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## Prediction of Xaa-Pro peptide bond conformation from sequence and chemical shifts

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Abstract We present a program, named Promega, to predict the Xaa-Pro peptide bond conformation on the basis of backbone chemical shifts and the amino acid sequence. Using a chemical shift database of proteins of known structure together with the PDB-extracted amino acid preference of cis Xaa-Pro peptide bonds, a cis/trans probability score is calculated from the backbone and  ${}^{13}C^{\beta}$ chemical shifts of the proline and its neighboring residues. For an arbitrary number of input chemical shifts, which may include  $Pro^{-13}C^{\gamma}$ , Promega calculates the statistical probability that a Xaa-Pro peptide bond is cis. Besides its potential as a validation tool. Promega is particularly useful for studies of larger proteins where  $Pro^{-13}C^{\gamma}$  assignments can be challenging, and for on-going efforts to determine protein structures exclusively on the basis of backbone and <sup>13</sup>C<sup> $\beta$ </sup> chemical shifts.

**Keywords** Backbone chemical shifts · CS-Rosetta · NMR · Omega angle · Proline · Structure prediction

In proteins, the majority ( $\sim 99.7\%$ ) of peptide bonds is found to be in the trans conformation (Weiss et al. 1998), which is energetically favorable due to (1) stronger

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favorable electrostatic interactions between  $O_i$  and  $C'_{i+1}$ and (2) the steric repulsion between the  $C^{\alpha}/H^{\alpha}$  atoms of the two bonded amino acids in a cis conformation (Wedemeyer et al. 2002). However, Pro residues exhibit a higher preference to form a cis Xaa-Pro peptide bond, attributed to the steric similarity between the cis  $C_{\alpha}^{i-1}H_{\alpha}^{i-1}/C_{\alpha}^{i}H_{\alpha}^{i}$  configuration and the corresponding trans  $C_{\alpha}^{i-1}H_{\alpha}^{i-1}/C_{\delta}^{i}H_{\delta}^{i}$  form. In proteins, the population of Pro residues engaged in a cis Xaa-Pro peptide bond is about 5%, making the correct identification of the Xaa-Pro peptide bond conformation an important task during NMR protein structure determination. Proline isomerization plays an important role in protein folding and can modulate protein function, and therefore remains the subject of active on-going research (Jahn et al. 2006; Baldwin 2008; Lindfors et al. 2008; Andrews et al. 2009; Day et al. 2009; Pascal et al. 2009; Severin et al. 2009; Weininger et al. 2009).

When following standard NMR procedures, identification of the cis or trans form of a Xaa-Pro peptide bond generally relies on the observation of a strong  $H^{\alpha}$ - $H^{\alpha}$  or  $H^{\alpha}$ - $H^{\delta}$  sequential NOE (Wüthrich 1986). However, considering that the isomer-specific  ${}^{1}H^{\alpha} - {}^{1}H^{\alpha}$  or  ${}^{1}H^{\alpha} - {}^{1}H^{\delta}$  NOE intensities can be difficult to quantify, due to the proximity of such resonances to the intense water signal, the often crowded nature of the  ${}^{1}\text{H}^{\alpha}$ - ${}^{1}\text{H}^{\delta}$  spectral region when considering larger proteins, and the absence of such signals when studying fully perdeuterated proteins, identification of the correct Xaa-Pro peptide bond conformation can remain a non-trivial task (Torchia et al. 1989). An alternate method for distinguishing cis and trans Xaa-Pro peptide bonds relies on the empirical finding that the <sup>13</sup>C chemical shifts for Pro in cis and trans configurations differ significantly, both in small peptides and in proteins (Dorman and Bovey 1973; Siemion et al. 1975; Howarth and Lilley 1978; Schubert et al. 2002). In particular, the chemical shift

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difference between  ${}^{13}C^{\beta}$  and  ${}^{13}C^{\gamma}$  has proven to be a reliable indicator for identifying the conformation of Xaa-Pro peptide bonds (Siemion et al. 1975; Schubert et al. 2002). In view of recent work aimed at determining protein structures solely from backbone NMR chemical shifts (Cavalli et al. 2007; Robustelli et al. 2008; Shen et al. 2008; Wishart et al. 2008; Shen et al. 2009b), it is particularly important to develop a robust procedure for identifying cis-Pro peptide bonds without recourse to NOE data or the often unavailable  ${}^{13}C^{\gamma}$  chemical shifts. The current study aims to present such a procedure.

