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# **Poly(amidoamine) Dendrimers on Lipid Bilayers I: Free Energy and Conformation of Binding**

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#### **Abstract**

Third-generation (G3) poly(amidoamine) (PAMAM) dendrimers are simulated approaching 1,2 dimyristoyl-*sn*-glycero-3-phosphocholine (DMPC) bilayers with fully atomistic molecular dynamics, which enables the calculation of a free energy profile along the approach coordinate. Three different dendrimer terminations are examined: protonated primary amine, uncharged acetamide, and deprotonated carboxylic acid. As the dendrimer and lipids become closer, their attractive force increases (up to 240 pN) and the dendrimer becomes deformed as it interacts with the lipids. The total energy release upon binding of a G3-NH<sub>3</sub><sup>+</sup>, G3-Ac, or G3-COO<sup>-</sup> dendrimer to a DMPC bilayer is, respectively, 36, 26, or 47 kcal/mol or, equivalently, 5.2, 3.2, or  $4.7 \times 10^{-3}$ kcal/g. These results are analyzed in terms of the dendrimers' size, shape, and atomic distributions as well as proximity of individual lipid molecules and particular lipid atoms to the dendrimer. For example, an area of 9.6, 8.2, or 7.9 nm<sup>2</sup> is covered on the bilayer for the G3–NH<sub>3</sub><sup>+</sup>, G3–Ac, or G3–COO– dendrimers, respectively, while interacting strongly with 18–13 individual lipid molecules.

## **Introduction**

Understanding the interaction of nanoparticles with biological membranes is of fundamental importance for both the design of effective nanodevices for medical applications and for avoiding unintended consequences from disruption of biological structures. Nanoparticles are chemically modified for precisely defined properties in attempts to create agents for gene

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**Supporting Information Available**: Animations of G3–NH3 +, G3–Ac, and G3–COO– binding to gel phase DMPC bilayer. This material is available free of charge via the Internet at<http://pubs.acs.org>.

therapy and targeted drug delivery. As nanodevices approach a living animal cell, the first interaction is with the cellular plasma membrane. Nanometer-sized particles are especially effective at penetrating the plasma membrane and altering the natural processes within the cell.<sup>1–8</sup> Nanoparticles can be effective carriers of therapeutic cargos through the plasma membrane, likely due to one of two internalization mechanisms: physical rupturing and pore formation<sup>1–3</sup> or receptor-mediated, energy-dependent cellular processes, such as endocytosis.6–<sup>8</sup>

Synthetic polymer nanodevices have been developed from poly(lysine), poly(ethylenimine), and assorted dendrimers.<sup>9</sup> Poly(amidoamine) (PAMAM) dendrimers are a widely studied synthetic polymer for both medical and basic science applications.<sup>10–12</sup> Their structure incorporates the starburst addition of repeating units around the ethylenediamine core to the desired generation (G) (Figure 1). Dendrimers are particularly useful due to their high homogeneity (polydispersity index  $\approx$  1.01)<sup>2</sup> and use as a framework in multifunctional nanodevices. PAMAM dendrimers are natively terminated with primary amines and are commonly modified by the covalent addition of small functional molecules (e.g., chromophores, chemotherapeutics, targeting moieties) and less reactive terminations (e.g., acetamide or hydroxyl) to create a nanodevice capable of targeting, binding, internalizing, labeling, and/or treating diseased cells.<sup>10,13–15</sup>

For example, acetylization of the PAMAM dendrimer's primary amine end groups can reduce nonspecific binding, enhance functional capabilities, and minimize nanoparticle toxicity.<sup>10,14–16</sup> Positively charged nanoparticles are more likely to bind and internalize into cells than are the uncharged analogues.<sup>2,3</sup> This strong relationship between nanoparticle termination and biological behavior demonstrates the importance of understanding the mechanisms of nanoparticle–membrane interactions for effective nanodevice design.

Atomic force microscopy (AFM) has been used to experimentally study the effects of PAMAM dendrimers on 1,2-dimyristoyl-*sn*-glycero-3-phosphocholine (DMPC) lipid bilayers with nanometer-scale resolution.<sup>17–19</sup> Drastic differences in the dendrimer–lipid interaction were observed for varying dendrimer termination. Charged G5 dendrimers at 20 nM caused membrane disruption via removal of membrane material via the formation of membrane holes and the expansion of preexisting defects. In contrast, neutral G5 dendrimers at 20 nM did not cause as much membrane degradation but predominantly accumulated around the edge of preexisting holes without removing lipid molecules.

