanting to extend their investigations.

Finally, one might ask when the approach described in this protocol should be implemented. There is no simple, single answer because many variables come into play. How essential is it that the structure be unambiguously known? What is the level of NMR expertise of the investigator(s)? How well-established are other known closely related structures and what computational resources and expertise are available locally? Hopefully, working through this protocol will give each researcher, at the very least, a better ability to answer these questions.

Note: Any Supplementary Information and Source Data files are available in the online version of the paper.

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