

# The nitrogenase MoFe protein

## A secondary structure prediction

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Surface residues, interior residues, and parsing residues, together with a secondary structure derived from these, are predicted for the MoFe nitrogenase protein in advance of a crystal structure of the protein, scheduled shortly to appear in *Nature*. By publishing this prediction, we test our method for predicting the conformation of proteins from patterns in the divergent evolution of homologous protein sequences in a way that places the method 'at risk'.

Protein structure prediction; Secondary structure prediction; Nitrogenase

### 1. INTRODUCTION

We have recently developed procedures for extracting conformational information from patterns in the divergence and conservation in the sequences of homologous proteins [1]. These procedures are based on models for the divergent evolution of behavior and structure of proteins [2–4]. The procedures have been used to predict various aspects of the conformation of several protein families [1,5]. In the cases of protein kinase [6] and the Src homology domain 3 [7,8], secondary structure predictions were made before crystallographic data became available and shown to be remarkably accurate by subsequently determined crystal and NMR structures [9–12].

The best way to test the power of structure prediction procedures is to apply them to make predictions in advance of experimental information concerning conformation. To be useful, the predictions must be published. This ensures that knowledge of the structure cannot bias the prediction, the predictions (both correct and incorrect) are visible, and the method is placed 'at risk'. The only problem is one of coordination. A prediction published years in advance of an experimental structure is uninteresting. A prediction made even days after a structure becomes available to the predictor is useless.

In the October 29, 1992 issue of *Nature* [7], we invited scientists to send sequences to use as prediction targets for our procedure for proteins (a) the structure of which shortly will be solved, (b) where no structure is available

for any obviously homologous protein, (c) where a set of homologous sequences are available, (d) where these sequences are sent to us by computer mail together with a few literature citations that provide an overview of the chemistry and biology of the protein family, and (e) when enough time is available to allow coordination of the publication of the prediction and publication of the structure. This Letter reports our first efforts directed towards this end.

Our first task has been to address challenges where criterion (e) was not fully met. For example, on November 16, Prof. D.C. Rees from the California Institute of Technology challenged us to predict a secondary structure for the MoFe protein of nitrogenase. He noted that the crystal structure of this protein had been solved, and that a manuscript coauthored with J. Kim describing that structure was in press in *Nature*, scheduled to appear in the week of December 14, 1992.

Four weeks is insufficient time to assemble a complete model for the conformation of any protein family. Nevertheless, the nitrogenase is an extremely interesting target. It is a large protein and it plays a critical role in an important metabolic process. Therefore, we have used the available time to assemble a first stage prediction of the secondary structure of this protein family. The prediction turns out to be especially instructive for those seeking to apply our procedures to their own proteins. Further, when this Letter appears in print, the issue of *Nature* containing the crystal structure will be in the library, and the success of the prediction can be immediately determined.

### 2. RESULTS

In presenting this prediction, we address one criticism

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of our procedure transmitted to us by established workers in the area: that it is inferior because it is not fully automated, and relies in part on the experience and training of individuals making the prediction. As noted elsewhere, we do not find this criticism particularly evincing [1,2,6,12]. Conformational analysis in proteins is not fundamentally different from conformational analysis in other branches of organic chemistry, and no predictive problem in conformational analysis in chemistry has yet been solved, even for small molecules, by a fully automated procedure in the century during which conformational analysis has been developed. Rather, problems in conformational analysis are solved in chemistry by first developing a formalism. The formalism is then applied by humans to real problems. In

this application, experience, training and intuition can make contributions, errors can be understood, and the formalism can be rationally improved. Organic chemical analyses can be taught, reproducibly applied, any subjected to critical testing, as any student in an undergraduate chemistry course can confirm. Of course, it is difficult to apply methods designed to evaluate automated prediction heuristics to the prediction heuristics obtained by an organic chemical paradigm. This is one reason why de novo predictions, such as the one presented here, are so important in developing the predictive formalism.

