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# Tuning the ATP–ATP and ATP–disordered protein interactions in high ATP concentration by altering water models

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## ABSTRACT

The adenosine triphosphate (ATP)–protein interactions have been of great interest since the recent experimental finding of ATP's role as a hydrotrope. The interaction between ATP and disordered proteins is fundamental to the dissolution of protein aggregates and the regulation of liquid–liquid phase separation by ATP. Molecular dynamics simulation is a powerful tool for analyzing these interactions in molecular detail but often suffers from inaccuracies in describing disordered proteins and ATPs in high concentrations. Recently, several water models have been proposed to improve the description of the protein-disordered states, yet how these models work with ATP has not been explored. To this end, here, we study how water models affect ATP and alter the ATP–ATP and ATP–protein interactions for the intrinsically disordered protein,  $\alpha$ -Synuclein. Three water models, TIP4P-D, OPC, and TIP3P, are compared, while the protein force field is fixed to ff99SBildn. The results show that ATP over-aggregates into a single cluster in TIP3P water, but monomers and smaller clusters are found in TIP4P-D and OPC waters. ATP–protein interaction is also over-stabilized in TIP3P, whereas repeated binding/unbinding of ATP to  $\alpha$ -Synuclein is observed in OPC and TIP4P-D waters, which is in line with the recent nuclear magnetic resonance experiment. The adenine ring-mediated interaction is found to play a major role in ATP–ATP and ATP–protein contacts. Interestingly, changing  $\text{Mg}^{2+}$  into  $\text{Na}^+$  strengthened the electrostatic interaction and promoted ATP oligomerization and ATP– $\alpha$ -Synuclein binding. Overall, this study shows that changing the water model can be an effective approach to improve the properties of ATP in high concentration.

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## I. INTRODUCTION

Adenosine triphosphate (ATP) serves as an energy currency in living cells. ATP consists of an adenine base, ribose sugar, and triphosphate groups and often exists as a complex with metal cations such as  $\text{Mg}^{2+}$ . While ATP at  $\sim 100 \mu\text{M}$  is sufficient for most ATP-utilizing enzymes, the physiological concentration of ATP (1–10 mM) is much higher by 10–100 fold,<sup>1–4</sup> implying that ATP may have other physiological functions as well. Recently, Patel *et al.* have shown that a high concentration of ATP ( $\sim 10 \text{ mM}$ ) can dissolve protein aggregates and inhibit protein aggregation.<sup>5</sup> Many experiments have further shown that ATP interacts with a variety of proteins in a nonspecific manner.<sup>6–12</sup> Thus, ATP can stabilize protein native state, improve protein solubility, and regulate

liquid–liquid phase separation (LLPS) by acting as an effective cosolvent, and act as a hydrotrope.<sup>13,14</sup> Interestingly, the proteins studied in these works are not ATP-utilizing proteins, i.e., do not have any ATP binding site. Nevertheless, both adenine base and triphosphate groups of ATP were indicated to contribute to the ATP–protein interactions but the molecular basis remains unclear. Furthermore, while  $\text{Mg}^{2+}$  ion is often accompanied with ATP to balance the negatively charged triphosphate moiety, it was found that ATP can bind to proteins even without  $\text{Mg}^{2+}$ .<sup>15,16</sup>

Molecular dynamics (MD) simulations have been performed to reveal the ATP–protein as well as ATP–ATP interactions in molecular detail.<sup>16–24</sup> For instance, the studies of ATP binding to proteins in the native state<sup>16,17</sup> have indicated that ATP molecules bind to the loop regions where the conformation is flexible. Arginine (Arg)

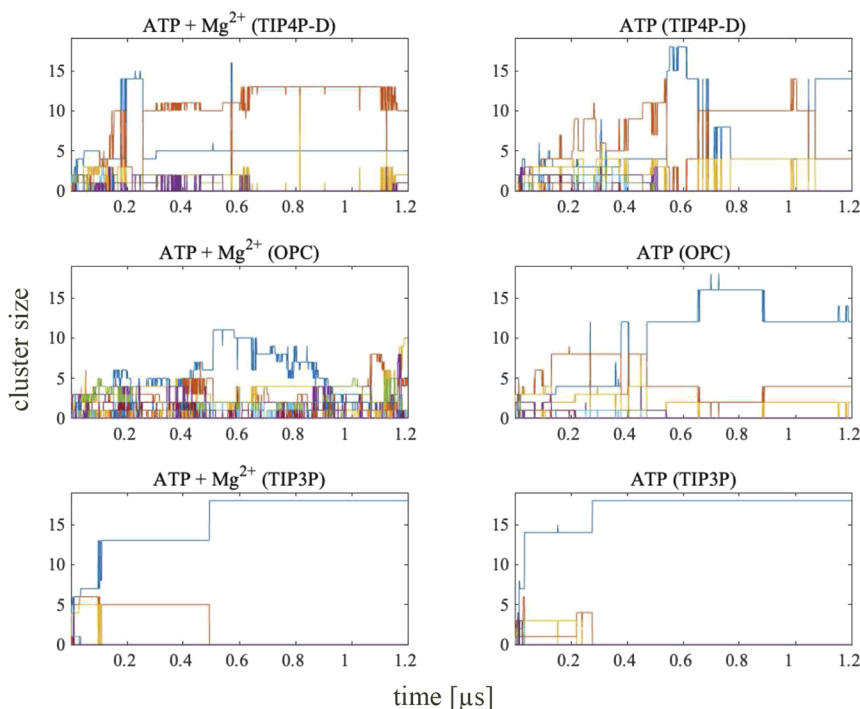
was indicated to bind ATP molecules most frequently,<sup>17</sup> possibly due to the positive charge of Arg that attracts ATP's strongly negative charge. Furthermore, ATP molecules themselves were found to aggregate strongly, form clusters around the protein, and thereby bind to proteins both directly and indirectly. MD simulations to understand the dissolution of protein aggregates have also been performed,<sup>23,24</sup> which indicated that the adenine moiety of ATP is important to interact with the disordered protein aggregates. The mechanism of ATP to inhibit the fibrillation of intrinsically disordered proteins has also been studied using short peptides and model molecules,<sup>19–22</sup> which also suggested that the adenine part of ATP is interacting with the proteins more frequently than the hydrophilic triphosphate moiety.

On the other hand, the studies of ATP–ATP interactions using MD simulations have indicated that ATP molecules tend to over-aggregate compared to the experimentally measured binding constant.<sup>18–20</sup> To circumvent this discrepancy, charge scaling of the atoms in ATP by a factor of 0.6–0.7 has been suggested.<sup>19,20</sup> While this scaling improves the ATP–ATP interaction and brings the binding constant similar to that in the experiment, this also deteriorates the ATP–protein potential and changes the molecular mechanism of ATP binding to proteins.

