

# Delineating the shape of COPII coated membrane bud

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Curvature-generating proteins that direct membrane trafficking assemble on the surface of lipid bilayers to bud transport intermediates, which move protein and lipid cargoes from one cellular compartment to another. However, it remains unclear what controls the overall shape of the membrane bud once curvature induction has begun. In vitro experiments showed that excessive concentrations of the COPII protein Sar1 promoted the formation of membrane tubules from synthetic vesicles, while COPII-coated transport intermediates in cells are generally more spherical or lobed in shape. To understand the origin of these morphological differences, we employ atomistic, coarse-grained (CG), and continuum mesoscopic simulations of membranes in the presence of multiple curvature-generating proteins. We first characterize the membrane bending ability of amphipathic peptides derived from the amino terminus of Sar1, as a function of inter-peptide angle and concentration using an atomistic bicelle simulation protocol. Then, we employ CG simulations to reveal that Sec23 and Sec24 control the relative spacing between Sar1 protomers and form the inner-coat unit through an attachment with Sar1. Finally, using Dynamical Triangulated Surface (DTS) simulations based on the Helfrich Hamiltonian, we demonstrate that the uniform distribution of spacer molecules among curvature-generating proteins is crucial to the spherical budding of the membrane. Overall, our analyses suggest a new role for Sec23, Sec24 and cargo proteins in COPII mediated membrane budding process in which they act as spacers to preserve a dispersed arrangement of Sar1 protomers and help determine the overall shape of the membrane bud.

membrane remodeling | COPII | Helfrich Hamiltonian | protein transport

## Introduction

Coat Protein complex II (COPII) is a multiprotein molecular machinery that orchestrates the export of newly synthesized proteins from the Endoplasmic Reticulum (ER) via membrane-enclosed transport carriers.(1) The complex consists of various isoforms of Sar1, Sec23, Sec24, Sec13, and Sec31, which are thought to assemble into a multilayered coat structure on the cytoplasmic face of discrete ER subdomains known as transitional ER. Sar1 initiates the membrane budding process when it becomes activated by transitioning from a GDP-bound state to a GTP-bound state by the guanine nucleotide exchange factor Sec12.(2, 3) Subsequently, Sar1 together with Sec23-Sec24 heterodimers forms the inner coat layer(4–6) on the membrane bud, whereas Sec13-Sec31 produces an outer cage-like layer(7, 8) to complete COPII coat formation. These membrane-bound, cargo laden carriers generally adopt a spherical or multi-lobed shape that are roughly ~ 50-200 nm in diameter.(9) With the help of Sec16 and members of the TANGO1 family, multiple COPII coated carriers can adopt a ‘beads-on-a-string’ conformation to accommodate bulky procollagens.(10, 11) However, in-vitro experiments have demonstrated that Sar1 in the presence of GTP forms an organized lattice structure on Giant Unilamellar Vesicles (GUVs), resulting in the formation of membrane tubules.(12, 13) This shape is noticeably different from the structure of COPII-coated transport carriers found inside living organisms. Further, this indicates that Sar1 alone cannot produce the spherical shape of a membrane bud. Therefore, the molecular origin of the shape of COPII coated carriers remains poorly understood.

Regulation of the spatiotemporal accumulation of COPII proteins is crucial to drive cargo export from the ER. Our recent study highlighted the formation of the inner-coat layer as the rate-limiting step for the cargo transport process.(14) We also demonstrated the molecular mechanism of membrane binding and bending activity of inner coat protein Sar1 in a nucleotide state- and concentration-dependent manner.(15) Despite these advances, what regulates the shape of membrane buds induced by COPII needs to be understood in more detail. Conventionally, it is considered that Sec23(16) functions as a GTPase activating protein (GAP),

## Significance Statement

Lipid membrane remodeling is crucial to many cellular processes. While tremendous progress has been made regarding how proteins generate local membrane deformations, such as bending and pore formation, it is less well understood how specific global membrane deformations are generated by the collective impacts of multiple proteins. For example, the COPII protein Sar1 leads to membrane tubulation under in vitro conditions, while together with other COPII components such as Sec23 and Sec24, Sar1 protomers generate spherical membrane vesicles. By integrating multi-scale simulations that span atomistic and continuum scales, we illustrate how Sec23, Sec24, and cargo proteins function as spacers to ensure a diluted membrane surface coverage of Sar1 protomers which is crucial to the spherical budding of the membrane.

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facilitating the hydrolysis of GTP on Sar1, whereas Sec24(17) is involved in cargo binding. However, in the absence of Sar1, cargo export persists through the continued action of Sec23-Sec24 in a phase separated state.(18) These findings suggest that Sec23-Sec24 complexes may play hitherto unrecognized roles in the process of membrane budding.

Sar1 inserts its amphipathic amino terminal helix into the membrane to induce local positive curvature.(15, 19) While a single Sar1 protein can locally deform the membrane, how multiple Sar1 molecules sculpt the membrane into distinct shapes remains unknown. The consequence of multiple curvature-inducing inclusions on membrane has been shown to produce a diverse array of morphologies such as tubes, corkscrew, disc, caveolae etc.(20, 21) In the context of COPII mediated membrane budding, relevant membrane shapes are tubules under *in vitro* conditions and more spherical under *in vivo* conditions. To comprehend the topology of the membrane bud formed by COPII, it is crucial to establish how the membrane responds to the multiple types of proteins involved.