To illustrate this point, the prediction in Fig. 1 is broken into several parts. For surface, interior, parsing, and active site assignments, the first line (TJ) reports

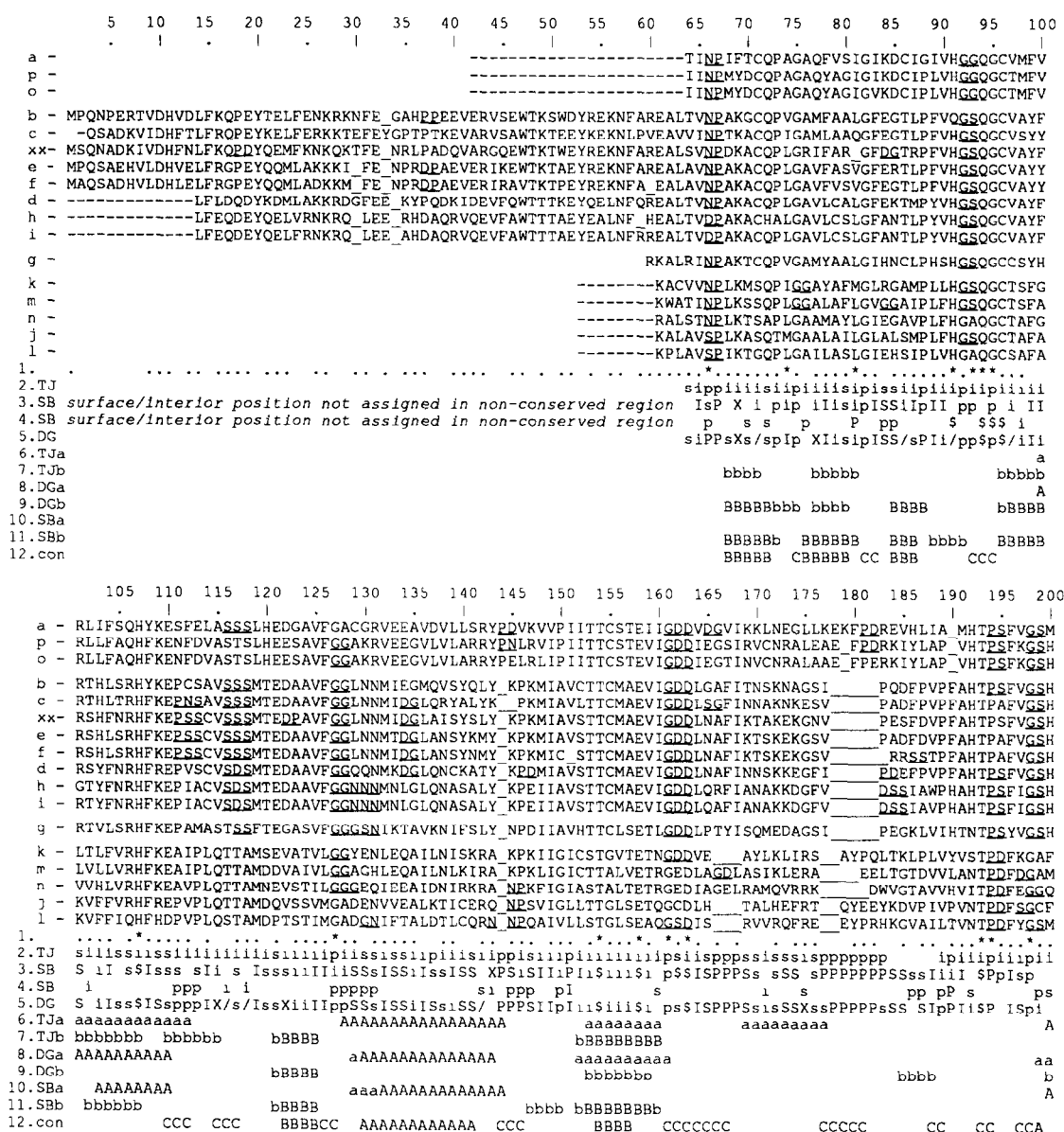
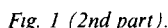


Fig. 1 (1st part)



Line 12: a consensus secondary structure prediction to be compared with the crystal structure when it becomes available. Symbols as above, with C designating coil/turn assignments.



