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Folding and association of a homotetrameric protein complex in an all-atom Go model

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The 84-residue homotetrameric BBAT1 is one of the smallest stable protein complexes and therefore a good test system to study the self-assembly of multimeric proteins. We have researched for this protein the interplay between folding of monomers and their assembly into tetramers. Replica exchange molecular dynamics simulations relying on a Go-model are compared with earlier simulations that use the physics-based coarse-grained UNRES model.



FIG. 1. The crystal structure of BBAT1 (PDB id 1SN9). The figure was prepared using VMD. [6]

I. INTRODUCTION

Experimental and computational studies have led to considerable insights into the principles of folding of small monomeric proteins [1]. However, the majority of proteins are built out of multiple subunits [2]. Despite their significance in controlling many biological processes [3, 4], the folding/unfolding and association pathways for oligomeric proteins are much less understood than that of monomeric proteins. In this brief report we investigate the folding and association of the homotetrameric BBAT1 (Protein Data Base identifier 1SN9) [5], and how the observed mechanism depends on the energy functions.

BBAT1, shown in Figure 1, is one of the simplest models of multi-subunit proteins. The protein is built from a four identical chains of 21 amino acids, each folding into a $\beta\beta\alpha$ motif. Even for such small protein complexes are all-atom molecular dynamics simulations of folding and association a challenge. This is because it requires long time scales (milliseconds to microseconds) to observe folding events, and the utilized force field must correctly describe the relative energies of a wide range of conformations during the folding process [7, 8].

Enhanced sampling and coarse-graining are two approaches to access the time scale of folding events [8, 9]. Another possibility is the use of Go models [10], which introduce structural data in the energy functions by fa-

voring contacts that appear in the native configuration [10]. This bias reduces the complexity of the resulting energy landscape to a perfect funnel with only residual energetic frustration caused by nonnative interactions[11, 12]. While such structure-based models have helped to understand the folding mechanisms of many proteins [13, 14], there are cases when they are known to fail [15–17]. This is because in Go-models intermediate states involving non-native contacts may be suppressed.

The question then arises whether Go-models can describe the folding and association of the more complex oligomeric proteins. In order to study this question we investigate in this brief report the folding and association pathway of BBAT1 using the all-atom Go-model proposed by Whitford et al.[18], and compare our results with that of simulations [19] relying on the physics-based UNRES force-field [20].

II. METHODS AND SIMULATION SETUP

Our simulations rely on the structure-based model SMOG (Structure-based MOdels in Gromacs), developed by the Onuchic group [10]. Using the SMOG@ctbp Web tool located at http://smog.ucsd.edu, we prepared topology and coordinate files [18] of the BBAT1 tetramer that were then employed in molecular dynamics simulations with the GROMACS 4.5.5 software package [21]. Note that it is important to take into account the symmetry of the target structure by including all permutations of the native contacts. The simulation starts from a completely extended conformation to avoid bias toward the native state. The chains are placed at random and separated by at least the length of the extended chain in a cubic box with box-size 100Å and hard walls. Langevin dynamics with a time step of 0.5 fs is used, and configurations are saved every 0.5 ps. Note that the energy function is non-physical, and therefore temperatures are given in reduced units u. In order to increase sampling efficiency, we rely on replica exchange molecular dynamics. 32 Replicas are used, with the temperatures spaced in a geometrical distribution between 170 u and 200 u. Each replica is simulated for 160 ns, leading to a total simulation time of 5.1μ s. The simulation of the isolated BBAT monomer is done using the same protocol as in the tetramer above with 32 replicas and a temperature distribution between 90 u and 220 u. All simulations start from a completely





FIG. 2. Walk of a single replica through temperature space for BBAT1 tetramer.

extended conformation, and each replica is simulated to 160 ns with a total simulation time of 5.1μ s. We display in Figure 2 the random walk in the temperature space for one of the 32 replicas of the tetramer simulation. As the other 31 replicas, it explores the full spectrum of temperatures, moving in the course of the simulation from the lowest to highest temperature and back, leading in this way to increased sampling of low-energy structures at the lowest temperature. The constant volume heat capacity as a function of temperature plotted in Figure 3 was calculated for three different time intervals. As the three curves overlap within the errors (data not shown), we conclude that our simulation has converged.