Ginzburg and Balijepalli<sup>20</sup> have utilized continuum thermodynamic models to demonstrate the effects nanoparticle surface charge density has on membrane binding. This model provides a phase diagram of nanoparticle–membrane structures, including regimes of nanoparticle binding within the bilayer's hydrophobic tails and enclosed within vesicles. Lee and Larson<sup>21</sup> have looked at dendrimer–phospholipid binding in greater detail through coarse-grained simulations, providing qualitatively similar conclusions of nanoparticle charge and size dependence on membrane disruption.

The research reported in this paper presents a quantitative analysis of molecular dynamic simulations of the dendrimer–membrane binding process. To date, only a qualitative picture existed concerning the pore formation process by nanoparticles on lipid bilayers.<sup>20,21</sup> Specifically, we examine the differences in energetics and forces of interaction between charged PAMAM dendrimers with zwitterionic DMPC bilayers. Three types of G3 PAMAM dendrimers were examined: positively charged primary amine  $(G3-NH<sub>3</sub><sup>+</sup>)$ , uncharged acetamide (G3–Ac), and negatively charged carboxyl (G3–COO– ). The CHARMM27 force field is used for atomistic Langevin dynamics simulations along an interaction coordinate defined as the center-of-mass separation distance between the

dendrimer and lipid bilayer. A distance-dependent dielectric function was used. A potential of mean force is calculated along the interaction coordinate, from which the forces of interaction are extracted. Further, the dendrimers' structure (radii of gyration, asphericities, and atomic distributions) and binding morphology are examined as a function of their proximity to the lipid membrane.

#### **Methods**

Umbrella sampling<sup>22</sup> and the weighted histogram analysis method (WHAM)<sup>23</sup> were employed to extract the free energy of binding along the interaction coordinate defined as the dendrimer and lipid bilayer center-of-mass separation distance. The potential of mean force  $(PMF)$ , <sup>24</sup> or free energy, along the interaction coordinate (*z*) is extracted from the coordinate's distribution function, averaged over all degrees of freedom as represented in the configurational vector (**X**):

$$
PMF(z_0) = -k_B T \log \int e^{-\frac{V(\mathbf{X})}{k_B T}} \delta(z_0 - z(\mathbf{X})) \quad d\mathbf{X}
$$
\n(1)

with Boltzmann constant  $(k_B)$ , the temperature (*T*), and the CHARMM<sup>25</sup> potential (*V*) with the protein parameter set 22.<sup>26</sup>

The PMF along particular (slow) coordinates is a central concept in the statistical mechanical representation of molecular

systemsandhasbeenwidelyusedincomputationalapplications $27-30$  The PMF reveals the equilibrium conformation (i.e., PMF minimum) and free energy changes. The negative gradient of the PMF is exactly the force averaged over the conformational ensemble.<sup>24</sup> In the umbrella sampling calculation performed here long-time events along the interaction coordinate are encouraged to happen within the nanosecond time scale by stepwise moving of the umbrella sampling window offset along the interaction coordinate.

The interaction coordinate (*z*), defined as the dendrimer–lipid center-of-mass separation distance, was examined from values of 2.8–6.9 nm. Sampling dynamics occurred in equally spaced windows along the interaction coordinate with 0.05 nm step size and a harmonic confinement of the interaction coordinate to the window center by 500 kcal mol<sup>-1</sup> nm<sup>-2</sup>. To start the simulations, the dendrimer and lipid bilayer were equilibrated with a harmonic confinement to  $z = 6$  nm for 500 ps. The result of this equilibration was used as the initial conditions for the production dynamics in the  $z = 6$  nm window as well as the starting configuration for the equilibration at  $z = 5.95$  nm, which lasted another 100 ps. The result of the equilibration at 5.95 nm was used to begin the  $z = 5.9$  nm window equilibration and so forth until all windows from 6 to 2.8 nm were recursively equilibrated. Once each window was equilibrated, production runs were calculated in parallel for 4 ns per window with atomic configurations saved every 2 ps. To confirm that *z* > 6 nm was outside the interaction range of the dendrimer with the lipid bilayers, further sampling windows were run for 6.05 nm  $\le z \le 6.9$  nm with identical recursive equilibration procedures starting from the  $z = 6$  nm configuration and recursively stepping to larger *z*.