Understanding how ATP molecules interact with the proteins in the disordered state is essential to reveal the mechanism of aggregate dissolution and LLPS. Yet, it has been realized that conventional protein force fields are not sufficient in describing the

protein unfolded states.<sup>25–29</sup> In particular, the simulated radius of gyration of the unfolded protein is often too small compared to the experimentally measured value.<sup>25,26</sup> This issue has partially been attributed to the widely used water model, TIP3P, which is known to be inaccurate in describing the solubilized molecules as well as reproducing water properties. Recently, Piana *et al.*<sup>30</sup> and Shabane *et al.*<sup>31</sup> have developed the TIP4P-D and OPC water models, respectively, to improve the properties of the unfolded proteins. These results imply that the over-aggregation of ATP molecules may also be improved by altering the water model rather than modifying the ATP force field.

To this end, here, we study how water models affect the ATP aggregation propensity and ATP–protein interactions for the protein in the disordered state. We study  $\alpha$ -Synuclein ( $\alpha$ -Syn), which is a typical intrinsically disordered protein. The interaction between  $\alpha$ -Syn and ATP has been studied experimentally in molecular detail.<sup>15</sup> The effect of  $Mg^{2+}$  ion on ATP aggregation and ATP binding to protein has also been discussed. Here, we focus on revealing how the water model alters the properties of ATP, rather than performing a comprehensive study of different combinations of protein, water, and ATP force fields. Thus, we compare three water models, i.e., TIP4P-D, OPC, and TIP3P, while the protein and ATP force fields are fixed to keep the ATP–protein potential unchanged. By performing multiple  $\sim \mu s$  MD simulations for each system to account, we discuss how the ATP cluster sizes change dynamically over time, what contributes to stabilizing the ATP–ATP and



**FIG. 1.** Time evolution of the ATP cluster sizes in the presence (left) and absence (right) of  $Mg^{2+}$  ions in different water models from the representative trajectories. Top, center, and bottom rows denote the results for TIP4P-D, OPC, and TIP3P waters, respectively. The clusters are colored based on the smallest residue ID of the ATP in each cluster to follow the dynamic changes of the cluster component. The change in color indicates that the components of the cluster changed, i.e., either the ATP with the smallest residue ID left or another ATP with smaller residue ID entered the cluster.



ATP–protein interactions, and how these properties depend on the water models.

## II. COMPUTATIONAL DETAILS

To study the ATP–ATP interactions in different water models, 18 ATP molecules were randomly placed in a box of  $126 \times 126 \times 126 \text{ \AA}^3$  using PACKMOL.<sup>32</sup> This sets the concentration of ATP molecule to  $\sim 15 \text{ mM}$ . The box was subsequently filled with water molecules. 18  $\text{Mg}^{2+}$  were then added, and after neutralizing the system with  $\text{Na}^+$  ions, 180  $\text{Na}^+$  and  $\text{Cl}^-$  ions were added to set the ion concentration to 150 mM. To examine the effect of magnesium ions, the systems without  $\text{Mg}^{2+}$  ions were also prepared. A separate setup adding 36 additional  $\text{Na}^+$  ions instead of 18  $\text{Mg}^{2+}$  ions was also prepared.

Since sampling the structure of intrinsically disordered protein thoroughly requires extensive MD simulations on the order of  $>10 \text{ }\mu\text{s}$  even without ATP molecules,<sup>30</sup> here we rather focus our study on the ATP distribution about a few representative structures of  $\alpha$ -Syn. The structures of  $\alpha$ -Syn were extracted from the  $\sim 11 \text{ }\mu\text{s}$  trajectory by Piana *et al.*,<sup>30</sup> which used Anton. Since His50 was protonated in their simulations, we followed the same protonation state. We used the trajectory generated from Amber 12 and TIP4P-D force fields that showed a large radius of gyration. We extracted three representative unfolded structures from the trajectory (Fig. S1) and used them as the initial structures. Each  $\alpha$ -Syn structure, together with 18 ATP molecules, was randomly placed in a box of  $126 \times 126 \times 126 \text{ \AA}^3$  using PACKMOL,<sup>32</sup> and either 18  $\text{Mg}^{2+}$  or 36  $\text{Na}^+$  ions were added. Note that this box size is much larger than that used for  $\alpha$ -Syn by Piana *et al.*<sup>30</sup> (where they used a  $\sim 100 \times 100 \times 100 \text{ \AA}^3$  box), but was adopted here to keep the number of ATP molecules the same as above. Each system was then neutralized using  $\text{Na}^+$  ions, and subsequently filled with water.  $\text{Na}^+$  and  $\text{Cl}^-$  ions were further added to set the NaCl concentration to 150 mM. Amber ff99SBildn force field was used for the protein,<sup>33</sup> and ATP was treated with the force field by Meagher *et al.*<sup>34</sup> Systems with three different water models, i.e., TIP4P-D,<sup>30</sup> OPC,<sup>31</sup> and TIP3P, were prepared separately, and the monovalent and divalent ions were described by the force fields developed by Joung and Cheatham<sup>35</sup> and Li *et al.*,<sup>36</sup> respectively, which have been tuned for each water model in Amber 20.<sup>37</sup> Long-range electrostatic interactions were calculated using the particle mesh Ewald method, and short-range non-bonded interactions were cut off at  $10.0 \text{ \AA}$ .

Each system was initially energy minimized for 3000 steps while restraining the heavy atoms and heated up to 300 K in 100 ps. Subsequently, constant-NPT (300 K, 1 atm) simulation was run for 500 ps while restraining the heavy atoms of  $\alpha$ -Syn and ATP molecules with a weak force constant of  $1 \text{ kcal mol}^{-1} \text{ \AA}^{-2}$ . The restraint on the heavy atoms was then removed, and another 10 ns constant-NPT simulation was conducted to finalize equilibration. The production simulations were then performed under the constant-NPT (300 K, 1 atm) condition for  $1.2 \text{ }\mu\text{s}$ . The temperature was maintained using a Langevin thermostat with a collision frequency of  $1.0 \text{ ps}^{-1}$ , and the pressure was controlled using the Berendsen barostat. Note that while the volume of the system changes when the constant-NPT condition is turned on, the final concentrations of ATP and  $\text{Mg}^{2+}$  changed only by  $\sim 3\%$ . The simulations were performed using the

