FOR THE RECORD A de novo designed protein–protein interface

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Abstract

As an approach to both explore the physical/chemical parameters that drive molecular self-assembly and to generate novel protein oligomers, we have developed a procedure to generate protein dimers from monomeric proteins using computational protein docking and amino acid sequence design. A fast Fourier transform-based docking algorithm was used to generate a model for a dimeric version of the 56-amino-acid β 1 domain of streptococcal protein G. Computational amino acid sequence design of 24 residues at the dimer interface resulted in a heterodimer comprised of 12-fold and eightfold variants of the wild-type protein. The designed proteins were expressed, purified, and characterized using analytical ultracentrifugation and heteronuclear NMR techniques. Although the measured dissociation constant was modest (~300 μ M), 2D-[¹H,¹⁵N]-HSQC NMR spectra of one of the designed proteins in the absence and presence of its binding partner showed clear evidence of specific dimer formation.

Keywords: de novo protein–protein interface; computational protein design; geometric recognition algorithm; protein G; heterodimer; NMR; docking

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Molecular self-assembly is the spontaneous association of molecules into stable, structurally well-defined complexes. All major cellular processes depend on the precise, highly specific self-assembly of proteins into functional arrays. Understanding and controlling the physical/chemical parameters that drive protein association is a major goal of protein biochemistry. To date, much progress has been made in this area by analyzing the large body of data collected on naturally occurring protein–protein interfaces (Clackson and Wells 1995; Jones and Thornton 1996; Janin and Seraphin 2003; Janin and Wodak 2003; Nooren and Thornton 2003a,b).

The field of protein design is uniquely positioned to complement these efforts with an inverse approach. That is, instead of analyzing and/or predicting the structures of native complexes, we can explore the physical chemistry of self-assembly through the de novo design of self-assembling protein complexes from previously monomeric proteins. Moreover, the ability to direct a designed protein to bind a target protein in a site-specific manner has potential therapeutic as well as other technological applications.

Computational protein design methods have recently made significant progress toward engineering novel protein-protein interfaces (Kortemme and Baker 2004). For example, Shifman and Mayo used computational methods to generate calmodulin variants with enhanced binding specificity (Shifman and Mayo 2002, 2003); Bolon et al. (2005) re-engineered a protein homodimer into a heterodimer; Havranek and Harbury (2003)

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generated GCN4-like coiled-coil variants that included the direct consideration of negative design; and Baker, Stoddard, and coworkers generated DNase-inhibitor protein pairs with altered specificity and an artificial endonuclease by fusing two domains from naturally occurring, multidomain endocucleases followed by re-engineering of the newly formed interface (Chevalier et al. 2002; Kortemme et al. 2004).

Here we report the de novo design of a protein–protein heterodimer that was generated by first computationally docking the β 1 domain of the streptococcal protein G (GB1) to itself in a structurally specific fashion followed by computational design of the interfacial amino acids so as to drive complex formation (Fig. 1). Wild-type GB1 is a monomeric, 56 amino acid protein domain that has been extensively characterized and used in previous computational protein design studies (Gronenborn et al. 1991; Malakauskas and Mayo 1998).

Results and Discussion

For this study, GB1 dimer orientations were generally restricted to helix-to-helix arrangements. The orientation used for the sequence design calculation (Fig. 1B) corresponds to the docked complex of highest surface complementarity as determined from a rotation-translation search using a surface recognition algorithm and Fourier correlation techniques for evaluating the translational degrees of freedom (Katchalski-Katzir et al. 1992; Gabb et al. 1997). Since the amino acid sequence at the protein–protein interface is determined subsequent to



Figure 1. (*A*) Ribbon representation of the GB1 monomer structure. (*B*) Tube representation of the docked GB1 dimer model; (*left*) GB1^A; (*right*) GB1^B. (*C*) Surface representation of the docked GB1 dimer model showing surface complementarity of the C β -truncated monomers used in the docking calculation; (*left*) GB1^A; (*right*) GB1^B.

generating the docked orientation, a reduced amino acid side-chain representation was developed by analyzing a series of naturally occurring protein dimers that had their side chains artificially restricted to the C_{β} atom. The primary outcome of this analysis was that the effective atomic radii used in the docking procedure were increased from 1.8 Å to 2.15 Å in order to account for the absence of side-chain atoms (Huang et al. 2005).