In this study, we employ atomistic, coarse-grained, and continuum mechanics based simulations to elucidate the molecular mechanism of how the inner coat layer shapes the membrane bud. Since the amphipathic amino terminal helix is the curvature-inducing region of Sar1, we arrange multiple such peptides on the membrane and study their collective membrane bending activities. First, we compare the relative bending activities of a GTP bound Sar1 dimer vs. the amino terminal peptide dimer in the absence of the rest of the protein using the atomistic bicelle simulation protocol. Then, we provide a quantitative estimate of the magnitude of curvature induction as a function of relative orientation of the amino terminal peptides and their concentration. We also investigate the membrane binding ability of Sec23 and Sec24 using MARTINI based coarse-grained model. Finally, we utilize the Dynamic Triangulated Surface (DTS) simulation framework to explore the relationship between the surface coverage of Sar1 and the shape of the membrane bud. Taken together, our model suggests a new role for Sec23, Sec24, and cargo proteins in COPII mediated membrane budding process in which they participate as spacers to control the relative distribution of Sar1 proteins on the lipid bilayer surface, which is critical for the spherical development of the membrane bud.

## Results

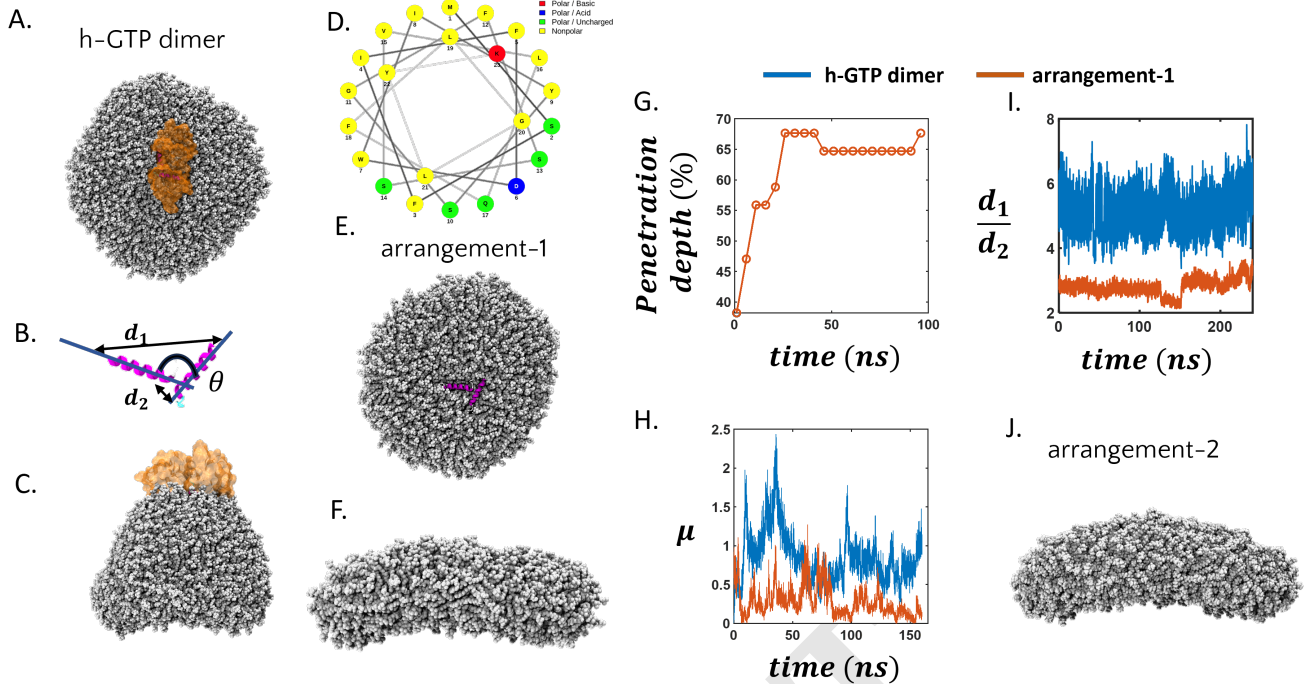
**Comparative assessment of the membrane bending activity of the amino terminal amphipathic helix of Sar1 in the presence and absence of the rest of the protein.** Since the simulation of a large number of Sar1 protomers on a lipid membrane is costly at the atomistic level, we first analyze to what degree the membrane bending activity of Sar1 can be captured with only the amphipathic helix in the amino terminus(15). GTP bound Sar1 dimer (h-GTP dimer) produces significant positive curvature on the membrane, transforming the flat-shaped bicelle (Fig-1A) into a highly bent dome-shaped structure (Fig-1C). The height of phosphate mid-plane changes by  $\sim 4$  nm as a consequence of this transition. However, when the amphipathic (Fig-1D) helices are present alone (arrangement-1) without the rest of the protein, the magnitude of curvature induction

is dramatically reduced (Fig-1E-F). Although the protein segment that causes curvature induction is the same for both cases, we observe a stark contrast in the extent of membrane bending.

According to the hydrophobic insertion mechanism of protein induced membrane bending (22), shallow inclusion of amphipathic helices of proteins is most effective for generating positively curved membrane deformations. Therefore, to explain the differential bending activity of the Sar1 amphipathic helices, we study the time evolution of the penetration depth of the peptides into a periodically continuous membrane. While the h-GTP dimer exhibits 40 % penetration depth (as defined by Paul et. al.(15)), the amphipathic helix increases the penetration depth up to 65 % within  $\sim 100$  ns when present in isolation (Fig-1G). This deeper membrane penetration in the absence of the rest of the protein reduces the magnitude of partitioning of hydrophobic/hydrophilic residues at the membrane-water interface. While the h-GTP dimer displays  $\mu \sim 1$  (Eqn. 1 in the SI), the isolated peptides (arrangement-1) lead to  $\mu$  significantly less than 1 (Fig-1H). This indicates that in the absence of the rest of the protein, the amphipathic helix inserts into the membrane so deeply that it brings some of its hydrophilic residues into the membrane. As a result, the inter-leaflet stress, which arises due to the hydrophobic/hydrophilic partitioning at the membrane water interface, becomes reduced and therefore does not bend the membrane significantly.