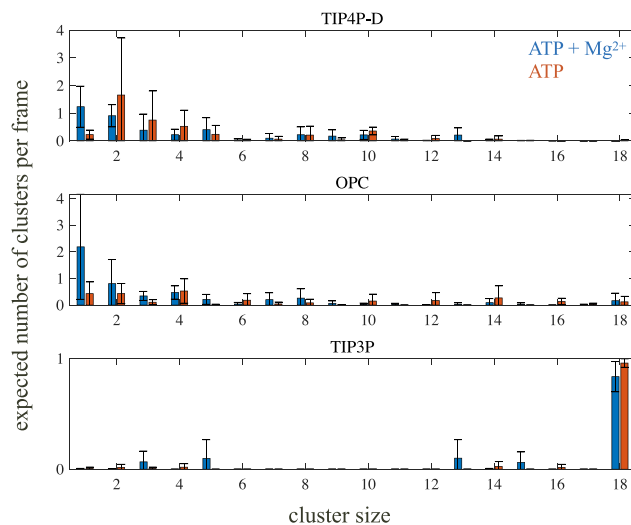
GPU version of the PMEMD module in the Amber 20 program package.<sup>37,38</sup>

## III. RESULTS AND DISCUSSION

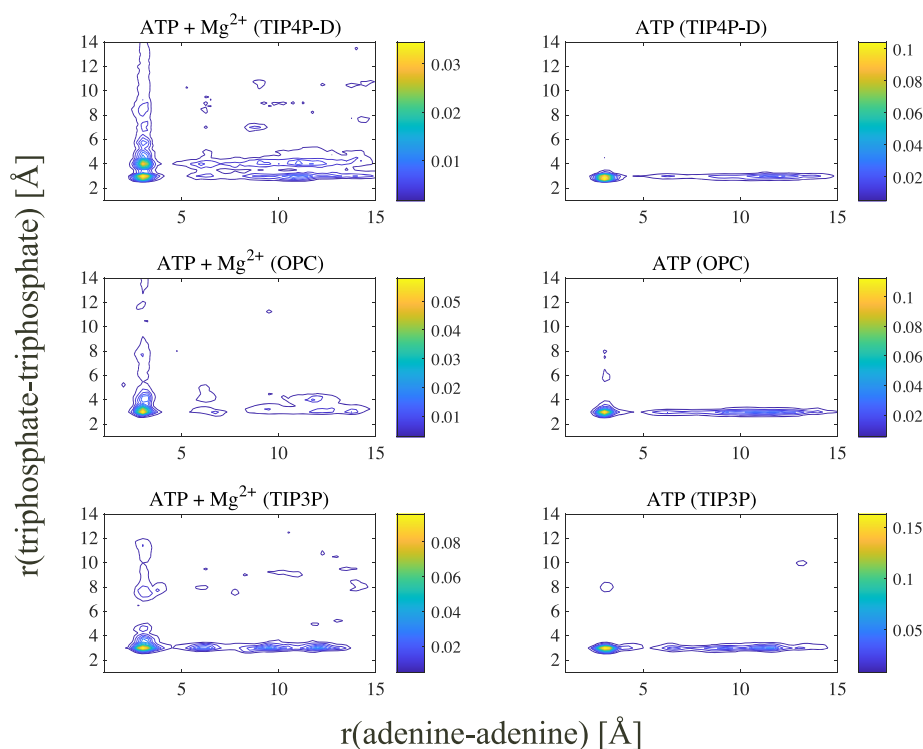
### A. ATP–ATP interactions and ATP clustering propensity

First, we compare how different water models affect the dynamics and oligomerization trend of ATP molecules. ATP molecules are counted to be in contact when the shortest inter-atomic distance between two ATP molecules is within  $4 \text{ \AA}$ ; the ATP molecules in contact are then assigned to the same cluster. Figure 1 shows how the sizes of ATP clusters change during the representative trajectories. The results for the other trajectories with and without  $\text{Mg}^{2+}$  ions are given in Figs. S2 and S3, respectively. The figures show that, in the presence of  $\text{Mg}^{2+}$ , the cluster sizes increase almost monotonically in TIP3P water and eventually converge to a single cluster within 500 ns. In contrast, the clusters in TIP4P-D and OPC waters change dynamically, and the sizes are diverse. Similar trend is seen when  $\text{Mg}^{2+}$  ions are absent, though the ATP clusters tend to be formed more rapidly and stably.

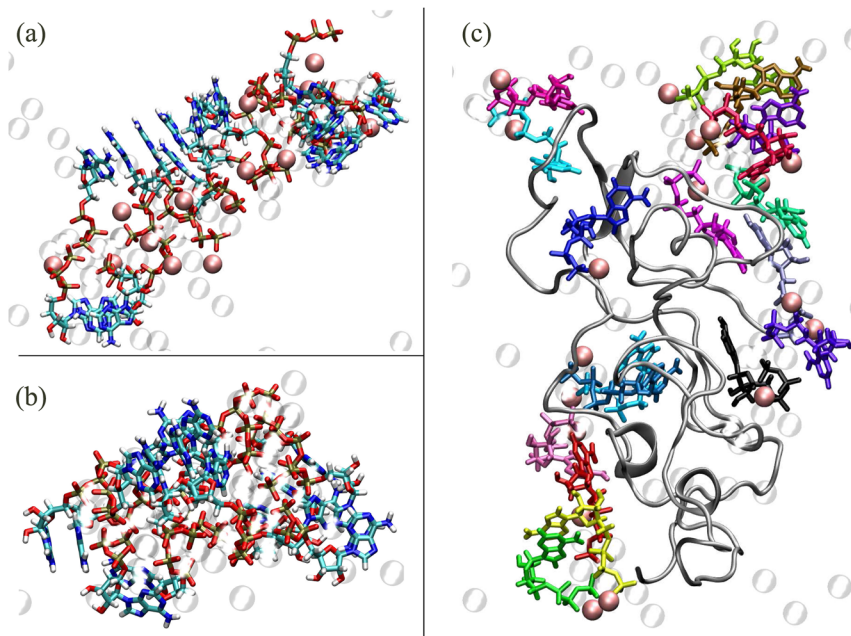
To compare the cluster sizes in more detail, the ATP cluster size distributions are summarized in Fig. 2. Since the cluster sizes changed drastically in the beginning of each trajectory, hereafter, the trajectory segment from 0.2 to  $1.2 \text{ }\mu\text{s}$  is used when taking the time averages. This result shows that ATPs in TIP3P water mostly form a single 18-mer. In TIP4P-D and OPC waters, monomers appear to be the major species when  $\text{Mg}^{2+}$  is present, but dimers and small oligomers become more favorable when  $\text{Mg}^{2+}$  is absent. The ATPs in TIP4P-D water tend to oligomerize more frequently than those in OPC water. Here, we note that the monomeric form is experimentally expected to be dominant in the current ATP concentration;<sup>14,15</sup>



**FIG. 2.** Cluster size distributions averaged over the trajectories of ATP molecules in water. Top, center, and bottom figures are the results in TIP4P-D, OPC, and TIP3P waters, respectively. Blue and red bars denote the results with and without  $\text{Mg}^{2+}$  ions. The trajectory data from 0.2 to  $1.2 \text{ }\mu\text{s}$  of each trajectory are used for the time averages, and the three trajectories with different initial configurations are combined. The error bars are the standard deviations.



