

# Vesiculation pathways in clathrin-mediated endocytosis

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1 **During clathrin-mediated endocytosis, a patch of flat plasma mem-**  
2 **brane is internalized to form a vesicle. In mammalian cells, how the**  
3 **clathrin coat deforms the membrane into a vesicle remains unclear**  
4 **and two main hypotheses have been debated. The “constant area”**  
5 **hypothesis assumes that clathrin molecules initially form a flat lat-**  
6 **tice on the membrane and deform the membrane by changing its**  
7 **intrinsic curvature while keeping the coating area constant. The al-**  
8 **ternative “constant curvature” hypothesis assumes that the intrinsic**  
9 **curvature of the clathrin lattice remains constant during the forma-**  
10 **tion of a vesicle while the surface area it covers increases. Previ-**  
11 **ous experimental studies were unable to unambiguously determine**  
12 **which hypothesis is correct. In this paper, we show that these two**  
13 **hypotheses are only two extreme cases of a continuum of vesicula-**  
14 **tion pathways if we account for the free energies associated with**  
15 **clathrin assembly and curvature generation. By tracing the nega-**  
16 **tive gradient of the free energy, we define vesiculation pathways in**  
17 **the phase space of the coating area and the intrinsic curvature of**  
18 **clathrin coat. Our results show that, overall, the differences in mea-**  
19 **asurable membrane morphologies between the different models are**  
20 **not as big as expected, and the main differences are most salient at**  
21 **the early stage of endocytosis. Furthermore, the best fitting pathway**  
22 **to experimental data is not compatible with the constant-curvature**  
23 **model and resembles to a constant-area-like pathway where the coat-**  
24 **ing area initially expands with minor changes in the intrinsic curva-**  
25 **ture, later followed by a dramatic increase in the intrinsic curvature**  
26 **and minor change in the coating area. Our results also suggest that**  
27 **experimental measurement of the tip radius and the projected area**  
28 **of the clathrin coat will be the key to distinguish between models.**

Endocytosis | Vesiculation | Clathrin assembly | Curvature generation

1 **C**lathrin-mediated endocytosis (CME) is a fundamental cel-  
2 **lular process to transport lipids, membrane proteins and**  
3 **extracellular cargo molecules into the cell (1–6). In mammalian**  
4 **cells, a small patch of flat plasma membrane is shaped into**  
5 **a spherical vesicle when CME occurs (7). Clathrin molecules**  
6 **are essential for the membrane remodelling process. They are**  
7 **made of three subunits that form a triskelion, which further**  
8 **assemble into a cage-like structure *in vitro* (8, 9). The mini-**  
9 **imum cages contain 16 polygons (10) and the most commonly**  
10 **observed ones are semi-regular icosahedral cages (11–13). Two**  
11 **main hypotheses are under debate regarding how the clathrin**  
12 **coat scaffolds the flat membrane into a spherical vesicle *in***  
13 ***vivo* (4, 7, 14–16). The **constant area model** asserts that**  
14 **the clathrin molecules initially polymerize into a flat lattice**  
15 **with a regularly arranged hexagonal structure, and later re-**  
16 **organization of the bonds between adjacent clathrins results**  
17 **in formation of pentagons in the hexagonal lattice, which in**  
18 **turn leads to curvature generation of the clathrin coat (10, 17)**  
19 **(Fig. 1a). Adhesion of clathrin molecules with the substrate has**

been suggested to contribute a flattening force that prevents  
curvature generation. Release of the flattening force therefore  
could induce curvature of the clathrin coat with preloaded  
pentagons (18). The alternative **constant curvature model**  
asserts that the intrinsic curvature of the elements of the lat-  
tice is kept constant during the assembly and expansion of the  
lattice, therefore curvature generation occurs from the very  
beginning of clathrin assembly (Fig. 1b).

In order to distinguish between the two models, the dynam-  
ics of clathrin assembly and the geometry of membrane shapes  
are needed. Fluorescence microscopy, including light sheet  
and MINFLUX, has revealed the assembly dynamics of the  
clathrin coat (19, 20), as well as other proteins that participate  
in endocytosis (21–27), while electron tomography has been  
able to resolve membrane shapes during endocytosis (7, 28).  
However, neither of the methods can capture both spatial  
and temporal information at the same time. Under conven-  
tional fluorescence microscopy, the clathrin-coated pits appear  
as diffraction-limited spots due to their small size (typically  
~ 30 – 150nm in mammals (1) and yeast (28)) and shape infor-  
mation of the membrane is completely lost (21, 29–32). On the  
other hand, super-resolution fluorescence microscopy has been  
able to reveal the protein organization at the endocytic pit  
(29, 33, 34) and to reconstruct the shape of the clathrin coat  
(16, 35, 36) from averaging over ensembles of endocytic sites.  
Correlative light and electron microscopy (CLEM) method  
has exploited the fluorescence of fiducial markers to locate  
endocytic sites while resolving membrane shapes using elec-

## Significance Statement

Endocytosis is a fundamental cellular process for cells to com-  
municate with their environment and recycle their membrane  
components. How clathrin molecules remodel the membrane  
remains debated more than 30 years after the discovery of  
clathrin. Whether curvature generation happens at the early  
stage of clathrin assembly or at the late stage is at the center of  
the debate. We constructed a physical model which allowed us  
to calculate an optimum pathway that is actually a combination  
of these two extreme hypotheses, and is closer to the late stage  
hypothesis than to the early stage hypothesis. Our results also  
suggest future experiments that can distinguish between the  
different hypotheses.

R.M. and J.B. designed the research; R.M. performed the research; R.M. and X.W. analyzed the data; R.M., J.B. and X.W. wrote the paper.

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tron tomography. However, both super-resolution and CLEM requires sample fixation, therefore, one can identify multiple endocytic sites at the same time and perform the average, yet unable to trace a single endocytic site over time. The temporal information is nevertheless lost. As a result of the incomplete information obtained by existing experimental methods, both hypotheses have experimental support. Experiments that apply electron microscopy to resolve the membrane shapes of endocytic pits favor the constant area model (7, 18, 37, 38). However, super-resolution imaging combined with analysis of the fluorescence intensity of the clathrin coat is inclined towards the constant curvature model (39). In addition, it was argued that the energetic cost of bond reorganization in a regular hexagonal lattice in the constant area model may be too large to be fulfilled (15, 40, 41).

Extensive theoretical efforts have been dedicated to model membrane morphology during endocytosis (42), of which molecular dynamics simulations (43) and continuum mechanics (44–48) are two common approaches. Hybrid models were also broadly applied to gain higher resolution than continuum mechanics and lower computing expense than molecular dynamics (49, 50). However, most theoretical investigations have focused on how mechanical properties, such as membrane tension and bending rigidity of the clathrin coat, influence the membrane morphology. The process of curvature generation is either neglected or taken for granted. Only few of them have addressed the difference between the constant area model and the constant curvature model.

In fact, the constant curvature and constant area models are only two extreme models for clathrin assembly during endocytosis and any change in area or curvature are possible at any time point during endocytosis. In this paper, we extend the classic Helfrich theory for membrane deformation to incorporate energy terms associated with clathrin assembly and curvature generation, and compare geometric features calculated by theory with that extracted from experimental data. The negative gradient of the total free energy defines a pathway that neither fits the constant area model nor the constant curvature model. We find that a pathway that is close to the constant area model fits electron tomograms of the endocytic pits the best. Our study also offers experimental suggestions to distinguish between the two main hypotheses.