III. RESULTS

The heat capacity as a function of temperature in Figure 3 has a pronounced peak at 210 *u*. This peak corresponds to the temperature where the average root-meansquare-deviation to the crystal structure and the radius of gyration, a measure for the compactness of configurations, steeply decrease, see Figure 4. Hence, this temperature marks the folding temperature of BBAT1. It also corresponds to the association temperature where the fraction of tetramers with rmsd to the crystal structure of less than 2Å is approximately 0.5 (Figure 5). The association of tetramers is accompanied by the steep decrease of monomers' population, whereas population of dimers and trimers are much lower (less than 0.1) indicating the strong cooperativity of the process.

FIG. 3. Heat capacity C_V as a function of temperature for BBAT1 tetramer. The error bars are from comparison between the averages taken over three time intervals (40-80, 80-120, and 120-160ns)

Note that the heat capacity curve of Figure 3 has a second, broader and shallower peak in the temperature range 170 u -195 u. This peak is related to the folding of the monomers. Within that temperature range intrachain native contacts grow from below 0.4 to 1, but only a small part of this increase (from 0.16 to 0.35 for helical contacts) is associated with the formation of tetramers (Figure 6). In contrast, inter-chain native contacts grow by 0.5 within a small temperature change around 210 u, but only increase slowly afterwards. Therefore, the peak



FIG. 4. (A) Average Root Mean Square Deviation (RMSD) with respect to the native structure of BBAT1 tetramer and (B) Radius of gyration (RGY) as a function of temperature for BBAT1 tetramer.



FIG. 5. Fraction of monomers, dimers, trimers, and tetramers as a function of temperature for BBAT1 (all four chains).



FIG. 6. Fractional native contacts and number of all and non-native contacts as function of temperature for BBAT1 tetramer. (A) Fraction of helical (medium grey, online color red), non-helical (light gray, online color gray) and interchain contacts (dark grey, online color blue) versus temperature; and (B) number of total contacts (upper line, online color green) and only non-native contacts (lower line, online color magenta) versus temperature.

around 170 u to 195 u marks the secondary structure formation in the monomers, including their N-terminal hairpin and C-terminal helix.

Figure 6 and 7 reveal that the thermodynamics of monomer folding is a multiple step process. Upon association of the monomers to tetramers (around 220 u),



FIG. 7. Temperature dependence of the average end-to-end distance of BBTA chains for BBAT1 tetramer (in Å).

the number of non-native contacts decreases and the endto-end distance increases strongly with decreasing temperature. This indicates that association to a tetramer leads to a straightening of the monomer chains (resulting in larger end-to-end distance and fewer non-native intra-chain contacts). Only when lowering further the temperature, at around 170 *u*-195 *u*, do the monomers fold and assume their secondary structure (Figure 6), which in turn leads to a shorter end-to-end distance (Figure 7). This is in agreement with concentration and temperature-dependent CD spectroscopy data [22] which show a significant negative ellipticity around 222 nm at low temperature due to folding of the peptide chain into α -helical rich structure, and a loss of α -helical content with increasing temperature [22].

The above folding and association process differs from what is observed in simulations [19] that rely on the physics-based coarse-grained UNRES force field [20]. In UNRES simulations [19], folding of the monomers is also preceded and aided by association to a tetramer, but the mechanism by which the individual chains fold differs. Upon association, the monomers do not straighten out, but at a lower temperature form instead a compact intermediate state with little secondary structure and a small end-to-end distance. Transition toward this intermediate state is marked by a peak in specific heat. A second transition from the intermediate state toward the native state at even lower temperature leads also to a second peak in specific heat and is marked by an increase in end-to-end distance and secondary structure. Unlike in our Go-model simulations, one observes in UNRES simulations not two but three transitions: 1) association of the chains to a tetramer, 2) collapse of each chain into a compact intermediate, and 3) secondary structure formation and folding from this intermediate form into the native structure. Hence, a critical intermediate state is not sampled in Go-model simulations. One possible explanation for this difference is that the intermediate involves non-native contacts against which the Go-model energy function introduces a bias. This is a problem that has been observed earlier for monomeric proteins [15, 16, 23, 24]. On the other hand, we like to emphasize that the essential elements of the folding and association process observed in the UNRES simulations are also seen in Go-model simulations: association and folding of their individual chains are separated processes, with the tetramer seeming to provide an environment that aids folding of the monomers,