The interaction coordinate versus time was recorded during all production runs and later used with WHAM to calculate the PMF.<sup>23,24</sup> The recursive calculation of the PMF via WHAM was performed until a fitting threshold of 0.001 kcal/mol was achieved.<sup>27</sup> WHAM results for the PMF were demonstrated to be dependent on the threshold such that more stringent thresholds resulted in a difference smaller than that between the PMF at  $z = 6$  nm and  $z = 6.9$  nm. Since the PMF at this extended range is flat and a sufficiently low threshold

value was too costly to compute, a linear fit to the PMF was calculated for  $z = 6.0-6.9$  nm and subtracted for the entirety of the PMF.

The initial structure for the DMPC bilayer originated from a preequilibrated patch of 32 lipid molecules replicated 16 times to create a single patch with 512 lipid molecules, from which a 10 nm diameter circular disk was extracted. Lipid equilibration occurred at every step during the creation of the final 10 nm patch for greater than 200 ps each. The equilibrated DMPC disk consisted of 263 phospholipid molecules at a lipid density (60  $\AA^2$ / lipid) and bilayer thickness (4.3 nm) in agreement with experimental measurements of DMPC bilayers.<sup>31,32</sup>

The focus of this paper is the examination of binding of dendrimers to a membrane with biological relevance. The primary contribution to the initial binding of dendrimers to membranes was thought to be the interaction between the charged dendrimer moieties with the polar lipid head groups.  $33-35$ 

Subsequently, the hydrophobic dendrimer moieties and lipid tails are likely playing an important factor in the later pore formation and penetration of the dendrimer into the bilayer. This manuscript focuses on the initial binding of dendrimers to the lipid bilayer surface. As such, in the interest of computational efficiency, the lipid tail atoms have been fixed in location. Indeed, the PMF computations were not feasible allowing full lipid mobility. This approximation limits the lateral and vertical motion of the individual lipid molecules and prevents lipid tail rearrangement from being incorporated into the resulting energetic calculations. This lipid tail fixation is not expected to significantly affect the binding for large dendrimer–lipid separations ( $z \ge 4$  nm) but does affect the binding at smaller separations. The effects of this approximation, and the influence of lipid tail mobility in general, is the subject of a companion article.<sup>36</sup>

Three different PAMAM dendrimers of varying surface chemistry are simulated with DMPC bilayers using the CHARMM27 parameters for lipids<sup>37</sup> and, for dendrimers, parameters from set 22, within the CHARMM c32b2 academic software package.<sup>37,38</sup> The G3 dendrimers natively contain 32 terminal groups, a net zero charge, and 1092 atoms before modifying the terminal chemistry. The terminations are modified to yield the G3–  $NH<sub>3</sub><sup>+</sup>$ , G3–Ac, and G3–COO<sup>–</sup> dendrimers (Figure 1), to make the dendrimers representative of a physiological pH 7 environment.<sup>39</sup> Dendrimer properties are given in Table 1 with each protonated primary amine terminal group having a +e charge and each deprotonated carboxylic acid terminal group having a –e charge. This yields three different dendrimers terminations giving the dendrimers a net charge of +32e, 0, or –32e. The initial structure for the dendrimer was generated by a recursive script in  $CHARMM<sup>38</sup>$  and equilibrated for over 400 ps in the absence of lipids. At this point the temperature, potential energy, and radius of gyration were stabilized. All images of the molecular structure within this manuscript were created with the software VMD.<sup>40</sup>

Electrostatic interactions are modeled with spatially dependent screening incorporated by an *r*-dependent dielectric function of the type  $\varepsilon(r) = 4r^{4}$ . This model accounts for the enthalpic electrostatic screening effects of the solvent and counterions but does not incorporate solvent or counterion entropic effects. Nonbonded interactions are cut off for atom–atom separation distances greater than 1.3 nm and switched at 0.8 nm.