Docking was carried out first by positioning monomer A, called GB1^A, such that its helix axis was along the *Y*-axis and its β -sheet plane was parallel to the *X*–*Y* plane. Monomer B, called GB1^B, was then created from monomer A by 180° rotations about the *Y*- and *Z*-axes resulting in a head-to-tail, helix-to-helix orientation. This orientation was chosen to direct contacts on mainly helices, as computational designs are more reliable on helices than sheets. The docking search was performed in a 3D grid that was 64 Å on a side using a 0.5 Å step size for the translation search and a 5° increment for the rotation search.

In the second step of the design process, a total of 24 residue positions (13 on GB1^A and 11 on GB1^B) were considered for sequence optimization using the ORBIT (optimization of rotomers by iterative techniques) suite of protein design programs (Dahiyat and Mayo 1997a). Following the same design principle for designing thermally stable protein variants, residues that are buried in the complex were restricted as hydrophobic residues. This implicitly captures negative design since the created hydrophobic patches destabilize the monomers, coupling dimerization with stability. Of these 24 positions, the 15 "core" positions were restricted to a set of seven hydrophobic amino acids (A, V, L, I, F, Y, and W), and the nine surface positions were restricted to a set of 10 polar amino acids (A, S, T, D, N, H, E, Q, K, and R) resulting in a combinatorial complexity of $\sim 10^{21}$ amino acid sequence combinations. The amino acids at the 88 remaining unoptimized positions were retained as in the wild-type sequence. Since symmetry restraints were not imposed during the docking or sequence design phases, the sequence design step resulted in a pair of protein monomers that had different sets of mutations corresponding to the formation of a heterodimer complex. GB1^A is a 12-fold mutant: T16F, T18A, V21E, T25L, K28Y, V29I, K31R, Q32A, Y33L, N35K, D36A, and N37Q. GB1^B is an eightfold mutant: A23I, E27A, K28D, K31A, N35A, D40K, Y45A, and D47E. In addition to the largely hydrophobic interface, there are six cross-dimer polar interactions in the structural model. Three of them are sidechain/side-chain interactions: E21^A to K40^B, D22^A to K40^B, and Q37^A to E47^B. The other three are side-chain/backbone interactions: $K35^{A}$ to $A45^{B}$ carbonyl oxygen, $D28^{B}$ to $E19^{A}$ amide hydrogen, and $E47^{B}$ to $A36^{A}$ carbonyl oxygen.

Genes for GB1^A and GB1^B were constructed by inverse-PCR mutagenesis and separately expressed in *Escherichia coli* and purified using standard procedures. The expression

level for GB1^A was similar to that for GB1 (~40 mg/L), but the yield of $GB1^B$ was ~10-fold lower (~4 mg/L), consistent with thermal melting temperatures of >100°C and $\sim 37^{\circ}$ C for GB1^A and GB1^B, respectively (data published previously as part of a stability study) (Barakat et al. 2007). The thermal stability for GB1 is ~83°C. Our computed energies for GB1^A and GB1^B in isolation cannot account for the divergent stability observed experimentally. It is unclear as to why GB1^A with an exposed hydrophobic patch, which is scored unfavorably in our design algorithm, is hyperthermophilic. GB1^B, on the other hand, is likely to be destabilized by the Y45A mutation, as it is known to affect the folding kinetics of the hairpin in protein G (Honda et al. 2000; Kobayashi et al. 2000). In solution at high concentrations ($\sim 1.3 \text{ mM}$), GB1^B forms macroscopic fibrils; however, fibril formation does not occur in equimolar solutions of GB1^A and GB1^B (Shukla et al. 2004).