Interestingly, the folding of the isolated monomer in our Go-model simulations resembles the mechanism observed in the UNRES simulations of both isolated monomer and tetramer. This can be deduced from Figure 8 where we plot heat capacity, average RMSD and average end to end distance as obtained in all-atom Gomodel simulations of the isolated monomer. Note that in our Go-model temperatures depend on the system, and therefore absolute temperature values cannot be compared between the isolated monomer and the tetramer. Folding of the monomer as indicated by a pronounced drop in root-mean-square deviation is marked by a peak in specific heat. This peak is also related to a minimum in end-to-end distance. This suggests that the monomer collapses first into a bend-like structure with small endto end distance. Upon further lowering the temperature, the isolated BBAT1 monomer stretches out of this compact intermediate state (characterized by small secondary structure and short end-to-end distance), increasing its end-to-end distance due to formation of the helix and β -turn (Figure 8). The same process is observed in UNRES simulations of the isolated monomer, with the difference that the two steps lead there to two peaks in specific heat. This indicates that successful (all-atom) Go-model simulations of monomers do not necessarily guarantee that these models are also adequate for simulation of the oligometric system. Note that the monomer folding mechanism is consistent with experimental work and high-temperature unfolding molecular dynamics simulations in Refs. [25, 26]

IV. DISCUSSIONS AND CONCLUSIONS

Go models, which favor the pairwise contacts in the native conformation, offer a way to circumvent the problem of slow sampling in protein folding simulations. While work so far has focused mostly on monomeric proteins, we have tested In the present brief report these models for the purpose of investigating folding and association of multimeric proteins. Our test case is the homotetrameric 84-residue BBAT1, chosen because of its small size. Comparing our results with that relying on earlier simulations [19] using the physics-based coarse-grained force field UNRES, we find that all-atom Go-model simulations reproduce the most important features of the folding mechanism observed also in the UNRES simulations. Both kind of simulations predict



FIG. 8. End-to-end distance (squares), root-mean-square deviation (open circles) , and heat capacity (dark circles) as a function of temperature for an isolated BBAT monomer. A constant factor 18 Å is subtracted from the end-to-end distance (squares) in order to allow for a better comparison of all three curves.

that association of the four chains to a tetramer precedes and aides folding of the individual chains. The two models differ in the details. Both models lead for the isolated monomer to the same folding mechanism which is consistent with experimental data. However, the Go-model leads for the tetrameric system only to an abbreviated folding mechanism for the individual chains that omits an important intermediate state. Hence, the three-step process of folding and association observed in UNRES simulations is reduced to two steps. As a direct comparison with experimental results is lacking. it is not clear which of the two models describe correctly the folding and association process of BBAT1. However, the discrepancy between the two models shows, that even if a Go-model can reproduce the folding mechanism of a monomeric unit, it is not guaranteed that it also describes correctly the oligomer. In the present case, we conjecture that the differences in folding mechanism between the two models is due to non-native contacts appearing in the intermediate state that are suppressed in Go-model simulations. Similar differences in folding mechanism have been observed earlier for monomeric proteins, and can be explained with the same reasoning [15, 16, 23, 24]. Hence, as with monomeric proteins, Go-model simulations are valuable tools but have to be used with care when exploring folding and association mechanism of oligomeric proteins [27, 28]. Our results suggest that to catch the details of the folding and association process of multimeric proteins and protein complexes in Go-model simulations, one may need to include sequence dependent non-native interactions. A statistics-based inter-residue potentials [29, 30] may bridge the gap and help to sample such hydrophobicitydriven non-native contacts. Work is underway to study the usefulness of such an approach.