Nowadays, a large number of proteins with both NMR chemical shifts and high-quality structures are available for studying the relations between NMR chemical shifts and local protein structure (Cornilescu et al. 1999; Neal et al. 2003; Shen and Bax 2007; London et al. 2008; Kohlhoff et al. 2009; Shen et al. 2009a), providing a good basis to further explore the relation between NMR chemical shifts and the cis/trans state of Xaa-Pro peptide bonds. Here, we first evaluate the relation between both the local amino acid sequence as well as the chemical shift patterns of Pro and its neighboring residues and the cis/trans state of the Xaa-Pro peptide bond, using a database newly constructed from proteins for which high resolution X-ray coordinates are available in the PDB, and chemical shifts have been deposited in the BMRB (Markley et al. 2008). Then, we present a scoring function to calculate the probability of any given Pro-centered tripeptide to contain a cis Xaa-Pro peptide bond.

We explore the relation between residue sequence and the probability of finding any given Xaa-Pro peptide bond in the cis or trans configuration by using the protein database originally developed for the CS-Rosetta program (Shen et al. 2009b). This database contains 109,396 Procentered tri-peptides of which 4,919 with a cis Xaa-Pro peptide bond, spread over 9,446 proteins for which highresolution ( $\leq 2.5$ Å) X-ray structures are available. This protein sequence database is about three times larger than the database previously used for the same purpose, which also had a less stringent X-ray resolution cutoff (Pahlke et al. 2005), but shows quite similar amino acid preferences for the residues neighboring cis and trans Pro (Table S1; Figure S1). Analysis of these structures indicates that Gly and the aromatic amino acids Phe, Trp, and Tyr are more prevalent in the Xaa position preceding a cis-Pro, and Phe, His, Trp, and Tyr are favored in the position following a cis Xaa-Pro peptide bond. Asp, Ile, Leu, Val, and Met are disfavored to precede a cis Pro, and Asp, Glu, and Ile are disfavored to follow a cis Pro.

A second database, containing 1,746 Pro-centered tripeptides (114 with a cis and 1,632 with a trans Xaa-Pro peptide bond), was constructed from 580 proteins for which both a high-resolution X-ray structure and (nearly) complete BMRB chemical shifts ( $\delta^{15}$ N,  $\delta^{13}$ C',  $\delta^{13}$ C<sup> $\alpha$ </sup>,  $\delta^{13}$ C<sup> $\beta$ </sup>,  $\delta^{1}$ H<sup> $\alpha$ </sup> and  $\delta^{1}$ H<sup>N</sup>) are available. The preparation of this chemical shift database, including the calculation of secondary chemical shifts, chemical shift re-referencing, exclusion of residues with large B-factors in the X-ray reference structure, and exclusion of chemical shift outliers follows the same procedure as was used for generating TALOS (Cornilescu et al. 1999) and SPARTA (Shen and Bax 2007) protein databases. Moreover, 89 proteins in the database were found to be studied using perdeuterated sample, with corresponding substantial <sup>2</sup>H isotope effects on <sup>13</sup>C<sup> $\alpha/\beta$ </sup> chemical shifts. Uniform corrections for these isotope effects were applied for those proteins following the same procedure described previously (Shen et al. 2009b).