## Models and methods

We model the membrane patch of the CCP (clathrin-coated pit) as a surface which is rotationally symmetric with respect to the  $z$ -axis. The shape of the membrane is parameterized with the meridional curve  $\{r(s), z(s)\}$ , where  $s$  denotes the arc length along the curve. The bending energy of the membrane (together with the clathrin coat) assumes the Helfrich model (51)

$$E_b = \int \frac{\kappa}{2} (C_1 + C_2 - C_0)^2 da, \quad [1]$$

where  $\kappa$  denotes the bending rigidity of the CCP,  $C_1$  and  $C_2$  denote the principal curvatures of the surface,  $C_0$  denotes the intrinsic curvature of the membrane induced by the clathrin coat. To model a finite area of the clathrin coat, we assume the intrinsic curvature  $C_0$  spatially varies as

$$C_0(a) = \frac{1}{2} c_0 (1 - \tanh[\alpha(a - a_0)]), \quad [2]$$

where  $a$  denotes positions on the membrane. Here we choose  $a$  to be the surface area calculated from the tip of the membrane, and  $C_0$  equals  $c_0$  for area  $a < a_0$ , and rapidly drops to zero when  $a > a_0$ . The parameter  $\alpha$  controls the sharpness of the drop. In the constant area model, we vary the intrinsic curvature  $c_0$  but keep the coating area  $a_0$  constant, while in the constant curvature model, we vary the coating area  $a_0$  but keep the intrinsic curvature  $c_0$  constant. As a result of clathrin coat, the bending rigidity  $\kappa$  also varies as

$$\kappa(a) = \frac{1}{2} (\kappa_{\text{coat}} - \kappa_{\text{bare}}) (1 - \tanh[\alpha(a - a_0)]) + \kappa_{\text{bare}}, \quad [3]$$

where  $\kappa_{\text{coat}}$  and  $\kappa_{\text{bare}}$  denotes the bending rigidity of the clathrin-coated membrane and bare membrane, respectively. Besides the bending energy, the membrane tension contributes to the free energy in the form of

$$E_t = \sigma_e A, \quad [4]$$

where  $\sigma_e$  denotes the membrane tension at the base and  $A$  denotes the surface area of the membrane patch within a fixed radius of  $R_b$ . The membrane tension  $\sigma_e$  and bending rigidity  $\kappa$  defines a characteristic length  $L_0 = \sqrt{\kappa_{\text{bare}}/(2\sigma_e)}$  (52). The total free energy  $E_{\text{tot}} = E_b + E_t$  is a functional of the membrane shape. Given a coating area  $a_0$  and an intrinsic curvature  $c_0$ , we numerically solve the variational equations of the energy functional to obtain membrane shapes that minimizes  $E_{\text{tot}}$ . More detailed descriptions of the model can be found in SI Appendix: detailed formula derivation.

## Results

### Difference between the constant area model and the constant curvature model in terms of membrane morphology.

Vesiculation requires assembly of a clathrin coat on the membrane, as well as curvature generation from the clathrin coat. A vesiculation process defines a pathway in the phase space  $(a_0, c_0)$  of the clathrin coat area  $a_0$  and the intrinsic curvature  $c_0$  of the coat. The constant area model and the constant curvature model are pathways that are made of a vertical line and a horizontal line. Besides these two extreme cases, there is a continuum spectrum of pathways with simultaneously increasing coating area  $a_0$  and intrinsic curvature  $c_0$  that could lead to vesiculation. Along the pathway, the membrane evolves from a flat shape to a dimple shape, and finally to an  $\Omega$ -shape, as shown in Fig. 2. Hereafter we use the maximal tangential angle  $\psi_{\text{max}}$  of the membrane as an indicator of the progression of vesiculation - when the membrane is flat,  $\psi_{\text{max}} = 0^\circ$ , and when the membrane becomes spherical,  $\psi_{\text{max}} = 180^\circ$ . In our simulation, the neck becomes extremely narrow before  $\psi_{\text{max}} = 180^\circ$ . Therefore, we consider vesiculation occurs when  $\psi_{\text{max}}$  reaches  $150^\circ$  (Fig. 2a).

First, we analyze the difference between the two models in terms of membrane morphology evolution along their pathways. We fit a circle around the membrane tip and use the radius  $R_t$  of the circle to characterize the curvature of the membrane at the tip. When  $R_t$  is plotted against the maximal angle  $\psi_{\text{max}}$ , both models show that  $R_t$  decreases with increasing  $\psi_{\text{max}}$  (Fig. 2b and c). We stress that even though the intrinsic curvature  $c_0$  is fixed in the constant curvature model, it does not imply the tip radius along the vesiculation pathway is a constant. When the coating area is small, the geometric curvature at the membrane tip remains small and differs from

the intrinsic curvature. Tip radius in the constant curvature model decays more steeply with  $\psi_{\max}$  than in the constant area model. This difference becomes obvious when one plots the ratio of the tip radius at  $\psi_{\max} = 150^\circ$  and  $\psi_{\max} = 30^\circ$  (Fig. 2b and c insets). For the constant area model, the ratio approximately equals to a constant 0.268 regardless of the coating area  $a_0$ , which agrees well with the analytical result (See SI Appendix: model fitting), while for the constant curvature model, the ratio stays above 0.6 and approaches 1 at a certain  $c_0$  value.

Another difference between the two models is the evolution of the projected area of the clathrin coat on the substrate. We use the maximal radius  $R_{\text{coat}}$  of the membrane within the clathrin-coated area as the indicator of the projected area (Fig. 2a). In the constant area model,  $R_{\text{coat}}$  decreases with increasing  $\psi_{\max}$ , while in the constant curvature model,  $R_{\text{coat}}$  increases with  $\psi_{\max}$  and reaches a plateau (Fig. 2d and e). The ratio  $R_{\text{coat}}(150^\circ)/R_{\text{coat}}(90^\circ)$  is about 0.732 in the constant area model and around 1 in the constant curvature model (Fig. 2d and e, insets). The analytical curves of  $R_t$  and  $R_{\text{coat}}$  against  $\psi_{\max}$  also fit perfectly with numerical solutions in the constant area model (Fig. 2b and d, compare dotted and solid curves). Our calculations therefore demonstrate that the two models exhibit clear differences in the evolution of  $R_t$  and  $R_{\text{coat}}$  at the beginning of endocytosis (i.e. when  $\psi_{\max}$  is small) which can be determined from shapes of endocytic pits obtained experimentally.

To demonstrate how the coating area  $a_0$  and the intrinsic curvature  $c_0$  of the clathrin coat influence the membrane morphology, for each pair of  $(a_0, c_0)$ , we calculate the corresponding membrane shapes and plot the contour lines for  $\psi_{\max}$  which indicate the stage of endocytosis (Fig. 2f). The contour line with  $\psi_{\max} = 150^\circ$  represents the critical line where vesiculation occurs. The line can be well fitted by the analytical expression  $\bar{a}_0 \bar{c}_0^2 = 8$  (Fig. 2f, thick black line, see SI Appendix: critical vesiculation curve). It implies that a small intrinsic curvature of the clathrin coat is able to induce vesiculation of the membrane with a large clathrin coat. We find that the distances between contour lines for higher values of  $\psi_{\max}$  is smaller than those for lower values of  $\psi_{\max}$ . It means that at the late stage of endocytosis, a small change in  $a_0$  and  $c_0$  could result in a more dramatic change in the membrane shape than that at the early stage. This trend is demonstrated clearly from the orange dots in Fig. 2f, which correspond to shapes in Fig. 2a.

Note that in order to produce the diagram in Fig. 2f, it requires that the bending rigidity of the clathrin coated area  $\kappa_{\text{coat}}$  is significantly larger than  $\kappa_{\text{bare}}$  in the uncoated area. If  $\kappa_{\text{coat}}$  is comparable with  $\kappa_{\text{bare}}$ , there exists a region in the phase diagram in which a single  $(a_0, c_0)$  corresponds to three possible membrane shapes (See Fig. S1 a-d). Physically, it implies a discontinuous transition in the membrane shape along a path that passes through this region, and a gap in the maximal angle  $\psi_{\max}$  would appear. Because in experiments, a wide spectrum of  $\psi_{\max}$  are observed and no gap in  $\psi_{\max}$  is found (7), we keep  $\kappa_{\text{coat}}$  much greater than  $\kappa_{\text{bare}}$  for the rest of the paper. In this regime, the membrane shapes evolve continuously along any pathway that connects the origin  $(0, 0)$  with a point on the critical vesiculation curve.

