

Computational design of ligand binding is not a solved problem

Bettina Schreier, Christian Stumpp, Silke Wiesner, and Birte Höcker¹

The Max Planck Institute for Developmental Biology, Spemannstrasse 35, 72076 Tübingen, Germany

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Computational design has been very successful in recent years: multiple novel ligand binding proteins as well as enzymes have been reported. We wanted to know in molecular detail how precise the predictions of the interactions of protein and ligands are. Therefore, we performed a structural analysis of a number of published receptors designed onto the periplasmic binding protein scaffold that were reported to bind to the new ligands with nano- to micromolar affinities. It turned out that most of these designed proteins are not suitable for structural studies due to instability and aggregation. However, we were able to solve the crystal structure of an arabinose binding protein designed to bind serotonin to 2.2 Å resolution. While crystallized in the presence of an excess of serotonin, the protein is in an open conformation with no serotonin bound, although the side-chain conformations in the empty binding pocket are very similar to the conformations predicted. During subsequent characterization using isothermal titration calorimetry, CD, and NMR spectroscopy, no indication of binding could be detected for any of the tested designed receptors, whereas wild-type proteins bound their ligands as expected. We conclude that although the computational prediction of side-chain conformations appears to be working, it does not necessarily confer binding as expected. Hence, the computational design of ligand binding is not a solved problem and needs to be revisited.

arabinose binding protein | biosensor | serotonin receptor |
glucose binding protein | ribose binding protein

Computational protein design has come a long way in recent years. It has been used to design new folds (1), binding interactions (2), and catalysts (3, 4) onto existing scaffolds. Recently, even the successful design of two nonnatural reactions have been described (5, 6). While these are great steps forward, many aspects of design leave room for improvement. For example, the substrate affinities of the new catalysts are generally only modest. This is surprising, as high affinity receptors for a number of small-molecule ligands, such as trinitrotoluene (TNT), L-lactate, serotonin (2), and the nerve agent surrogate pinacolyl methyl phosphonic acid (PMPA) (7) have been reported. These computationally designed receptors were built in the periplasmic binding protein (PBP) fold. Members of the PBP superfamily are single-chain polypeptides folding into two distinct, globular N- and C-terminal domains connected by a flexible hinge region. The ligand binding site is situated in the cleft between the two domains. Binding of the cognate ligand induces large conformational changes from an open apo state to a completely closed, ligand-bound state. Binding affinities of the designed receptors were determined indirectly by monitoring the changes in fluorescence emission intensity of a covalently attached, environmentally sensitive fluorescent probe (2, 7). We decided to structurally characterize these receptors further and thus learn about the strength and shortcomings of current computational design methods. Of the variety of published receptors, we tested five high-affinity designs: arabinose-binding protein (ABP) variants reported to bind to serotonin and L-lactate, a ribose-binding protein (RBP) variant reported to bind to TNT, and galactose/glucose-binding protein (GBP) variants reported to bind L-lactate and PMPA. No binding of the ligands to any of the

designed receptors could be detected using methods that directly probe ligand binding, such as isothermal titration calorimetry (ITC) and nuclear magnetic resonance (NMR), while we were readily able to detect ligand binding and determine binding affinities of wild-type PBPs. Taken together, our findings indicate that the investigated protein designs do not bind their new ligands in the expected way. Thus, the computational design of ligand binding is not a solved problem and needs to be revisited.

Results and Discussion

Structural Analysis of Designed Receptor Proteins. To characterize a number of PBP designs on a structural level, we expressed ABPs designed to bind L-lactate (Lac.A1) and serotonin (Stn.A2), GBPs designed to bind L-lactate (Lac.G1) and pinacolyl methyl phosphonic acid (PMPA.G12), and a RBP designed to bind trinitrotoluene (TNT.R1), as described (2, 7). For a comparative analysis, wild-type ABP, GBP, and RBP were also expressed. The His-tagged proteins were purified via affinity chromatography and subsequently subjected to analytical gel filtration. The wild-type proteins, as well as Stn.A2, eluted with a volume corresponding to the size of the monomer. In contrast, the other four designed proteins showed a mixture of oligomerization states indicating a high tendency to aggregate. Thus, these proteins were purified further via preparative gel filtration. We were able to separate monomeric Lac.A1, PMPA.G12, and TNT.R1 (Fig. 1 *A*, *D*, and *G*). However, isolated Lac.A1 and TNT.R1 started to form dimers again overnight or at higher concentrations. In the case of Lac.G1, only higher oligomeric states could be observed (Fig. 1*D*).