In addition to the excess penetration of the peptides, another contributing factor in this context can be the relative orientation of the peptides on the membrane surface (Fig-1B). The distribution of the inter-peptide angle ( $\theta$ ) in the h-GTP dimer is sharply peaked around  $\sim 105^\circ$  whereas the peptides in isolation following arrangement-1 exhibit a broad distribution of  $\theta$  (Fig-S2A). We further characterize this orientational dissimilarity by computing the ratio of the end distances ( $d1$  and  $d2$ ) of the peptide pair. In the case of a serial arrangement of the peptides  $d1/d2$  will be  $2d$  where  $d$  is the length of a single helix ( $\sim 3.5$  nm in the case of Sar1), and in the case of a parallel arrangement,  $d1/d2$  should be 1. The high value of  $d1/d2$  observed for the h-GTP dimer indicates a serial-like arrangement of the helix-pair while the significantly lower value of  $d1/d2$  for the peptides in isolation indicates rather different arrangements (Fig-1I). To estimate the effect of the inter-helix orientation on the membrane curvature induction, we perform bicelle simulations in the presence of two peptides while restraining the inter-peptide angle to be  $180^\circ$  (peptide-arrangement-2). The angular restraint is not observed to enhance the degree of membrane bending (Fig-1J). Therefore, the relative orientation of the amphipathic peptides does not significantly impact the membrane bending activity. This suggests that curvature induction by a large assembly of the amphipathic peptides can be modeled without considering specific relative orientation (*vide infra*).

**The magnitude of membrane curvature induction is proportional to the concentration of the embedded peptides.** In this section, we study the impact of the peptide concentration on the magnitude of membrane curvature induction. From the previous section, it is clear that two copies of the amphipathic peptide derived from the h-GTP dimer are unable to generate significant membrane curvature irrespective of their relative orientation. With one more amphipathic helix (peptide-



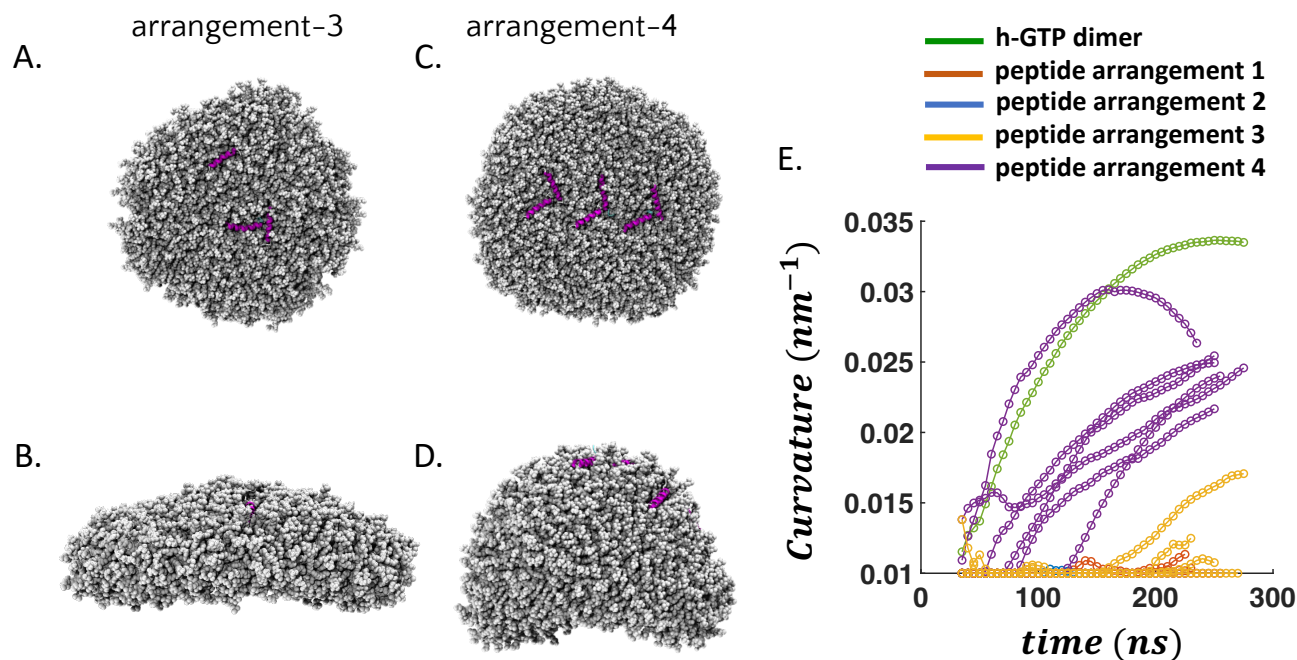
**Fig. 1.** Isolated amphipathic regions of Sar1 diminish its capacity to bend the membrane. (A) Top view of h-GTP dimer protein on membrane bicelle. The amphipathic helix is coloured in purple. The protein is depicted in surface representation with orange colour and the membrane is shown in VDW representation with silver colour. (B) Arrangement of the helix-pair (residue 1-23) derived from the amino terminal amphipathic region in h-GTP dimer. End distances of the peptide pair is represented by  $d_1$  and  $d_2$  and the inter-peptide angle is  $\theta$ . (C) Side view of the h-GTP dimer membrane system after  $\sim 248$  ns simulation revealing a highly bent shaped membrane as a consequence of high curvature induction. (D) Helical wheel diagram of the amino terminal amphipathic helix of h-GTP Sar1 where different colours represent different residue types (yellow: hydrophobic, green: polar uncharged, blue: polar acidic and red: polar basic). (E) Top view of the membrane bicelle system with peptide-arrangement-1 (isolated amphipathic peptide case). (F) Snapshot of the membrane bicelle with peptide-arrangement-1 after 250 ns of simulation. Time evolution of (G) membrane penetration depth and (H)  $\mu$  (see Eqn. 1 in the SI) for the h-GTP dimer and peptide-arrangement-1 in the presence of continuous membrane. (I)  $d_1/d_2$  as a function of time in case of membrane bicelle simulation in the presence of h-GTP dimer and peptide-arrangement-1. (J) Snapshot of the membrane bicelle system in the presence of peptide-arrangement-2 where  $\theta$  is restrained to  $180^\circ$ .