**Vesiculation needs free energy sources to drive clathrin assembly and curvature generation.** In the previous section, we

take curvature generation in the constant area model and clathrin assembly in the constant curvature model for granted, so that the coating area  $a_0$  and the intrinsic curvature  $c_0$  are imposed, such that the physical forces behind clathrin assembly and curvature generation are ignored. However, the bending energy  $E_b$  and the tension energy  $E_t$  typically increase with  $a_0$  and  $c_0$  along a vesiculation pathway. Therefore, vesiculation will be energetically unfavorable if no additional free energy sources are provided. In this section, we extend the model to include free energy terms for the assembly of the clathrin coat and its reorganization for curvature generation.

To describe the assembly of the clathrin coat in the constant curvature model, we introduce

$$E_a = -\mu a_0, \quad [5]$$

where  $\mu$  denotes the effective surface binding energy density of clathrin molecules with the membrane. This term reduces the free energy with increasing  $a_0$ , therefore, driving the growth of  $a_0$ , i.e., clathrin assembly. We can identify three types of free energy curves for different assembly strength  $\mu$ : (1) When  $\mu$  is small, the total free energy  $E_{\text{tot}} = E_b + E_t + E_a$  as a function of the coating area  $a_0$  has two local minima, with the lowest one at a small  $a_0$  and the other one at the maximum  $a_0$  where vesiculation occurs (Fig. 3a, red curve). The minima are separated by an energy barrier that is significantly higher than the thermal energy  $k_B T$  and the clathrin coat would assemble to a small area and halt. (2) With increasing  $\mu$ , the lowest free energy minimum is shifted to the vesiculation point, but the energy barrier still exists and the clathrin coat remains small (Fig. 3a, orange curve). (3) Vesiculation could happen for large enough  $\mu$  such that the energy barrier vanishes and the free energy  $E_{\text{tot}}$  monotonically decreases with  $a_0$  (Fig. 3a, green). Based on the above analysis of the energy landscape we construct the phase diagram of the constant curvature model with clathrin assembly in the phase space of  $(c_0, \mu)$  and classify the points into four types. Besides the three types mentioned above, when the intrinsic curvature  $c_0$  is small, increasing  $a_0$  to its maximum value ( $10^5 \text{ nm}^2$ ) cannot produce vesiculation. (Fig. 3b, gray region). The critical assembly energy density  $\mu$  at which the energy barrier vanishes is found to increase with the intrinsic curvature  $c_0$  (Fig. 3b, interface between the green region and the orange region), which implies that a larger assembly strength of clathrin coat  $\mu$  is needed to complete vesiculation if the clathrin coat has a higher intrinsic curvature  $c_0$ . When comparing the contour lines of the energy barrier  $\Delta E_{\text{tot}} = 1k_B T$  and  $\Delta E_{\text{tot}} = 10k_B T$  (Fig. 3b, dotted curve and dash-dotted curve), the gap between them increases with  $c_0$ , which means that the energy efficiency is reduced with  $c_0$  in the sense that, for larger  $c_0$ , a larger increase in  $\mu$  is needed to reduce the same amount of free energy.

We next consider curvature generation in the constant area model. As the molecular mechanisms of curvature generation of the clathrin coat remains debated, we introduce a phenomenological model in which the free energy has the general form,

$$E_c = -\nu a_0^m c_0^n, \quad [6]$$

where  $\nu$  denotes the strength of curvature generation,  $m$  and  $n$  are two positive numbers that are associated with the molecular mechanisms of curvature generation. The free energy  $E_c$  in Eq. (6) decreases with increasing  $c_0$ , therefore, driving curvature generation. We set  $m = 1$  such that  $E_c$  is proportional to

the coating area. Note that  $m$  cannot be zero, otherwise,  $E_c$  only depends on the intrinsic curvature  $c_0$  and can be nonzero even when the coating area is zero. As for the power  $n$  of the intrinsic curvature  $c_0$ , we set  $n = 1$  or  $2$  (called Model(1,1) and Model(1,2), respectively). Physically, Model(1,2) implies cooperativity in the curvature generation such that the reduction of free energy per increase of unit curvature is proportional to the current curvature, i.e.,  $\Delta E_c \propto -c_0 \Delta c_0$ , while in Model(1,1), the reduction of free energy per increase of unit curvature is independent of current curvature. For Model(1,1), when  $\nu$  is small, the total free energy  $E_{tot} = E_b + E_t + E_c$  as a function of the intrinsic curvature  $c_0$  has two minima, the lowest one at a small positive  $c_0$  and the other one at the maximum  $c_0$  where vesiculation occurs (Fig. 3c, red curve). Further curvature generation is strictly limited by the high energy barrier (sometimes more than  $100k_B T$ ) between the two minima. With increasing  $\nu$ , the lowest minimum shifts to the vesiculation point, but the energy barrier still prevents curvature generation (Fig. 3c, orange line). For a large enough  $\nu$ , the free energy monotonically decreases with  $c_0$  and the curvature generation proceeds until vesiculation occurs (Fig. 3c, green curve). When the coating area  $a_0$  is very small, vesiculation fails to occur even when the intrinsic curvature is increased to its maximum value ( $0.125\text{nm}^{-1}$ ) (Fig. 3c, gray region). In the phase space of  $(a_0, \nu)$ , the critical value of  $\nu$  where the energy barrier vanishes increases with the coating area  $a_0$  (Fig. 3d, interface between the orange region and the green region), which implies that a larger clathrin coat needs a stronger strength of curvature generation to complete vesiculation.

Model(1,2) has similar free energy landscape as Model(1,1) (Compare Fig. 3c and e, d and f). However, in Model(1,2), for very small  $\nu$ , the lowest free energy minimum is strictly pinned at  $c_0 = 0$ , which implies no spontaneous curvature generation. In contrast, the minimum is at a small positive  $c_0$  in Model(1,1), which indicates slight curvature generation.

**Determination of the vesiculation pathway from the energy landscape.** In this section, we combine the assembly energy Eq. (5) and the curvature generation energy Eq. (6) together and calculate the total free energy  $E_{tot}(a_0, c_0) = E_b + E_t + E_a + E_c$  as a function of both the coating area  $a_0$  and the intrinsic curvature  $c_0$ . A pathway from the origin can be constructed by the descent along the negative gradient of the free energy landscape  $-\nabla E_{tot}$ . In Fig. 4a we show the free energy landscape for a fixed assembly strength ( $\bar{\mu} = 0.6$ ) and varied reorganization strength ( $\bar{\nu}$ ) for model(1,2). When  $\nu$  is small, the energy contour lines near the origin are kinked, which represents an energy barrier that prevents the path from going up, i.e. from generating curvature. The path extends horizontally and terminates on the  $a_0 - axis$  (Fig. 4a, first column, red curve). With increasing  $\nu$ , the kinked contour lines shift towards larger  $a_0$  and the path can be lifted up to  $\bar{c}_0 > 0.1$  in the middle and drops to the  $a_0 - axis$  in the end (Fig. 4a, second column, orange curve). Beyond a critical  $\nu$ , the energy barrier vanishes and the path bends up and terminates on the vesiculation curve (Fig. 4a, third column, green curve). Further increasing  $\mu$  leads to the path lifting up at a smaller coating area  $a_0$  (Fig. 4a, fourth column, green curve). The path goes horizontally first and is later lifted up, which resembles the path of the constant area model. The three types of pathways are classified into three colored regions in the phase diagram of  $(\mu, \nu)$ , which represent complete vesiculation

(green), partial vesiculation (orange) and no vesiculation (red), respectively (Fig. 4c).