We then analyzed the secondary structure content of the designs by far-UV circular dichroism. While the CD spectra of most designs were comparable to the ones of the parent proteins, the spectrum of Lac.G1 indicates a considerable loss of secondary structure (Fig. 1 *B*, *E*, and *H*). Therefore, only Lac.A1, Stn.A2, PMPA.G12, and TNT.R1 were subjected to crystallization trials.

In the case of Stn.A2, we were able to grow crystals that diffracted to 2.2 Å resolution and to solve its structure by molecular replacement using the separated domains of wild-type ABP (PDB ID 5abp) (8) as search models. Two molecules (A and B) were found in the asymmetric unit, which are both in different open conformations (Fig. 2). This was surprising because the crystals were grown in the presence of 2 mM serotonin. If binding occurred in the micromolar range as reported (2), the ligand binding sites should be saturated. Furthermore, no structure of ABP in the open conformation has

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Data deposition: The atomic coordinates of have been deposited in the Protein Data Bank, www.pdb.org (PDB ID 2wrz).

¹To whom correspondence should be addressed. E-mail: birte.hoecker@tuebingen.mpg.de.

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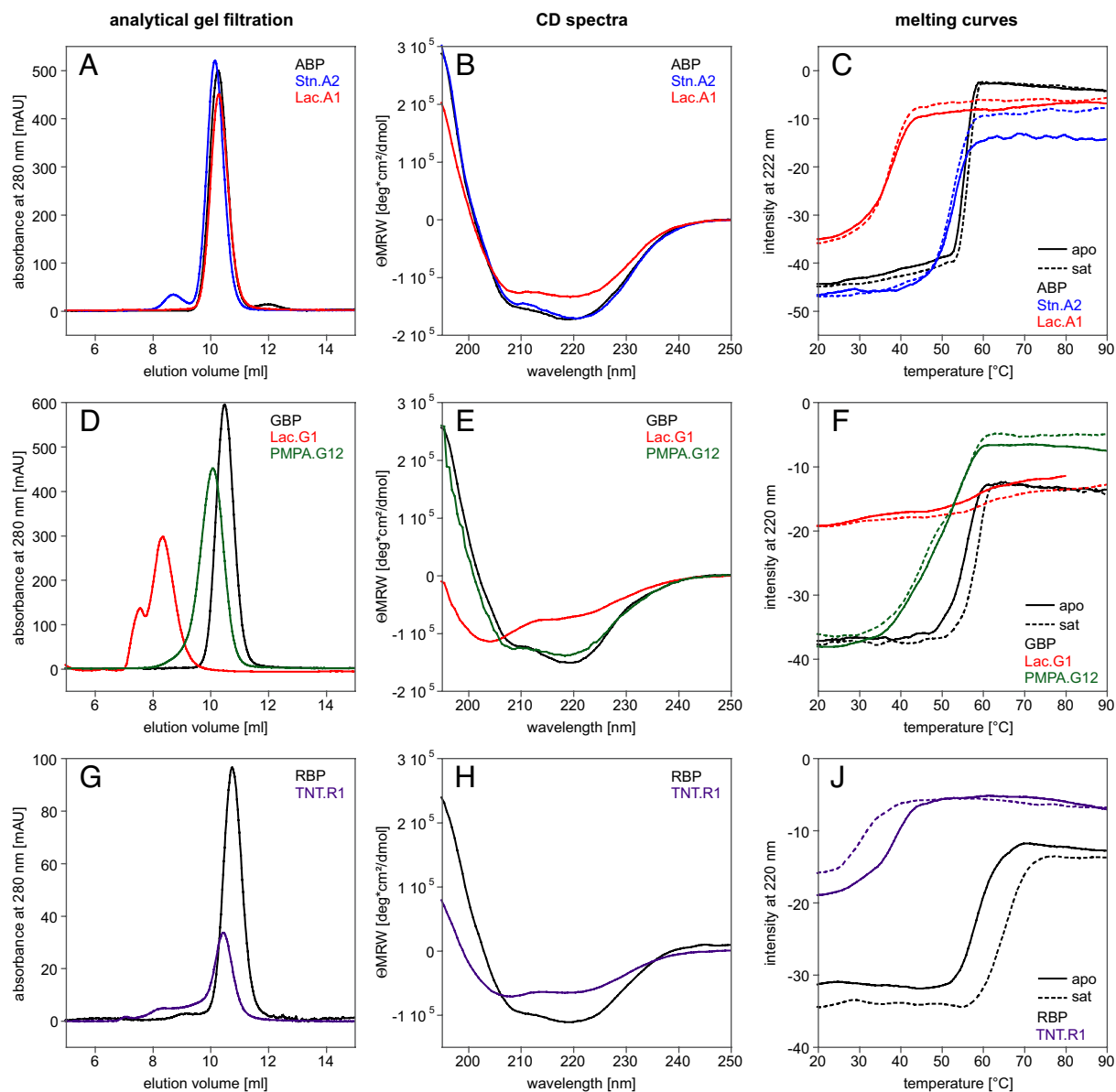