**FIG. 3.** Joint distributions of the adenine–adenine and triphosphate–triphosphate distances for all ATP pairs. Top, center, and bottom panels are the results for TIP4P-D, OPC, and TIP3P waters, respectively, and left and right columns describe the result with and without  $\text{Mg}^{2+}$  ions. Note that color ranges differ between the figures.

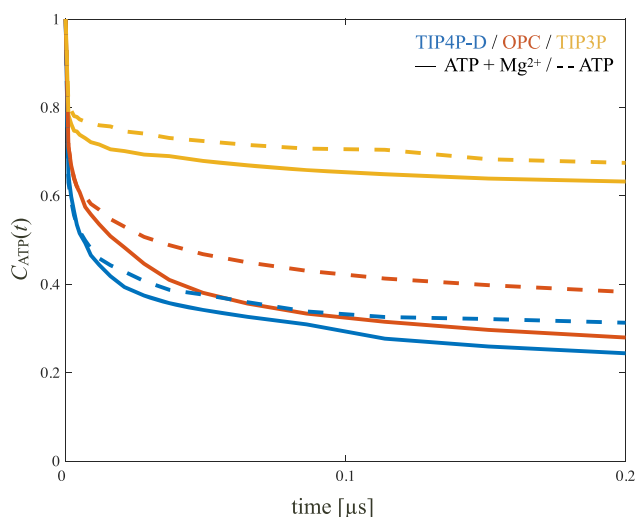


**FIG. 4.** Representative snapshots of (a) ATP and  $\text{Mg}^{2+}$ , (b) ATP without  $\text{Mg}^{2+}$ , and (c)  $\alpha$ -Syn, ATP, and  $\text{Mg}^{2+}$  in TIP3P water. Pink and transparent balls are  $\text{Mg}^{2+}$  and  $\text{Na}^{+}$  ions, respectively. ATP and  $\alpha$ -Syn are described in licorice and cartoon representations, respectively. Note that the patterns of the ATP–ATP interactions in different solvents are similar but the sizes of the clusters differ.

for instance, under the experimental condition of 10 mM ATP, 10 mM magnesium chloride, and 150 mM sodium chloride, similar to the current simulations, 84% of ATP–Mg complex is estimated to exist in the monomeric form.<sup>15,39–41</sup> Figure 2 shows that 7%, 12%, and 0% of the ATPs exist as monomers in TIP4P-D, OPC, and TIP3P waters, respectively. Thus, TIP3P water drastically overestimates the oligomerization trend. The TIP4P-D and OPC waters, on the other hand, are still biased toward oligomers, but the deviation from the experiment is greatly improved compared to the TIP3P case.

To analyze the molecular origin of ATP–ATP interactions in more detail, the joint distribution as a function of adenine–adenine and triphosphate–triphosphate distances between ATP molecules is plotted in Fig. 3. Here, the distance is defined as the shortest inter-atomic distance between the two groups. The inter-triphosphate distance in the presence of  $\text{Mg}^{2+}$  shows a single peak at  $\sim 3$  Å with a broad tail, implying that multiple conformations exist. This tail on the long-distance side becomes less obvious when  $\text{Mg}^{2+}$  is absent. The adenine–adenine distance, on the other hand, shows a sharp peak at  $\sim 3$  Å, and additional peaks at 6, 9, and 12 Å. These secondary peaks are most obvious in the TIP3P water in the presence of  $\text{Mg}^{2+}$ . This periodic character is indicative of the multiple  $\pi$ – $\pi$  stacking layers, which can be confirmed in the snapshots [Fig. 4(a)]. The snapshots of the clusters in the absence of  $\text{Mg}^{2+}$ , on the other hand, show that a highly charged “core” consisting of many  $\text{Na}^+$  ions and triphosphate groups is formed; this leads to the lack of long triphosphate–triphosphate distance and  $\pi$ – $\pi$  stacking layers.

To see the stability of ATP–ATP contacts, we next analyze the lifetime of the ATP–ATP contact ( $C_{\text{ATP}}(t)$ ), defined by the lifetime correlation function,



**FIG. 5.** Lifetime correlation functions of the ATP–ATP contacts with different waters. Blue, red, and yellow lines describe the results for TIP4P-D, OPC, and TIP3P waters, respectively, and solid and dashed lines denote the results with and without  $\text{Mg}^{2+}$  ions.

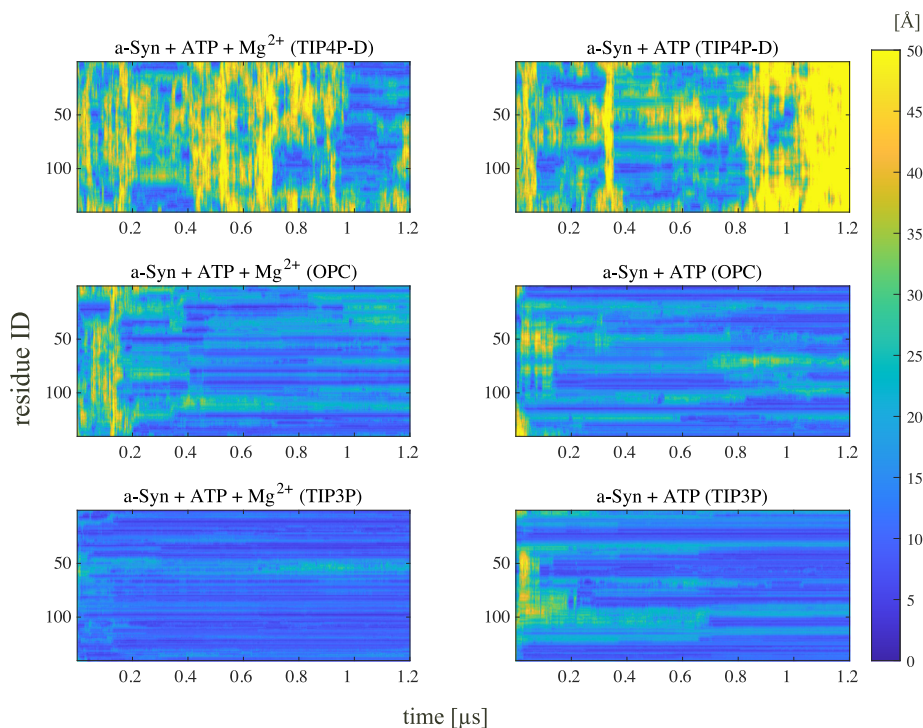
$$C_{\text{ATP}}(t) = \frac{1}{\sum_i^{\text{ATP}} \sum_{j>i}^{\text{ATP}} \langle \theta(r_0 - r_{ij}(\tau)) \rangle} \times \sum_i^{\text{ATP}} \sum_{j>i}^{\text{ATP}} \langle \theta(r_0 - r_{ij}(\tau)) \theta(r_0 - r_{ij}(\tau + t)) \rangle, \quad (1)$$