Using this pruned database, the average secondary chemical shift  $<\Delta \delta_Y^{x,j} >$ , as well as the standard deviation  $\sigma_Y^{x,j}$ , are calculated for each backbone atom  $x \ [x = ({}^{15}\text{N}, {}^{13}\text{C}', {}^{13}\text{C}^{\alpha}, {}^{13}\text{C}^{\beta}, {}^{1}\text{H}^{\alpha} \text{ and } {}^{1}\text{H}^{N})]$  at position  $j \ [j = i - 1$ , i, i + 1] of the Pro-centered tripeptides with Xaa-Pro peptide bond conformation  $Y \ (Y = cis \text{ or } trans)$ , with results listed in Table 1 and Supplementary Table S2, and shown in Figures 1A and S2. For slightly more than half of the tripeptides in the data base (940, of which 45 have a cis Pro), Pro  ${}^{13}\text{C}^{\gamma}$  chemical shifts were also available (Fig. 1D).

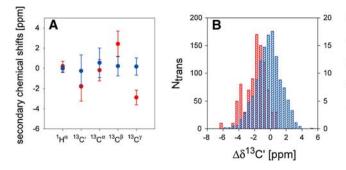
As previously found, our data show that the  ${}^{13}C^{\beta}$  and  ${}^{13}C^{\gamma}$  chemical shifts of Pro engaged in cis and trans Xaa-Pro peptide bonds differ considerably (Fig. 1, Table 1). We find  $\delta^{13}C^{\beta}$  values for Pro with trans and cis conformations at  $31.8 \pm 1.0$  and  $33.8 \pm 1.2$  ppm, respectively, while  $\delta^{13}C^{\gamma}$  values fall at  $27.4 \pm 0.9$  and  $24.4 \pm 0.7$  ppm, respectively, and therefore are much more discriminating. When considering the difference of  $\delta^{13}C^{\beta}$  and  $\delta^{13}C^{\gamma}$ , or  $\Delta\beta\gamma$ , our values of  $4.5 \pm 1.2$  and  $9.4 \pm 1.3$  ppm, respectively, agree closely with those of previous studies (Siemion et al. 1975; Schubert et al. 2002), confirming their utility as an indicator for cis and trans Pro peptide bonds. Furthermore, the  ${}^{13}C'$  chemical shifts are found to be different for cis and trans Pro (Fig. 1b; Table 1), albeit

**Table 1** Average secondary chemical shift and standard deviation for backbone and  ${}^{13}C^{\beta}$  and  ${}^{13}C^{\gamma}$  nuclei of Pro residues preceded by a cis or trans peptide bond<sup>a</sup>

X	$<\Delta\delta^X_{cis}>$	$\sigma_{cis}^{X}$	$<\Delta\delta^X_{trans}>$	$\sigma^X_{trans}$	
${}^{1}\mathrm{H}^{\alpha}$	0.17	0.53	-0.03	0.39	
<sup>13</sup> C′	-1.78	1.45	-0.26	1.58	
$^{13}C^{\alpha}$	-0.19	1.07	0.55	1.47	
${}^{13}C^{\beta}$	2.42	1.27	0.21	0.97	
${}^{13}C^{\gamma b}$	24.41	0.74	27.45	0.86	

<sup>a</sup> Using the random coil chemical shifts used by TALOS+ (Shen et al. 2009a)

<sup>&</sup>lt;sup>b</sup> The regular chemical shift instead of the secondary chemical shift is reported



**Fig. 1** Chemical shift distribution for Pro residues in folded proteins. **a** Plot of the average  ${}^{1}\text{H}^{\alpha}$ ,  ${}^{13}\text{C}'$ ,  ${}^{13}\text{C}^{\alpha}$ ,  ${}^{13}\text{C}^{\beta}$  and  ${}^{13}\text{C}^{\gamma}$  secondary chemical shifts and their standard deviations for Pro with cis (*red*) or trans (*blue*) Xaa-Pro peptide bond.  $\Delta \delta^{13}\text{C}^{\gamma}$  are calculated using an average chemical shift of 27.28 ppm provided by BMRB, all other

to a lesser extent than  ${}^{13}C^{\beta}$  and  ${}^{13}C^{\gamma}$ . With the exception of  $\delta^{1}H^{\alpha}$  of the preceding residue, which is found to be more up-field when this residue precedes a cis peptide bond, the chemical shifts of the two Pro-neighboring residues correlate only very weakly with the cis/trans form of the peptide bond (Table S2; Fig. S2).