Fig. 1. Biophysical characteristics of designed receptor proteins: (A–C) ABP, Lac.A1, and Stn.A2, (D–F) GBP, Lac.G1, and PMPA.G12, (G–J) RBP and TNT.R1. (A) Association states measured by analytical gel filtration (0.5 mg loaded each). All three variants elute at the same volume, which corresponds to the molecular mass of monomeric protein. (B) CD spectra: the intensity of the signal of Lac.A1 is slightly reduced compared to ABP and Stn.A2. (C) Melting curves: no clear increase in stability upon addition of the respective ligand was observed for all three proteins. Thermal stability of Lac.A1 is severely reduced compared to wild-type, whereas the stability of Stn.A2 is almost the same. However, visible aggregation of Stn.A2 occurred, leading to varying signal intensity after unfolding. (D) Analytical gel filtration (0.6 mg each). Lac.G1 exists in solution only in the form of higher order oligomers. PMPA.G12 elutes in a single defined peak but with a higher apparent molecular weight than wild-type GBP. (E) CD spectra: a loss of secondary structure is observed in Lac.G1 compared to GBP and PMPA.G12. (F) Melting curves: A stability increase upon addition of ligand was only observed for wild-type GBP. No cooperative unfolding could be observed for Lac.G1. (G) Analytical gel filtration: (0.9 mg each). Monomeric TNT.R1 can be purified but aggregation increases over time. (H) CD spectra: TNT.R1 has a lower secondary structure content compared to RBP. (J) Melting curves: The thermal stability of TNT.R1 is severely reduced compared to wild type. Addition of TNT further decreases thermal stability, because of the solvent acetonitrile.

been reported so far. The opening angle in molecule A is 37° and, as such, is in the normal range of opening angles adopted by various wild-type PBPs in open conformation (9). Molecule B adopts a much further opened conformation with a hinge bending motion of 96° , so far not observed in any of the 135 structures of wild-type or mutant PBPs published in the protein data bank. Multiple open conformations have been described for other members of the PBP superfamily as well (10, 11). Although it is possible that wild-type ABP adopts similar conformations, the unusually high rotation angle of molecule B might be an artifact of crystal packing or a result of mutations in or near the

hinge region that alter the conformational flexibility of the protein. Both the N- and C-terminal domains of molecule A superimpose with wild-type ABP (PDB ID 5abp) in closed conformation with a rmsd of 0.35 (over 116 C α -atoms) and 0.24 (122 C α), respectively, and of molecule B with 0.35 (111 C α) and 0.32 (133 C α), respectively. This clearly shows that the backbone movement is restricted to the hinge region of ABP (see Fig. 2).

