

Computational Biology  
Editor's Choice

# Structure, Dynamics, and Interactions of GPI-Anchored Human Glypican-1 with Heparan Sulfates in a Membrane

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## Abstract

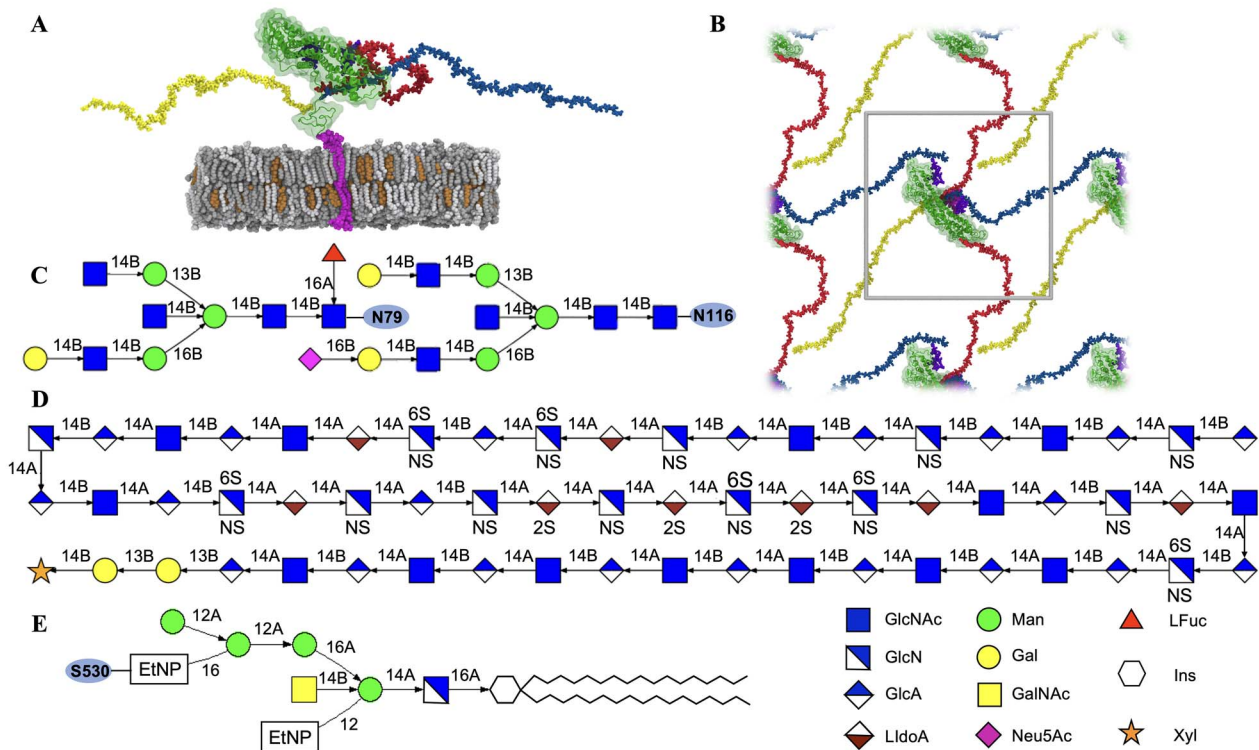
Glypican-1 and its heparan sulfate (HS) chains play important roles in modulating many biological processes including growth factor signaling. Glypican-1 is bound to a membrane surface via a glycosylphosphatidylinositol (GPI)-anchor. In this study, we used all-atom molecular modeling and simulation to explore the structure, dynamics, and interactions of GPI-anchored glypican-1, three HS chains, membranes, and ions. The folded glypican-1 core structure is stable, but has substantial degrees of freedom in terms of movement and orientation with respect to the membrane due to the long unstructured C-terminal region linking the core to the GPI-anchor. With unique structural features depending on the extent of sulfation, high flexibility of HS chains can promote multi-site interactions with surrounding molecules near and above the membrane. This study is a first step toward all-atom molecular modeling and simulation of the glycocalyx, as well as its modulation of interactions between growth factors and their receptors.

**Key words:** heparan sulfates, glycosaminoglycan, glycocalyx, molecular dynamics simulation, glycosylphosphatidylinositol

## INTRODUCTION

Heparan sulfate proteoglycans (HSPGs) are proteins with heparin-like glycosaminoglycan (GAG) chains that can be found on cell surfaces and in extracellular matrices. Evidence supporting their roles in modulating growth factor signaling has accumulated for more than 30 years. Specific interactions between HS chain and growth factors have been meticulously studied (Li et al. 2016, Schlessinger et al. 2000). Membrane-associated HSPGs are either transmembrane proteins (syndecans) or glycosylphosphatidylinositol (GPI)-linked proteins (glypicans) (Kramer and Yost 2003). The extended

HS chains have been proposed to serve as co-receptors that bind both growth factor receptors and their ligands, a hypothesis further supported by studies with free heparin or HS chains (Bernfield et al. 1999). Glypicans and syndecans are found across a wide range of organisms. In drosophila, zebrafish, and xenopus, missing these proteins results in specific phenotypes that indicate their significant roles in growth and development. For example, HSPG facilitates growth factor receptor binding and internalization, which modulate the signal transduction (Li et al. 2016, Schlessinger et al. 2000).



**Fig. 1.** (A) Snapshot of the glypican-1 system: glypican-1 protein in green, N-glycans in purple sticks, heparan sulfates in sticks with HS486 in red, HS488 in blue, and HS490 in yellow, GPI-anchors at both leaflets in magenta sticks, and membrane bilayers colored as van der Waals spheres with POC in dark gray, PSM in gray, and Chol in brown. (B) Top view of the glypican-1 system with the primary simulation system in a gray box and surrounding image systems in the X-/Y-directions. (C) N-glycan sequences used in this study: galactose (Gal), N-acetylglucosamine (GlcNAc), mannose (Man), L-fucose (Fuc), and N-acetylneuraminic acid (Neu5Ac). (D) Heparan sulfate sequence in this study: xylose (Xyl), glucuronic acid (GlcA), glucosamine (GlcN), and iduronic acid (IdoA). Sulfation of sugar residues is denoted by the letter 'S'. (E) GPI-anchor sequence: phosphoethanolamine (EtNP) and myo-inositol 1-phosphate (Ins). Linkages are given by numbers and anomeric configurations by letters, e.g., an  $\alpha$ -(1  $\rightarrow$  4)-linkage is denoted by '14A' and a  $\beta$ -(1  $\rightarrow$  4)-linkage is denoted by '14B'.

Recent studies have identified changes in specific glypican expression levels in many different cancer types, indicating their key roles in the growth factor interactions and in many types of cancer (Wang et al. 2019).

