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Modelling cellular spreading and emergence of motility in the presence of curved membrane proteins and active cytoskeleton forces

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Abstract Eukaryotic cells adhere to extracellular matrix during the normal development of the organism, forming static adhesion as well as during cell motility. We study this process by considering a simplified coarse-grained model of a vesicle that has uniform adhesion energy with a flat substrate, mobile-curved membrane proteins and active forces. We find that a high concentration of curved proteins alone increases the spreading of the vesicle, by the self-organization of the curved proteins at the high-curvature vesicle–substrate contact line, thereby reducing the bending energy penalty at the vesicle rim. This is most significant in the regime of low bare vesicle–substrate adhesion. When these curved proteins induce protrusive forces, representing the actin cytoskeleton, we find efficient spreading, in the form of sheet-like lamellipodia. Finally, the same mechanism of spreading is found to include a minimal set of ingredients needed to give rise to motile phenotypes.

1 Introduction

The adhesion of cells to an external substrate is an essential process allowing cells to form cohesive tissues, migrate and proliferate [1]. The stages of cellular spreading over an adhesive surface have been studied experimentally [2–9] and involve an initial stage of non-specific and weak adhesion, followed usually by spreading that is driven by the formation of thin sheet-like lamellipodia. These structures form when actin polymerization is recruited to the leading edge of the lamellipodia [10]. The actin provides both a protrusive force that pushes the membrane outwards and traction forces that enhance the growth of adhesion complexes. When actin polymerization is inhibited, cells exhibit very weak spreading, reduced adhered area [5], and strongly retract (if the drug is delivered after normal spreading [11]).

While this complex process has been explored from its biological aspects, a more basic physics understanding of the cell spreading process is lacking [12]. There are several theoretical treatments of the cell spreading process, with various levels of coarse-graining and detail, starting from the simplest dynamical-scaling model [4]. Some models focus on the role of actin and actin–adhesion coupling during the spreading and adhesion, but do not describe the

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membrane shape dynamics in detail [13–16]. Other models describe in detail the cell shape and the stress fibres that span the adhered cell [17,18], with the higher realism obtained at a price of much higher model complexity.

The simpler process of vesicle adhesion, which has been explored using in vitro systematic experiments [19–23], is amenable to theoretical physics description [23]. A large number of theoretical studies treated the coarse-grained adhesion of a vesicle with uniform adhesion [24–26], while other studies have explored the molecular-scale adhesion dynamics [27–29], which include ligand binding/unbinding as well as diffusion and aggregation of ligands on the membrane–substrate interface (through direct and membrane-induced interactions [30,31]).

We aim here to help bridge the gap between our understanding of vesicle adhesion and the more complex process of active cellular spreading. We do this by exploring a simple, coarse-grained theoretical model of vesicle adhesion which contains two ingredients: (i) we add a fixed density of curved membrane proteins and (ii) exert active protrusive forces at the locations of the membrane proteins. Both of these components are motivated by experimental properties of cells: cell membranes contain a plethora of curved membrane proteins [32,33], and many of these curved proteins (or membrane-bound protein complexes) are involved in the recruitment of actin polymerization activity to the membrane [34,35]. These two ingredients have been recently shown theoretically [36] and experimentally [37,38] to be sufficient to induce the formation of sheet-like lamellipodia protrusions in cells. We therefore set out to explore theoretically the role of these ingredients during active spreading of cells.

2 Model

We use here the same theoretical model of [36], adapted to include membrane–substrate adhesion. We consider a three-dimensional vesicle that is described by a surface of N vertices, each connected to its neighbours with bonds of length l, to form closed, dynamically triangulated, self-avoiding network, with the topology of a sphere, as shown in Fig. 1. The location of the vertices is described by the position vector \vec{r}_i , where i runs from 1 to N. An adhesive surface is placed near the vesicle, parallel to x-y plane and at position $z = z_{ad}$ (see Fig. 1). The total energy of the vesicle is the sum of four contributions: (1) the local bending energy due to its curvature, (2) the energy due to binding between neighbouring proteins (direct interaction energy), (3) the energy due to the active cytoskeleton force and (4) the adhesive energy due to the attractive interaction between the vesicle and the substrate.

Note that the term 'curved membrane proteins' stands for any complex of such proteins and lipids (such as in nanodomains) in general [39,40] that has a spontaneous curvature and can induce local polymerization of the cortical actin cytoskeleton.