where  $t$  is the lag time,  $i$  and  $j$  denote the ATP molecules, and  $\langle \dots \rangle$  is the time average.  $\theta(r_0 - r(t))$  is the binary function that becomes 1 when  $r(t) \leq r_0$  and 0 otherwise, and  $r_0$  is set to 4 Å. Thus,  $C_{\text{ATP}}(t)$  describes the lifetime of a contact once it is formed. The result, shown in Fig. 5, shows that the contacts are long-lived in the order of TIP3P > OPC > TIP4P-D. The large value of  $C_{\text{ATP}}(t)$  for TIP3P even at 200 ns indicates that many contacts are kept preserved. This is consistent with the observation in Fig. 1 and Figs. S2 and S3 that the cluster size in TIP3P water increases almost monotonically. We also see that the contacts are strengthened and become long-lived when  $\text{Mg}^{2+}$  ions are absent, which is also consistent with the results discussed above.

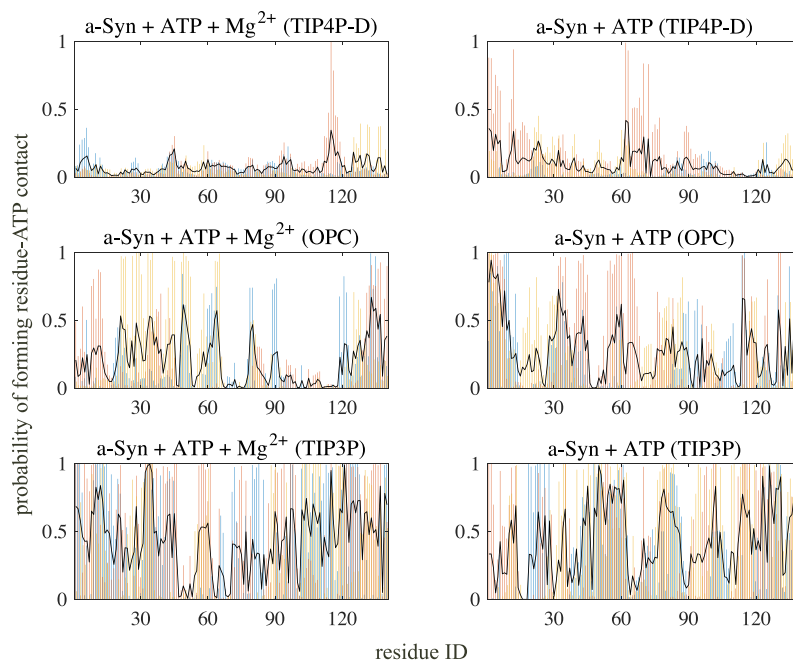
## B. ATP– $\alpha$ -Syn interactions

Next, we analyze how ATP molecules interact with  $\alpha$ -Syn. The time evolution of the shortest inter-atomic distances between the residues in  $\alpha$ -Syn and the nearest ATP molecule for the representative trajectories is shown in Fig. 6. The results for the other trajectories with and without  $\text{Mg}^{2+}$  ions are provided in Figs. S4 and S5, respectively. Figure 6 shows that ATP molecules approach and leave  $\alpha$ -Syn frequently in TIP4P-D water, whereas ATPs often stay nearby and contacts seem last for a few 100 ns in OPC water. The distances become even shorter in TIP3P water, i.e., almost all the residues are in close contact with ATP for most of the time. The absence of  $\text{Mg}^{2+}$  ions does not change these trends, though the chances of finding ATP molecules near  $\alpha$ -Syn seems to increase slightly.

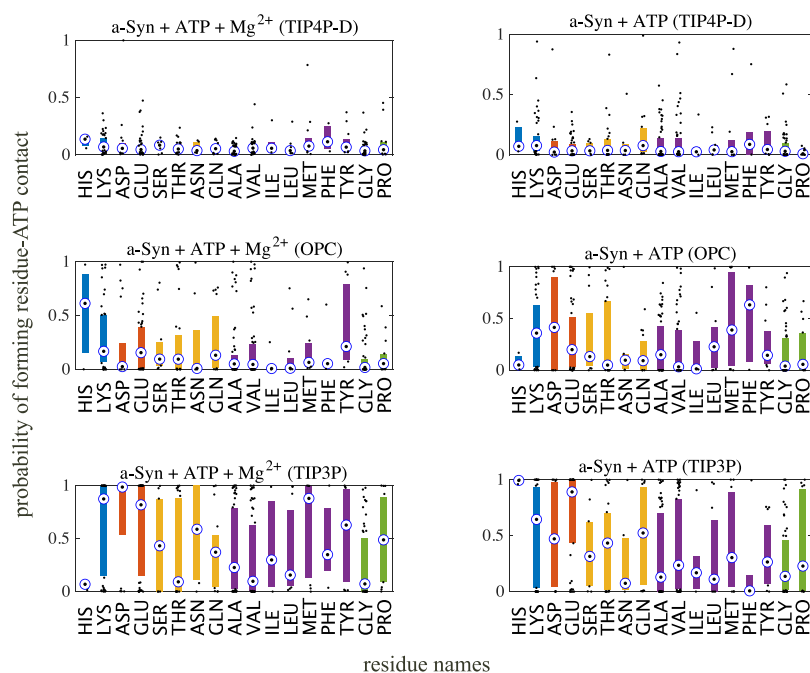
To understand the ATP–protein contacts in more detail, the probability of finding the ATP–protein contact for each residue is plotted in Fig. 7. The trajectory segments from 0.2 to 1.2  $\mu\text{s}$  are used in time averaging to omit the drastic change of ATP distributions in the first 0.2  $\mu\text{s}$ . The residue–ATP contact is counted when the shortest inter-atomic distance between the residue and an ATP is within 4 Å. The TIP4P-D result shows that a stable contact is only occasionally found when  $\text{Mg}^{2+}$  is present (7.5%, defined as an average over all residues), and the chances are only slightly increased when  $\text{Mg}^{2+}$  is absent (10.0%). In the OPC water, on the other hand, ATP–protein contacts are formed more frequently, and the ratio increases when  $\text{Mg}^{2+}$  is absent (20.3% and 20.7% for cases with and without  $\text{Mg}^{2+}$ , respectively). In contrast, strong contacts between ATP and  $\alpha$ -Syn are seen in the TIP3P water even when  $\text{Mg}^{2+}$  ions are present (44.2%), and the probability is almost unchanged when  $\text{Mg}^{2+}$  is replaced with  $\text{Na}^+$  ions (43.0%). The increase in the interactions in the absence of  $\text{Mg}^{2+}$  has also been observed in the nuclear magnetic resonance (NMR) experiment.<sup>15</sup> However, we note that while the NMR experiment indicated that the effect of ATP is most notable at about the N-terminal (residues 113–137) and His50 (residues 49–52) moieties, the current results do not find a clear preference to any regions. This may partly be due to the lack of sufficient conformational sampling of  $\alpha$ -Syn, which is beyond the scope of this work.