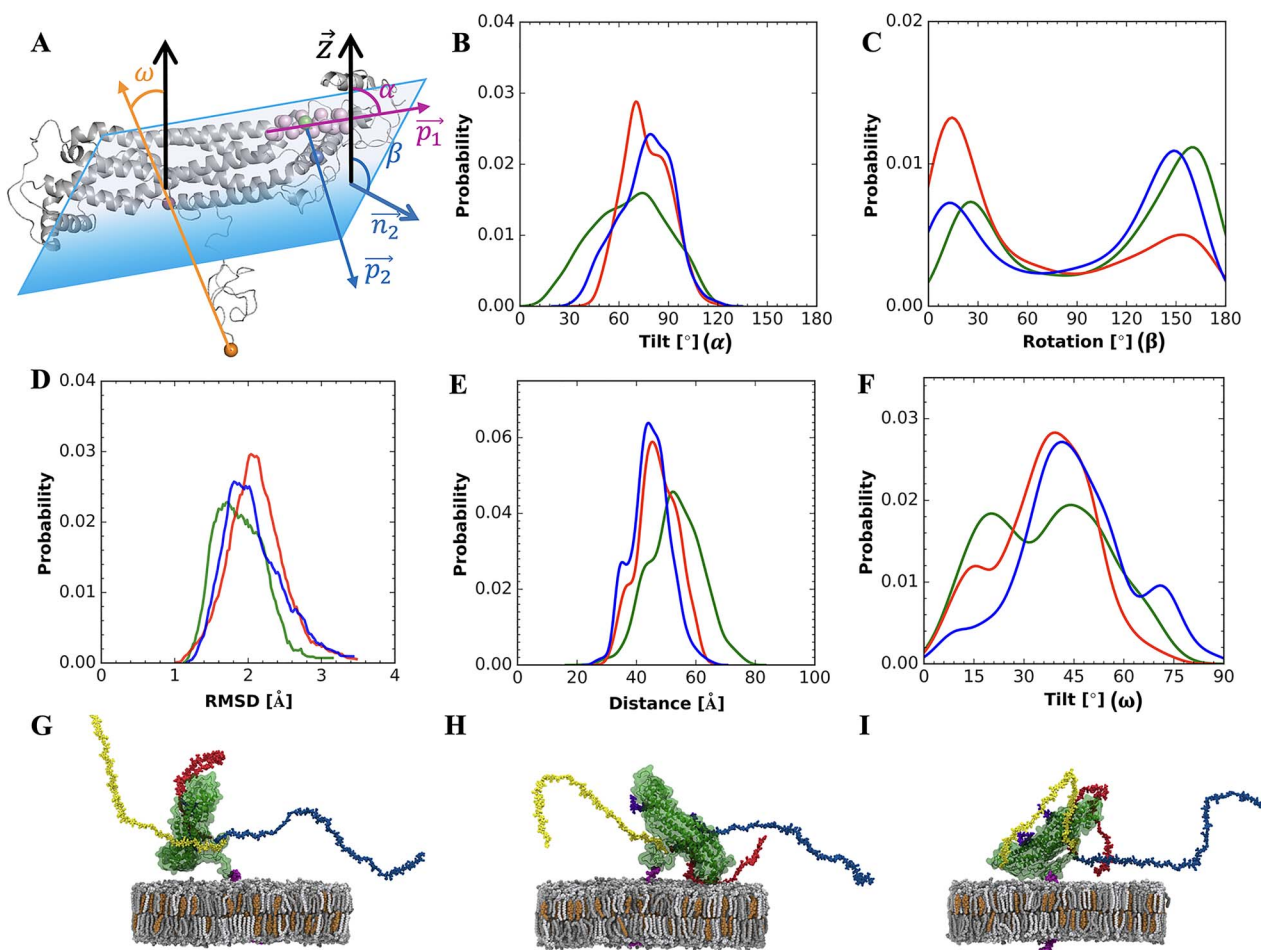
In addition to modulating growth factor signaling, specific HSPGs appear to have additional roles. For example, syndecan-4 interacts with the cytoskeleton for cytoplasmic signaling and is critical for cell migration during development of multiple tissues (Morgan et al. 2013). Syndecan-1 and glypican-1 appear to be important in endothelial responses to fluid shear stress (Zeng et al. 2018) that control nitric oxide production (Ebong et al. 2014, Svensson et al. 2012, Tarbell et al. 2014). Syndecans are required for the 24-hr realignment of endothelial cells in response to flow (Ebong et al. 2014). In addition, HSPGs appear to be important in development of synaptic specificity (Condomitti and de Wit 2018).

HS chains are composed of repeating units of disaccharides that vary in length between tissues (Shi and Zaia 2009) and are linked to the proteins with a short linkage region. The sulfate groups are attached in the Golgi by specific enzymes, resulting in HS chains with regions of varying sulfation (Carlsson et al. 2008). Despite similarly modified chains, differences in HS chain length may exist between different proteins in a single cell type (Tumova et al. 2000). Studies of free HS chains indicate some flexibility in the longer chains (Khan et al. 2013). HSPGs on the surfaces of most cell types contribute 50 to 90% of GAGs in the glycocalyx that surrounds single cells

in culture (Tarbell et al. 2014), and similar glycocalyx complexes have been studied on the apical surfaces of epithelial and endothelial cells. Besides the HSPGs, the glycocalyx contains chondroitin sulfate chains, hyaluronic acid, and glycoproteins. These components are tissue specific, and the glycocalyx may range between 500 nm and tens of micrometers (Ebong et al. 2011), extending the reach of cells away from the plasma membrane. Intriguingly, many viruses associate with HS chains or other glycocalyx components during the process of initial viral attachment to the cells. Herpes simplex virus I even uses HSPGs to gain internalization (Cagno et al. 2019).

In humans, there are six glypicans divided into two subgroups and four syndecans (type I membrane proteins that connect to the cytoplasm). The best studied glypican is glypican-1, and its N-terminal well-folded core domain structure has been determined to be a cylinder-like shape (Svensson et al. 2012). A disordered C-terminal domain contains the attachment sites of three closely spaced HS (close to the folded core) and the GPI-anchor (at the C-terminal end). GPI-linked proteins have more freedom than transmembrane proteins to move in the plane of the membrane due to the lack of cytoskeletal links (Svensson et al. 2012). However, the HS chains of both HSPG types have been determined to interact with growth factor receptors and other proteins, which may limit their mobility.