The bending energy can be mathematically expressed using the Helfrich expression [41] as,

$$W_b = \frac{\kappa}{2} \int_A (C_1 + C_2 - C_0)^2 \mathrm{d}A$$
(1)

where C_1 and C_2 are principle curvatures, C_0 is the spontaneous curvature at any position of the vesicle, and κ is the bending rigidity. The bending energy is properly discretized following Refs. [42–44]. We model the spontaneous curvature as discrete entities that is occupied by a vertex. The spontaneous curvature of a vertex that is occupied by curved proteins is taken to have some nonzero value $C_0 = c_0$, and zero otherwise. In our model, we consider a positive (convex) and isotropic spontaneous curvature having numerical value $c_0 = 1.0 l_{min}^{-1}$, where l_{min} is the minimal length of a bond in our triangulated surface. The ratio of vesicle size to protein size in our model is of the order 10–100, while in real cells the ratio can be of the order 10^4-10^5 . Thus, the proteins in our model can be interpreted as protein complexes or curved nanodomains. Alternatively, the vesicle in our simulations can be viewed as a cell fragment rather than a whole cell, but the dynamics we expose here can also be scaled up to the cellular scale.

The energy due to the binding between proteins is expressed as,

$$W_d = -w \sum_{i < j} \mathcal{H}(r_0 - r_{ij}) \tag{2}$$

where \mathcal{H} is the Heaviside step function, having a value of unity if the argument is positive, otherwise vanishes, $r_{ij} = |\vec{r}_j - \vec{r}_i|$ is the distance between proteins, r_0 is the range of attraction, beyond which the attractive force becomes zero, and w is a positive constant (throughout the paper we use: $w = 1 k_B T$). In our model, we choose r_0 to be such that only the proteins in neighbouring vertices can bind with each other.

The actin cytoskeleton that is recruited by the curved proteins exerts an outward force, which therefore gives the following energy contribution,

$$W_F = -F \sum_{i} \hat{n}_i \cdot \vec{r}_i \tag{3}$$

where *F* is the magnitude of the force, $\hat{n_i}$ is the outward normal of the vertex that contains a protein, and \vec{r}_i is the position vector of the protein. The assumption of a normal active force is motivated by simplicity [36], as well as by a coarse-grained view of the average direction of forces applied by actin filaments on the membrane. Note that this active force appears as an energy term which is not bounded from below and therefore drives the system out of equilibrium. In a real cell, the active forces arise from the internal consumption of chemical energy, which we describe here by an external force. Furthermore, we assume here for simplicity that the active force follows the dynamics of the proteins. This means that when a protein changes its location, the active force acts immediately in the new position of the protein and vanishes from the protein's previous location. This adiabatic assumption may be valid for membrane proteins that are closely bound to the cortical actin, such as actin nucleators [45,46].

Finally, the vesicle can adhere on the adhesive surface, due to which it has the energy contribution,

$$W_A = -\int_A V(z) \mathrm{d}A \tag{4}$$

where V(z) is the interaction potential between the adhesive surface and the vesicle. In our model, we choose the interaction potential V(z) to be a Heaviside step function, such that the adhesion interaction energy is negative for all the adhered vertices and zero otherwise. In other words, $W_A = -\sum_{i'} E_{ad}$, where E_{ad} is a constant, termed as adhesion strength, and the sum runs over all the adhered vertices for which the z-coordinate is within the range: $z_{ad} \le z(i) \le (z_{ad} + \Delta z)$, where z_{ad} is the z-coordinate of the adhesive surface, and $\Delta z = 1 l_{min}$ is the width of the adhesion potential energy (see Fig. 1b). The adhesive surface is considered to be a hard surface, such that a vertex cannot penetrate it.

Thus, the total energy of the system can be written as,

$$W = W_b + W_d + W_F + W_A \tag{5}$$

The simulation details are given in Appendix A. Throughout these simulations, we do not conserve the vesicle volume, which is appropriate for cells that are observed to change their



Fig. 1 A schematic representation of our model. **a** A three-dimensional vesicle is placed on the adhesive surface, having uniform adhesion interaction with the vesicle throughout. The position of the adhesive surface is at $z = z_{ad}$ and parallel to x - y plan. **b** The range of adhesive interaction is within a distance of Δz above the adhesive surface. The total adhesion energy will be E_{ad} times the number of vertices within this interaction range, where E_{ad} is the adhesion strength, defined as the adhesion energy per adhered vertex

volume significantly during spreading and adhesion [47,48]. One can, however, add to the model the effects of an internal osmotic pressure that inflates the vesicle [36].