Fig. 1 (3rd part).

those made by a fully automated package that is essentially an 'expert system' attempting to reproduce assignments made by organic chemists using experience, training and intuition applying procedures described in detail elsewhere [1,2,5,6,11]. This is the first time this package has been applied. The second, third and fourth lines reflect two sets of predictions prepared independently by two experts (D.G. and S.B.). A comparison of these lines illustrates the range of assignments made when relying on the experience, training, and intuition of individual scientists.

Secondary structure predictions, derived from patterns in surface and interior assignments, are likewise assigned separately, first by a rigorously applied heuristic (TJa and TJb, for  $\alpha$  and  $\beta$  assignments) and then by

two experts acting independently. The final line contains the consensus of all three predictions resulting from discussion among the experts, with the computer prediction represented by an expert (T.J.) as well. Special emphasis was placed on identifying core secondary structural units, as these are the most critical in assembling a tertiary structure model. Finally, an additional sequence (labeled xx) was introduced later into the multiple alignment to illustrate the extent to which assignments might be altered by additional sequence information.

A new procedure was used to help identify 'breaks' (or 'parses') in the secondary structure of a protein. In this procedure, dipeptides in the sequence composed of Pro, Gly, Asp, Asn, Ser, or any combinations of these

were identified as 'parsing strings'. Further description of the use of parsing strings as indicators of breaks in secondary structure will be presented elsewhere.

### 3. DISCUSSION

The first stage prediction used a multiple alignment of one family (the  $\beta$  family) of the MoFe protein of nitrogenases only. A second stage prediction would include input from the second, more distantly homologous,  $\alpha$  family, which aligns satisfactorily over part of the sequence. Preliminary study of the  $\alpha$  family yielded secondary structure predictions that strongly confirm several predictions made in the first family (e.g., the  $\alpha$  helix assigned to positions 131–142). The comparison does not, however, help define the conformation of the unusually structured (yet certainly important, judging by a variety of sequence features) stretch from positions 165–200.

Further, the alignment was subjected only to minimal revision. In a second stage prediction, revised versions of the multiple alignment would be considered in an effort to optimize secondary structural assignments. Further, in this first stage prediction, neither a supersecondary nor a tertiary structure was modeled, nor did we use information available regarding the active site of the enzyme, the subunit structure, or the biological function of this enzyme [13]. These procedures often help identify errors in the secondary structure prediction [6]. There was, regrettably, too little time.

A certain number of inconsistencies can undoubtedly be found in the figure, again due to a shortage of time. The authors welcome inquiries, as well as additional sequences for prediction.

#### NOTE ADDED IN PROOF: JANUARY 4, 1992

At the Editor's request, we have compiled recently published crystallographic data for the MoFe nitrogenase protein from *Azotobacter vinelandii* [14] in a form that allows them to be compared with a first stage prediction for the protein family (Fig. 1), completed before the crystallographic data were available. Three points are important.

First, we normally do not publish discussions of our own predictions [12] until after they have been evaluated by others. Premature evaluations by predictors of their own predictions encourage a certain type of criticism that can obscure important science, no matter how circumspect these evaluations might be. Thus, our prediction of protein kinase [6] was evaluated first by the crystallographers who solved the structure [9], by Thornton et al. [15], and then briefly by Lesk and Boswell [16]. For the SH3 domain prediction, a summary of the prediction was evaluated by Sander [17] (the prediction paper was not available to the evaluators

when they made their evaluation); an editorial evaluation of the full prediction will appear simultaneously with the prediction paper [8].