The accuracy of the distance-dependent dielectric function on the dendrimer structure has been previously compared to molecular dynamics in explicit water with counterions with satisfactory results.<sup>17,41–44</sup> Although the  $4r$ -dependent dielectric solvent model is an approximation relative to explicit water solvation, the size of these simulations, if surrounded by appropriate explicit solvent molecules, would have created a system with a

volume of  $3600 \text{ nm}^3$  and  $260\,000$  atoms. Already, simulation of the system with implicit solvent is computationally challenging, especially for the highly demanding process of developing a PMF, as is performed here. Similar calculations using explicit water are currently too computationally demanding. The distance-dependent dielectric simulations we perform provide new, meaningful details of the energetics and morphology of dendrimer– phospholipid binding, while avoiding drawbacks that explicit solvent simulations may incorporate, such as excessive computation time impeding the achievement of ergodicity, slow water equilibration, or insufficient averaging of counterion distribution.

As an example of current difficulties using explicit solvent, recently Changand Violi<sup>45</sup> have performed similar nanoparticle–lipid bilayer molecular dynamics on a considerably smaller system and had difficulty achieving adequate equilibration of the explicit solvent. Their study of lipid–nanoparticle interactions includes a carbon nanoparticle ( $\approx \frac{1}{10}$  the size of the G3 dendrimer) and demonstrates hysteresis effects over the course of the simulations due to the initial water molecule positions and slow water equilibration times. Therefore, the use of implicit solvent will be necessary for computational studies of the dynamics of nanoparticles and membranes for the time being, especially nanoparticles of the relatively large size and internal complexity of dendrimers.

An alternative to the 4*r* dielectric function is the use of generalized Born solvation models. <sup>46</sup>–48 For example, implicit solvent models using the analytical continuum electrostatics (ACE) or generalized Born using molecular volume (GBMV) analysis<sup>49,50</sup> have been effectively utilized with the CHARMM force field to study protein folding/unfolding.<sup>51,52</sup> ACE and GBMV and other models<sup>53</sup> have demonstrated, for proteins, good agreement with the thermal unfolding properties reported by experiments and MD simulations with explicit water (with exceptions such as differences in solvent dynamics leading to a dewetting transition.) $54-56$  However, our tentative utilization of generalized Born implicit solvent models within simulations of dendrimers and lipids yielded results that were unsatisfactory because of the lack of well-established parameters for solvation of lipids in water.

Although an explicit atomic representation of water molecules is the most accurate means to account for the effect of the solvent on molecular kinetics and thermodynamics,<sup>55,56</sup> we already have presented the computational limitations regarding the simulation for 129 windows for >35 000 dendrimer and lipid atoms in addition to explicit solvent atoms. Additionally the implicit solvent model enhances computational time due through instantaneous (adiabatic) equilibration of implicit water around the solute. If water would be explicitly represented, it would be out of equilibrium for this duration and the objective of simulating representative dendrimer dynamics in equilibrated water would not be obtained. Implicit representation is not necessarily a poorer choice in this regard because it maintains the time scale separation of water dynamics and dendrimer dynamics by instantaneous relaxation akin to an adiabatic separation. Given these considerations, in combination with the necessity of many trajectories to sample even the most probable conformations reasonably well, we have opted for an implicit water representation.

The constant temperature ensemble was generated using Langevin dynamics to simulate the thermal fluctuations within an implicit solvent by incorporating random fluctuations,  $(\mathbf{R}_i(t))$ , and a damping constant (*γ*) into Newton's equations, as shown in eq 2. **x***<sup>i</sup>* represents the position of the *i*th atom of mass *m<sup>i</sup>* in CHARMM potential *V*:

$$
m_i \ddot{\mathbf{x}}_i = -\nabla \qquad V_{\mathbf{x}_i} - \gamma m_i \dot{\mathbf{x}}_i + \mathbf{R}_i \left( t \right) \tag{2}
$$

The friction coefficient *γ* is related to  $\mathbf{R}_i(t)$  by fluctuation–dissipation;  $\langle \mathbf{R}_i(0) \cdot \mathbf{R}_i(t) \rangle =$  $2m_i k_B T \gamma \delta(t)$ . For bulk water,  $\gamma = 91 \text{ ps}^{-1}$ . During equilibration,  $\gamma$  was decreased to 10 ps<sup>-1</sup> because lower *γ* values accelerate molecular kinetics while yielding identical equilibrium structures. During dynamics, we set  $\gamma = 50 \text{ ps}^{-1}$  to mimic the decreased viscosity within the dendrimer. During both equilibration and production runs, the temperature was set to 300 K.