Note that during the process of vesicle adhesion and spreading, there are hydrodynamic processes that we do not include in our model, such as fluid flow within the vesicle, between the vesicle and the substrate, and of the fluid membrane, i.e. visco-elastic properties of the system were neglected (see, for example, [49]). These omissions mean that the dynamics that we extract from the simulations, in MC time steps, may not be simply mapped to a real timescale.

3 Results

In order to validate our simulation method, we first compared the steady-state shapes of adhered protein-free vesicles (Movie 1) to those previously obtained using detailed numerical solutions [23,50]. The very good agreement between the two different methods (Fig. 10 of Appendix B) verifies the accuracy of our simulations. The equilibrium vesicle shapes minimize the energy, striking a balance between the adhesion energy that drives the spreading and the bending energy that resists the deformation of the membrane.

Next, we explore the effects of the curved proteins and the active forces that they recruit.

3.1 Spreading of vesicles with passive-curved proteins

We start by exploring the effects of passive-curved proteins, without active cytoskeletal forces. Since there is no active force acting on the system, the system reaches an equilibrium configuration after evolving it for sufficiently long times. We aim to understand here, how the presence of the curved proteins affects the vesicle shape, as well as the demixing of the curved proteins.

In Fig. 2, we plot snapshots of typical equilibrium adhered vesicle shape and the protein cluster-size distribution for different values of adhesion strength (E_{ad}) and the number density of proteins ($\rho = N_c/N$). The background colour shows the adhered area fraction (AAF,



Fig. 2 Typical steady-state configurations of the vesicles and cluster distribution in the $E_{ad} - \rho$ plane for the passive case (F = 0). The background colour shows the fraction of adhered area of the vesicle on the adhesive surface. The blue part in the vesicle denotes the protein-free regions, and the red colour denotes the curved proteins. In the inset, we show the cluster distribution of proteins near each snapshot; *x*-axis is the size of the cluster, and the *y*-axis is the corresponding frequency of having the particular cluster in the ensemble. The *y*-axis is shown in the log-scale. We show the snapshots for $E_{ad} = 0.20, 0.75, 1.5, 2.5$ (in units of k_BT) and $\rho = 3.45\%, 10.36\%, 17.27\%$ and 24.18%. Other parameters are: total number of vertices, N = 1447, $\kappa = 20 k_B T$ and $w = 1 k_B T$. The width of the potential, Δz , is taken to be l_{min} , and the spontaneous curvature of the curved proteins is taken to be $c_0 = 1 l_{min}^{-1}$

 A_{ad}/A , where A_{ad} is the area adhered on the adhesive surface and A is the total area of the vesicle (so that the maximal possible value is $A_{ad}/A \simeq 0.5$ for very small volume).

For small ρ and small E_{ad} , the vesicle shape is quasi-spherical, similar to adhered proteinfree vesicles. The proteins are weakly clustered, and there are small patches of proteins around the whole vesicle. For very small adhesion energy, such as $E_{ad} = 0.2$, increasing ρ increases the adhesion area, but does not lead to full flattening of the vesicle. At higher values of E_{ad} , as ρ increases, the vesicle fully spreads and becomes flatter (since the volume is not fixed; see Movie 2). This spreading is driven by the aggregation of the curved proteins at the highcurvature region [39,51] where the adhered vesicle contacts the substrate ('contact line', Fig. 3a). Due to their large convex spontaneous curvature, the aggregation of the proteins in this region lowers significantly the bending energy of the vesicle and facilitates stronger bending and larger spreading on the substrate compared to the protein-free vesicle (Fig. 3b).

Note that demixing and phase separation of membrane proteins on an adhered vesicle were considered theoretically [52], however, the curvature-based demixing [53] that we discuss here was not previously treated during membrane adhesion. A simplified analytic model (see Appendix C) allows us to qualitatively recover the same trends found in the simulations. We find that the aggregation of curved proteins along the high curvature rim of the vesicle leads to a monotonous increase in the AAF and decrease in the bending energy with increasing protein density (for low ρ , Fig. 13).

As ρ increases, the vesicle flattens and surplus proteins that have no more space along the contact line form necklace-like protein clusters around the vesicle (Fig. 2). The necklace-like structures are formed because of the isotropic membrane proteins used in our simulation [36,54]. The AAF increases with ρ as long as the shape of the vesicle remains quasi-spherical or pancake-like. However, for large ρ , the shape of the vesicle changes and the surplus-curved proteins lead to budding all over the membrane. These buds (isolated and necklace-like) deform the membrane away from the flat shape and give rise to a decrease in the AAF with increasing ρ (Fig. 2).