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- J. A. O. Rumfeldt, C. Galvagnion, K. A. Vassall, and E. M. Meiering, Prog. Biophys. Mol. Bio. 98, 61 (2008).
- [2] M. J. Bennett, M. P. Schlunegger, and D. Eisenberg, Protein Sci. 4, 2455 (1995).
- [3] A. F. Mehl, K. Okada, S. M. Dehn, and S. Kurian, Biochem. Bioph. Res. Co. 402, 618 (2012).
- [4] A. R. Mezo, R. P. Cheng, and B. Imperiali, J. Am. Chem. Soc. **123**, 3885 (2001).
- [5] M. H. Ali, E. Peisach, K. N. Allen, and B. Imperiali, Proc. Natl. Acad. Sci. USA **101**, 12183 (2004).
- [6] W. Humphery, A. Dalk, and K. Schulten, J. Mol. Graphics 114, 33 (1996).
- [7] R. O. Dror, R. M. Dirks, J. P. Grossman, H. Xu, and D. E. Shaw, Ann. Rev. Biophys. 41, 429 (2012).
- [8] P. L. Freddolino, C. B. Harrison, Y. X. Liu, and K. Schulten, Nat. Phys. 6, 751 (2010).
- [9] U. H. E. Hansmann, Chem. Phys. Lett. **281**, 140 (1997).
- [10] J. K. Noel, P. C. Whitford, K.Y. Sanbonmatsu, and J.N. Onuchic, Nucleic Acids Res. 38, W657 (2010).
- [11] P. C. Whitford, K. Y. Sanbonmatsu, and J.N. Onuchic, Rep. Prog. Phys. **75**, 076601 (2012).
- [12] J. D. Bryngelson, J. N. Onuchic, N. D. Socci, and P. G. Wolynes, Proteins 21, 167 (1995).
- [13] C. Clementi, H. Nymeyer, and J.N. Onuchic, J. Mol. Biol. 298, 937 (2000).
- [14] G. H. Zuo, J. Wang, and W. Wang, Proteins 63, 165 (2006).
- [15] Z. Zhang, and H.S. Chan, Proc. Natl. Acad. Sci. USA 107, 2920 (2010).
- [16] N. Koga, and S. Takada, J. Mol. Biol. **313**, 171(2001).
- [17] C. T. Friel, G. S. Beddard, and S. E. Radford, J. Mol.

Biol. 342, 261 (2004).

- [18] P. C. Whitford, J. K. Noel, S. Gosavi, A. Schug, K. Y. Sanbonmatsu, and J. N. Onuchic, Proteins 75, 430 (2009).
- [19] A. Sieradzan, A. Liwo, and U.H.E. Hansmann, J. Chem. Theory comput. DOI: 10.1021/ct300528r.
- [20] A. Liwo, M. Khalili, and H. A. Scheraga, Proc. Natl. Acad. Sci. U S A **102**, 2362 (2005).
- [21] D. Van Der Spoel, E. Lindahl, B. Hess, G. Groenhof, A.E. Mark, and H.J. Berendsen, J. Comput. Chem. 26, 1701 (2005).
- [22] K.A. McDonnell, B. and Imperiali, J. Am. Chem. Soc. 124, 428(2002).
- [23] S. S. Plotkin, Proteins 45, 337 (2001).
- [24] W. L. Treptow, M. A. Barbosa, L. G. Garcia, and A. F. Pereira de Araújo, Proteins 49, 167 (2002).
- [25] M. H.Ali, C. M. Taylor, G .Grigoryan, K. N. Allen, B.Imperiali, and A. E.Keating, Structure 13, 225(2005).
- [26] L. Wang, Y. Duan, R. Shortle, IB. Imperiali, and P. A. Kollman, Protein Sci. 8, 1292(1999).
- [27] Y. Levy, A. Caflisch, J. N. Onuchic , and P. G. Wolynes, J. Mol. Biol. **340**, 67 (2004).
- [28] S. Yang, S. S. Cho, Y. Levy, M. S. Cheung , H. Levine, P. G. Wolynes, and J. N. Onuchic, Proc. Natl. Acad. Sci. USA **101**, 13786 (2004).
- [29] S. Miyazawa, and L. J. Robert, Macromolecules 18, 534 (1985).
- [30] Y. C. Kim, and G. Hummer, J. Mol. Biol. 375, 1416 (2008).