#### **Results and Discussion**

The binding of G3–NH<sub>3</sub><sup>+</sup>, G3–Ac, and G3–COO<sup>–</sup> to DMPC bilayers was simulated (Figure 2). The energetics, macromolecular structure, and mechanisms of interaction are examined with atomistic detail. The PMF has been calculated along the interaction coordinate defined as the center-of-mass separation for the dendrimer–lipid system from 2.8 to 6.9 nm (Figure 3). The charged dendrimers  $(G3-NH<sub>3</sub><sup>+</sup>$  and  $G3-COO<sup>-3</sup>)$  are more strongly attracted to the lipids than the uncharged dendrimer (G3–Ac). As listed in Table 2, the total free energy released upon interaction with the bilayer is 36, 26, and 47 kcal/ mol for  $G3-NH_3^+$ ,  $G3-Ac$ , and G3–COO– , respectively. The majority of the released energy occurs at smaller separation distances, where the dendrimer and lipid have made contact and the attractive force is large. Within these simulations, G3–COO– released the most energy per molecule upon binding to the DMPC bilayer; however,  $G3-NH_3^+$  released the most energy per mass. As shown in Figure 3B and Table 2 with the mass-weighted energy release of binding per dendrimer is 5.2, 3.2, and  $4.7 \times 10^{-3}$  kcal/g for G3–NH<sub>3</sub><sup>+</sup>, G3–Ac, and G3–COO<sup>-</sup>, respectively. In both the per-molecule and per-mass analyses, G3–Ac released the least energy upon binding.

The derivative of the PMF as a function of the interaction coordinate is the mean force between the dendrimer and lipid bilayer (Figure 4). The attractive force between the dendrimers and lipid bilayers ranged from 0 to 240 pN (Table 2), depending on dendrimer termination and dendrimer–lipid separation distance. The attractive force increases as contact is made between the dendrimer and lipids and decreases to zero as the dendrimer and lipid approach their equilibrium separation distances of  $z \approx 3$  nm. The attractive force before contact is made  $(z > 4.5 \text{ nm})$  seems to depend only on the magnitude of dendrimer charge and not on the sign of the charge;  $G3-NH_3^+$  and  $G3-COO^-$  have similar forces of attraction (≈35 pN) in this range. At distances *z* < 4.5 nm, variables such as number of atoms per dendrimer and terminal group size contribute to the differences between the dendrimers. The maximum attractive force is greatest for the carboxyl dendrimer, the largest of the three dendrimers examined.

The dendrimer structure is affected by the lipids, as quantified by the dendrimers' radii of gyration within each umbrella sampling window. A dendrimer's radius of gyration  $(R_G)$ represents the magnitude by which the dendrimer atoms are stretched out away from their close-packed state.  $R_G$  is calculated according to eq 3, incorporating the dendrimer's mass (*M*) and center of mass  $(\mathbf{x}_0)$ , in addition to each dendrimer atom's mass  $(m_i)$  and position  $(\mathbf{x}_i)$ :

$$
R_{\rm G} = \frac{1}{M} \sqrt{\sum_{i} m_i |\mathbf{x}_i - \mathbf{x}_0|^2}
$$
 (3)

The radius of gyration increases, by 19% on average, as the dendrimer approaches the lipids (Figure 5A). As the system becomes close to the equilibrium separation ( $z < 3.7$  nm) the radius of gyration decreases to approximately the initial, isolated values. The dendrimer elongates in response to the interactions with the lipid and settles into an equilibrated size similar to that without the influence of lipids. Throughout the entire range of interaction

coordinate, the size of the three dendrimers is ordered as  $G3-NH_3^+ > G3-COO^{-3} > G3-Ac$ , with the smallest mass dendrimer demonstrating the largest  $R_G$ .