Despite some structural information for HS chains and HSPG proteins, our current understanding of their function is largely based on physiological outcomes. More specific structural and dynamic



**Fig. 2.** (A) Schematic representation of glypican-1 core tilt ( $\alpha$ ), rotation ( $\beta$ ), and C-terminal tilt ( $\omega$ ) angles with respect to the Z axis, i.e., the membrane normal; see the main text for their definition. The selected residues used to define  $\alpha$  and  $\beta$  are shown as van der Waals spheres with pink (Glu75-Arg90), green (Ala83), blue (Pro244), red (Gly473), and orange (Ser530). (B–C)  $\alpha$  and  $\beta$  angle distributions. (D) Distributions of root mean square deviation (RMSD) of glypican-1 core helical domain. (E–F) End to end distance (between Gly473 and Ser530) and  $\omega$  angle distributions. Note that each color in (B–F) represents each replica among three replicas: red for replica-1, green for replica-2, and blue for replica-3. (G–I) Snapshots at 300 ns, 100 ns, and 100 ns for (G) replica-1, (H) replica-2, and (I) replica-3.

information about HSPG proteins and the HS chains is required to facilitate a better understanding of their functions. This knowledge can be obtained from all-atom simulations of the protein, associated HS chains, and the surrounding membrane. The utility of this approach is demonstrated by a recent investigation showing that syndecan-4, the HSPG required for elongation and alignment of endothelial cells with flow, undergoes conformational changes and mediates the transmission of shear forces to the cell surface (Jiang et al. 2017).

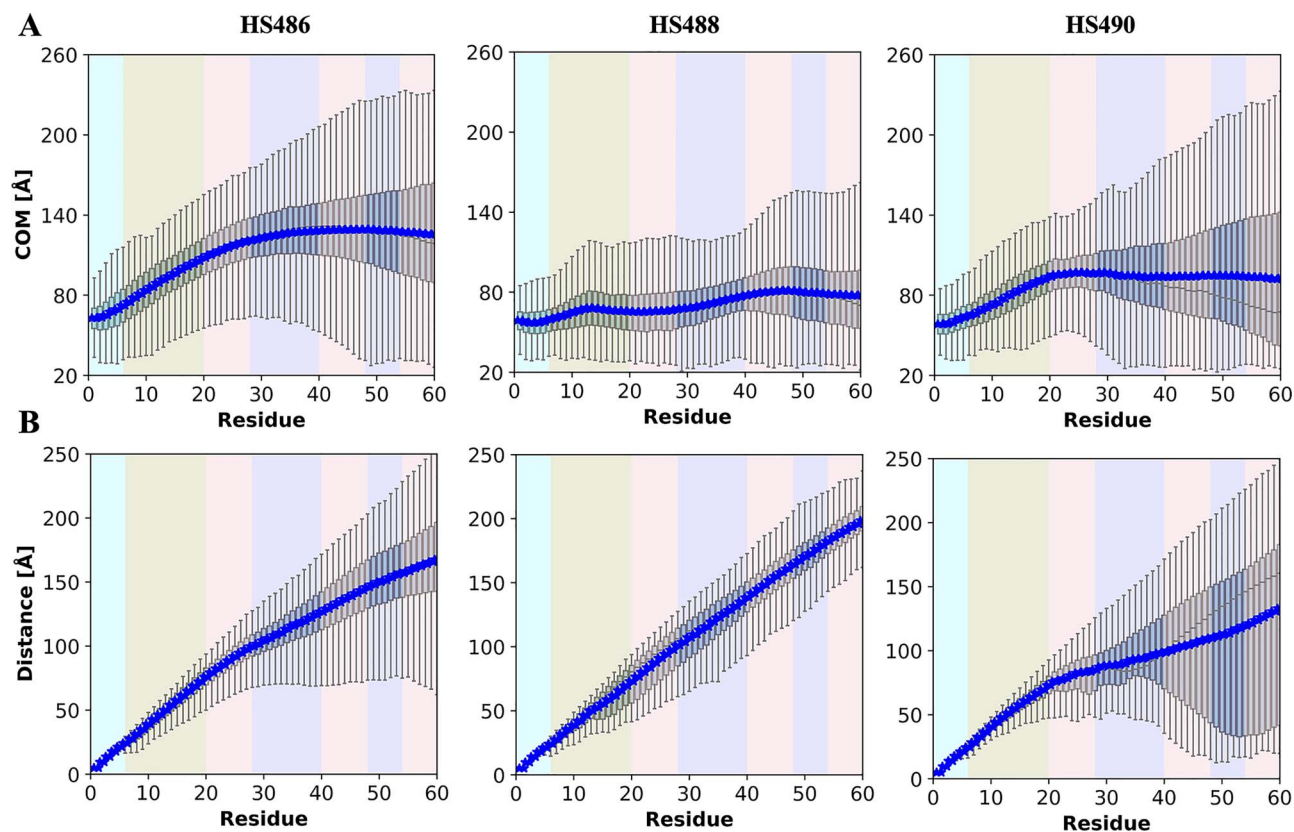
In this work, we have performed all-atom molecular modeling and simulation of GPI-anchored glypican-1 with three HS chains in a lipid bilayer in order to explore the landscape of their possible structure, dynamics, and interactions. We observe high stability of the folded glypican-1 core, and find that the flexible unstructured C-terminal domain linking the core to the membrane anchor gives the core a large amount of freedom to tilt and rotate relative to the membrane. We also find that the HS chains are highly dynamic with local flexibility related to the degree of sulfation of the chain. The flexibility of the GAGs allows for the possibility of multiple interaction sites; during the simulation, they make contact with the neighboring glypican-1

protein core, other HS chains on the same glypican, HS chains on neighboring glypicans, ions in solution, especially the sulfated residues, and surrounding lipid head groups. This GAG flexibility makes it possible to imagine the interactions of these chains with the growth factor and its receptor complexes, as well as cell adhesion structures, viruses, and other players. The simulated system also provides opportunities to begin exploring some of these interactions at the molecular level.

## RESULTS AND DISCUSSION

### Orientations of the glypican-1 core domain and the C-terminal domain are highly dynamic

To gain insights into the structure, dynamics, and interactions of GPI-anchored glypican-1 carrying three HS chains in a membrane bilayer, we performed 1- $\mu$ s all-atom molecular dynamics (MD) simulations with three independent replicas. The model structures of the membrane along with N-glycans, HS chains, and GPI-anchor are presented in Figure 1A and 1B. The N-glycan sequences at Asn79 and



**Fig. 3.** (A) Center of mass of the Z coordinate ( $Z_{COM}$ ) of each residue in heparan sulfate chains HS486, HS488, and HS490. Z = 0 is set to the bilayer center. (B) Distance of each residue in each heparan sulfate chain to its Ser residue. In (A) and (B), the background is shaded to show linker (cyan), non-sulfated NA domain (brown), highly sulfated NS domain (blue), and less-sulfated transition NS/NA domain (pink). Note that in each figure, the averaged values are represented as blue points, the first 25%–75% ascending values in shaded boxes, and remaining values as black lines.