The above residue type and chemical shift analysis for Pro and its immediate neighbors can be used to estimate the probability for the Xaa-Pro peptide bond to be cis or trans. Below, we describe the computational procedure used by the program Promega to predict the Pro omega angle. Promega utilizes a probability scoring function which includes both the amino acid type and the chemical shifts of a Pro-centered tripeptide to predict its Xaa-Pro peptide bond conformation.

At first, a normalized relative occurrence H (Pahlke et al. 2005) is defined to account for the occurrence of each amino acid type (X) in the neighboring positions (j) of a Pro residue at position i:

$$H_Y^{j,X} = O_Y^{j,X}/N^X \quad j = [i-1, i+1]; \ Y = [cis, \ trans]$$
(1)

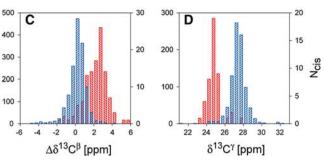
where  $O_Y^{j,X}$  stands for the observed occurrence of amino acid *X* at position *j* of a given Pro-centered tripeptide,  $N^X$  is the natural occurrence of amino acid *X* in the database.

Next, assuming a Gaussian distribution for the chemical shifts (Fig. 1 b–d), a chemical shift score function,  $P_Y^{CS}$ , is generated to account for the compatibility of a given Procentered tri-peptide with either a cis or trans Xaa-Pro peptide bond:

$$P_{Y}^{CS} = \prod_{x} \prod_{n=-1,0,1} P_{Y}^{\delta x, i+n}$$
(2)

where  $x = [{}^{15}N, {}^{13}C', {}^{13}C^{\alpha}, {}^{13}C^{\beta}, {}^{1}H^{\alpha} \text{ and } {}^{1}H^{N}]$  for the two neighboring residues,  $x = [{}^{13}C', {}^{13}C^{\alpha}, {}^{13}C^{\beta}, {}^{1}H^{\alpha}, \text{ and } {}^{13}C^{\gamma}$  (if available)] for the center Pro residue, Y = [cis, trans], and

$$P_Y^{\delta x,j} = e^{-\left(\frac{\Delta \delta_{exp}^{x,j} - <\Delta \delta_Y^{x,j} >}{\sigma_Y^{x,j}}\right)^2/2}$$
(3)



secondary chemical shifts are calculated relative to the random coil values taken from TALOS+ program (Shen et al. 2009a). **b–d** Histograms of  ${}^{13}C'$  (**b**),  ${}^{13}C^{\beta}$  (**c**) secondary chemical shifts and  ${}^{13}C^{\gamma}$  (**d**) chemical shifts of Pro residues preceded by a cis (*red*, *right y*-axis) or trans (*blue*, left *y*-axis) peptide bond

where  $\Delta \delta_{exp}^{x,j}$  is the experimental secondary chemical shift (corrected for <sup>2</sup>H isotope shifts when applicable).