The asphericity (*A*) is a quantifiable description of how deformed from a reference spherical shape the dendrimer has become (Figure 5B). The asphericity has been calculated according to eq 4 by comparing the eigenvectors  $I_{x,y,z}$  of the dendrimer's moment of inertia matrix:<sup>57</sup>

$$
A=1-3\frac{\left\langle I_xI_y+I_xI_z+I_yI_z\right\rangle}{\left\langle \left(I_x+I_y+I_z\right)^2\right\rangle} \tag{4}
$$

The three dendrimers in this study have similar asphericity ( $A = 0.014$ ) at  $z \approx 6$  nm, which demonstrates the slight asymmetry in the PAMAM dendrimer core. As the dendrimer and lipids become closer, the asphericities of the dendrimers increase to  $A \ge 0.06$  at  $z \approx 4.2$  nm, a 4.3-fold increase. With further decrease in separation, the dendrimer returns to a near spherical shape and settles into the equilibrium interaction coordinate,  $z \approx 3$  nm, with  $A =$ 0.015.

Upon decreasing dendrimer–lipid separation distance the dendrimer stretches normal to the bilayer for greater contact with the lipids. This transition to larger asphericity occurs simultaneously with the increasing dendrimer radius of gyration, increased attractive force to the bilayer, and initial contact between the dendrimer and lipids. The charged dendrimers contact the bilayer at  $z = 5.1$  nm, whereas the uncharged dendrimer does not contact the bilayer until  $z = 4.5$  nm (Figure 2).

Turning from these average quantities, it is useful to examine the distribution of the dendrimer atoms in more detail. This can provide an understanding of the dendrimer structural change upon binding. Normalized histograms of radial atomic positions from the dendrimers' centers of mass demonstrate the distribution of dendrimer atoms (Figure 6A–C) and the terminations (Figure 6D–F). At large bilayer–dendrimer separation, the atoms within the dendrimer are distributed with nearly uniform density. Specifically, the dendrimer terminal groups are distributed throughout the dendrimer with both large and small separation distances. This may be surprising, as the terminal groups might be expected to form an outer shell due to electrostatics. At  $z = 4.5$  nm the charged terminal groups are pulled away from the dendrimer center as they become attracted to the DMPC bilayer.

The atomic details of the dendrimer-lipid interaction have been examined at the equilibrium separation distance for all three dendrimers on the DMPC bilayer. Each atom in the DMPC molecule has been compared by its proximity to the dendrimer, and differences in the binding morphology of the three dendrimers are identified. The individual atoms on the lipid molecules, as labeled in Figure 7A, have been examined via counting how many of each DMPC atom type are within 2, 3, 4, 5, or 6 Å of the dendrimer (Figure 7B). This analysis considers all DMPC atoms of identical structure as a single type, and the resulting count is normalized by the degeneracy of each atom type. The data of Figure 7B has been further compared in Figure 7C by subtracting the data of G3–Ac from the data of G3–NH<sub>3</sub><sup>+</sup> and G3–COO<sup>–</sup>. In this way the binding morphology of the charged terminal groups can be more clearly observed. Conclusions from this data include (1) fewer positively charged choline atoms are close to  $G3-NH_3^+$ , (2) more negatively charged phosphate atoms are close to  $G3-$ NH<sub>3</sub><sup>+</sup>, (3) fewer negatively charged phosphate atoms are close to G3–COO<sup>-</sup>, and (4) G3– NH<sub>3</sub><sup>+</sup> are able to penetrate deeper into the DMPC bilayer and closer to more of the glycerol atoms.

The morphology of the equilibrated structure is examined in terms of the area that the dendrimers occupy over the lipid bilayer. The dendrimers cover an area of 9.6, 8.2, or 7.9 nm<sup>2</sup> for G3–NH<sub>3</sub><sup>+</sup>, G3–Ac, or G3–COO<sup>–</sup>, respectively, with G3–NH<sub>3</sub><sup>+</sup> flattening out the most in covering the greatest area of lipids. This analysis measures the footprint, or the area of their shadow on the lipids. The structures have also been examined by the area of the smallest circle inscribing the projection of the dendrimer onto the bilayer plane. The smallest circles containing the dendrimer have area of 14.9, 9.4, or 10.4  $\text{nm}^2$  for G3–NH<sub>3</sub><sup>+</sup>, G3–Ac, or G3–COO<sup>–</sup>, respectively. By comparing the size of the inscribing circle to the size of the dendrimer footprint, it is revealed how spherically symmetrical and dense the dendrimers are over the bilayer.  $G3-NH_3$ <sup>+</sup> stretches out the farthest on the bilayer, as represented by its largest inscribing circle. These effects are observed qualitatively in the top view of the bound dendrimers in Figure 8. Interestingly, G3–COO– is the largest mass dendrimer but displays the smallest footprint upon binding to the lipids. This is one of the many ways by which the longer termination of G3–COO– affects atomic structure and yields considerable differences from the other terminations.