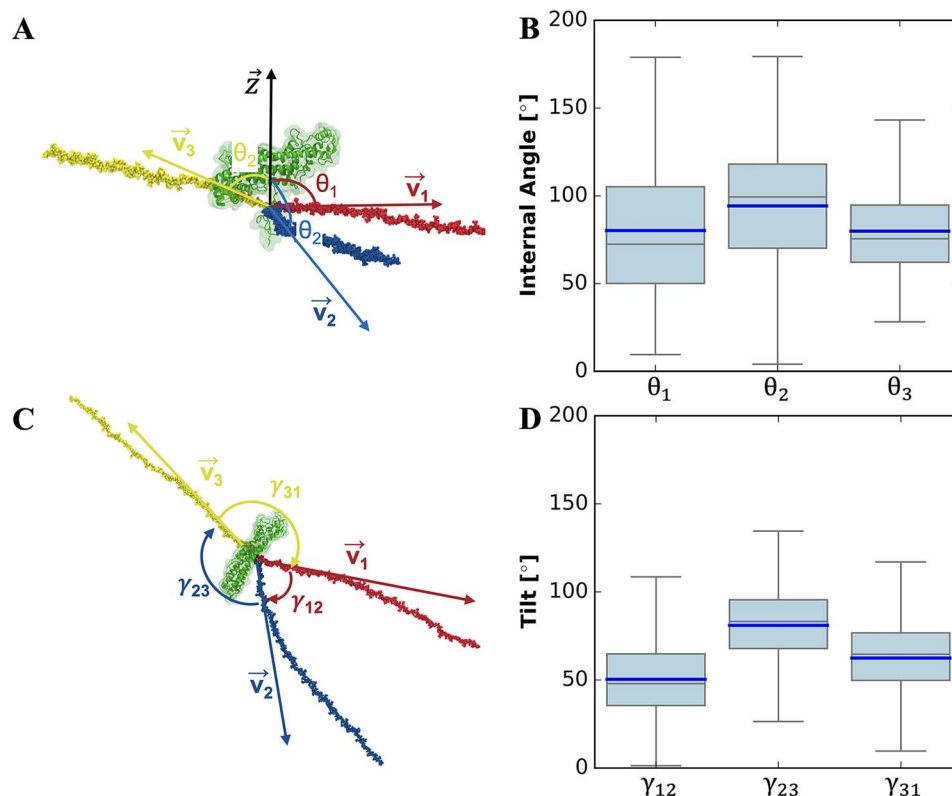
Asn116 (Figure 1C) were chosen according to the previous experimental work (Awad et al. 2015). A single glypican-1 protein was modeled with the missing unstructured C-terminal domain (Asn474-Ser530) and three HS chains of the same structure (Figure 1D) located at Ser486, Ser488, and Ser490 (Carlsson et al. 2008). The HS sulfation patterns are complicated and cell/tissue specific rather than being specific for the protein cores. Therefore, in our work, we simply followed the HS sequence in reference (Carlsson et al. 2008). The GPI anchor sequence is shown in Figure 1E. A detailed description of the model structures and procedures of system preparation are presented in the Methods section.

To investigate the orientation of glypican-1 in a bilayer, tilt ( $\alpha$ ) and rotation ( $\beta$ ) angles of the glypican-1 core domain, as well as tilt angle ( $\omega$ ) of the unstructured C-terminal domain, are characterized (Figure 2A). Part of helices (Glu75-Arg90) and two residues (Ala83 and Pro244) located on one side of the protein were selected to describe  $\alpha$  and  $\beta$ . A principal vector ( $\vec{p}_1$ ) of Glu75-Arg90 was used to define  $\alpha$  as the angle between  $\vec{p}_1$  and  $\vec{z}$  (unit vector in the Z direction). A vector ( $\vec{p}_2$ ) from Ala83 to Pro244 was used to define  $\beta$  as the angle between the normal vector ( $\vec{n}_2$ ) formed by  $\vec{p}_1 \otimes \vec{p}_2$  and  $\vec{z}$ . The angle  $\omega$  and the end-to-end distance ( $D_{EE}$ ) of the C-terminus domain were defined using Gly473 and Ser530.

Figures 2B and 2C show  $\alpha$  and  $\beta$  angle distributions. The distributions of  $\alpha$  are ranging from  $0^\circ$  to  $120^\circ$  for replica-2 and from  $30^\circ$  to  $120^\circ$  for replica-1 and 3. For  $\beta$ , the angle distributions are ranging from  $0^\circ$  to  $180^\circ$  for all replicas, indicating that the protein structure undergoes large orientational changes with respect

to the membrane. To investigate the structure change of the glypican-1 helical core domain, the root-mean-square deviation (RMSD) is employed (Figure 2D). The RMSD values only fluctuate around 1–3 Å for all replicas, indicating that the glypican-1 core domain undergoes large fluctuations in terms of its orientation relative to the membrane while the structure itself remains stable during the simulation time. This is further confirmed by the secondary structure analysis of glypican-1 for all replicas (Figure S1). No significant changes in the secondary structures were observed during the entire simulation time.

It is noteworthy that the core domain rotates to almost parallel to the membrane normal with the helical vector  $\vec{p}_1$  pointing upward for replica-1, making  $\alpha$  small ( $14^\circ$ ). On the other hand, for replica-2 and replica-3 with  $\vec{p}_1$  pointing downward, the  $\alpha$  values become very large ( $\sim 150^\circ$  for replica-2 and  $\sim 163^\circ$  for replica-3). Glypican-1 has a long unstructured C-terminal domain (i.e., Asn474-Ser530), such that the core domain can be located quite far away from the GPI-anchored point, especially when the C-terminal region is extended. Figures 2E and 2F show the dynamics of the C-terminal domain, represented by  $D_{EE}$  and  $\omega$ . To illustrate the magnitude of the fluctuations, snapshots were taken from each replica at 300 ns (Figure 2G) and 100 ns (Figure 2H-I).  $D_{EE}$  fluctuates in a range of 20–70 Å in replica-1 (red in Figure 2E and a snapshot in Figure 2G). In Figure 2G, it is evident that the entire core protein with the C-terminal domain extended ( $D_{EE} \sim 70$  Å) moves to one side of the membrane while the GPI anchor stays near the center. On the other hand, by the end of 100 ns of replica-3 (blue in Figure 2E and



**Fig. 4.** (A, C) Schematic representations of tilt angles ( $\theta$ ) of each heparan sulfate chain with respect to the Z axis and internal angles ( $\gamma$ ) between each pair of heparan sulfate chains. For the representation of each chain direction, a vector was defined from the Ser residue bearing each heparan sulfate to the center of mass of the linker-NA domains. (B, D) Box plots of angle distributions defined in (A) and (C) with the mean values in blue lines, the first 25%–75% ascending values in light blue boxes and remaining values in black lines. Note  $\vec{v}_1$  for HS486,  $\vec{v}_2$  for HS488, and  $\vec{v}_3$  for HS490.

a snapshot in Figure 2I),  $D_{EE}$  is relatively short and close to the initial value. Accordingly, in Figure 2I, the glypican-1 core domain does not move far away from the GPI-anchored point, compared to the starting position (Figure 1A). In Figure 2F,  $\omega$  shows a large fluctuation between  $0^\circ$  to  $90^\circ$ . Replica-1 in Figure 2G has a  $\omega$  value of around  $70^\circ$  whereas  $\omega$  of replica-3 in Figure 2I is only around  $10^\circ$  (see also Supplemental Movie S1-S3 for snapshots of each replica). Svensson et al. (Svensson et al. 2012) predicted that this long C-terminal domain might give the core protein a large freedom in terms of orientation relative to the membrane. Since both the core domain and the HS chains play important roles for brain function, such a large orientational freedom of glypican-1 (core domain as well as HS chains) may enhance the process of binding, activating, or transporting growth factors and enzymes (Jen et al. 2009).