The free energy landscapes of Model(1,1) dramatically differs from Model(1,2). When  $\nu$  is small, the energy gradient is strongly biased towards the horizontal direction, and the path extends horizontally with little or no curvature generation (Fig. 4b, first column). For an intermediate  $\nu$ , the path first goes towards the top right direction until  $\bar{c}_0 > 0.1$  and then slowly bends down and extends towards large coating area along a valley formed in the energy landscape, which corresponds to membrane shapes with a small dimple (Fig. 4b, second column). For large enough  $\nu$ , the path shoots nearly straightly towards the top right direction before it reaches the vesiculation line (Fig. 4b, third column). Further increasing  $\nu$  makes the path more straight and terminates at a smaller coating area (Fig. 4b, fourth column). The  $(\mu, \nu)$  phase diagram shows the parameter regions that lead to complete, partial or no vesiculation for Model(1,1) (Fig. 4d).

### Comparison between different models with the experimental

**data.** The constant area model and the constant curvature model represent two extreme pathways of membrane vesiculation. We have found constant-area-like pathways in Model(1,2) and straight-line-like pathways in Model(1,1). In order to understand which model is the most plausible, we compare membrane shapes predicted by the models with the membrane profiles obtained by electron microscopy in (7). The fitting error  $\epsilon$  of a vesiculation path reflects the relative difference between the model-predicted geometric features along the path and the rolling median of the corresponding experimental data (Fig. 5a, see SI Appendix: rolling median calculation and error calculation). The fitting geometric features include neck width, tip radius and invagination depth (Fig. 5c). We draw the corresponding optimum energy paths that minimize the fitting error (Fig. 5b), and compare the best model-predicted shapes with the experimental ones (Fig. 5d).

For Model(1,2) and Model(1,1), the fitting parameters include the polymerization strength  $\bar{\mu}$  and the reorganization strength  $\bar{\nu}$  which together determine the vesiculation pathway, as well as the characteristic length  $L_0$  which scales the size of the membrane. For Model(1,2), the best fits are obtained for  $\bar{\mu} = 0.36$ ,  $\bar{\nu} = 0.54$  and  $L_0 = 30\text{nm}$  (Fig. 5a). The resulting path moves horizontally at first and then bents up vertically (Fig. 5b), which resembles the behavior of the constant area model. For Model(1,1), the best fitting parameters are  $\bar{\mu} = 0.12$ ,  $\bar{\nu} = 1.00$  and  $L_0 = 40\text{nm}$  (Fig. 5a). The fitting path is almost a straight line towards the vesiculation line (Fig. 5b). The optimum fitting error of Model(1,2) ( $\epsilon = 0.14$ ) is slightly better than that of Model(1,1) ( $\epsilon = 0.17$ ).

We also perform the fitting procedure to the constant area model and find the optimum parameters are  $a_0 = 1.69 \times 10^4\text{nm}^2$  and  $L_0 = 30\text{nm}$ . For the constant curvature model, the best fitting parameters are  $c_0 = 0.043\text{nm}^{-1}$  and  $L_0 = 50\text{nm}$ . The minimum fitting error of the constant curvature model ( $\epsilon = 0.28$ ) is exactly twice as large as that of the constant area model ( $\epsilon = 0.14$ ) (Fig. 5a and b). So considering the fitting error and the pathway in  $(a_0, c_0)$  phase diagram, we raise the conclusion that the experimental vesiculation process probably favors constant-area-like pathways.

When comparing the model-predicted geometric features with the rolling median of the experimental data, we find that the four models fit almost equally well the experimental

405 data for the neck width (Fig. 5c left). Model(1,2) and the  
406 constant area model predict very similar results such that the  
407 curves almost overlap with each other (Fig. 5c, red curve and  
408 orange curve). The predictions of these two models match the  
409 rolling median of the experimental data best. The constant  
410 curvature model strongly deviates from the rolling median of  
411 the experimental tip radius, particularly in the early stage of  
412 vesiculation when  $\psi_{\max} < 90^\circ$ .

413 To compare the axisymmetric membrane shapes predicted  
414 by the models with the non-axisymmetric membrane profiles  
415 obtained with electron microscopy, we symmetrize the exper-  
416 imental data with a procedure (See SI Appendix: Fig. S3,  
417 symmetrization algorithm). Then, we average the symmetrized  
418 profile within an interval of  $\psi_{\max} \in [\psi_0 - 10^\circ, \psi_0 + 10^\circ]$  and  
419 overlay the averaged profile with model-predicted shapes for  
420  $\psi_{\max} = \psi_0$  (Fig. 5d). At the early stage when the membrane  
421 exhibits a dimple shape ( $0^\circ < \psi_{\max} < 60^\circ$ ), the membrane  
422 morphology predicted by the constant curvature model is dis-  
423 tinguishable from the other three models, particularly when  
424 looking at the tip radius. At the late stage when the membrane  
425 exhibits an  $\Omega$ -shape, i.e.,  $\psi_{\max} > 90^\circ$ , the difference in shape  
426 between models is mainly manifested in the invagination depth.  
427 The constant curvature model and Model(1,1) mainly predict a  
428 deeper invagination depth than the symmetrized experimental  
429 profile, while the constant area model and Model(1,2) usually  
430 give much better fitting.

## 431 Discussion

432 **Three types of clathrin coats.** In this paper, we have con-  
433 structed a physical model to describe how curvature generation  
434 and clathrin assembly are interrelated during the vesiculation  
435 process in CME. Previous experiments have reported three  
436 groups of clathrin coated pits, which are plaques, abortive pits  
437 and pits that lead to vesiculation, according to their structural  
438 and dynamic properties (30, 53–57). In Fig. 4, we show that  
439 depending on the clathrin assembly strength  $\mu$  and its reor-  
440 ganization strength  $\nu$ , the pathway might end up with three  
441 possible final shapes: (i) a flat membrane with no curvature  
442 generation, (ii) a nearly flat membrane with small curvature  
443 generation, (iii) a spherical cap that leads to vesiculation. They  
444 essentially correspond to the three types of clathrin-coated  
445 pits found in experiments. Based on the phase diagram of  
446 Model(1,2) (Fig. 4c), the difference between the three groups  
447 comes from the difference in the assembly and reorganization  
448 strengths of clathrin molecules. Furthermore, Model(1, 2) pre-  
449 dicted that at the boundary between the type (iii) region and  
450 the type (ii) region, the reorganization strength  $\nu$  increases  
451 with the assembly strength. This result has important impli-  
452 cations to explain why large plaques are commonly observed  
453 in experiments. The large area of the plaques are due to the  
454 strong assembly strength  $\mu$ . However, for these plaques to go  
455 to vesiculation, a strong reorganization energy  $\nu$  is also needed.  
456 Therefore, the combination of a strong  $\mu$  and weak  $\nu$  leads  
457 to the formation of large plaques. Model(1,2) predicts that a  
458 plaque or an abortive pit can be transformed into a vesicle by  
459 either increasing the reorganization strength or reducing the  
460 assembly strength (Fig. 6). The former ends up with a large  
461 vesicle and the latter ends up with a small vesicle. This can  
462 be used as a test of our theory with experiments to modify the  
463 binding affinity of clathrin molecules with adaptor proteins  
464 on the membrane. Weakening the affinity might increase the

465 portion of vesicles and reduce the portion of plaques, though  
466 the vesicles would become smaller.