A final analysis of the morphology of the dendrimers equilibrated on the DMPC bilayers was performed with a Voronoi diagram (Figure 8A–C).<sup>58</sup> Each circle represents the center of mass of a DMPC molecule on the top bilayer leaflet projected onto the bilayer plane. The thin black lines represent the division between DMPC molecules and those points that are halfway between the two closest lipids. This representation provides a mapping of the top DMPC leaflet with which we can map which DMPC molecules are strongly interacting with the bound dendrimers. This has been represented by a coloration of the DMPC molecules on the Voronoi diagram. DMPC molecules that are within 3 Å of the dendrimer for 100% of the acquired simulation frames of the equilibrated structure are colored red; those that are within 3 Å of the dendrimer in 50–100% of frames are colored green, and 1–50% are colored blue.

The surprising result from these Voronoi diagrams is the similarity between the number and distribution of lipids in close proximity to the dendrimers, regardless of the dendrimer termination. All three dendrimers are within  $3 \text{ Å}$  of  $12-13$  particular lipid molecules in all of the simulation frames,  $5-8$  lipids are within 3 Å for  $50-100\%$  of the frames, and  $3-4$  lipids are within  $3 \text{ Å}$  for 1–50% of the frames. Variations between dendrimer binding morphologies (number of lipids, likelihood of switching between lipids, etc.) as a function of dendrimer termination are possible, although not observed over this time scale. Combined analysis of Figure 8 and Table 3 provides a quantitative understanding of bound configuration of a G3 PAMAM dendrimer on a DMPC bilayer.

#### **Conclusions**

Simulations using an implicit solvent model have been performed to quantitatively analyze the interaction between G3 PAMAM dendrimers, of varying terminal chemistry, to DMPC bilayers. These simulations have the advantage of making quantitative PMF calculations computationally feasible but are unable to include solvent or counterion entropic effects. The qualitative conclusions from these simulations are identical to those observed experimentally: charged dendrimers more favorably interact with zwitterionic membranes than do neutral dendrimers. Additionally, these simulations provide a quantitative description of this interaction. An average force of 35 pN attracts the charged dendrimers to the lipid before the dendrimer and lipid make contact with each other. In contrast, neutral dendrimers have negligible interactions. After the dendrimer has made contact with the lipids, average attractive forces of 170, 200, and 240 pN are observed for  $G3-NH_3^+$ ,  $G3-Ac$ , and G3–COO– , respectively. A net free energy release for dendrimer binding to the DMPC bilayers is measured to be 36, 26, 47 kcal/mol and 5.2, 3.2,  $4.7 \times 10^{-3}$  kcal/g for G3–NH<sub>3</sub><sup>+</sup>, G3–Ac, and G3–COO<sup>–</sup>, respectively.

These results are directly applicable to nanodevice design, or other nanoparticles, for medical purposes. This research contributes to the growing understanding of the critical importance of nanoparticle size and surface chemistry to biological activity. Nanodevices utilized for gene delivery applications commonly exploit cationic nanoparticles for strong binding to nucleic acids.<sup>9,10,60–62</sup> However, targeting these gene delivery nanodevices is challenging due to the influence of the remaining charged terminal groups. By further comparing the forces and energies of nonspecific nanoparticle binding to relevant system components, such as targeting moieties and cellular receptors, optimized nanoparticles can be designed and implemented.

## **Supplementary Material**

Refer to Web version on PubMed Central for supplementary material.

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#### **References and Notes**

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#### **Figure 1.**

Composition of a natively terminated first-generation (G1) PAMAM dendrimer and three possible terminations: protonated primary amine  $(-NH_3^+)$ , neutral acetamide  $(-Ac)$ , and deprotonated carboxylic acid (–COO– ). A summary of dendrimer properties is given in Table 1.