arrangement-3) as shown in Fig-2A, the magnitude of membrane curvature increases from  $\sim 0.012 \pm 0.0006 \text{ nm}^{-1}$  (arrangement-1 and 2) to  $0.013 \pm 0.003 \text{ nm}^{-1}$  (Fig-2B). With 6 peptides (arrangement-4) distributed around the center of the bicelle (Fig-2C), we observe strong bending of the membrane, leading to a vesicular cap like structure (Fig-2D and S1) similar to that induced by the h-GTP dimer with a curvature of  $\sim 0.025 \pm 0.002 \text{ nm}^{-1}$  (Fig-2E). Thus, the bicelle simulations demonstrate that peptide assemblies induce membrane curvature in a concentration-dependent manner. Analysis of inter peptide angles reveals a broad distribution ( $50 - 180^\circ$ ), further confirming the lack of any strong correlation between membrane bending activity and inter-peptide orientation (Fig-S2 B-C). As a control simulation, we study a bicelle system covered with a total of 18 peptides (Fig-S3). Surprisingly, in this case, we do not observe any significant membrane bending. By the end of  $\sim 250$  ns of simulation, many peptides are located at the highly curved edges of the bicelle, and they propagate the stress induced by hydrophobic insertion throughout the membrane. As a result, the net inter-leaflet stress is minimal and no curvature induction is observed.

**Sar1 serves as a tether connecting Sec23-Sec24 to create the inner-coat layer.** We next study the binding of different protein components from the inner-coat layer to the membrane, moving towards a more realistic description of

COPII. To address this question in a computationally effective manner we adopt the coarse-grained MARTINI models, which were successfully employed to model protein(23) and liquid droplet(24) mediated remodeling of membranes. Here, we first investigate the binding of Sec23 and Sec24 separately to the membrane. Both proteins detach from the membrane rather quickly (tens of nanoseconds) during the simulation despite initial placement on the membrane surface (Fig-3 A-D). These observations are consistent with the model that Sar1 acts as an anchor to bring Sec23 and Sec24 to the membrane surface and generate the inner-coat layer. Indeed, in a simulation with a Sar1-Sec23-Sec24 trimer on the membrane (Fig-3E-F), Sec23 and Sec24 securely attach to Sar1, thereby maintaining their binding to the membrane and producing a cohesive unit. Subsequently, we attempt to simulate a more realistic inner-coat layer by increasing the number of repeating units of Sar1-Sec23-Sec24 from 1 to 2, 4 and 8. When the number of Sar1-Sec23-Sec24 trimer units is 2, we do not observe spontaneous protein-protein association among the trimer units due to dilution of the protein concentration (Fig-S4). However, as we increase the number of trimer units we observe more trimer-trimer associations. In the case of 8 trimer repeating units, we observe that a few Sar1 proteins stay out of the membrane plane as a consequence of crowding (Fig-3G). Overall, we observe a stable binding of the inner-coat components to the membrane where proteins are dynamically coupled with each other. We further evaluate the spacing





**Fig. 2.** Curvature induction on the membrane as a function of peptide concentration. (A) Initial (top) and (B) final (side) snapshots of a tri-peptide assembly (peptide-arrangement-3) on a membrane bicelle after  $\sim 250$  ns simulation (replica-1). (C-D) Initial and final snapshots from replica 1 of peptide arrangement 4. (E) Time evolution of membrane curvature in all the cases of peptide arrangements including multiple replica simulations of peptide arrangement 1, 3 and 4 and h-GTP dimer protein. h-GTP dimer protein exhibit highest curvature followed by peptide-arrangement-4. Peptide arrangement 1-2 show lowest curvature induction. Final snapshots of remaining replica simulations are shown in Fig-S1.