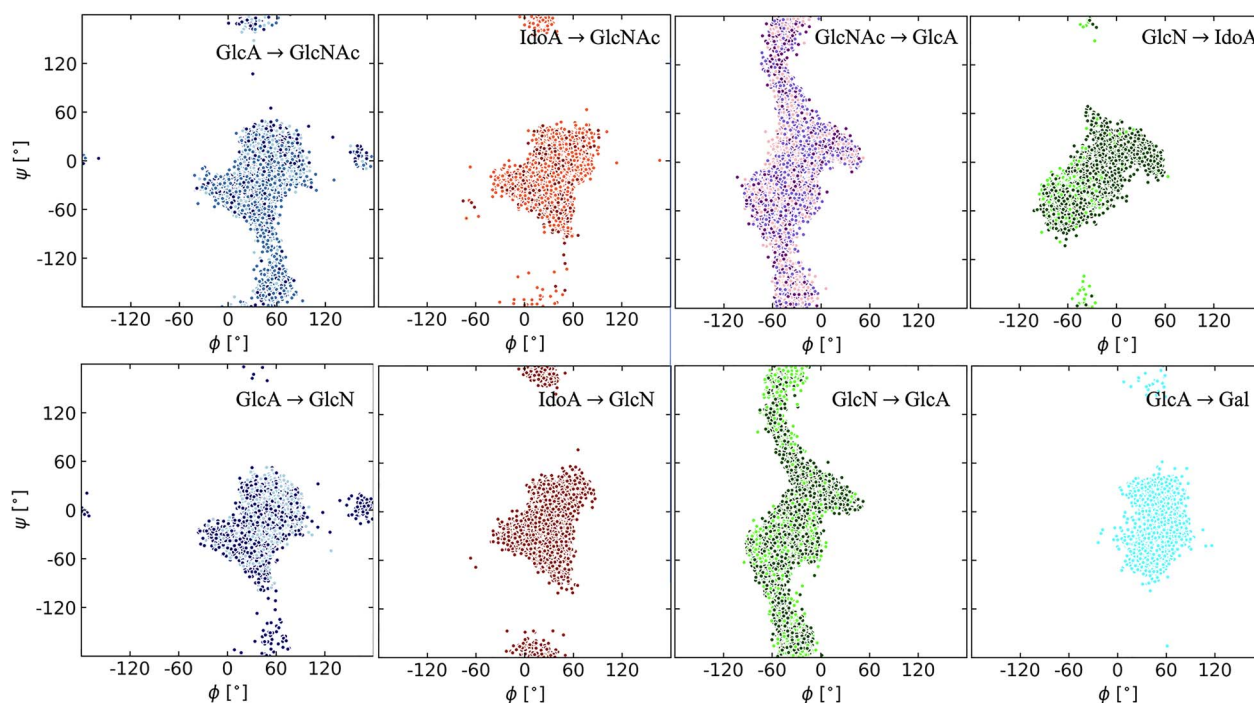
### Heparan sulfates show high flexibility

Figure 3 represents the center of mass of the Z coordinates ( $Z_{COM}$ ) of each residue in HS chains and the distance ( $D_{O-S}$ ) between each HS residue and the Ser residue bearing its HS chain. The shaded area colors show different HS domains: a non-sulfated NA domain, a highly-sulfated NS domain, and a less-sulfated transition NS/NA domain. Every residue shows a large range of  $Z_{COM}$  (20–220 Å), especially the ones in the NS and NS/NA domains. Note that rotation of glypican-1 core domain and the extension of the C-terminal domain also influence the  $Z_{COM}$  range. As the glypican-1 core rotates, as shown in Figure 2G, one of the HS chains shows a higher  $Z_{COM}$  than the other two. However, by considering the averaged

behaviors of all replicas over the entire simulation time (blue points), there is no significant difference among HS chains. An averaged plateau or slight decrease in  $Z_{COM}$  with a larger fluctuation range toward the terminal HS residues (especially HS486) is due to the fold back of HS chains. Interactions between these terminal HS residues of each chain and the glypican-1 core protein is elaborated below.

As for  $D_{O-S}$ , a much smaller variation is observed from the non-sulfated residues (linker and NA domains). As shown in Figure 3B, these linker and NA domains exhibit quite linear correlations while the remaining parts of the HS chains do not always show this pattern. The last residue on each chain shows the largest  $D_{O-S}$  fluctuation varying from 10–250 Å. For example, referring to Figure 2I, the last 20 residues of HS490 fold back to and interact with the glypican-1 core domain, resulting in relatively small  $D_{O-S}$ . This particular conformation persists in this chain, showing various modes of interactions between glypican-1 and HS chains.

In order to gain a better understanding of the orientation of each HS chain, we characterize the tilt angle ( $\theta$ ) of each chain as well as the internal angle ( $\gamma$ ) between each pair of the chains (Figure 4). The linker and NA domains of each chain roughly preserve a linearly extended polysaccharide conformation (Figure 3B) and thus were used to define  $\theta$  and  $\gamma$ . Figure 4B shows that each HS chain exhibits a large range of  $\theta$  fluctuations. HS486 ( $\theta_1$ ) shows the largest range of  $170^\circ$  (10– $180^\circ$ ), while HS490 ( $\theta_3$ ) shows the smallest range of  $115^\circ$  (30– $145^\circ$ ). The same trend is observed in  $Z_{COM}$  (Figure 3A), where  $Z_{COM}$  fluctuations in non-sulfated domains of HS486 are the largest. When considering the 50% data around the mean value (light blue boxes in Figure 4B), the fluctuation of each



**Fig. 5.** Distributions of the glycosidic dihedral angles of the disaccharide units in HS486. Data points were colored based on the domain: GlcA (linker) in cyan, GlcA (NA) in light blue, GlcA (NS/NA) in blue, GlcA (NS) in dark blue; IdoA (NS/NA) in orange, IdoA (NS) in brown; GlcNAc (NA) in light purple, GlcNAc (NS/NA) in pink; GlcN (NS/NA) in lime, and GlcN (NS) in dark green. The glycosidic dihedral angles  $\phi$  and  $\psi$  are defined by H1'-C1'-O(n)-C(n) and C1'-O(n)-C(n)-H(n), where n is the linkage position, and a prime represents an atom from a sugar (n + 1) in the polysaccharide.

chain is much smaller:  $55^\circ$  ( $50\text{--}105^\circ$ ) for  $\theta_1$ ,  $45^\circ$  ( $70\text{--}115^\circ$ ) for  $\theta_2$ ,  $30^\circ$  ( $65\text{--}95^\circ$ ) for  $\theta_3$ . Initially, each chain was placed horizontally ( $90^\circ$ ). Averaged over the entire simulation time, all chains still stay around  $90^\circ$ . HS488, on the other hand, shows slightly larger  $\theta$ . This is mainly due to multi-site interactions with the glypican-1 core protein in the neighboring system (blue in Figure 2I and see below).