Sedimentation equilibrium ultracentrifugation suggested a modest dissociation constant of $\sim 300 \ \mu\text{M}$, but a detailed global analysis was confounded by the non-ideal behavior of GB1^B.

NMR chemical shift perturbation analysis supports complex formation at the designed interface (Fig. 2). Backbone [¹H,¹⁵N] resonance assignments of free ¹⁵N-labeled GB1^A were determined using 3D-[¹H,¹⁵N]-NOESY-HSQC and 3D-[¹H,¹⁵N]-TOCSY-HSQC. 2D-[¹H,¹⁵N]-HSQC spectra of ¹⁵N-labeled GB1^A in the absence and presence of equimolar amounts of unlabeled GB1^B show clear signs of specific complex formation with 20 resonances displaying significant perturbation in chemical shift and/or peak intensity (peaks no longer observable: Y3, K13, E19, I29, and R31; peaks with significantly diminished intensity and/or



Figure 2. $[^{15}N, ^{1}H]$ HSQC spectra of uniformly enriched ^{15}N -GB1^A alone (in red) and in the presence of equimolar quantities of unlabeled GB1^B (in black). Example ^{15}N -monomer-A peaks that are nonobservable or exhibit chemical shift perturbations upon complex formation are labeled blue.

chemical shift perturbation: A20, D22, A23, A24, L25, E27, A32, and A48; peaks with small changes in intensity and/or chemical shift: G14, F16, A26, F30, L33, K35, and A36). With few exceptions (Y3, K13, and A48) the residues corresponding to the perturbed resonances map to the designed dimer interface (Fig. 3). The peaks rendered nonobservable are probably the result of exchange broadening due to fluctuations between two or more states on a microsecond-to-millisecond timescale and imply that the complex may experience a relatively rapid exchange between free and bound states. This explanation appears likely especially in light of the relatively modest binding affinity measured by analytical ultracentrifugation.

Materials and Methods

Assessment of de novo docking parameters

To not bias the docking results with wild-type amino acids, it was necessary to prune all side chains to the C_{β} atoms (excluding glycines), and therefore it was not possible to use the geometric recognition algorithm in its original form (Huang et al. 2005). To ascertain optimal discretization values for the proper spacing between the docked models, an extensive analysis was performed on the crystal structures of several natural complexes, the goal of which was to extract from the natural complexes optimized parameters that would provide proper interfacial volume for successful side-chain selection. The accession codes of the 18 PDB files used to extract de novo docking parameters are 1ATN, 1BRS, 1DQJ, 1DZB, 1FCC, 1FDL, 1HRP, 1IGC, 1JHL, 1JTO, 1LPA, 1MLC, 1NCD, 1VFB, 2BTF, 2JEL, 3HFL, and 3HFM.

The distances for each complex that corresponded to the largest correlation were statistically analyzed and resulted in an average value of 2.05 Å \pm 0.48 Å. Owing to the relatively large variance in the values for the different complexes, a series of GB1 to GB1 docking calculations were separately conducted with radial distances of 2.00, 2.05, 2.10, 2.15, and 2.20 Å. The resulting docked complexes were analyzed with 3D molecular visualization tools (e.g., GRASP, MOLMOL), and it was concluded that the complex that corresponded to the 2.15 Å radial distance had the best interfacial volume in the set before proceeding with design. The decision was made by visually inspecting the interface for close contacts that often resulted from small radial distances, and by comparing the top ranking dimers on surface complementarity whereby unreasonably large gaps can usually be identified in calculations that do not converge to a specific orientation. The radial distance of 2.15 Å gave a very specific docking orientation with appropriate interface volume and was therefore used to produce the orientation used for design.