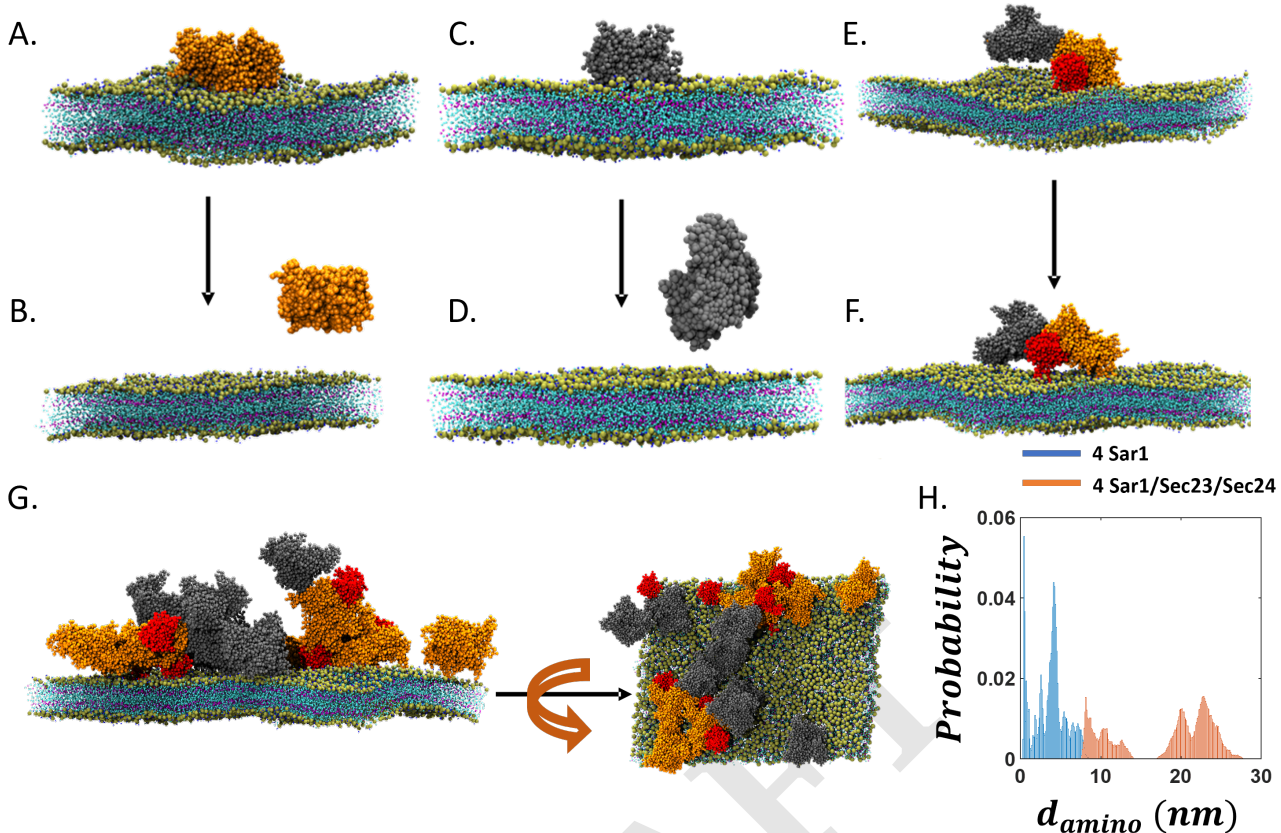
between the Sar1 proteins in the presence and absence of Sec23 and Sec24 by measuring the distances ( $d_{\text{amino}}$ ) between their amino-terminal amphipathic segments (Fig-3H). In the absence of Sec23 and Sec24, the Sar1 tetramer exhibits strong inter-protein binding (Fig-S4) resulting in  $d_{\text{amino}}$  values in the range of 0–10 nm. In the presence of Sec23 and Sec24,  $d_{\text{amino}}$  increases significantly ( $\sim 8$ –30 nm). The role of Sec23-Sec24 as spacers is robust with respect to the initial arrangement of protein configurations (Fig-S5). It is important to note that we consider only the structured part of Sec24 in our simulation. The amino terminal (resid 1-132) of Sec24 is intrinsically disordered and not included in our model; it is expected to further separate Sar1 protomers due to entropic repulsion. Thus, Sec23 and Sec24 serve as spacers in the inner-coat layer to separate Sar1 proteins from one another and prevent them from co-assembling with one another. In addition to Sec23 and Sec24, the bulky cargo proteins that are being packaged may also serve as spacers.(25) In the next section, we explore the consequence of including spacers between the curvature-generating proteins on the shape of the generated membrane bud using DTS simulations. The MARTINI simulations described in this section not only reveal the spacing between the Sar1 protomers in the presence of Sec23 and Sec24 but also provide a basis to establish the connection between the length scales considered in DTS and atomistic simulations. The simulations also reveal that structured regions of Sec23 and Sec24 cannot bind to the membrane and induce curvature. This is an experimentally testable hypothesis that is important to examine in the future

to better define the roles of these proteins in COPII-mediated transport.

#### The effect of spacers on the shape of the membrane bud.

Here, we describe how the spatial arrangement of curvature-generating proteins impacts the shape of the induced membrane bud employing the DTS simulation protocol. DTS simulations have been previously used to study the transformation of a membrane vesicle into tubes, discs, and other shapes when curvature induction takes place anisotropically.(20, 26, 27) With a flat membrane patch under constant tension, isotropic curvature-inducing inclusions have been shown to produce pearled tubule-like budding when the surface coverage of the proteins exceeds a certain threshold value.(28, 29) Using the atomistic bicelle simulations, we observe that isotropic curvature induction is the key characteristic in the case of Sar1-mediated membrane remodeling where the relative orientation of its amphipathic helices does not affect the magnitude of curvature induction. Results from the previous section also suggest that Sec23 and Sec24 maintain the spatial separation of Sar1 proteins. Based on these findings, we develop a mesoscopic model of the inner coat layer on a triangulated membrane mesh where protein-containing vertices (blue region) have positive intrinsic curvatures ( $c_0 = 1.0 \text{ d}^{-1}$ ) isotropically coupled to the Helfrich term. These curvature-inducing vertices represent Sar1 protomers while other vertices represent the membrane ( $c_0 = 0 \text{ d}^{-1}$ ). In this case, we observe tubular budding of the membrane with one or multiple tubules (Fig-4A). This condition resembles that in *in vitro* GUVs coated with Sar1, where tubular budding is





**Fig. 3.** Simulating the inner coat layer using MARTINI based description. Initial ( $t = 0$ ) and final ( $t \sim 2 \mu s$ ) snapshots of (A-B) Sec23 (C-D) Sec24 and (E-F) Sar1-Sec23-Sec24 trimer in the presence of membrane. Protein coloured in red indicates Sar1 whereas Sec23 and Sec24 are depicted as orange and grey colour respectively. Sec23 and Sec24 individually fail to maintain a stable attachment with the membrane but with the help of Sar1 it remain bound to the membrane surface. (G) Top and side view of the 8 repeating units of Sar1-Sec23-Sec24 trimer. (H) Probability distribution of  $d_{amine}$  estimated from the simulations of Sar1 tetramer in the absence of Sec23 and Sec24 (cyan) and 4 trimer repeating units of Sar1-Sec23-Sec24 (brown).

commonly observed(12). A fraction of the protein containing vertices turns into a tubular shape while the rest remains flat surrounding the tubular region.