**Cooperativity in the curvature generation process.** In Fig. 5,  
467 we show the best fitting results for all the four models and find  
468 that Model(1,2) produces better fits than Model(1,1), which  
469 suggests the existence of cooperativity in the curvature genera-  
470 tion process. In particular, if curvature generation is driven by  
471 breaking bonds in the hexagonal lattice, cooperativity implies  
472 that the number of newly broken bonds is proportional to the  
473 number of already broken bonds. Because of this cooperativity,  
474 at the early stage of endocytosis bonds are broken slowly and  
475 clathrin assembly dominates over curvature generation. At  
476 the late stage of endocytosis, an increasing number of bonds  
477 are broken and curvature generation could happen rapidly and  
478 dominate over clathrin assembly. Altogether, this cooperativ-  
479 ity leads to a constant-area-like behavior. Similar effect have  
480 been reported in (36).  
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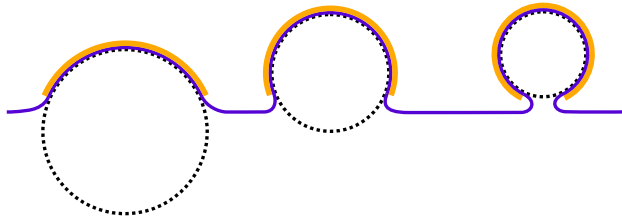
## 482 The difference in membrane morphology between the differ- 483 ent models is most salient at the early stage of endocytosis.

484 When we compare the model predictions, we find that the  
485 difference in membrane morphology between models is not as  
486 big as expected, which might explain why it has been difficult  
487 to distinguish between the constant area and the constant  
488 curvature models for so long. For instance, the neck width  
489 vs.  $\psi_{\max}$  and the invagination depth vs.  $\psi_{\max}$  are similar for  
490 all the four models (Fig. 5c, left and right). The best fitting  
491 error of the four models calculated from the geometric features  
492 are relatively close, except for the constant curvature model,  
493 which gives the worst fit (Fig. 5 a). The models are mainly  
494 distinguishable from the tip radius vs.  $\psi_{\max}$  plot at the early  
495 stage of endocytosis when the membrane is nearly flat (Fig. 5c,  
496 middle), i.e. for shapes with small  $\psi_{\max}$ . However, published  
497 experimental shape at early stages of endocytosis are sparse.  
498 Our result hints that in order to distinguish between the mod-  
499 els, collecting membrane shapes at the early stage is necessary  
500 and the relation of tip radius vs.  $\psi_{\max}$  is the key geometric  
501 feature to tell the models apart.

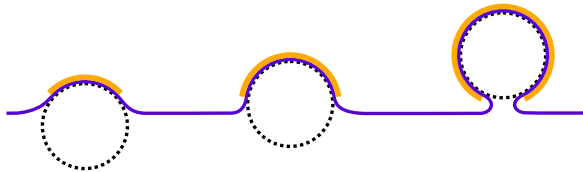
## 502 The projected area of clathrin coat in the plane of the plasma 503 membrane could distinguish between the two models.

504 In Fig. 2d and e we have shown that the coat radius  $R_{\text{coat}}$ ,  
505 which represents the projected area of the clathrin coat in the  
506 plane of the plasma membrane, as a function of  $\psi_{\max}$  exhibit  
507 opposite trends for the constant curvature model and the con-  
508 stant area model. The results suggest that in experiments  
509 the projected area for the constant area model would first in-  
510 crease and then decrease over time, finally reaching a plateau.  
511 However, for the constant curvature model, the projected area  
512 would increase over time and finally reach a plateau without  
513 a decreasing phase. This result suggests another method to  
514 distinguish between the two models via the projected area  
515 measurement. The idea has been used in a study where the  
516 clathrin-coated pit was imaged with platinum replica and cryo-  
517 electron microscopy and tomography (18). The results support  
518 a constant-area-like model, consistent with the prediction of  
519 our Model(1,2), in which the dome structures have a slightly  
520 larger coating area than flat structures. On the other hand,  
521 another study has used the super-resolved live cell fluorescence  
522 imaging with TIRF to measure the growth of the clathrin  
523 coat over time (39). The authors found a smooth drop in the

## (a) Constant area model



## (b) Constant curvature model



**Fig. 1.** Schematic illustrations of the constant area model (a) and the constant curvature model (b) for CME. Blue: plasma membrane, yellow: clathrin coat, black dashed line: curvature of the clathrin coat

**Table 1.** List of default parameters in the model.

Symbols	Meaning	Value	Unit
$\kappa_{\text{bare}}$	Bending rigidity of uncoated area	20	$k_B T$
$\kappa_{\text{coat}}$	Bending rigidity of coated area	1000	$k_B T$
$\sigma_e$	Membrane tension at the base	0.025	$\text{pN} \cdot \text{nm}^{-1}$
$R_b$	Boundary radius	5	$L_0$
$\alpha$	Sharpness of the step function	10	$(2\pi L_0^2)^{-1}$

to J.B.