As E_{ad} is increased, the vesicle is more spread, and the natural curvature along the contact line increases. This has the effect of aggregating the curved proteins more strongly and the flattening effect of the curved proteins sets at lower densities (Fig. 2). Similarly to low E_{ad} , the AAF decreases for large ρ , and the peak in the AAF shifts to smaller values of ρ . As E_{ad} increases, the proteins form a large cluster at the contact line, where almost all the proteins are clustered in a single cluster.

To quantify the effect of the curved proteins on the vesicle spreading, we measure the ratio of AAF between vesicles with highly curved passive proteins and protein-free vesicles (Fig. 3c). We find that this ratio is larger for small E_{ad} , where the protein-free vesicles are very weakly adhered. As expected from Fig. 2, the enhancement of spreading due to the curved proteins has a maximum as function of ρ , with the peak shifted to lower values of ρ as E_{ad} increases. Note that for the passive case (F = 0), a protein-free vesicle is similar to a vesicle with flat proteins ($c_0 = 0$). For details, please see Appendix D.

3.2 Spreading of vesicles with active-curved proteins

Next, we study the active system, with active cytoskeletal forces acting outward on the proteins. To highlight the effects of the active force, we start with a large value of $F = 4 k_B T / l_{min}$ (Fig. 4). Despite the presence of the active force, we find that for sufficiently large times, most systems do reach a well-defined steady state, which allows us to extract average quantities, such as the AAF and the cluster distribution. When the density ρ is small, the shapes of the adhered vesicle are quite different compared to the passive case (Fig. 2; Movie 3). However, for large ρ , the shapes are quite similar to the passive case (see Movie 4).

For small value of ρ , unlike the passive case (Fig. 2), the shape of the vesicle is highly non-rotationally symmetric (Fig. 4, and Movie 3). The transition into this class of shapes, for ρ to the left of the vertical dashed green line (around 5.25%), is very sharp and was also observed for free vesicles with active-curved proteins (denoted by the vertical dashed red line, $\rho \sim 7.26\%$) [36]. At a low number of proteins, there are simply not enough proteins to complete a circular aggregate around the rim of the adhered vesicle. Instead, the proteins



Fig. 3 Curved proteins facilitate spreading at low adhesion energy. **a** Protein distribution along the angle θ for the passive case with $E_{ad} = 0.50 k_B T$ and various ρ along with the snapshots. The angle (θ) is defined as the angle between the line parallel to the x-y plane, passing through the COM of vesicle, and the line joining the surface of the vesicle and its COM, as shown in figure. ($P\theta$) is the probability that there is a protein at the angle θ , averaged over the azimuthal direction, such that θ varies from $-\pi/2$ to $\pi/2$. **b** Bending energy as a function of AAF with and without proteins. The blue circles are for protein-free vesicle, and the red triangles are for passive case. We also show the snapshots for each case, in the minimum and the maximum adhered state. For protein-free vesicle, we vary E_{ad} from $0.50 k_B T$ to $4.0 k_B T$, while for passive vesicle, we fix E_{ad} to $0.50 k_B T$ and vary ρ from 0.70 to 27.64%. **c** Ratio of AAF between vesicles with highly curved passive proteins (Fig. 2) and protein-free vesicles. The ratio closely approaches unity for either $\rho \rightarrow 0$ or for $E_{ad} \rightarrow \infty$

settle into two opposing arc-like aggregates, which exert opposing forces on the vesicle, that therefore assumes a stretched tube-like shape.

In Fig. 5a, we demonstrate the dynamics of the spreading in the low ρ regime. We find that often the proteins form three or more aggregates that drive the spreading, but they coarsen over time to form the stable two-arc shapes (see Movie 5). These two-arc shapes are mostly non-motile, but due to asymmetry between the sizes of the arc-like protein aggregates on either side, there can be a net force that leads to sliding of these vesicles in the direction of the end that has the larger aggregate (see Fig. 9c and Movie 6).

For ρ values to the right of the red dashed line in Fig. 4, there is a transition to pancakelike shapes that correspond to very efficient spreading and high AAF. For even larger protein density, there is not enough space on the outer rim of the vesicle to accommodate all the proteins, so the pancake-like shape does not remain stable. Small bud-like structure appears around the vesicle and the AAF decreases, similar to the passive case at high densities (Fig. 2).