Second, our central message [1] is that the organic chemist's research strategy, where a scientist actively applies a chemical formalism during the prediction process, is more likely to yield useful results than one focusing on obtaining automated computational methods. This means that methods designed to evaluate automated predictions are often deceptive when applied to predictions made using other research paradigms. With a prediction method based on a chemical formalism, it is appropriate to ask *why* a secondary structure assignment is correct (if it is correct), or why it is incorrect (if it is incorrect). This is especially true for a first stage prediction (Fig. 1). Fig. 2 shows several points where the prediction was influenced by gaps, problematic alignments, ambiguous patterns in surface and interior assignments, and other issues often resolved during refinement (reference [6] discusses refinement procedures). As noted above, there was insufficient time to address any of these issues.

Third, evaluating predictions made from multiple alignments raises issues that are central to the field, not peripheral as this short note might imply. A structural model for a family of proteins does not apply exactly to any individual family member, and it is not always clear how to correlate a 'consensus' model to the conformation of an individual protein. It is clear, however, that consensus models are best evaluated using more than one experimental structure, as illustrated by the example of the SH3 domain [10,11].

Overall, the results for the MoFe nitrogenase protein are typical for a first stage unrefined prediction. Helix assignments are normally rather accurate;  $\beta$ -strands are less so. Problems are often encountered in unrefined predictions when assigning secondary structure near the active site (e.g. the first line of Fig. 2). Here sequence divergence is dominated by functional constraints relating to catalytic function, obscuring patterns that indicate particular types of secondary structure.

We ourselves evaluate a first stage prediction by grouping the assigned units in 7 categories: 'correct' (a predicted secondary structure unit that would not adversely affect an effort to build a tertiary structure model), 'possibly correct' (a predicted secondary structure unit whose effect on a tertiary structure model depends on context), 'wrong' (a helix assigned as a strand, tabulated as an incorrect strand assignment, or a strand assigned as a helix, an incorrect helix assignment), 'missed significant' (a helix or strand not identified in a region that does not contain a gap, and where the missed unit is important to a tertiary structural model), 'missed insignificant' (a helix or strand not identified in a region that does not contain a gap, but where the missed unit does not appear important to building a tertiary structure), 'gapped' (a helix or strand

Align #	65	70	75	80	85	90	95	100	105	110	115	120	125	130
Seq	TVNPAKACQPLGAVLCALGF	ETMPYVHGSQGC	VAYFRSYFNRH	FRFREP	VSCVSD	SMTE	DAAVFGG	QQ						
Predict	BBBBB	CBBBBB	CC	BBB	CCC					CCC	CCC	BBBBCC	A	
Cryst	..BBB	AAAAAAAAAAAA		BBBBBBB	AAAAAAAAAAAA					BBBBBBB	AAAAAA	AA		
Cryst #		70	80	90	100	110	120							

Align #	140	145	150	155	160	165	170	175	180	185	190	195	200
Seq	NMKDGLQNC	KATY	KPDMIA	VSTTCMAE	VIGDDL	NAFINNS	KKEGFI		PDEFFV	PPFAHT	PSFV	GSH	
Predict	AAAAAAAAAA	CC	BBB	CCCCC					CCCC		CC	CCA	
Cryst	AAAAAAAAAA		BBBBBBB	AAAAAA	AAAAAA					BBBBBBB		A	
Cryst #	130	140	150	160	170	180	190						

Align #	205	210	215	220	225	230	235	240	245	250	255	260	265	270
Seq	VTGWDNMFEG	IARYF		T		LKSMDD	KVVG	SNKKIN	IVPGF	ETYL	GNFR	VIKRL	SEMG	
Predict	AAAAAAAAAA		unassigned	due to gaps		BBBBB	CCCCCCC	AAAAAA						
Cryst	AAAAAAAAAA		A			BBBBBBB		A	AAAAAA					
Cryst #	200			210	220	230	240							