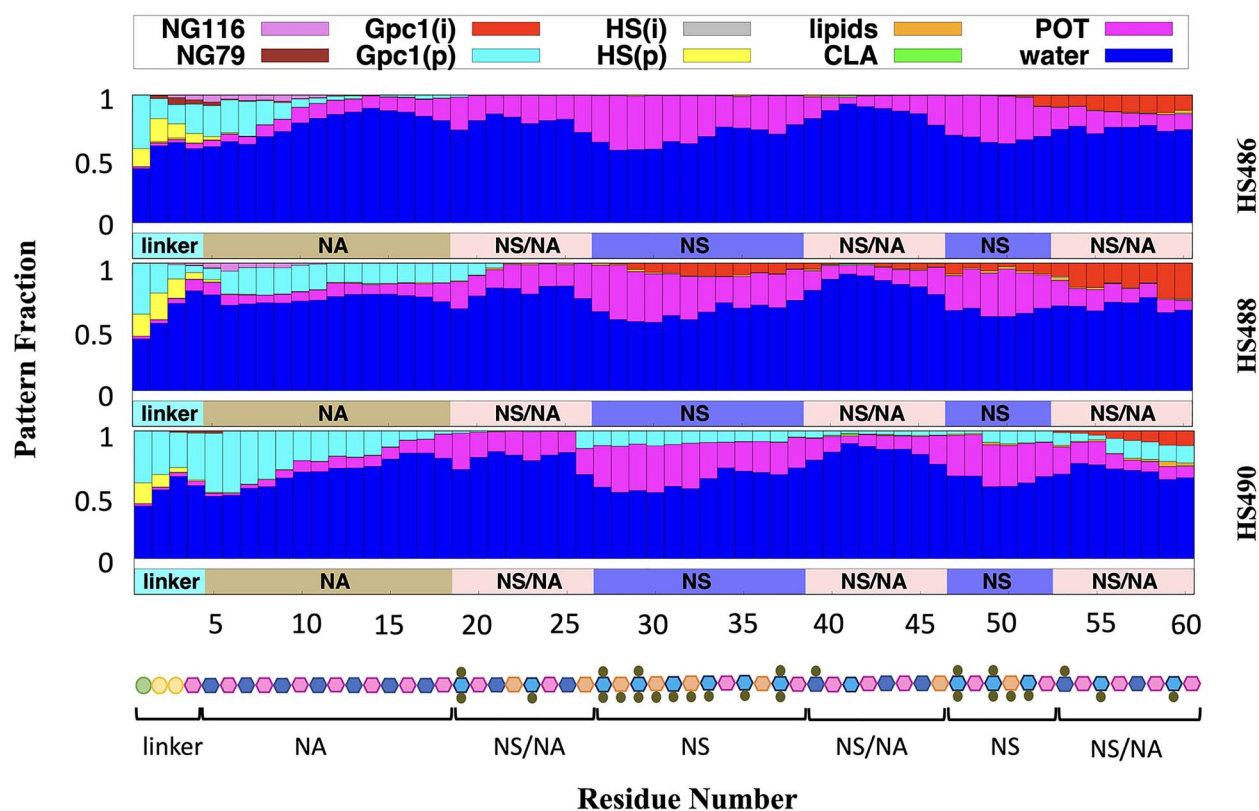
Angle  $\gamma$  was employed to represent the angle between the chains (Figure 4C and D). The fluctuations among three  $\gamma$  angles show similar range around  $60^\circ$  ( $0\text{--}120^\circ$  for  $\gamma_{12}$ ,  $30\text{--}135^\circ$  for  $\gamma_{23}$ , and  $15\text{--}120^\circ$  for  $\gamma_{31}$ ). Each HS chain was built based on the sequence in the Figure 1D and equilibrated before the production simulations. Influenced by the initial locations of Ser residues,  $\gamma_{12}$  is smaller than the other two on average.

### Heparan sulfates show diverse structural heterogeneity

Figure 5 represents the glycosidic torsion angle distributions of the disaccharide units in HS486 and the results are similar for HS488 and HS490 (Figure S2 and S3). The central region of the  $\phi/\psi$  scatter plots is highly populated for all glycosidic linkages of the polysaccharides, which corresponds to a *syn*-conformation of disaccharide elements in a HS chain. This is the main conformational state observed for D-GlcA-( $\beta 1 \rightarrow 3$ )-D-Gal, which is present in the linker region, although a second state, referred to as an *anti- $\phi$*  conformation (Landersjö et al. 1997), is also present to some extent. For D-GlcA-( $\beta 1 \rightarrow 4$ )-D-GlcNAc and D-GlcA-( $\beta 1 \rightarrow 4$ )-D-GlcN, some excursions occur to *anti- $\phi$*  or *anti- $\psi$*  conformations (Höög et al. 2001) where  $\phi \approx 180^\circ$  or  $\psi \approx 180^\circ$ , respectively. In comparison to these GlcA-containing disaccharides, similar torsion angle distributions are observed also

for L-IdoA-( $\alpha 1 \rightarrow 4$ )-D-GlcNAc and L-IdoA-( $\alpha 1 \rightarrow 4$ )-D-GlcN, a result which to a first approximation is anticipated since  $\beta$ -D-hexoses and  $\alpha$ -L-hexoses show a similar conformational space at their respective glycosidic linkages (Widmalm 2013). In contrast, D-GlcNAc-( $\alpha 1 \rightarrow 4$ )-D-GlcA and D-GlcN-( $\alpha 1 \rightarrow 4$ )-D-GlcA display a band-like region that is populated along the  $\psi$  torsion angle. For D-GlcN-( $\alpha 1 \rightarrow 4$ )-L-IdoA, the conformational region corresponds to a *syn*-conformation. Thus, the HS chains exhibit flexibility at  $\psi$  torsion angles, to some degree for the  $\beta$ -linked residues and to a larger extent for the  $\alpha$ -linked residues.