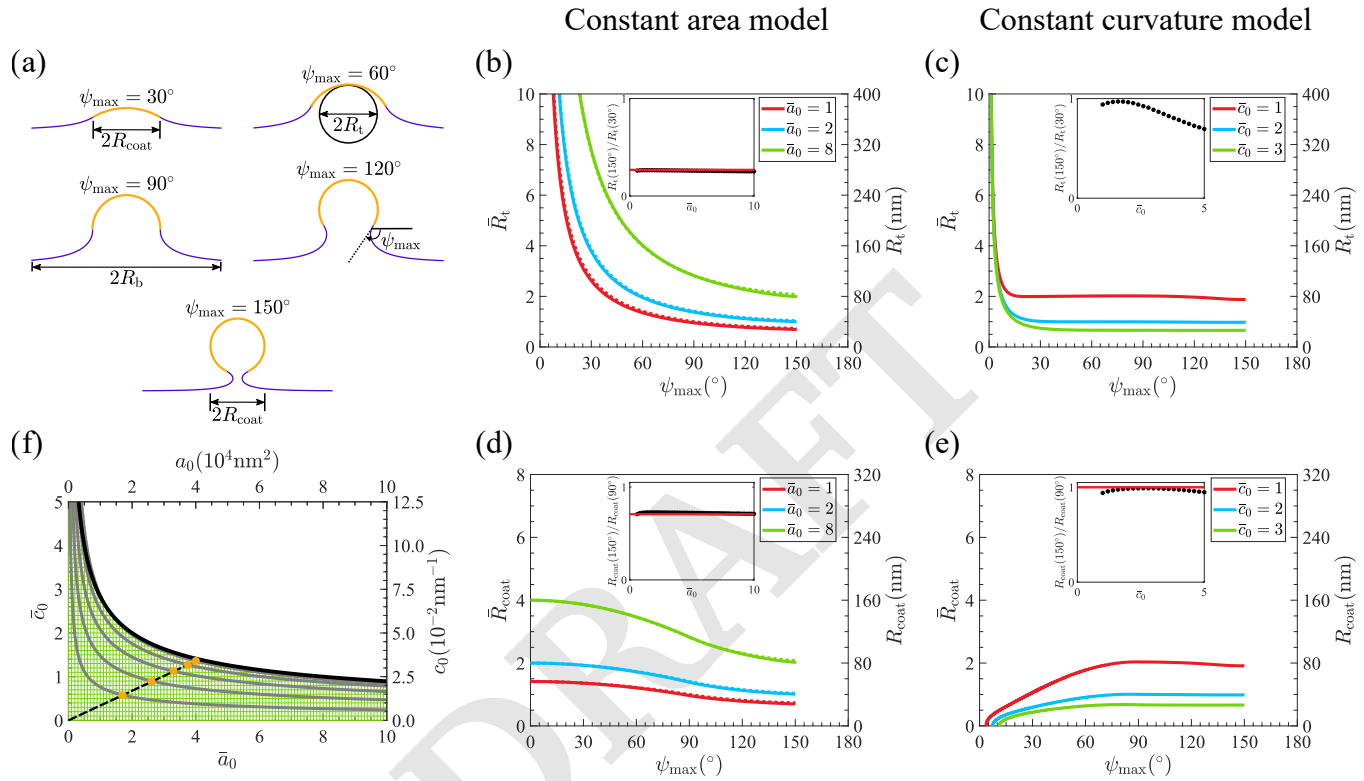
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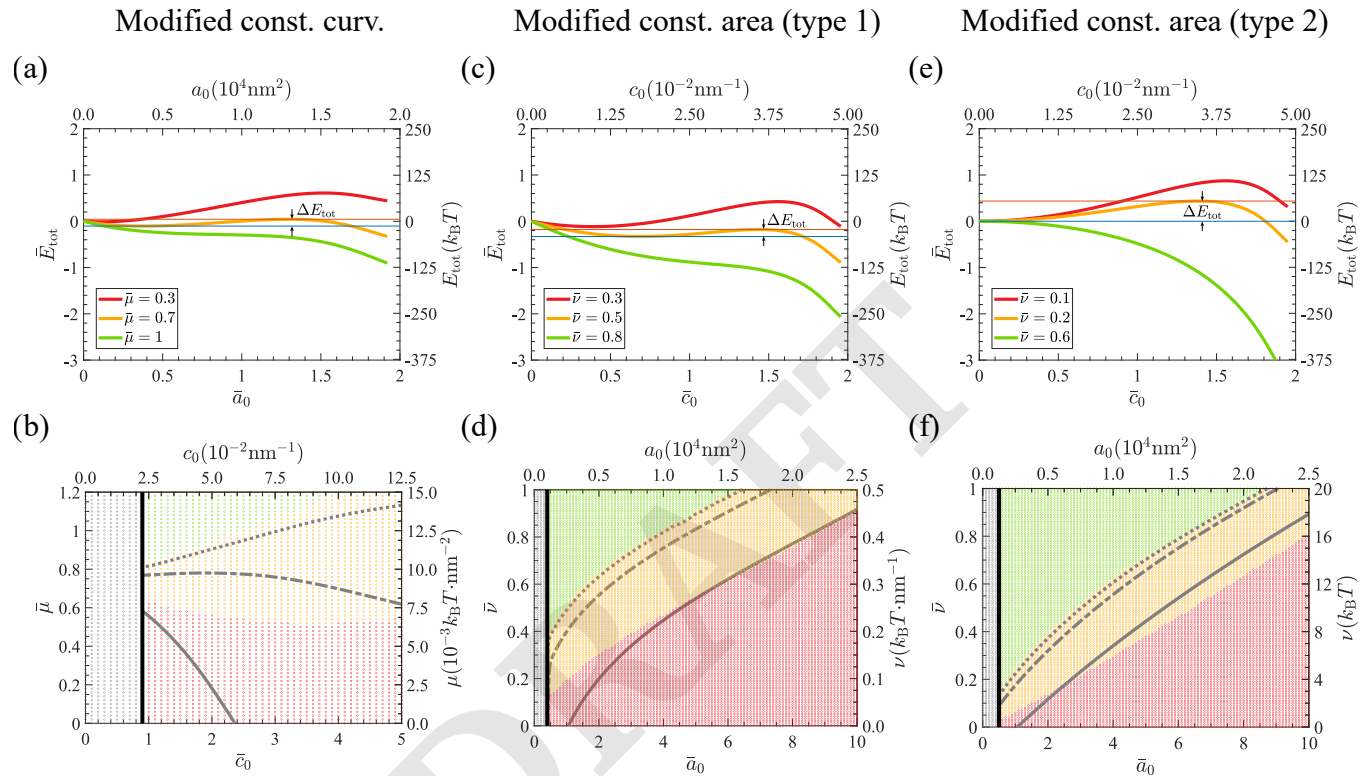
524 projected area of clathrin coat over time. However, based on a  
 525 computer simulation of clathrin assembly, they concluded  
 526 that the smooth drop of the projected area was the result of  
 527 a constant-curvature-like model because a constant-area-like  
 528 model would produce a sharp drop. We attribute the difference  
 529 between their model and our model to the fact that they model  
 530 the clathrin coat as a discrete lattice while we use a continuum  
 531 mechanics method. More importantly, in their model, the  
 532 moment at which curvature generation occurs was arbitrarily  
 533 imposed at 80% of clathrin triskelions. If the transition were  
 534 chosen to occur with fewer triskelions, e.g. 40%, the sharp  
 535 drop in the project area might not happen in the constant-  
 536 area-like model. Furthermore, the authors used the number  
 537 of triskelions to monitor the progress of endocytosis which  
 538 terminates when the triskelions reach the maximum number.  
 539 This choice might bias towards the constant-curvature-like  
 540 model because the vesiculation may not happen at all when  
 541 the clathrin numbers reaches its maximum.

542 **The bending rigidity of the coated area should be much larger**  
 543 **than the uncoated area.** Comparison of our model to experi-  
 544 mental data demonstrates that the relative bending rigidities  
 545 of the coat and the membrane are constrained. Indeed, if  
 546  $\kappa_{\text{coat}}/\kappa_{\text{bare}} < 50$ , the model predicts an abrupt change (or  
 547 a gap) in  $\psi_{\text{max}}$  at the end of vesiculation (See SI Appendix,  
 548 Fig. S1, gap of the maximum angle), i.e., a snap-through  
 549 transition reported in (44). If a gap in  $\psi_{\text{max}}$  existed, we  
 550 would expect that the distribution of experimental shapes to  
 551 be discontinuous, with no or very few data corresponding to a  
 552 certain range of  $\psi$ . However, in the experiments from (7), the  
 553 endocytic pits shapes are continuously distributed across the  
 554  $\psi_{\text{max}}$  spectrum, indicating the ergodicity of  $\psi_{\text{max}}$  during the  
 555 endocytic process. Our calculation suggests that the clathrin  
 556 coat is about 50 times stiffer than the membrane.

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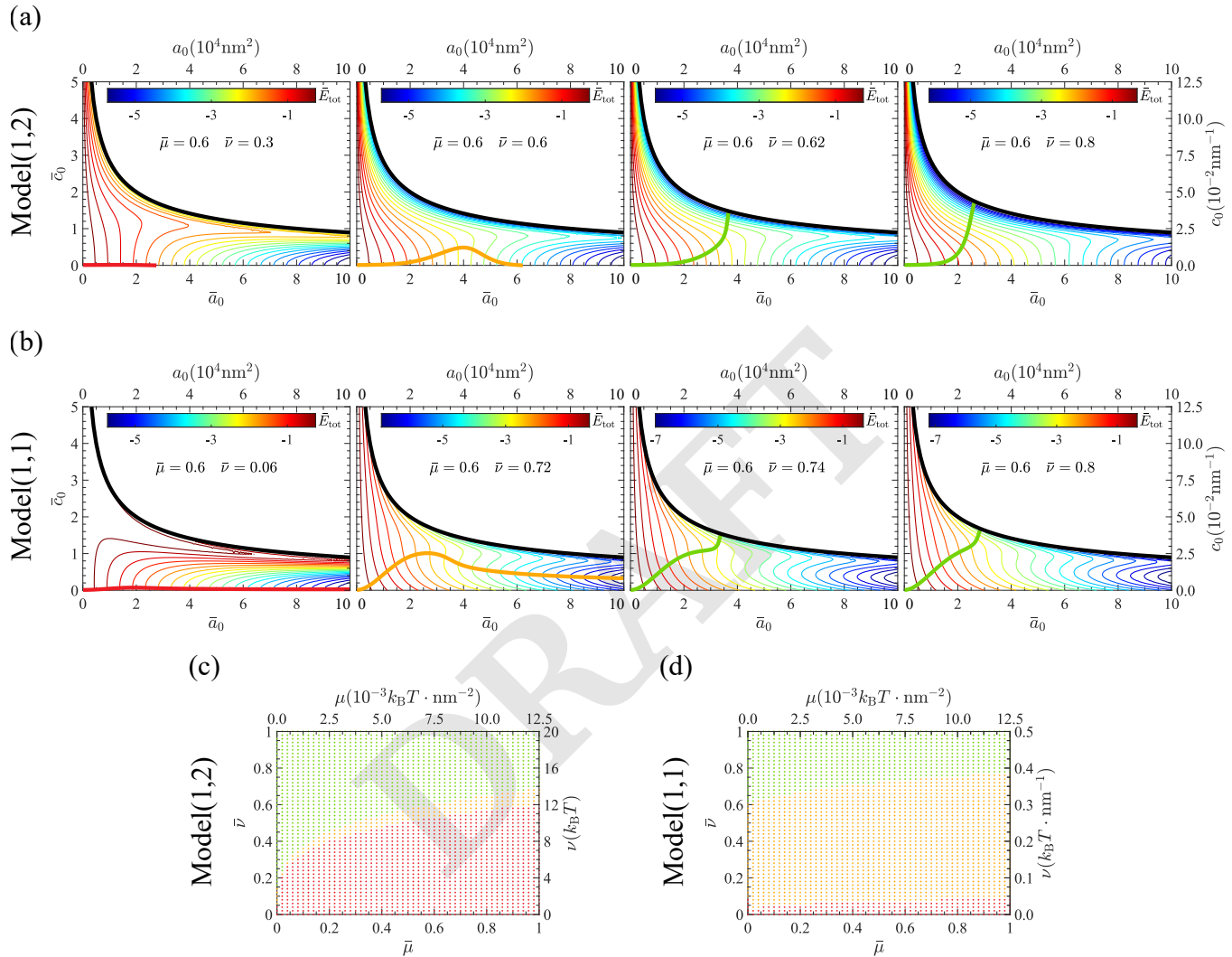