Align #	275	280	285	290	295	300	305	310	315	320	325	330	335	340
Seq	VGYSLLSDP	EEVL	DTPAD	GQFR	MYAGGT	QTEEM	KDAP	NALNT	VLLQ	PWHLE	KTKF	VEGT	WKHE	VPKL
Predict			CCCCCCCC	CCCC	AAAAAA	CC	BBBBB	AAAAAA						
Cryst	BBBBBBB	AAAA			AAAAAA	BBBBB	AAAAAA							
Cryst #	250	260	270	280	290	300	310							

Align #	345	350	355	360	365	370	375	380	385	390	395	400	405	410
Seq	NIPMGLD	WTDEF	LMKV	SEISG	QPI	ASLTK		ERGLV	DMMTD	SHTWL	HGKR	FALW	GDP	DFVM
Predict	CC	AAAAAAAA	CCCCC					C	AAAAAA	ACCB	BBBB	BBBB	CCC	
Cryst	B	AAAAAAAA		AAAAA				AAAAAA	AAAAA	BBBBBB	AAAAA			
Cryst #	320	330	340	350	360	370								

Align #	415	420	425	430	435	440	445	450	455	460	465	470	475	480
Seq	GLVKFL	LLEGC	EPVH	ILCH	NGN	KRWK	KAVDAI	LAASP		YGKN	ATVY	IGKDL	WHLR	SLVFTD
Predict	AAAAAA		BBBBB	CCCC	unassigned	due to gaps								
Cryst	AAAAAA	BBBBBB		AAAAAA	AAA			BBBBBB		AAAAAA				
Cryst #	380	390	400	410	420	430								

Align #	485	490	495	500	505	510	515	520	525	530	535	540	545
Seq	KPDFM	IGNSY	GKFIQ	RTLHK	GKEFE	VLIRIG	FPFID	RHHL	RSTTL	GYEG	AMQIL	TTLV	NSILE
Predict	CCC	BBBB	unass. gaps		BBBBBB	BBB	BBBB	AAAAA					
Cryst	BBBBBB	AAAAAA		BBBBBB		AAAA		AAAAAA					
Cryst #	440	450	460	470	480	490	500						

Fig. 2. The sequence of the MoFe nitrogenase protein from *Azotobacter vinelandii*, numbered according to the multiple alignment in Fig. 1, followed by the first stage, unrefined secondary structure prediction (Fig. 1) and the secondary structure assigned by crystallography [14]. A =  $\alpha$  helix, B =  $\beta$  strand, C = coil or turn. Beneath is the sequence numbering of the MoFe nitrogenase protein from *Azotobacter vinelandii*, the protein the crystal structure of which was solved (sequence *d* in the multiple alignment in Fig. 1). Positions not designated A, B, or C in the prediction are left blank; non-assignments are 'canonical' in a first stage prediction whenever the multiple alignment includes a gap and whenever the 'expert' assignments disagree. See references [1], [6] and [12] for further discussion of canonical assignments in a first stage prediction and procedures used for refining these predictions.

Table I

Secondary structure of the MoFe nitrogenase protein: comparison of the prediction and the crystal structure

	$\alpha$ helices	$\beta$ strands
Correct	10	7
Possibly correct	0	2
Wrong	0	3
Missed significant	3	4
Missed insignificant	3	0
Gapped	2	1
Overpredicted	0	2

not identified because of the canonical treatment of gaps [6,12]), and 'overpredicted' (a helix or strand assigned to a region left unassigned by the experimentalists). These numbers for the MoFe nitrogenase protein are collected in Table I. Note that these are preliminary assignments; precise assignments can be made only in the context of an effort to assemble a tertiary structure model, which necessarily follows refinement.

Above all, this comparison illustrates the importance of early communication between crystallographer and predictor to ensure that adequate time is available for refinement. We are unable to say how much our prediction would have been improved by refinement. However, adjustments made to the multiple alignment, a standard part of a refinement procedure, should at least have allowed detection of some of the secondary structures in the regions left unassigned due to gaps (see Fig. 2). More challenging would have been improvement of

the secondary structure prediction in the region of the active site.

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