Though there is only a small difference for the glycosidic dihedral angles between  $\alpha$ -linked L-IdoA and  $\beta$ -linked D-GlcA residues, their ring conformation shows significant differences (Figure S4 and S5). The most abundant ring conformation of D-GlcA is  ${}^4C_1$  and that of L-IdoA is  ${}^1C_4$  (see ring conformations in Figure S4). Since the  ${}^1C_4$  chair conformation is a low energy state for GlcA, it does not show any notable conformational change during the simulation period. In contrast, the  ${}^2S_0$  skew conformation can be observed for IdoA for a significant time period (as high as 14% of the entire simulation time in one case) (Hsieh et al. 2016). By clustering IdoA ring conformations by neighboring residue types, one can represent the fraction of different ring conformation occurrence (Figure S5). Specifically, IdoA22 and IdoA26 (red) are followed by sulfated sugar residues; IdoA28, IdoA30, and IdoA32 themselves (blue) are sulfated; IdoA36 and IdoA46 (green) have both neighboring residues that are sulfated; and IdoA50 (cyan) follows a sulfated sugar residue. Note that the numbering of HS chain residues starts from the reducing end (i.e., Xyl as residue 1). Clearly, IdoA36 and IdoA46 (green) have the highest probability of having  ${}^2S_0$  conformations and IdoA22 and IdoA26 (red) have some. Transitions from  ${}^1C_4$  to  ${}^5S_1$  or  ${}^2S_0$  and



**Fig. 6.** Averaged interaction patterns of each HS residue with its environment over the entire simulation time of three replicas. The interaction pattern graph shows the frequency of occurrence within 4 Å from each of N-glycan 116 (pink), N-glycan 79 (brown), glypican-1 in the primary system (cyan), glypican-1 in the periodic image system (red), heparan sulfates in the primary system (yellow), heparan sulfates in the image system (gray), lipids (orange),  $\text{Cl}^-$  (green),  $\text{K}^+$  (purple), and water molecules (blue). Bottom panel shows the schematic of the linker, NA, NS/NA, and NS domains.

between  ${}^5S_1$  and  ${}^2S_0$  took place during the simulations (Figure S4). Furthermore, IdoA residues having  ${}^2S_0$  conformations also show a similar fraction of time in  ${}^5S_1$  conformations (Oborský et al. 2013), which in these simulations are populated to a larger extent than the more commonly observed  ${}^2S_0$  conformation.

### Heparan sulfates show multi-site interactions with surrounding molecules

As shown in Figure 3 and 4, each HS chain shows high dynamic fluctuations in  $Z_{\text{COM}}$  and the internal angle  $\theta/\gamma$ . Thus, the polysaccharides are very likely to interact with various components in the system. Figure 6 shows the averaged interaction patterns of each residue in the HS chains over the entire simulation time. Clearly, sugar residues near glypican-1 protein (i.e., the linker and most part of NA domains) interact with glypican-1 (cyan color bars) for a significant portion of the simulation time. Furthermore, some linker residues also show interactions with other HS chains due to proximities between Ser486, Ser488, and Ser490. Specifically, there is a notable interaction of HS490 with the glypican-1 core protein (cyan color bars). This represents the fold-back behavior of the chain.

Clearly, the terminal residues of each chain are able to interact with other HS chains from the neighboring periodic image system. As shown in Figure 1B, terminal residues of HS488 can interact with the linker domain of HS488 from the periodic image system with a more or less stretch conformation. Interactions of HS chains

with each other are highly stochastic due to their high flexibility and the relatively large system size. It is important to note that, due to the selected membrane bilayer size in this work, HS chain interactions with neighboring glypican-1 protein has been observed in all chains, with the probability of no more than 10% of the time on average. Interacting with the neighboring protein mostly happened near the ending residue on each chain, while HS488 also show some central residues (NS domains) contributing to this interaction pattern. As also shown in Figure 4B, this central NS domain-neighboring protein interaction leads to a relatively higher internal angle of chain HS488 (blue in Figure 2I). As indicated by other groups (Clausen et al. 2020, Jiang et al. 2020), these interactions are predominantly electrostatic by nature. Therefore, if glypican-1 density were higher than the current system or HS chains were longer than the current one, more interactions of HS with neighboring HS and glypican-1 (or core protein) would be expected, perhaps forming dense HS chain networks.

Besides some interactions with glypican-1, other HS chains, and water molecules, each charged sugar residue is mostly interacting with  $\text{K}^+$  ions. The more sulfated sites each residue has, the higher the interaction possibility is with  $\text{K}^+$  ions. For example, the NS domains that contain most charged sugar residues show up to 50% probability of interacting with  $\text{K}^+$ , and NA domains that have the least charged sugar residues have only around 10% probability of interacting with  $\text{K}^+$ . This trend is the same for different HS chains. In addition to this, some residues also interact with lipid head groups

(Figure 2H and Figure 6 of HS488). Sugar residues in NS and NS/NA domains show a small probability (less than 2%) of interacting with lipid acyl chains. In addition, as seen in Figure 3A, these residues infrequently fall into the interaction range of lipid head groups ( $< 30 \text{ \AA}$ ).

## CONCLUSIONS

In this study, we describe the structure and dynamics of glypican-1 and its three HS chains and their interactions with the surrounding environment. The glypican-1 core domain structure remains stable during the simulation period (RMSD  $\sim 2 \text{ \AA}$ ), but exhibits large variations in terms of its distance and orientation with respect to the membrane. The unstructured C-terminal domain connecting the core domain to the GPI anchor is relatively long and contains more than 50 residues (Asn474-Ser530) including the three HS sites (Ser486, Ser488, and Ser490). It is the conformational flexibility of the unstructured C-terminal domain that gives the glypican-1 core domain a significant freedom for its movement and orientation. The observed extension of the unstructured domain also offers accessibility of enzymes to add and modify HS chains. We speculate that such conformational plasticity in the unstructured domain may enhance membrane association by decoupling the small GPI anchor from large movements of the larger core domain. The effectiveness of this mechanism could be explored in future experiments by measuring membrane dissociation rates.

Another possible function of the unstructured domain may be to modify the mechanical response of the protein to shear stress. One important result from this simulation is the value of the average distance between the core domain and the lipid membrane. This quantity is of interest to experimentalists and theorists investigating how shear flow may affect glycocalyx molecules. Calculations and experiments show that the size and shape of the aqueous part of lipid-anchored proteins determine how much force shear flow can apply to the lipid anchor (Jönsson et al. 2011, Jönsson and Jönsson 2015). Hu et al. compared the drift velocity of streptavidin bound to biotinylated lipids with or without a 4-carbon acyl chain link between the lipid head group and the biotin, and found that the presence of the link allowed the complex to move twice as fast. The link increased the height of the avidin molecule above the membrane, and also reduced the friction between the avidin and surrounding lipids (Hu et al. 2016). Further experiments and simulations are required to explore this possibility.