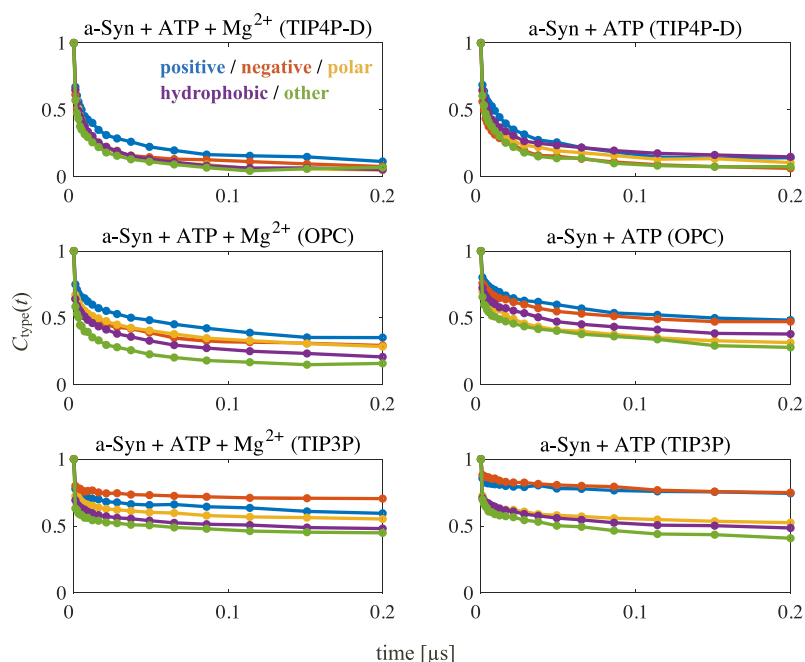
**FIG. 6.** Time evolution of the minimum distances between the residues in  $\alpha$ -Syn and the ATP closest to each residue in the presence (left) and absence (right) of  $\text{Mg}^{2+}$ . Top, center, and bottom rows denote the results for TIP4P-D, OPC, and TIP3P waters, respectively.



**FIG. 7.** The probability of finding the residue-ATP contacts during the trajectories. Top, center, and bottom rows are the results in TIP4P-D, OPC, and TIP3P water, respectively, and left and right columns are with and without  $\text{Mg}^{2+}$  ions. The bars in blue, red, and yellow are the results for the three trajectories from different initial structures, and the black lines show the average over the three trajectories.



**FIG. 8.** Box plots for the probability of residue–ATP contacts formed throughout the trajectories, classified by residue names. Bottom and top edges of each box indicate the 25% and 75% ranges, respectively, and the outliers are shown in black points. Top, center, and bottom rows are for TIP4P-D, OPC, and TIP3P water results, respectively. Left and right columns are the results with and without  $\text{Mg}^{2+}$  ions. Dot plots show the raw data for each residue, and stars denote the average over the residues. The colors of the dots denote the types of each residue. The positive, negative, polar, hydrophobic, and residual (other) residues are plotted in blue, red, yellow, purple, and green, respectively. Note that His residue is protonated, and Arg, Trp, and Cys residues are not included in  $\alpha$ -Syn.



**FIG. 9.** Lifetime correlation functions of the ATP–protein contacts for residue types. Top, center, and bottom rows denote the results in TIP4P-D, OPC, and TIP3P waters, respectively, and left and right columns are for those with and without  $\text{Mg}^{2+}$ . The positive, negative, polar, hydrophobic, and residual (other) residues are plotted in blue, red, yellow, purple, and green, respectively.



It has been suggested that Arg residues most frequently bind ATP molecules and mediate ATP–protein interactions in the protein native state.<sup>17</sup> Yet,  $\alpha$ -Syn does not contain Arg. Thus, we examine which residue binds more frequently to ATPs. Figure 8 shows the probability of residue–ATP contact formations for different residue names. The result shows that the residues containing a hydrophobic side chain in OPC water seem to bind ATP slightly more frequently than others. Charged residues in OPC water also seem to show a slightly higher probability than the others. Yet, overall no clear preference to any residues is found.

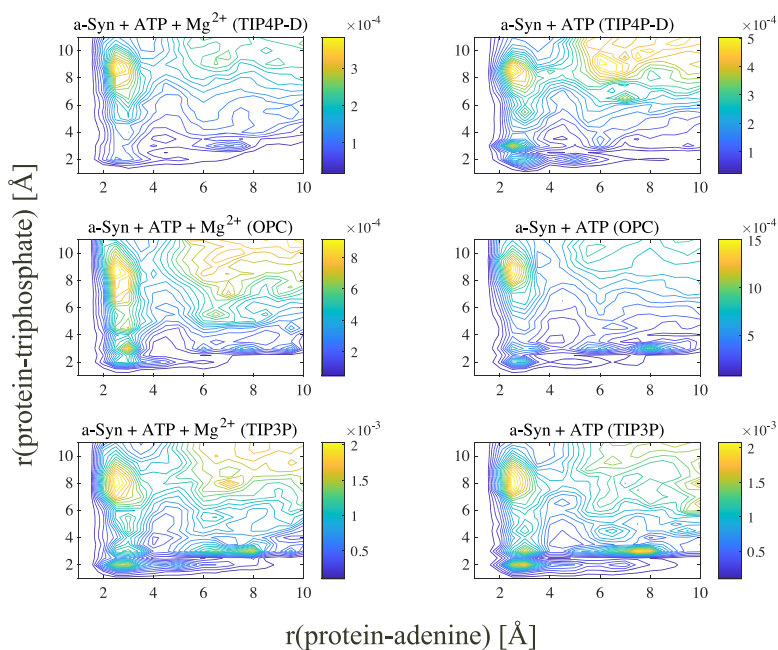
To see the strength of residue–ATP contacts in further detail, the lifetime of the contacts is analyzed with the lifetime correlation function ( $C_{\text{type}}(t)$ ) similar to Eq. (1),

$$C_{\text{type}}(t) = \frac{1}{\sum_{i \in \text{residue}} \sum_j^{\text{ATP}} \langle \theta(r_0 - r_{ij}(\tau)) \rangle} \times \sum_{i \in \text{residue}} \sum_j^{\text{ATP}} \langle \theta(r_0 - r_{ij}(\tau)) \theta(r_0 - r_{ij}(\tau + t)) \rangle, \quad (2)$$