The transition between the two-arc and pancake-like shapes for different values of ρ and E_{ad} is shown in more detail in Fig. 5b. As $E_{ad} \rightarrow 0$, the transition density increases and approaches its value for a free vesicle. The pancake transition is quantified by the mean cluster size ($\langle N_{cl} \rangle$), which we plot as function of ρ (Fig. 5c). The quantity $\langle N_{cl} \rangle$ exhibits a



Fig. 4 Typical steady-state configuration of vesicle shape and cluster-size distribution with active forces. Similar to Fig. 2 for an active protrusive force $F = 4k_BT/l_{min}$. The green dashed line circles denote the transition to a pancake-like shape. The red dashed vertical line denotes the density for the pancake transition for a free vesicle (without adhesion, [36]). We estimate these transition lines by measuring the mean cluster size, which shows a sharp jump at the critical ρ (Fig. 5c). Snapshots are shown for $E_{ad} = 0.75$, 1.5, 2.5 (in units of k_BT) and $\rho = 3.45\%$, 10.36%, 17.27% and 24.18%. All the other parameters are the same as in Fig. 2

sharp jump near the pancake transition, where one cluster contains almost all the proteins (phase separation).

Next, we study the AAF as a function of F, for different values of E_{ad} and a fixed density $\rho = 10.36\%$ (Fig. 6a). For large E_{ad} , the force increases the AAF smoothly, as the vesicles are already spread even in the absence of active forces. For small E_{ad} , the AAF shows a large increase with F, including an abrupt jump for $E_{ad} = 0.25 k_B T$ at $F \sim 0.8 k_B T/l_{min}$. This jump corresponds to crossing the pancake transition line for these parameters. In Fig. 7, we plot a more complete phase diagram, of the steady-state shapes of the vesicle for low adhesion ($E_{ad} = 0.5 k_B T$), as function of the proteins density and active force. The active force is seen to shift the transition to the pancake (or the two-arc) shape, to lower values of



Fig. 5 Transition to pancake-like, highly spread shape, for active-curved proteins ($F = 4 k_B T / l_{min}$). **a** Snapshots of the vesicle for small density, at different instants of time. Here, we show that there are different possible metastable states in the small density regime. We use here $\rho = 3.45\%$, $E_{ad} = 0.75$, 1.5, 2.5 (in units of $k_B T$). **b** Configurations of vesicle for different values of E_{ad} and ρ . The green line with circles denotes the density for a given E_{ad} at which the pancake-like shape is obtained. **c** Mean cluster size of proteins, $\langle N_{cl} \rangle$, as a function of ρ for different values of E_{ad} . The sharp increase in the value of $\langle N_{cl} \rangle$ shows the discontinuous transition to pancake-like shape. We also show the snapshots of vesicle for $E_{ad} = 2.5 k_B T$ for different densities to show how the jump in the value of $\langle N_{cl} \rangle$ gives rise to the pancake-like shape transition



Fig. 6 Variation of adhered fraction due to the active force (*F*). **a** Fraction of adhered area with *F* for different values of E_{ad} for a fixed $\rho (= 10.36\%)$. Red, blue and green circles are for: $E_{ad} = 0.25$, 0.4, and 0.75 k_BT , respectively. For small E_{ad} , the fraction A_{ad}/A increases with *F* significantly; however, as E_{ad} increases, the value of A_{ad}/A does not vary much. We also show the shape of the vesicle for $E_{ad} = 0.25 k_BT$. **b** The ratio of adhered area of active vesicle with $c_0 = 1 l_{min}^{-1}$ to the passive vesicle with $c_0 = 0$. The ratio is maximal for small E_{ad} over a wide range of ρ . **c** The ratio of adhered area of active to passive vesicle, with spontaneous curvature $c_0 = 1 l_{min}^{-1}$. We note that the maximum increase in the adhered area of the active vesicle over passive one is in the small ρ and small E_{ad} region

the density, compared with the passive system (at F = 0). This shift to lower densities due to the force is also seen for the initiation of protein aggregation (Appendix E, Fig.17).

The role of the active force in increasing the steady-state AAF is emphasized in Fig. 6b, where we plot its ratio with the AAF of the protein-free vesicle. We find that the largest increase in AAF due to the active-curved proteins is for low E_{ad} . Compared to the vesicle containing curved passive proteins, this enhanced spreading is extended to lower values of ρ due to the pancake transition (compared to Fig. 3c). This is emphasized in Fig. 6c where we plot the ratio of the AAF of the active- and passive-curved protein systems. The largest contribution of the active force is for low E_{ad} and ρ , where the passive proteins do not form strong aggregation at the contact line and are ineffective in driving spreading, while the added active forces drive the pancake transition and strongly enhance spreading.