**Fig. 2.** Evolution of membrane morphology and phase diagram of vesiculation in the  $(a_0, c_0)$  parameter space. (a) Membrane shapes at different stages of invagination and definition of some variables used in this paper. We define the distance from the axisymmetric axis to the edge of the coating area as  $R_{\text{coat}}$ , the radius of the tangential curvature circle at the tip of the shape as  $R_t$ , and the distance from axisymmetric axis to the boundary as  $R_b$ . The maximum tangential angle of the cross section contour is  $\psi_{\max}$ . (b,c) Tip radius  $R_t$  vs. maximal angle  $\psi_{\max}$  for the constant area model in (b) and for the constant curvature model in (c). Dotted lines in (b) denote the analytical solutions. Insets show the ratio of the tip radii  $R_t$  at  $\psi_{\max} = 150^\circ$  and  $\psi_{\max} = 30^\circ$ . The inset dark dots denotes the numerical results and the red line is the analytical solution (See SI Appendix: model fitting). (d,e) Coat radius  $R_{\text{coat}}$  vs. maximal angle  $\psi_{\max}$  for the constant area model in (d) and for the constant curvature model in (e). Dotted lines in (d) denote the analytical solutions. Insets show the ratio of the coat radius  $R_{\text{coat}}$  at  $\psi_{\max} = 150^\circ$  and  $\psi_{\max} = 90^\circ$ . The inset dark dots denotes the numerical results and the red lines are the analytical ones (See SI Appendix: model fitting). (f) Vesiculation diagram in the phase space of  $(a_0, c_0)$ . Each horizontal line represents a path of the constant curvature model and each vertical line represents a path of the constant area model. Each path terminates when  $\psi_{\max} = 150^\circ$ . The solid grey lines represent contours of  $\psi_{\max} = 30^\circ, 60^\circ, 90^\circ, 120^\circ, 150^\circ$ , respectively. The solid black line is the analytical results for the vesiculation line  $\bar{a}_0 \bar{c}_0^2 = 8$  (See SI Appendix: critical vesiculation curve). The dashed black line is a random-picked straight line connecting the origin and the vesiculation boundary. The intersections of the dashed black line and the gray lines are plotted in orange dots and they are the coordinates of  $(a_0, c_0)$  where the five shapes in (a) are located. Shapes are arranged in an increasing order of  $\psi_{\max}$  in (a). (b-e) Parameters with a bar over them (left vertical axes) are normalized to be dimensionless, and the dimensional parameters (right vertical axes) are calculated by one of the typical fitting values  $L_0 = 40 \text{ nm}$  (Fig. 5)