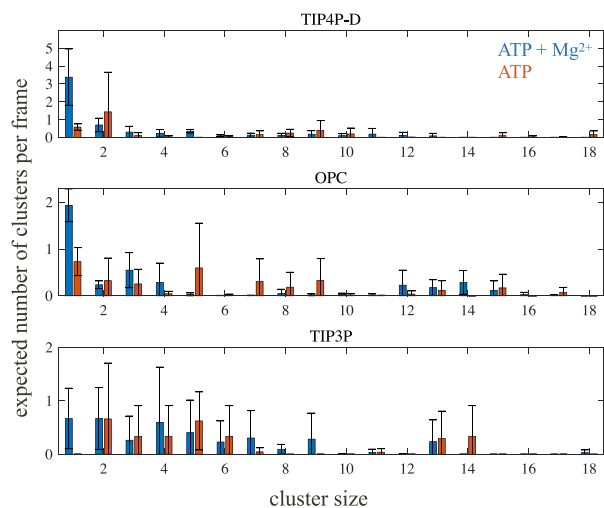
where  $i$  and  $j$  denote the residues in  $\alpha$ -Syn and ATP, respectively, and the cutoff distance ( $r_0$ ) is set to 4 Å. To simplify the plot, the residues are classified into five types, i.e., positive (protonated His and Lys), negative (Asp and Glu), polar (Ser, Thr, Asn, and Gln), hydrophobic (Ala, Val, Ile, Leu, Met, Phe, and Tyr), and others (Gly and Pro).  $C_{\text{type}}(t)$  is calculated as an average over the residues that belong to the same type. The result, shown in Fig. 9, shows that all contacts behave similarly in TIP4P-D water and decay within 0.1  $\mu$ s when  $\text{Mg}^{2+}$  is present. Here, the absence of  $\text{Mg}^{2+}$  only slightly increases the lifetimes. The contacts in OPC water show longer

lifetimes compared to those in TIP4P-D and do not decay to  $\sim 0$  at 0.2  $\mu$ s. The contacts between ATP and positively charged and polar residues tend to show slightly longer lifetimes. When  $\text{Mg}^{2+}$  is absent,  $C_{\text{type}}(t)$  for both positively and negatively charged residues increase notably in the OPC result. This indicates that the contacts involving charged residues are stabilized. Finally, in TIP3P water,  $C_{\text{type}}(t)$  changes quickly within 0.01  $\mu$ s, but above 0.5 even at 0.2  $\mu$ s. Together with Fig. 8, this result indicates that the majority of the ATP–protein contacts are maintained in TIP3P water once they are formed. This trend is more apparent for the charged residues and is further pronounced when  $\text{Mg}^{2+}$  is not involved in the system.

To understand the molecular origin of the ATP–protein contacts, the joint probability distribution of the residue–triphosphate and residue–adenine distances between  $\alpha$ -Syn and ATP molecules are plotted in Fig. 10. The distances denote the shortest inter-atomic distances between the two groups. This figure shows that the adenine moiety of ATP is frequently found within 4 Å of  $\alpha$ -Syn. Notably, while we do see a peak where the triphosphate group is within 4 Å in the cases of OPC and TIP3P waters, this peak disappears in the 4P result. The TIP3P result further shows a peak where the contact is formed only via the triphosphate group, i.e., the residue–triphosphate and residue–triphosphate distances are peaked at  $\sim 8$  and  $\sim 3$  Å, respectively. When  $\text{Mg}^{2+}$  is absent, the protein–triphosphate interactions become stronger in all cases. In the OPC and TIP3P results, the triphosphate-mediated contacts, i.e., protein–triphosphate and protein–adenine distances are  $\leq 4$  Å and  $> 4$  Å, respectively, show multiple peaks. This contact pattern is rarely seen in the TIP4P-D result, indicating that the electrostatic interaction remains to be minor in TIP4P-D water.

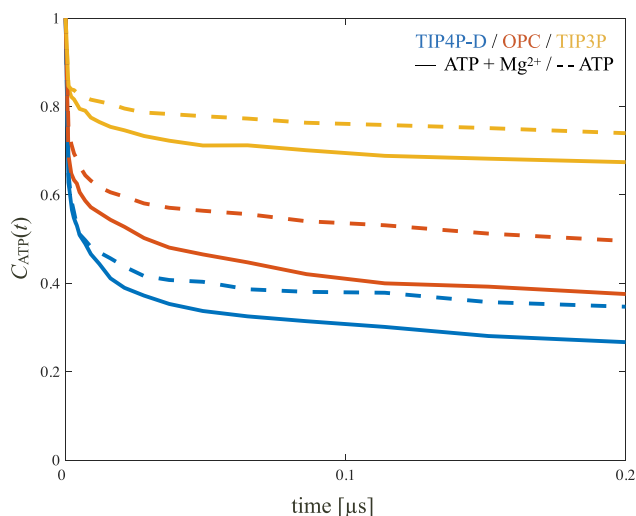


**FIG. 10.** The joint distributions of residue–triphosphate and residue–adenine distances. Top, center, and bottom rows are the results in the TIP4P-D, OPC, and TIP3P water, respectively, and left and right columns show those with and without  $\text{Mg}^{2+}$  ions. Note that the color range differs between the figures.



**FIG. 11.** Distributions of the expected sizes of ATP clusters in the presence of  $\alpha$ -Syn. Top, center, and bottom panels are the results for TIP4P-D, OPC, and TIP3P waters, respectively. Blue and red plots denote the cases with and without  $\text{Mg}^{2+}$  ions. The error bars are the standard deviation estimated from the three trajectories.

Finally, we analyze the ATP clusters in the presence of  $\alpha$ -Syn. Figs. S6 and S7 show the time evolution of the cluster sizes with and without  $\text{Mg}^{2+}$ , respectively. Figure 11 summarizes the cluster size distributions, and Fig. 12 shows the lifetime correlation function [ $C_{\text{ATP}}(t)$ , Eq. (1)] for the ATP-ATP contacts. Figure 11 shows that the size distributions of the ATP clusters are broader than in the case without  $\alpha$ -Syn (Fig. 2). This is even more pronounced in TIP3P water, i.e., multiple clusters are found. Yet, it turns out that these



**FIG. 12.** Lifetime correlation functions of the ATP-ATP contacts in the presence of  $\alpha$ -Syn. Blue, red, and yellow colors show the TIP4P-D, OPC, and TIP3P results, respectively, and solid and dashed lines are the results with and without  $\text{Mg}^{2+}$  ions.

ATP clusters are bound to  $\alpha$ -Syn; thus, a large single cluster involving  $\alpha$ -Syn is formed [Fig. 4(c)]. In contrast, the ATPs in TIP4P-D water separate from  $\alpha$ -Syn and exist as independent oligomers. The OPC result shows a trend in between TIP4P-D and TIP3P. Finally, Figs. 11 and 12 indicate that ATP-ATP contacts tend to become stronger when  $\text{Mg}^{2+}$  is absent and the  $C_{\text{ATP}}(t)$  behave similarly to those in the absence of  $\alpha$ -Syn (Fig. 5). Thus, the character of the ATP-ATP interactions is largely unaffected by  $\alpha$ -Syn.