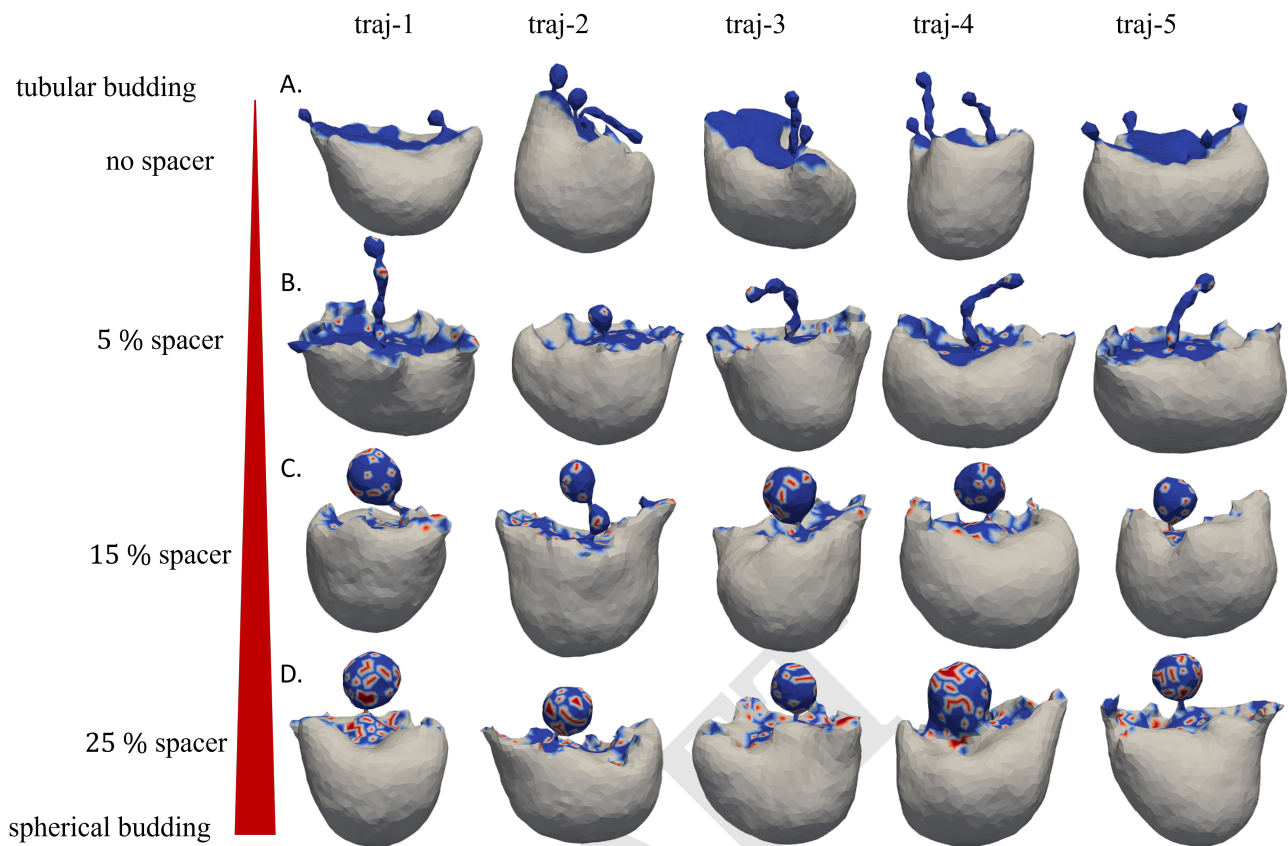
Next, to model the presence of Sec23 and Sec24, we include spacers (red) uniformly distributed in the protein-containing region. With 5% spacer, we observe a pearled tubule-like shape of the membrane bud (Fig-4B). The spacers occupy both tubular and flat protein-containing vertices. Due to the incorporation of spacers, only one tubule is generated in 4 trajectories and a small spherical budding is observed in traj-2. Upon increasing the fraction of spacers from 5 % to 15 %, the shape of the membrane bud becomes more spherical in nature (Fig-4C). A spherical shape is observed in almost all cases of membrane buds with a constricted neck. Only in the case of traj-2, a doubly pearled tubule is generated. Further increasing the spacer content to 25 % leads to a perfectly spherical membrane bud (Fig-4D). Thus, increasing the concentration of spacers alters tubular budding into a more spherical budding. When spacer content exceeds a certain threshold the membrane budding no longer takes place. While 50 % spacer leads to a reduced size of the buds, 75% spacer does not lead to any budding during the MC simulations (Fig-S8). This is consistent with an earlier study where the curvature generating proteins were observed to fail

to generate membrane buds when the surface coverage on the membrane is below a threshold value.(28)

In the absence of volume and area compressibility, membrane budding is accompanied by intense deformation of the overall shape because of the propagation of the stress due to the fluid nature of the membrane (Fig-S9). In this case, a larger number of spacers also yields a more spherical membrane bud. To generate membrane budding, uniform distribution of the spacers is crucial. When the spacers are clustered together we do not observe prominent buds (Fig-S10). We also study the effect of anisotropic curvature induction on the shape of membrane budding (Fig-S11). With  $c_{||} = 1 d^{-1}$ ,  $c_{||} = 0 d^{-1}$  and  $k_{||} = \kappa_B$ , the membrane buds in a tubular fashion. If we turn on  $c_{\perp}$ , multiple branched spheres are generated under a strong coupling limit ( $k_{||/\perp} = \kappa_B$ ). Increasing the value of  $c_{||/\perp}$  results in a flat shaped budding, which is not consistent with that observed in case of COPII in cells.