We note that for large E_{ad} and large ρ , the AAF is also increased due to activity, compared to the passive-curved proteins (Fig. 6c). This is the region where the passive proteins form large necklace-like structures which decrease the adhered area (Fig. 2), while the active forces tend to destabilize them and therefore increase the AAF.

The active forces exerted at the locations of the curved proteins may give rise to a nonzero net force. While the planar component of this force simply pushes the vesicle on the substrate, the vertical component (along z-direction) can affect the adhesion. Since the curved proteins prefer the free (dorsal) side of the vesicle over the perfectly flat basal side, this force tends to overall push the vesicle away from the substrate. In the regime of very low E_{ad} and large ρ , the active forces exerted by the proteins can lead to lowering the AAF by partially detaching the vesicle. In Fig. 18 of Appendix F, we show the behaviour of vesicles where we apply an external force that balances the total vertical component of the active forces. For a living cell, this condition corresponds to assuming that actin filaments that are pushing the top membrane upwards exert an equal and opposite force on the bottom membrane. We see that except at the lowest E_{ad} , there is no qualitative difference, compared to the previous results (Fig. 4).

The importance of coupling the force to curvature is demonstrated by simulating the adhesion of a vesicle with flat active proteins (zero spontaneous curvature, $c_0 = 0$). As in previous studies [36,38], we find the formation of long protrusions that are highly dynamic (Fig. 19 of Appendix G). Due to the adhesion, the long protrusions are found to often grow along the substrate. However, when they point upwards, they lead to partial detachment of the vesicle. Clearly, active forces that are not coupled to curvature do not contribute to effective spreading and adhesion. Note that when the vesicle forms a pancake or two-arc shapes, the non-equilibrium nature of the active forces becomes harder to distinguish directly from the dynamics of the vesicle, since the centre of mass is stationary and the shape is very stable. The fact that the active term in the Hamiltonian is unbounded (Eq. 3) indicates that these shapes are in a non-equilibrium steady state.

When comparing our results with experimental observations of the shapes of adhered cells, we begin by noting that cells undergo a much diminished and slower spreading (or strong retraction) when actin polymerization is inhibited [55]. (Adhered area decreases by factor of ~ 4 [5].) Decreasing the density of proteins can similarly convert the cell from the well-spread pancake to the elongated two-arc shape, in the model (Fig. 5b, c) and in experiments [56]. These observations suggest that the bare adhesion of the cell to external substrates is typically low, so that in terms of our model, cells are usually in the regime of low E_{ad} . In this regime, we demonstrate that self-organization of the actin polymerization recruited by curved membrane proteins can increase the adhered area by factors that are similar to those observed experimentally (Fig. 6b, c).

However, the actin polymerization in the cell does more than just provide a protrusive force, as we assumed in our model. The actin retrograde flow produces shearing forces that triggers the growth of integrin-based adhesion complexes [3,8]. This suggests that the activity of actin polymerization also effectively increases E_{ad} for the cell, compared to the actin-inhibited cell. Similarly, increased adhesion strength (E_{ad}) allows for stronger mechanical coupling between the actin filaments and the substrate, inducing a larger effective protrusive force F [15,57]. These effects mean that when comparing our model to cell shapes, the effective actin protrusive force F and the effective value of E_{ad} are not independent of each other.

Many adhered cells are found not to be circularly spread, but have a distinct spindle-like shape with usually two oppositely formed lamellipodia protrusions [58]. This typical shape appears naturally in our model when the density of the curved proteins is below the pancake transition value, and the adhered vesicle assumes the elongated two-arc shape (Figs. 4 and 5). Note that since the critical density for the pancake transition increases for decreasing E_{ad} (Fig. 5b), we expect that cells can transform from the pancake to the elongated two-arc shape with decreasing adhesion strength. This is indeed observed in experiments [3,8,59].



Fig. 7 Typical steady-state configurations of vesicle shape and cluster-size distribution for different *F* and ρ , for a given small adhesion strength: $E_{ad} = 0.50 k_B T$. The snapshots are shown for F = 0.50, 1.50, 2.50 and 3.50 (in units of $k_B T/l_{min}$), and $\rho = 3.45\%$, 10.36%, 17.27% and 24.18%. The yellow dotted lines denote the transition to a pancake-like shape. For large *F*, the transition to a pancake shape from a two-arc shape is very sharp, and the transition line is estimated by measuring the mean cluster, as explained in Fig. 5. For small *F*, the transition is not very sharp. Here, in order to identify the transition line, we measure the largest cluster, and we approximate the shape to be a pancake when the largest cluster is at least 60% of the total number of proteins (see Fig. 21 of Appendix I). The green dotted line represents the transition is also estimated by measuring the largest cluster is taken to be 30% in this case, as there are two separate clusters in the two-arc shape. All the other parameters are the same as in Fig. 2

The morphology of two oppositely oriented lamellipodia (similar to our two-arc shapes) was observed to stretch cells and is sometimes utilized to drive cell division [60,61].