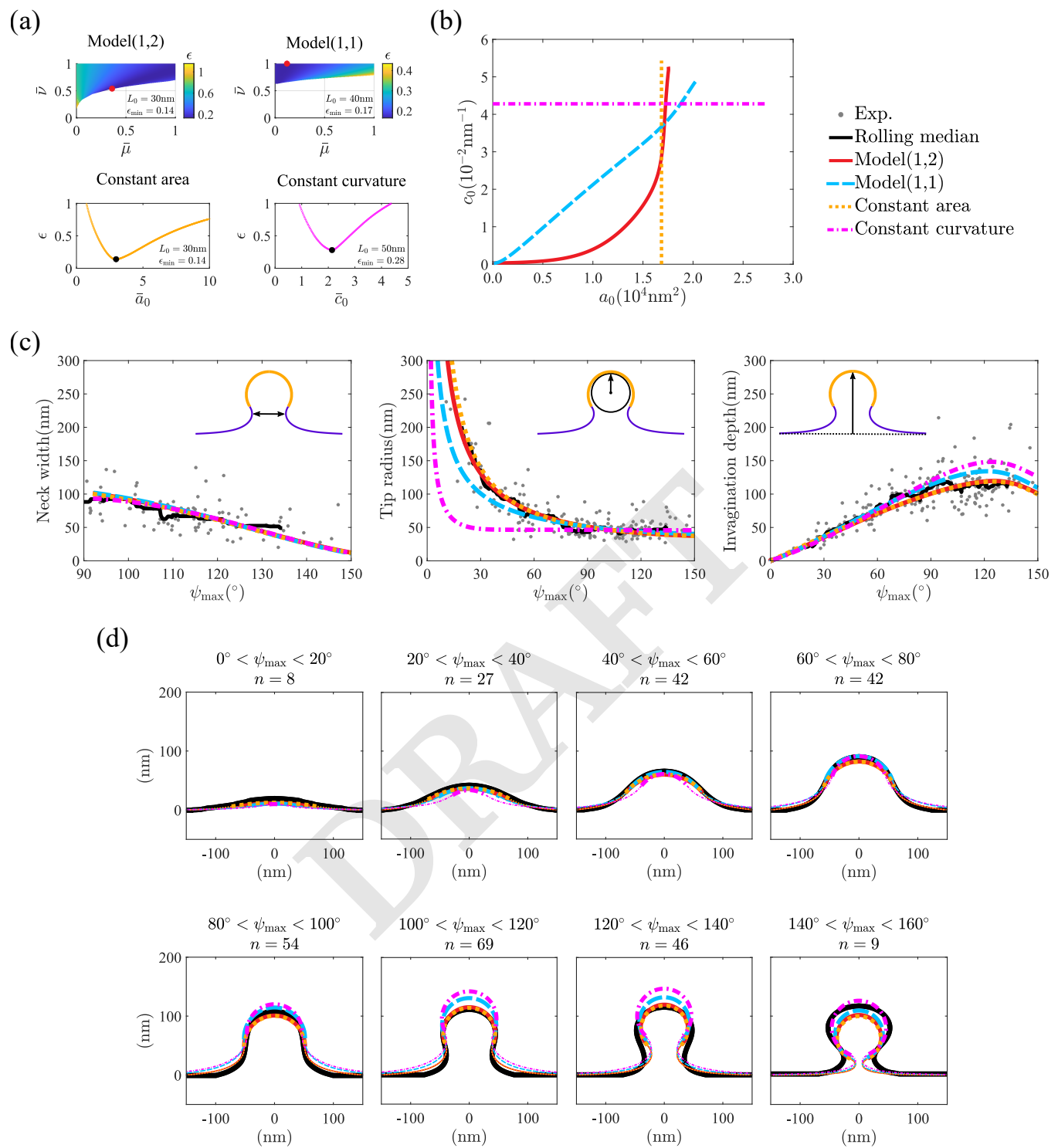


**Fig. 3.** Free energy evolution in the constant curvature and constant area models when accounting for one of either the polymerization energy term  $E_a = -\mu a_0$  or the curvature generation energy term  $E_c = -\nu a_0 c_0$  (type 1) and  $E_c = -\nu a_0 c_0^2$  (type 2). (a,b) Free energy landscape of the modified constant curvature model where  $\bar{c}_0 = 2$  with polymerization energy  $E_a = -\mu a_0$  in (a) and the corresponding phase diagram in the phase space of  $(c_0, \mu)$  in (b). The rightmost endpoint of each curve is the vesiculation point where  $\psi_{\max} = 150^\circ$ . The red line in (a) and red dots in (b) correspond to pathways with minimum free energy  $E_{\text{tot}}$  appearing at a point other than the vesiculation point on the  $E_{\text{tot}} - \bar{a}_0$  curve. The orange line in (a) and the orange dots in (b) correspond to pathways where the vesiculation point is the minimum free energy point, but an energy barrier still exists. The green line in (a) and green dots in (b) correspond to vesiculation pathways without an energy barrier. The energy barrier  $\Delta E_{\text{tot}}$  is defined as the energy difference between the maximum point and the first minimum point before the maximum.  $\Delta E_{\text{tot}}$  of the orange curve is shown in (a) as a typical example. The gray dots in the left-hand side of (b) correspond to pathways that numerically fail to reach the vesiculation point when  $\bar{a}_0$  reaches its upper limit 10. (c,d) Free energy landscape of the modified constant area model where  $\bar{a}_0 = 2$  with curvature generation energy  $E_c = -\nu a_0 c_0$  in (c) as a function of the intrinsic curvature  $c_0$  and the corresponding phase diagram in the phase space of  $(a_0, \nu)$  in (d). The gray dots in the left-hand side of (d) correspond to pathways that numerically fail to reach the vesiculation point when  $\bar{c}_0$  reaches its upper limit 5. (e,f) Free energy landscape of the modified constant area model where  $\bar{a}_0 = 2$  with  $E_c = -\nu a_0 c_0^2$  in (e) and the corresponding phase diagram in the phase space of  $(a_0, \nu)$  in (f). The gray dots in the left-hand side of (f) correspond to pathways that numerically fail to reach the vesiculation point when  $\bar{c}_0$  reaches its upper limit 5. (a-f) The parameters with a bar over them are normalized to be dimensionless, and the dimensional parameters are calculated using one of the typical fitting values  $L_0 = 40\text{nm}$  (Fig. 5). (b,d,f) The black line separates the region with gray dots (which did not numerically reach vesiculation) from the other regions. The dotted, dash-dotted and solid gray lines respectively represent the paths where  $\Delta E_{\text{tot}} = 1k_B T$ ,  $\Delta E_{\text{tot}} = 10k_B T$ ,  $\Delta E_{\text{tot}} = 100k_B T$ .

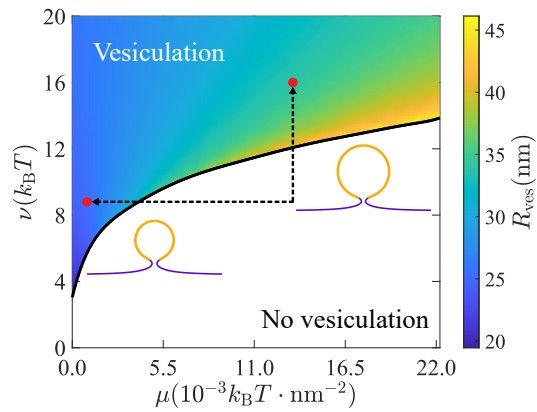




**Fig. 4.** Vesiculation phase diagram when accounting for both the polymerization energy  $\mu$  and the reorganization energy  $\nu$ . (a,b) Free energy landscape for Model(1,2) (i.e. with reorganization energy  $E_c = -\nu\alpha_0^1 c_0^1$ ) in (a) and Model(1,1) (i.e. with reorganization energy  $E_c = -\nu\alpha_0^1 c_0^1$ ) in (b). Thick black lines are the analytical solutions for the vesiculation boundary. Thin rainbow-colored lines visually represent the energy landscape (values of the color bar are for the dimensionless free energy scale). Thick colored-lines represent pathways that stream along the negative gradient of the free energy landscape in the phase space starting from the origin (i.e. no clathrin assembled and no curvature). Our model shows that only a subset of suitable  $(\mu, \nu)$  values create pathways that lead to vesiculation, i.e. that reach the thick black line (thick green lines in the third and fourth panels). The orange and red curves are pathways that fail to reach vesiculation. The red curve does not produce any curvature, while the orange curve generates a small curvature but never leads to vesiculation. (c,d) Phase diagrams for Model(1,2) in (c) and Model(1,1) in (d) show the relationship between pathway types and the  $(\mu, \nu)$  values. The colors of the dots correspond to the same types of pathways as represented by thick colored lines in (a,b). Our results show that larger  $\mu$  or  $\nu$  values lead to an easier vesiculation. Parameters with a bar over them are normalized to be dimensionless, and the dimensional parameters are calculated using one of the typical fitting values  $L_0 = 40\text{nm}$  (Fig. 5).



**Fig. 5.** Comparison between our theory and experimental data from mammalian cells. (a) Parameter fit of the best of the four models (constant curvature model, constant area model, Model(1,1), Model(1,2)) to obtain the minimum error  $\epsilon$ . Fitting procedure of Model(1,1) and Model(1,2) consider the total free energy  $E_{\text{tot}} = E_b + E_t + E_a + E_c$ , while the fitting of the constant area model and the constant curvature model consider  $E_{\text{tot}} = E_b + E_t$ . The optimized parameters are  $\bar{a}_0 \in [0, 10]$  for the constant area model,  $\bar{c}_0 \in [0, 5]$  for the constant curvature model,  $\bar{\mu} \in [0, 1]$  and  $\bar{\nu} \in [0, 1]$  for model(m,n), and  $L_0 \in [10\text{nm}, 100\text{nm}]$  within an interval of 10nm in the four models. We only assign fitting error to the parameter sets that lead to vesiculation and only plot the error figure for the best  $L_0$ . (b) Vesiculation pathways with minimum fitting error in the four models. In each model, we use the best  $L_0$  value from (a) to obtain the dimensional scale of the  $(a_0, c_0)$  phase space. (c) Comparison of model fits and experimental data for three geometric features: neck width, tip radius ( $R_t$ ) and invagination depth. Neck width is calculated as the distance between the left and right parts of the shape for  $\psi_{\max} = 90^\circ$ , and the invagination depth is measured as the height from the base to the tip of the invagination. (d) Comparison between the model-predicted shapes and the experimental shapes. Experimental membrane shapes for mammalian cells are grouped according to their maximum angle as a proxy for the different stages of CME. The number of experimental shapes falling in a certain  $\psi_{\max}$  range is defined as  $n$ . The black lines are the average experimental shapes after symmetrization. The model-predicted shapes are calculated by the midpoint value of each  $\psi_{\max}$  interval. (c,d) The curves predicted by theory are shown with colored lines, and experimental data is shown with gray dots and black lines. Parameters with a bar over them are non-dimensionalized. The detailed procedure to treat the experimental data can be found in the supplement: symmetrization algorithm, rolling median calculation and error calculation.



**Fig. 6.** Tip radius of vesiculation shapes ( $R_{ves}$ ) in Model(1,2). The colored region shows the  $(\mu, \nu)$  sets that lead to vesiculation, and brighter colors correspond to larger  $R_{ves}$ . Decreasing assembly strength  $\mu$  or increasing reorganization strength  $\nu$  might lead to vesiculation of different vesicle sizes. An example from  $(\mu, \nu) = (13.3 \times 10^{-3} k_B T \cdot \text{nm}^{-2}, 8.8 k_B T)$  to the vesiculation region is marked by arrows, red dots and corresponding vesicle shapes. The characteristic length  $L_0 = 30 \text{nm}$  is used in the calculation.

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