## Discussion

This work demonstrates the relationship between the insertion of several amphipathic helices and the creation of specific membrane shapes. This kind of remodeling of the membrane is particularly important in the context of membrane budding



**Fig. 4.** Monte Carlo simulations of triangulated membrane mesh where 20 % vertices are occupied by proteins. The shape of the membrane mesh after  $5 \times 10^5$  MC steps in 5 parallel runs in the presence of (A) no spacer (B) 5 % (C) 15 % (D) 25 % spacers. Blue regions represent protein and the spacers are depicted with red. The thickness of the red bar is proportional to the number of spacers. The white region is the protein-free membrane surface facing a volume ( $K_V$ ) and area ( $K_A$ ) compressibility of  $10 \kappa_B$ .

triggered by protein coat assemblies.(30) Here, we specifically focus on the case of COPII-mediated membrane budding. Our previous study(15) unraveled a detailed molecular picture of the membrane curvature generation by Sar1, which is known to initiate the COPII-mediated protein trafficking. This study goes beyond the description based on Sar1 and examines the impact of including other inner-coat proteins, Sec23 and Sec24, on the morphology of the membrane budding process. Our findings demonstrate that when Sar1 is densely organized without other COPII proteins, it leads to tubular membrane budding. However, when Sec23 and Sec24 are added, they do not directly contribute to the curvature induction but regulate the surface coverage of Sar1, resulting in a more spherical shape of the bud. Therefore, our results suggest an additional role for Sec23, Sec24, and cargo proteins during COPII transport carrier formation, where they regulate the spacing between Sar1 proteins and thereby facilitate the formation of spherical membrane carriers. This is also supported by recent cryo-EM derived structures showing that Sar1-Sec23-Sec24 trimer units appear as randomly oriented patches on vesicles(25) in contrast to uniformly distributed lattices found on the membrane tubules (5). The amino terminal intrinsically disordered region (IDR) of Sec24, which is not considered in this study, is composed of 70 hydrophilic (13 of which are charged) and 62 hydrophobic residues. It is unclear whether this IDR region helps Sec24 attach to the membrane. However, our simulations indicate that Sec23 and

the structured region of Sec24 require Sar1 to maintain their stable attachment with the membrane and thereby form the inner-coat layer. According to our previous studies (15, 19), Sar1 binds to the membrane in both GDP and GTP bound states, but only creates positive membrane curvature in the GTP bound state. Therefore, Sar1 together with Sec23 and Sec24 are able to be associated with the membrane prior to any curvature induction. Afterwards, Sec12 exchanges GDP bound to Sar1 with GTP, which triggers Sar1 to induce curvature on the membrane. However, due to the presence of Sec23, Sec24 and cargo proteins, Sar1 protomers remain scattered on the membrane surface with disordered orientations, leading to spherical budding of the membrane.

Membrane active amphipathic peptides are known to insert and can lead to pore formation.(31, 32) The C-terminal amphipathic helices of complexin have been shown to produce a stable pore in the lipid bilayer when the number of peptides reaches 12.(33) There are just seven hydrophilic residues out of 23 in the amino terminal helix of Sar1. We observe that the amphipathic peptides derived from Sar1 are embedded horizontally to the membrane plane without stretching across despite containing a large amount of hydrophobic residues. The spontaneous transition of a membrane bicelle to a vesicular intermediate triggered by curvature generating protein has been demonstrated previously using the MARTINI model.(34) Here, we establish the dependence of the concentration of amphipathic peptide

on the magnitude of curvature induction on membrane bicelle (Fig-2). We also reveal that the relative membrane sculpting efficiency of amphipathic peptides decreases in the absence of the entire protein segment. In the case of BAR(35, 36) domains and the ESCRT machinery(37), proteins form an intrinsically curved filament, which is key to the process of membrane bending by these proteins. On the contrary, the lack of dependency of the membrane curvature induction on the inter-peptide angle indicates that the curvature induction is isotropic in the case of COPII. Our DTS simulations also reveal that isotropic curvature induction on the protein-bound vertices is essential to producing spherical membrane bud at optimal spacer concentration.

The conventional mechanism of cargo transport through COPII-coated membrane vesicles has been challenged by two recent experiments.(38–40) These results suggest that COPII localizes at the neck of the membrane bud, defining a boundary between ER and ER-Golgi intermediate compartments (ERGIC). Further, the inhibition of Sar1 reduced the recruitment of Sec23 on the ER membrane and thus disrupted the formation of a proper COPII assembly.(39) Our MARTINI based simulations also support this finding by showing that Sar1 recruits Sec23-Sec24 to form the inner-coat layer. However, the mechanism by which such a ring-shaped COPII collar can produce a membrane bud remains unclear.

In summary, we offer a mechanistic overview of the complex interplay between multiple proteins from COPII family in regulating the shape of the coated membrane surface. We cover a broad range of length scales by employing atomistic, MARTINI, and Helfrich Hamiltonian based mesoscale simulations to establish the role of spacer proteins in producing spherical membrane buds. Our atomistic simulations indicate that the membrane penetration depth of the amphipathic helices increase significantly in the absence of the rest of the protein segment (Fig-1 G). This can be tested experimentally by fluorescence quenching based assays as described in(19) where one can monitor the fluorescence quenching of a Trp residue within the amino terminal amphipathic helix by quenchers present at various depths of the membrane. Based on our simulations, we also predict that Sar1 in the presence of Sec23 and Sec24 sculpt spherical/lobe shaped budding rather than tubules on GUVs, which can also be investigated experimentally. In our study we focus on the inner-coat proteins Sar1, Sec23, and Sec24, which are considered to be the key players in the membrane budding process at the subdomains of ER. In addition to the inner-coat layer, Sec13 and Sec31 form the outer-coat layer, which has a cage-like structure and promotes vesicle fission.(41) It is not clear whether the highly bent outer-coat layer also contributes to the curvature induction and membrane budding process. An intriguing possibility is that interactions between the inner and outer coat protein facilitate appropriate spacing between Sar1 protomers to drive the budding of spherical transport carriers. Although our approach of modeling the inner-coat layer is sufficient to explain the shapes of remodeled membranes in both *in vitro* and *in vivo* conditions, it is important in the next step to directly consider the roles of Sec13 and Sec31 in this process.