Fig. 8 Dynamics of the spreading process. a Variation of adhered area with time for a protein-free vesicle. Here, we use $E_{ad} = 5.0 k_B T$. b Variation of adhered area with time for a passive vesicle with $\rho = 13.82\%$ and $E_{ad} = 0.50 k_B T$. c Variation of adhered area with time for an active vesicle with $F = 4 k_B T / l_{min}$, $\rho = 10.36\%$ and $E_{ad} = 0.50 k_B T$. We note that the protein-free vesicle adheres much faster than the other cases. The spreading of passive vesicle is very smooth, while the active vesicle spreading is very noisy. Here, the unit of time (t) is 2×10^3 MC steps for (a)–(c). d Variation of adhered radius (R_{ad}) with time, for protein-free, passive and active vesicles. The blue circles are for protein-free vesicle, the red triangles are for passive vesicle, and the black boxes are for active vesicle. We note that the growth of a protein-free vesicle and passive vesicle is uniform in the beginning and then saturates; however, for active case, there are two phases of growth in the small time regime before R_{ad} saturates. For protein-free vesicle, $R_{ad}(t) \sim t^{0.152}$, while for a passive vesicle, $R_{ad}(t) \sim t^{0.183}$. Unlike the protein-free and passive vesicles, the active vesicle exhibits two growth phases: a slower initial growth of $R_{ad}(t) \sim t^{0.063}$ followed by a faster growth $R_{ad}(t) \sim t^{0.267}$. Here, we use $E_{ad} = 5.0 k_B T$ for protein-free vesicle, and $\rho = 10.36\%$ and $E_{ad} = 0.50 k_B T$ for passive and active vesicles. For active vesicle, we use $F = 4 k_B T / l_{min}$. e Variation of R_{ad} with time for an active vesicle with various values of $E_{\rm ad}$: from bottom to top, the symbols of star, box, circle, triangle and cross represent $E_{ad} = 0.25, 0.5, 1.0, 2.0, 5.0 k_B T$, respectively. Note that the fast growth phase takes longer to appear for lower E_{ad} , while the growth exponent of the fast growth phase decreases with E_{ad} . We vary E_{ad} from 0.25 k_BT to 5.0 k_BT that gives rise to variation in the exponent from 0.51 to 0.19. For very large $E_{ad} (= 5.0 k_BT)$, the two growth phases merge into one, similar to the protein-free spreading at the same adhesion energy (Fig. 8d). In this adhesion energy, the vesicle collapses onto the adhesive surface at long times, and the simulation is therefore terminated at an earlier time. Here, we use $\rho = 10.36$ % and $F = 4 k_B T / l_{min}$. The unit of time (t) is 2×10^4 MC steps. **f** The circularity of the vesicle shows non-monotonic variation with time. Here, we use $F = 4 k_B T / l_{\text{min}}, E_{\text{ad}} = 0.50 k_B T \text{ and } \rho = 10.36\%$

3.3 Spreading dynamics

We compare our results for the spreading dynamics of a protein-free vesicle, a vesicle with passive-curved and active-curved proteins, respectively, in Fig. 8a–c (see Movie 1, Movie 2, Movie 4 and Movie 7). The vesicles with proteins are shown in the interesting regime of low E_{ad} . We note that the active vesicle spreading is much noisier than the passive spreading. This is because in the active case the vesicle may transiently get locally de-adhered from the substrate, which gives rise to large variations in the measurement of the AAF (Fig. 8c, and Movie 7). In Fig. 20 of Appendix H, we plot the cross-sectional shapes, side views and three-dimensional shapes, of the spreading vesicles as function of time, for all three cases. Clearly, the passive systems are observed to spread more isotropically, compared to the active system. The anisotropic spreading of the active vesicles is quantified in Fig. 8f, where we see a sharp reduction in the circularity of the adhered region during the initial stages of spreading.