An overall score function, taking into account both the amino acid type and the chemical shift patterns, is then used to estimate the compatibility of the chemical shifts and residue types of a given Pro-centered tripeptide Xaa-Pro-Xbb with those of a cis or trans Xaa-Pro peptide bond:

$$P_Y^{\text{total}} = P_Y^{CS} \times P_Y^{\text{residue}} \quad Y = [cis, trans]$$
(4a)

where

$$P_Y^{residue} = H_Y^{i-1, X_{i-1}} \times H_Y^{i+1, X_{i+1}}$$
(4b)

The propensity of a given Pro-centered tri-peptide to have a cis Xaa-Pro peptide bond is given by:

$$P_{cis} = P_{cis}^{\text{total}} / (P_{cis}^{\text{total}} + P_{trans}^{\text{total}})$$
(5)

Note that  $P_{cis}$  does not represent a normalized probability, as it does not yet account for the fact that the total likelihood of any given Pro to be in the cis form, in the absence of chemical shift or residue type information, is only *ca* 5%. The  $P_{cis}$  value of 0.5, corresponding to such a case, simply indicates that the Pro residue has the database average likelihood of 5% to be cis. Therefore,  $P_{cis}$  simply signifies the above or below average likelihood for a Pro residue to be in the cis form.  $P_{cis}$  can be converted to a normalized, true probability by:

$$P_{cis}^{\text{norm}} = P_{cis}^{\text{total}} / (P_{cis}^{\text{total}} + 19P_{trans}^{\text{total}})$$
(6)

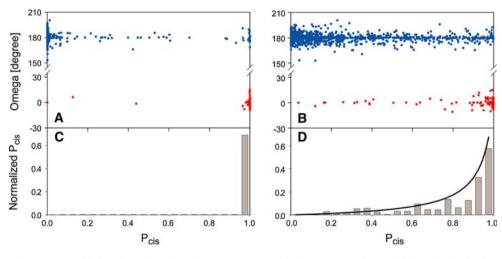
The effectiveness of  $P_{cis}$  to identify cis-Pro peptide bonds is illustrated in Fig. 2. As expected on the basis of previous results (Schubert et al. 2002), when  ${}^{13}C^{\gamma}$  chemical shifts are present along with the  ${}^{13}C^{\beta}$  chemical shifts (Fig. 2a), the  $P_{cis}$  score is an excellent indicator for the Xaa-Pro peptide bond. Figure 2A shows that 42 out of 45 tripeptides with cis Xaa-Pro peptide bond having a  $P_{cis}$ score close to 1.0, and NOE data indicates that for at least two of the three cis-Pro residues with low  $P_{cis}$  scores the peptide bond differs in conformation from the crystal structure (Table S3). For 846 out of 895 tripeptides with a trans Xaa-Pro peptide bond,  $P_{cis} \leq 0.1$ , corresponding to  $P_{cis}^{norm} \leq 0.006$  (Fig. 2a).

Manual inspection of several of the prediction outliers, for which additional NMR data were available, including an NMR reference structures and/or NOE restraints (Table S3), suggests differences between the crystal and solution structures for at least a significant fraction of the outliers. For example, the two tripeptide segments with smallest  $P_{cis}$ score but with a cis Pro in the X-ray reference structure (Fig. 2a; Table S3), exhibit strong sequential  $H_{i-1}^{\alpha}$  to Pro- $H_i^{\delta}$  NOEs, characteristic of a trans peptide bond in the NMR structure. Similarly, for a number of residues with a high  $P_{cis}$  value ( $\geq$ 0.99) but a trans peptide bond in the X-ray structure, NOE data strongly point to cis peptide bonds (Table S3).

<sup>13</sup>C<sup>γ</sup> chemical shifts are often difficult to assign, in particular for larger proteins and when using perdeuterated samples. Therefore, the ability of  $P_{cis}$  scores to identify cis peptide bonds without recourse to  $\delta^{13}$ C<sup>γ</sup> is particularly important. Such  $P_{cis}$  scores were calculated for all Xaa-Pro-Xbb tripeptides contained in the chemical shift database (Fig. 2b), and show that  $P_{cis}$  remains a strong indicator for the Xaa-Pro peptide bond. For example, 66 out of 82 tripeptides with cis Xaa-Pro peptide bond have a  $P_{cis}$ score >0.8, and 969 out of 1,436 tripeptides with trans Xaa-Pro peptide bond have a  $P_{cis}$  score <0.2. When viewed in histogram format, the fraction of Pro residues with a cis Pro peptide bond as a function of its  $P_{cis}$  score closely follows the expected  $P_{cis}^{norm}$  probability of Eq. 6, i.e., the actual probability for a cis Pro peptide bond (Fig. 2d).