## Materials and Methods

We perform simulations at three different length scales which are atomistic, coarse-grained, and mesoscopic (See Table-S1 for the summary of MD simulations conducted). First, we assess the membrane penetration depth of the Sar1 amphipathic helices by performing atomistic simulations using a continuous membrane bilayer. We follow the protocol described in Paul et. al. (15) to perform the atomistic membrane simulations. The h-GTP dimer model of Sar1 is first introduced into an atomistic lipid bilayer ( $10nm \times 10nm$ ) containing 66 % DOPC, 21 % DOPE, 8 % DOPS, and 5 % DOPA; that is, a 13 % anionic membrane. We ignore the remaining protein and solvent and only take into account the amino-terminal amphipathic helix (residue 1-23) embedded in the membrane bilayer. The system is then re-solved and re-ionized to maintain the physiological (0.15 M) salt concentration and to make the system charge-neutral. Following minimization and equilibration, NPT simulations are carried out for 160 ns with the Nosé-Hoover thermostat and Parinello-Rahman barostat (semiisotropic pressure coupling) to control the temperature and pressure of the system. All simulations are performed using GROMACS(42, 43) version 2018.3 and the CHARMM36m(44) force field with the TIP3P explicit solvent model. We estimate the magnitude of the partitioning of the hydrophobic/hydrophilic residues of the amphipathic helices at the membrane-water interface by a quantity  $\mu$  (see SI text for definition).

Next, we perform simulations with the membrane bicelle for  $\sim 250$  ns to evaluate the extent of membrane bending by these amphipathic helices. We model the bicelle system by replicating the continuous membrane system along  $+X : -X$  and  $+Y : -Y$  directions using the gmx genbox utility followed by the deletion of membrane segments near the edges to break the membrane continuity along  $X$  and  $Y$  (see SI text and Paul et. al. (15) for details). To demonstrate the statistical robustness of our membrane bicelle simulation strategy, we conduct six independent replica simulations for peptide arrangement 4, four for peptide arrangement 3, and three for peptide arrangement 1. All simulations began with identical starting coordinates but had different starting velocities. VMD version 1.9.3(45) is used for visualization and analysis. The helical wheel diagram is constructed using NetWheels(46).

Afterwards, to demonstrate the effect of Sec23 and Sec24 on the relative spacing between Sar1 proteins on the membrane surface, we perform coarse-grained simulations using the MARTINI 3 model with Sar1 (Fig- S3-S4) and multiple units of the Sar1-Sec23-Sec24 trimer on a lipid bilayer. We convert the atomistic models of Sar1-Sec23-Sec24 (PDB code: 6GNI(5)) trimer into MARTINI3.0(47) model using martinize2(48) with the elastic bond force constant of  $1300 \text{ kJ/mol/nm}^2$  and a decay factor 0.8. After building the MARTINI model of the proteins, we construct a  $\sim 40 \text{ nm} \times 30 \text{ nm}$  membrane bilayer with 87 % DOPC and 13 % DOPS lipid molecules and place the protein molecules on top using the insane tool. Then, we add water beads and  $Na^+/Cl^-$  to neutralize the system and maintain a physiological salt concentration. The simulation box size is  $\sim 40 \text{ nm} \times 30 \text{ nm} \times 30 \text{ nm}$ . After energy minimization and short equilibration, a  $\sim 2 - 5 \mu\text{s}$  production run is carried out with the equilibrated configuration. In this step, V-rescale thermostat and Parinello-Rahman barostat are used with the same  $\tau_P$ . The time step in the MARTINI simulations is 20 fs.

Finally, we carry out the Monte Carlo (MC) simulation of the Dynamic Triangulated Surface (DTS) model following the strategy described by Ramakrishnan et. al.(21, 49) In this simulation the membrane dynamics is governed by the Helfrich Hamiltonian at the mesoscopic length scale where the membrane is considered as a surface discretized by triangles (see SI for more details). The presence of curvature-inducing proteins is represented by vertices that have intrinsic non-zero curvatures. Here, instead of using the formalism developed by Ramakrishnan et al., we utilize isotropic curvature induction as discussed by Pezeshkian et. al.(28). Vertex movement and link flips are considered as the MC moves. We allow nematic exchange between protein (blue) and spacers (red)



while no nematic exchange is allowed between membrane and protein/spacer. A total of  $5 \times 10^5$  MC steps are carried out. For comparison, we also perform DTS simulations using anisotropic curvature induction condition. The total number of vertices in the membrane vesicle is 2030, 20% of which are occupied by proteins (Sar1). Among the protein-containing vertices, we place spacers representing Sec23/Sec24 with varying amounts (5-75 %). We use paraview(50) to visualize the membrane in the form of the triangulated mesh where surface representation is selected and the colour scheme is based on the phases of the vertices. Non-protein containing vertices (grey) belong to phase 2 whereas proteins (blue) and spacers (red) containing vertices belong to phase 1 and 3 respectively.

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**Data availability.** Scripts for analyzing atomistic and CG MD trajectories and the codes for DTS simulations are freely available at : <https://github.com/Sanjoy-Paul/membrane-budding/>.

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