Comparison of the binding pocket in the structure and the computational model (2) shows high similarity. The binding site residues of the two domains of molecule A and B superimpose with the coordinates of the model with a rmsd over all atoms of

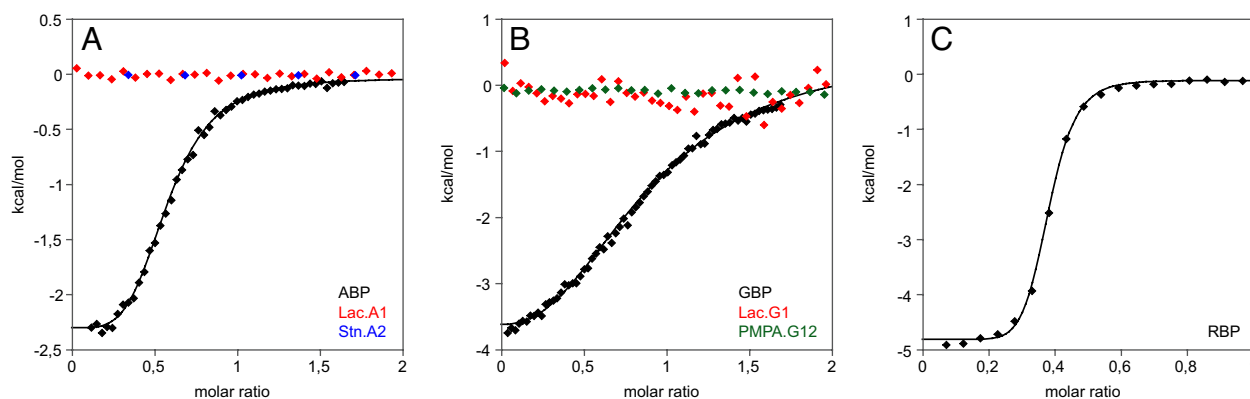


Fig. 4. Analysis of binding by ITC. Binding constants were determined from sigmoidal fits to two independent measurements. (A) Representative ITC measurements for ABP, Lac.A1, and Stn.A2. No significant change in heat upon addition of the respective ligand could be detected in the case of the designs. (B) Representative ITC measurements for GBP, Lac.G1, and PMPA.G12. No change in heat upon addition of the respective ligand could be detected in the case of the designs. (C) Representative ITC measurement for wild-type RBP. Saturation is reached for wild-type RBP already at a molar ratio of 0.5, which indicates that residual ribose remains in the purified protein sample. No ITC measurement could be performed with TNT.R1 because the ligand TNT is insoluble in aqueous buffer.

smaller temperature shift. In contrast to the wild-type proteins, none of the designs showed an increase in stability upon ligand binding at the same conditions. The addition of TNT to TNT.R1 rather led to a loss in stability (see Fig. 1J), which is due to the destabilizing effect of the solvent acetonitrile. These experiments show that in general, the thermal stability of the designed receptors is strongly reduced compared to the wild-type proteins because of the numerous introduced mutations. We then tested binding by ITC. The binding constants of arabinose, glucose, and ribose to the respective wild-type proteins were determined to $3.7 \pm 1.2 \mu\text{M}$ for ABP, $9.4 \pm 1.1 \mu\text{M}$ for GBP, and $0.5 \pm 0.1 \mu\text{M}$ for RBP (Fig. 4). The values for ABP and RBP are in accordance with previously published binding constants: $2 \mu\text{M}$ for ABP (16) and $0.13 \mu\text{M}$ for RBP (17). For GBP a binding constant of $0.2 \mu\text{M}$ has been reported (18). The difference in measurement, which is also observed in the temperature melts, might be caused by residual glucose in our preparations or the use of different solution conditions. In contrast to the wild-type proteins, the designed proteins Lac.A1, Stn.A2, Lac.G1, and PMPA.G12 did not show any change in heat above the heat of mixing upon addition of ligand (see Fig. 4). To employ a third independent technique to detect ligand binding, we performed NMR experiments in which we recorded two-dimensional ^1H , ^{15}N -correlation spectra of ^{15}N -labeled wild-type, and designed proteins in the absence and presence of saturating ligand concentrations. Because the chemical shift of a nucleus strongly depends on its local environment, solution NMR spectroscopy is a powerful monitor of conformational changes and ligand binding, even if interactions are as weak as in the millimolar range. As expected, in the wild-type proteins we observed numerous large chemical shift changes that are caused by the protein-ligand interaction, as well as the conformational change induced by ligand binding (Fig. 5 and Fig. S2). In RBP we observed two sets of peaks in the NMR spectrum of the apo form that correspond to a mixture of open and closed conformations (see Fig. S2C). This could be because of either residual ribose in the purified protein, although it was dialyzed extensively, or an equilibrium between open and closed conformations even in the absence of ribose. However, upon addition of ribose the spectrum shifts toward a single set of peaks corresponding to the bound and closed state (see Fig. S2C). We then recorded 2D NMR spectra of the ABP-based designs Lac.A1 and Stn.A2, the RBP-based design TNT.R1, and the GBP-based design PMPA.G12. The spectra confirm that Stn.A2 is well folded. The spectral overlap observed for Lac.A1, TNT.R1, and PMPA.G12