Computational protein design

Details of the side-chain selection process performed on interfacial positions including the potential energy function and parameters for solvation, hydrogen bonding, and van der Waals interactions are essentially the same as described previously (Dahiyat and Mayo 1996, 1997a,b; Dahiyat et al. 1997; Gordon et al. 1999). Reclassification of interfacial residues was accomplished with the RESCLASS algorithm (Dahiyat and



Figure 3. (*A*) Chemical shift perturbations mapped to the surface of GB1^A in the docked model orientation together with GB1^B shown as a gray backbone worm on which the interfacial side chains are colored red. (Dark blue) Residues with nonobservable [15 N, 1 H] HSQC peaks; (lighter blue) those that exhibit chemical shift changes. (*B*) 180° rotation of *A*.

Mayo 1997a). By comparing monomers in isolation and in the docked orientation, residues reclassified from "surface" to "core" and from "surface" to "boundary" by RESCLASS were considered in the design. Rotamer libraries used during the side-chain selection process were based on the backbonedependent library of Dunbrack Jr. and Karplus (1993). The Dead-End Elimination theorem (Desmet et al. 1992; Gordon et al. 2003) was used to select for the specific side-chain rotamers that exist in the lowest possible calculated structure (i.e., the global minimum energy conformation).

Protein expression and purification

Synthetic DNA oligonucleotides were used for recursive PCR synthesis of the genes for GB1^A and GB1^B. One modification to the ORBIT selected sequence was made: Position 28 of GB1^A was changed from tryptophan to tyrosine so as to reduce the hydrophobicity of regions that were not fully buried at the interface. The genes were cloned into pET-11a (Novagen), and recombinant protein was expressed by IPTG induction in BL21(DE3) hosts (Invitrogen). The proteins were isolated using a freeze/thaw method (Johnson and Hecht 1994), and purification was accomplished with reverse-phase HPLC using a linear 1% min⁻¹ acetonitrile/water gradient containing 0.1% TFA. The yield of purified protein from expression in rich media was ~4 mg/L of bacterial growth for $GB1^B$ and ~40 mg/L for $GB1^A$. Labeled GB1^A protein, for NMR studies, was prepared with standard M9 minimal media using ¹⁵N-ammonium sulfate (2 g/L). Protein purity was verified with standard SDS-PAGE and reversephase HPLC, and the correct molecular weight was confirmed by mass spectrometry.

Analytical ultracentrifugation

Sedimentation equilibrium experiments were conducted in a Beckman XL-I Ultima analytical ultracentrifuge equipped with absorbance optics. Runs were carried out at 28,000, 40,000, and 48,000 rpm, at 20°C. Three separate solutions consisting of different concentrations for both free proteins plus the complex were prepared to achieve OD_{280} readings of ~0.15, 0.25, and 0.4. The protein concentrations were ~36 μ M, ~60 μ M, and ~96 μ M in a total volume of 110 μ L containing 50 mM NaCl and 50 mM NaPi (pH ~ 6.5). Data were processed using the WinNONLIN software from the National Analytical Ultracen-

trifuge Facility following standard global nonlinear fitting methods (Lebowitz et al. 2002). The sedimentation equilibrium data were best described by a monomer–dimer self-association model with an estimated K_d of 331 μ M.

NMR spectroscopy

NMR spectra were collected at 293 K on a Varian UnityPlus 600 MHz spectrometer equipped with an HCN-triple-resonance probe with triple-axis pulse field gradients. Protein concentrations were ~1.25 mM in 50 mM sodium phosphate (pH ~ 6.5). Standard 2D-[¹H, ¹⁵N] HSQC spectra were collected on free ¹⁵N-GB1^A and ¹⁵N-GB1^A in a 1:1 stoichiometric complex with unlabeled GB1^B and standard 3D-[¹H, ¹⁵N]-NOESY-HSQC and 3D-[¹H, ¹⁵N]-TOCSY-HSQC were collected on free ¹⁵N-GB1^A. Varian data processing software and the program NMRPipe (Delaglio et al. 1995) were used to process the NMR data, and the program NMRView (One Moon Scientific, Inc.) was used to analyze and assign the various spectra.

Electronic supplemental material

The sedimentation equilibrium data and their fits were included in the Supplemental material.

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