When no chemical shifts are available, i.e., only the residue type information is included in Eq. 4a, the ability of Promega to identify cis Xaa-Pro peptide bonds is much decreased, and with  $P_{\rm cis}$  values then falling in the 0.2–0.8 range (Figure S3), these values are only suggestive of whether a given Pro residue has above ( $P_{cis} > 0.5$ ) or below ( $P_{cis} < 0.5$ ) average likelihood to be in the cis configuration.

Promega output serves as an alert to exercise caution when building molecular models in the absence of complete sets of NOE data, where the possibility of a cis peptide bond is often ignored. In this respect, an important application concerns the chemical shift based protein structure generation process (Cavalli et al. 2007; Shen et al. 2008; Wishart et al. 2008). These protocols rely on empirically optimized search procedures to select protein fragments from a protein database, followed by an assembly and relaxation procedure. The character of the Xaa-Pro peptide bond is generally not considered during the fragment selection procedure and its chemical shifts provide insufficient weight when selecting larger fragments. Therefore, such fragment pools usually do not differ significantly in the fraction that contains a cis Xaa-Pro peptide bond from the database average of  $\sim 5\%$ . This makes it likely that true cis peptide bonds are not identified during such procedures. Therefore, the MFR fragment search procedure (Kontaxis et al. 2005) has been adapted such that  $P_{cis}$  functions as an additional term



**Fig. 2** Prediction of Xaa-Pro peptide bond conformation from NMR chemical shifts by the program Promega. (**a**, **b**) Plot of the crystallographically observed  $\omega$  angles, versus their probability score,  $P_{cis}$ , calculated by Eq 5, **a** for residues that included <sup>13</sup>C<sup>7</sup> chemical shift assignments, and **b** for all database residues with at least three out of four ( $^{13}C'$ ,  $^{13}C^{\alpha}$ ,  $^{13}C^{\beta}$ ,  $^{1}H^{\alpha}$ ) Pro assignments, and ignoring  $^{13}C^{\gamma}$  chemical shifts. Note that  $P_{cis}$  (Eq. 5) corresponds to a relative probability, i.e.,  $P_{cis} = 0.5$  refers to the case where the cis probability

equals the average cis probability in the database (*ca* 5%). (**c**, **d**) Histograms of the normalized, true probability score  $P_{cis}^{norm}$ , calculated by using Eq. 6 for Pro residues in the database in **c** the presence and **d** the absence of <sup>13</sup>C<sup> $\gamma$ </sup> chemical shifts. The solid line in **d** corresponds to Eq. 6. Note that in the presence of <sup>13</sup>C<sup> $\gamma$ </sup> chemical shifts the  $P_{cis}$  result is essentially binary, and the below unity value observed in the histogram for the highest  $P_{cis}$  bin largely reflects cases where solution and crystal structures differ

defining the  $\omega$  torsion angle, improving the quality of input fragments for the CS-Rosetta protocol. As an example, we consider the protein XcR50, for which models were calculated in our original study of the effectiveness of CS-Rosetta. (Shen et al. 2008) This 76-residue protein contains five Pro residues, of which three have cis peptide bonds in the X-ray reference structure (Table S5). Nine out of ten lowest energy models of our previous CS-Rosetta study correctly identified cis-Pro<sup>62</sup>, but failed to identify cis-Pro<sup>49</sup>. NOE and chemical shift data indicate that the C-terminal residue Pro<sup>76</sup> is trans in solution. Including a Promega term in MFR fragment selection results in CS-Rosetta models that have the correct cis conformations for both Pro<sup>49</sup> and  $\text{Pro}^{62}$ , and clearly identify the other three as trans. Even though the local backbone rmsd with the Promega-term included in MFR fragment selection removes the discrepancy at  $\text{Pro}^{49}$  (Fig. 3b), the impact on the overall structure is minimal and the backbone rmsd relative to the X-ray structure remains unchanged at  $1.7 \pm 0.3\text{\AA}$ .