might reflect their tendency to form higher order oligomers as observed in analytical gel filtration experiments or result from only partially folded protein (compare CD measurements). However, upon addition of a large excess of the respective ligands, we did not observe any significant chemical shift changes in the NMR spectra of the designed receptors that would indicate the expected large conformational changes upon ligand binding as observed in wild-type PBPs (see Fig. 5 and Fig. S2). The observed minor changes might be a result of unspecific binding to the open conformation or small pH effects.

Altogether, our combined analysis of the binding properties of the designs indicates that no specific binding of the target ligands to the respective designs occurs. In contrast to our measurements, the reported binding affinities for these receptors were based on an indirect measure via an environment-sensitive fluorophore attached to the proteins in their hinge regions. These fluorophores attached to wild-type proteins are able to sense the conformational change induced through the binding of a sugar (19). The same concept is expected to work in the designed receptors. However, this type of analysis might be susceptible to false-positive results if the ligand or its solvent directly interacts with the fluorophore or changes its environment significantly without specific ligand binding to the protein. Direct measurements, such as presented here, appear to be a better means to evaluate whether the original design strategy was successful.

Implications for the Field of Computational Biology. Although the overall conformation of the designed binding-site residues in Stn.A2 indeed resembles the model, binding to the new ligand, serotonin, is not conferred. This should be kept in mind when judging model quality based on structures without a bound ligand. Our analysis shows the importance of experimental and structural validation to improve computational design methodologies.

We conclude that computational ligand-binding design remains an unsolved problem that needs reconsideration in its details. Do the algorithms capture all aspects important for the prediction of small molecule binding? Could the energetic cost associated with domain reorientation in PBPs (20) pose additional difficulties for the design in this particular scaffold? Boas and Harbury (21) successfully used the molecular-mechanics potential energy function to recapitulate and improve upon wild-type RBP, which points toward the fact that the general principles in receptor design hold true. Nevertheless, predicted

data of single crystals was collected with a MarCCD 225-mm detector at the synchrotron beamline PXII (Swiss Light Source, Villigen PSI). Data were indexed and processed with XDS and converted with XDSCONV (25). Molecular replacement searches were performed with Phaser (26) using the coordinates of wild-type ABP N-terminal (residues 2–109 + 254–285 of PDB-entry 5abp) and C-terminal domains (residues 110–253 + 286–306 of PDB-entry 5abp) as search models. Model building was performed in alternating rounds of computational refinement with REFMAC 5.4.0066 (27) and manual adjustments with the program Coot (28). The quality of the final structure was judged by Molprobity (29) and WhatCheck (30). No density corresponding to the ligand

serotonin was present in the refined electron density maps. Data and refinement statistics for the Stn.A2 dataset are summarized in Table S2.

Structure Analysis. The degrees of opening of molecules A and B were determined using DynDom (31). Structural superpositions were calculated with the Pymol (32) align function.

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