It has been shown that HSPG serves as a receptor or attachment factor for a number of viruses, such as herpes simplex virus, Dengue virus, and human papillomavirus (see Cagno et al. (Cagno et al. 2019) for a complete list). Typically, viruses interact with the negative charges of HSPG through the basic residues of viral surface proteins. Such interactions increase the concentration of viruses on the surface of host cells. The viruses then interact with more specific entry receptors to achieve cell entry. Therefore, HSPG has been proposed as a broad-spectrum antiviral target. Several HSPG-mimicking compounds are currently under clinical trials to assess their antiviral efficacy. Notably, recent studies suggest that severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2), the virus causing the coronavirus disease 2019 (COVID-19) pandemic, can interact with HSPG through its surface spike protein (Clausen et al. 2020, Hao et al. 2020, Liu et al. 2020). SARS-CoV-2 spike protein was shown to bind heparin with an affinity ( $K_d$ ) of 55 nM and that the interaction can be inhibited by a HS oligosaccharide (Liu et al. 2020). Another study showed that the spike protein binds HS in a sulfation-dependent

manner, and it does not bind sialic acid residues. Moreover, HS binds the polybasic residues near the S1/S2 junctional region of SARS-CoV-2 spike. This interaction can stabilize the S protein trimer in the open conformation to facilitate the binding between the receptor binding domain of spike and angiotensin-converting enzyme 2, the major entry receptor of SARS-CoV-2 (Hao et al. 2020). Therefore, the computational model presented in the current study can be potentially used to elucidate the dynamic interactions between viruses (including SARS-CoV-2) and HSPG in a more physiological setting, as well as to aid in the development of broad spectrum antivirals to block virus entry.

Furthermore, observed variations in the position, end-to-end distance, and orientation of each HS chain reflect its flexibility and high dynamic nature. Residues on each HS chain can interact with multiple chemical moieties in the environment, including ions, lipid head groups, and the glypican-1 core protein and HS chains in the primary system, as well as neighboring periodic image systems. We find that more sulfated residues show a higher probability to interact with  $K^+$  ions and lipid groups.

Such variability and mobility of HS chain orientations along with the range of interactions indicate that the glypican HS chains can clearly interact with growth factors, their receptors, adhesion molecules, and more at the cell surface. Furthermore, it is clear that even a single glypican HSPG can bridge such molecules over fairly significant distances due to the variable extensions and orientations of the HS chains and the unstructured C-terminal domain. This study provides an important step to begin analysis of the specific interactions that are involved in HSPG linking of growth factors with their receptors as well as other HSPG-facilitated interactions on the surface. Observed differences in  $K^+$  interactions make it clear that interactions with HS binding sites in other proteins, e.g. growth factors, could be examined in future studies. The data here also support that virus particles interacting with multiple HS chains from different HSPGs could facilitate clustering and thereby induce internalization. It will be interesting to see how the high dynamic fluctuation and interaction pattern change with a HS chain sequence with different sulfation patterns and lengths.

## MATERIALS AND METHODS

All simulations were performed with GROMACS (Abraham et al. 2015). The CHARMM36(m) force field was employed for lipids (Klauda et al. 2012, Klauda et al. 2010), protein (Huang et al. 2017), and carbohydrates (Guvench et al. 2008, Guvench et al. 2009, Hatcher et al. 2009). A crystal structure of glypican-1 core domain (PDB ID: 4YWT, Asp24-Gly473) was taken from the Protein Data Bank (Awad et al. 2015). In this work, TIP3P was used as a water model (Jorgensen et al. 1983) with 0.15 M KCl aqueous solution.

We chose to use a lipid composition of POPC:PSM:Chol = 1:1:1 for all systems to represent a neuronal plasma membrane using 1-palmitoyl-2-oleoyl-*sn*-glycero-3-phosphocholine (POPC), cholesterol (Chol), and palmitoyl-sphingomyelin (PSM). Based on the sequence from UniProt (Consortium 2019), the missing C-terminal domain of glypican-1 protein was initially built as a linear chain using the internal coordinate information in the CHARMM force field and CHARMM (Brooks et al. 2009). Through a series of simulations, the C-terminal domain became collapsed with Asn474 at  $Z = 77 \text{ \AA}$  (to the core domain) and Ser530 at  $Z = 35 \text{ \AA}$  (to a GPI linker), where the bilayer is centered at  $Z = 0$  and its normal is along the Z axis. Then, glypican-1 C-terminal residue Ser530 was linked to a GPI (Ferguson et al. 2009) anchored in the membrane. The model structure of the



membrane, GPI-anchor, N-glycans, and HS chains were generated through CHARMM-GUI *Glycan Reader & Modeler* (Jo et al. 2011, Park et al. 2017, Park et al. 2019), *Membrane Builder* (Jo et al. 2009, Wu et al. 2014), and *Glycolipid Modeler* (Jo et al. 2011, Lee et al. 2018). The initial system size was 240 Å × 240 Å × 240 Å to have enough space to include all the initial components, yielding a total of 1,080,442 atoms for each replica. All simulation systems and simulation inputs were generated through CHARMM-GUI (Jo et al. 2008, Lee et al. 2016) and CHARMM (Brooks et al. 2009). Visualization was done via VMD and PyMOL (DeLano 2002, Humphrey et al. 1996), and all analyses were carried out by CHARMM (Brooks et al. 2009).

The van der Waals interactions were smoothly switched off over 10–12 Å by a force-based switching function (Dion et al. 2004) and the long-range electrostatic interactions were calculated by the particle-mesh Ewald method (York et al. 1993) with a mesh size of ~1 Å. The time-step was set to 3 fs using the hydrogen mass repartitioning technique (Hopkins et al. 2015) and bonds containing hydrogen atoms were constrained by the LINCS algorithm (Hess et al. 1997). Temperature was held at 310.15 K; the constant temperature was controlled by Nosé-Hoover temperature coupling method (Hoover 1985, Nosé 1984). The system in a canonical ensemble (NVT, constant particle number, volume, and temperature) was first relaxed with all the solute atoms subjected to harmonic restraints. An isothermal–isobaric ensemble (NPT, constant particle number, pressure, and temperature) was then applied to adjust the solvent density. The Parrinello-Rahman pressure coupling method was used to control the constant pressure (Nosé and Klein 1983, Parrinello and Rahman 1981). A dihedral restraint force constant was set to 1 kcal/(mol·rad<sup>2</sup>) to maintain the carbohydrate chair conformation only during the equilibration steps. For the production runs, each replica was simulated for 1 μs where trajectories were saved every 75 ps. The results described herein are based on the analysis of production simulations.

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## Conflict of interest statement

None declared.

## Supplementary data

Supplementary data for this article is available online at <http://glycob.oxfordjournals.org/>.

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