Promega is written in the C++ language, and reports both the  $P_{cis}$  and normalized  $P_{cis}^{norm}$  scores, calculated by Eqs. 4a–6. The backbone and  ${}^{13}C^{\beta}$  chemical shifts of each Pro-centered tripeptide, the  ${}^{13}C^{\gamma}$  chemical shift of the center Proline residue if available, as well as the amino acid types of the two neighboring residues, serve as input for the prediction. A script is included to correct the  ${}^{13}C^{\alpha/\beta}$ chemical shifts for  ${}^{2}$ H isotope effects, if required.

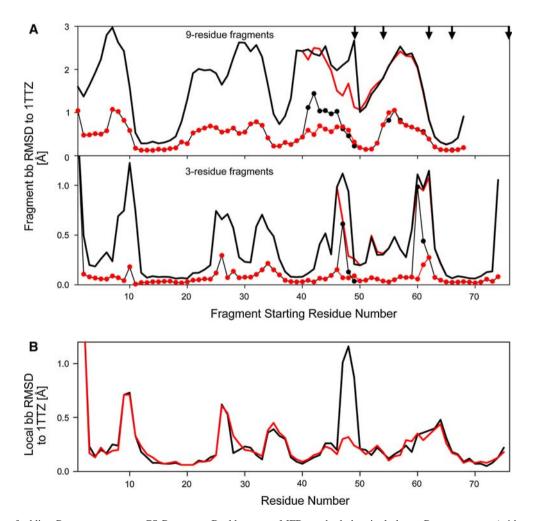


Fig. 3 Impact of adding Promega output to CS-Rosetta. **a** Backbone RMSD of 200 MFR-selected CS-Rosetta fragments for protein XcR50. Plots of the lowest (*thin lines with dots*) and average (*bold lines*) backbone coordinate rmsd's (N,  $C^{\alpha}$  and C') between any given segment in the experimental structure (PDB entry 1TTZ) and 200 fragments, as a function of starting position of the query segment (note that the 68 is the last starting residue for a 9-residue fragment in this 76-residue protein). Results from the standard MFR method with chemical shifts are plotted in black, while those selected using the

MFR method that includes a Promega term (with no  $\delta^{13}C^{\gamma}$  shifts considered), are in red. The locations of five Pro residues are marked by *arrows*. **b** Local accuracy of the XcR50 CS-Rosetta structures, relative to the reference Xray structure (1TTZ). For the 10 lowest energy CS-Rosetta models obtained using standard (*black line*) and Promega-included MFR (*red line*), the average local backbone RMSD (N, C<sup> $\alpha$ </sup>, C') values are plotted against the center residue number for fragments of 3 residues

In conclusion, the cis/trans configuration of Xaa-Pro peptide bonds in proteins can be predicted with reasonable accuracy on the basis of amino acid type and backbone and  ${}^{13}C^{\beta}$  chemical shifts. When both Pro  ${}^{13}C^{\gamma}$  and  ${}^{13}C^{\beta}$  chemical shifts are available, the Xaa-Pro cis or trans state will be identified uniquely for the vast majority of cases. In the absence of Pro  ${}^{13}C^{\gamma}$  chemical shifts, Promega merely provides a statistical probability for the peptide bond in question to be cis or trans.

## Software availability

Promega and the CS-Rosetta package with its updated MFR protocol can be downloaded from http://spin.niddk.nih.gov/bax/.

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