#### **Figure 2.**

Images of G3–NH<sub>3</sub><sup>+</sup>, G3–Ac, and G3–COO<sup>–</sup> at center-of-mass separation distances of 6.9, 6.0, 5.0, 4.0, and 3.0 nm from the DMPC bilayer. For *z* > 6 nm, there is no interaction between the dendrimers and lipids. At  $z = 3$  nm the dendrimers are near the equilibrium separation, as determined by the potential of mean force (PMF) (Figure 3). Notice the variation in dendrimers' size, shape, and density, as quantified in Figures 5 and 6. Animations of dendrimers binding to the DMPC bilayer are found in the Supporting Information.



#### **Figure 3.**

Potential of mean forces for dendrimers, of varying termination, binding to DMPC bilayers. (A) shows the energy per molecule binding to the bilayers while (B) shows the energy per mass. The total energy release for the binding is 36, 26, and 47 kcal/mol and 5.2, 3.2, 4.7  $\times$  $10^{-3}$  kcal/g for the G3–NH<sub>3</sub><sup>+</sup>, G3–Ac, and G3–COO<sup>-</sup>, respectively.



#### **Figure 4.**

Attractive force between dendrimers of varying termination and a DMPC bilayer. There is no force at larger separation distances (*z* > 6 nm), which increases to 170, 200, and 240 pN for  $G3-NH_3^+$ ,  $G3-Ac$ , and  $G3-COO^-$ , respectively.

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#### **Figure 5.**

Radius of gyration and asphericity vs interaction coordinate for the three different dendrimers. The dendrimers become influenced by the lipids for *z* < 6 nm, and the radii of gyration and asphericities increase. Both the radii of gyration and asphericities decreases as the dendrimers approach their equilibrium bound states at  $z \approx 3$  nm. These results can be qualitatively observed in the images of the simulation shown in Figure 2.

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#### **Figure 6.**

Atomic distributions for G3–NH<sub>3</sub><sup>+</sup>, G3–Ac, and G3–COO<sup>–</sup> at varying interaction coordinates. The vertical axis is a normalized probability distribution of (A–C) all dendrimer atoms or (D–F) the 32 most terminal carbon or nitrogen atoms in each dendrimer. The horizontal axis is the radial distance from dendrimer center of mass. Results have been averaged over a 4 ns simulation within each sampling window: (A and D)  $z = 3.0$  nm, (B) and E)  $z = 4.5$  nm, and (C and F)  $z = 6.0$  nm.



#### **Figure 7.**

Plot of which DMPC atoms are in close proximity to each dendrimer at the equilibrium dendrimer–lipid separation distance. The atoms in each DMPC molecule have been assigned a number, according to (A), and plotted on the horizontal axis of (B) and (C). Identical DMPC atoms have been assigned the same number, and the results have been normalized appropriately. The vertical axis of (B) represents the average number of DMPC atoms of each type that are within 2, 3, 4, 5, or  $6 \text{ Å}$  of the dendrimer at the equilibrium interaction coordinate. (C) shows the difference between the charged and uncharged dendrimers.



#### **Figure 8.**

(A–C) Voronoi diagram of the top leaflet of the DMPC bilayer with coloration according to portion of time each DMPC molecule is within 3 Å of the dendrimer.(D–F) Top view of dendrimers bound to the bilayer. (A and D)  $G3-NH_3^+$ , (B and E)  $G3-Ac$ , and (C and F)  $G3-$ COO– . (A–C) Circles correspond to each lipid molecule's center of mass projected onto the bilayer plane, and the thin black lines represent the boundaries between lipid molecules. Lipid molecules colored red represent those that are within  $3 \text{ Å}$  of the dendrimer in 100% of the simulation frames; green indicates close proximity 50–100% of the time, and blue indicates 1–50%. The scale bar in each image is 2 nm. (D–F) Lipids are colored gray and dendrimers are colored cyan, blue, white, and red for atom types C, N, H, and O, respectively.

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#### Properties of the G3 PAMAM Dendrimers



<sup>a</sup><br>
All 32 primary amines of each G3 PAMAM dendrimer are converted to one of these three terminal groups, giving the dendrimers a +32e, 0, or – 32e net charge.

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#### **TABLE 3**

Area Occupied by the Dendrimers on the Lipid Bilayer, Analyzed as the Average Area They Shadow or as the Average Area of the Smallest Circle Which Inscribes the Dendrimer Projected onto the Bilayer Plane*<sup>a</sup>*



*a*<br>
The standard deviation of observed areas was 2% for the footprints and 6% for the inscribing circles.