#### IV. SUMMARY

In this study, we performed MD simulations of ATP molecules under different solvent environments to understand how the choice of water model affects ATP oligomerization and ATP binding to a disordered protein,  $\alpha$ -Syn. Three water models, i.e., TIP4P-D, OPC, and TIP3P, were compared, and the effect of  $\text{Mg}^{2+}$  was also examined.

The common TIP3P water model was confirmed to highly overestimate the aggregation of ATPs regardless of  $\text{Mg}^{2+}$  ions. In contrast, the aggregation behavior was greatly reduced in TIP4P-D and OPC waters, and the monomeric state was found for 7% and 12% of ATPs, respectively, in the presence of  $\text{Mg}^{2+}$  ions. When  $\text{Mg}^{2+}$  ions were replaced with  $\text{Na}^+$  ions, the oligomerization of ATP molecules was promoted. The ATP-ATP contacts were formed via both  $\pi$ - $\pi$  (adenine-adenine) and electrostatic (triphosphate-triphosphate) interactions, where the latter was mediated by positively charged ions. Interestingly, the electrostatic interaction was found to become stronger when  $\text{Mg}^{2+}$  was absent, despite the fact that the positive charge on  $\text{Na}^+$  is smaller than that on  $\text{Mg}^{2+}$ . Inspections of the trajectory snapshots indicated that while one divalent  $\text{Mg}^{2+}$  ion can stabilize the negatively charged triphosphate group in ATP more effectively than a monovalent  $\text{Na}^+$ , multiple  $\text{Na}^+$  ions gather around each triphosphate moiety and form a globular cluster containing multiple  $\text{Na}^+$  ions and triphosphate groups when  $\text{Mg}^{2+}$  ions are absent. The globular structure resulted in shorter inter-triphosphate distances and larger ATP clusters.

The ATP distribution of  $\alpha$ -Syn was also found to strongly depend on the water models. In particular, the binding of ATP molecules to  $\alpha$ -Syn in TIP3P water was estimated to be very strong, i.e., more than half of the ATP-protein contacts were maintained for more than 0.2  $\mu\text{s}$ . In contrast, the ATP-protein contacts were formed only weakly in TIP4P-D water. In OPC water, more ATPs were bound to  $\alpha$ -Syn compared to the case in TIP4P-D water, and the contact formation was promoted when  $\text{Mg}^{2+}$  was absent.

While a previous study suggested that Arg residue is important for ATP-protein interactions in the protein native state, the intrinsically disordered protein  $\alpha$ -Syn, which lacks Arg, did not show a clear preference for any residues. This may be because, unlike the native state where charged residues are often exposed to the surface, disordered protein is quite flexible such that ATP molecules can approach any residue with a similar chance; thus, hydrophobic residues can interact with ATPs more frequently. The ATP-hydrophobic residue interactions have also been found in previous studies on protein aggregates,<sup>21,23,24</sup> and whether this feature is common in disordered proteins is left to be explored.

By analyzing the molecular origin of the ATP-protein contacts, the protein-adenine was found to be the dominant interaction. The contact mediated only via electrostatic interaction was also observed

in TIP3P water in the presence of  $\text{Mg}^{2+}$ . When  $\text{Mg}^{2+}$  ions were absent, the protein–triphosphate contacts also became stable in OPC water, and the charged residues were found to form contacts with ATP more frequently and stably. These results indicate that the absence of  $\text{Mg}^{2+}$  increases the ATP–protein interactions, which is consistent with the previous NMR experiment.<sup>15</sup>

Here, we note that this work is intended to explore the effect of water models rather than quantifying the ATP–protein interactions. Nevertheless, the current results already show clear differences in the strength of ATP–protein interactions between the three water models. The TIP3P and TIP4P-D waters indicate that the interactions are nearly permanent and very weak, respectively, whereas the OPC model shows modest interaction and repeated binding/unbinding events. The NMR experiment<sup>15</sup> has stated that the interactions are “weak and nonspecific,” thus implying that TIP3P overestimates the ATP–protein interaction. Yet, to compare the water models quantitatively, the conformational space of the protein itself has to be explored in more detail. It has been shown that conformational sampling of  $\alpha$ -Syn requires more than 10  $\mu\text{s}$ -long trajectories,<sup>30</sup> and discussing the slow ATP binding/unbinding events will need the trajectory to be even longer. Thus, it is expected that extensive conformational sampling of disordered proteins employing extended sampling methods is required to discuss the ATP–protein interactions in more detail.

Finally, previous studies have noticed that ATP molecules tend to over-aggregate in TIP3P water and have tuned the force field of ATP by scaling the charges to control oligomerization.<sup>19,20</sup> While such an approach will also diminish the ATP–protein potential, here we showed that by merely changing the water model, the ATP over-aggregation trend can be reduced while keeping the ATP–protein potential unchanged. On the other hand, ATP in high concentration plays various roles by interacting with both native and disordered proteins. We also note that these water models have been recognized to destabilize the protein native states,<sup>30</sup> and protein force fields to describe both the native and disordered states in a balanced manner have, thus, been developed.<sup>42,43</sup> Since the ATP–protein interactions in high ATP concentrations have not been explored for these state-of-art force fields, a comprehensive study to reveal the ATP–protein interactions is necessary to reveal the role of ATP as a hydrotrope.

## SUPPLEMENTARY MATERIAL

See the supplementary material for cartoon representations of the initial conformations of  $\alpha$ -Synuclein, time evolution of the cluster sizes for ATP without protein and  $\text{Mg}^{2+}$  ions, time evolution of the minimum distances between the residues in  $\alpha$ -Syn and ATP in the absence of  $\text{Mg}^{2+}$ , and time evolution of the cluster sizes found in the trajectories in the presence of  $\alpha$ -Syn with and without  $\text{Mg}^{2+}$  ions.

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## AUTHOR DECLARATIONS

### Conflict of Interest

The authors have no conflicts to disclose.

### Author Contributions

**Toshifumi Mori:** Conceptualization (lead); Data curation (lead); Formal analysis (lead); Funding acquisition (lead); Investigation (lead); Methodology (lead); Writing – original draft (lead); Writing – review & editing (lead). **Norio Yoshida:** Conceptualization (supporting); Data curation (supporting); Formal analysis (supporting); Funding acquisition (equal); Investigation (supporting); Writing – original draft (supporting); Writing – review & editing (supporting).

## DATA AVAILABILITY

The data that support the findings of this study are available from the corresponding author upon reasonable request.

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