Next, we plot the increase in the adhered radius (R_{ad}) as function of time, which is defined as $\sqrt{A_{ad}/\pi}$, where A_{ad} is the adhered area (Fig. 8d, e). We find that for the passive systems, the adhered radius (R_{ad}) grows with time as $\sim t^{\beta}$, where the exponent β is different for the different cases. Although this plot is given in MC time steps and does not include the hydrodynamic effects of the membrane flow and the fluid flow within and around the vesicle, the calculated dynamics of the passive vesicles resemble the experimental observations for spreading artificial vesicles [21].

For the active case (Fig. 8e), we averaged over those cases which adhered smoothly without significant events of de-adhesion, in order to get a less noisy curve. For this case, we find that there is a slower growth in the beginning (Fig. 8d), followed by a faster growth regime. The exponent of the faster growth stage depends on E_{ad} (Fig. 8e). The slower initial growth is due to the low circularity of the active vesicle, with the protein aggregates spread over the vesicle and pushing the membrane upwards and in uncoordinated manner (see Movies 4, 7). Once the proteins form the circular aggregate along the contact line, they induce a very efficient and rapid spreading, which corresponds to the fast growth phase. Note that in the large E_{ad} regime, the spreading is dominated by the adhesion energy, and in this limit, the growth exponent approaches that of the protein-free vesicle (Fig. 8d).

The calculated spreading dynamics for an active vesicle resemble several aspects experimentally observed in spreading living cells [2,7,62]: (i) The active vesicles exhibit an initially accelerating radial growth, followed by a growth with almost constant velocity (Fig. 8c, d). These features are observed in living cells and do not appear for our passive vesicles. (ii) The initiation of the rapid spreading phase takes longer to appear for cells on substrates of lower adhesiveness, as we also find (Fig. 8e). (iii) Compared to the passive system, the active vesicle initially grows more slowly (Fig. 8d), similar to experimental observations [4].

Other features of cell spreading are also manifested in our spreading active vesicles: similar to the case of spreading cells [13], we find that the circularity of the spreading active vesicles decreases sharply during the beginning of the spreading process and recovers slowly afterwards. Furthermore, the active forces often give rise to the transient upwards detachment of the leading edge in our simulations (Fig. 8c), resembling the ruffles observed at the leading edge of spreading cells [6,9,37,63].

Note that since we do not conserve the vesicle volume, we find that the volume strongly decreases as the vesicles spread. We discuss this in more detail in Appendix J (Fig. 22).

3.4 Motile vesicles at low protein densities

In the regime of low (curved and active) protein density, where there are not enough proteins to form a circular aggregate around the cell rim (pancake shape), we find that the vesicles can form motile shapes. By 'motile', we mean that the active proteins form a single large aggregate on one side of the vesicle that results in an unbalanced force that pushes the vesicle along the adhesive substrate. Such motile crescent shapes are shown, for example, in Fig. 9a, c (see Movie 8 and Movie 9).

In Fig. 9a, we show the regime of active force and adhesion energy that gives rise to the motile crescent shapes, at very low protein density ($\rho = 3.45\%$). We find that the regime where the crescent shapes appear coexists with two-arc shapes, and the two can transiently convert into each other (see, for example, Fig. 9c and Movie 10). When moving, the crescent shape remains persistent by maintaining a sharp leading edge (Fig. 9c, inset), due to the active force concentrated in a single cluster, while the rear region is less curved due to minimization of bending energy and area conservation.



Fig. 9 Motile vesicles with crescent shape, its speed and stability. a Probability for a vesicle to be found in a crescent-shaped state (background colour), in the $E_{ad} - F$ plane for small $\rho = 3.45\%$. In the region, where there is nonzero probability of obtaining a crescent-shaped vesicle, the snapshots of a crescent-shaped vesicles are shown; otherwise, a typical snapshot is shown. The yellow solid line is the analytical prediction separating the two-arc phase to a crescent phase (Eq. 7). Here, we fit the numerical data and obtain a good fit at $E_{ad} \simeq 2.04 \ F^2$. We also numerically calculated the prefactor, and it turns out to be $\simeq 1.96$, close to the value obtained by fitting the curve (see Fig. 26 for details). The yellow dots are the simulation points separating the two-arc shapes from crescent-shaped vesicle: For a given E_{ad} , these dots represent the value of F, above which we do not find crescent-shaped vesicles. The green dashed line separates the region of vesicles with disordered small protein clusters (below) and the regime of clustered proteins (either two-arc or crescent shape). Here, we estimate this line by measuring the largest cluster, and if the largest cluster is less than 30% of the total proteins, we regard it to be in the disordered state of small protein clusters. The snapshots are shown for $E_{ad} = 0.50, 1.5, 2$ and 3 (in units of $k_B T$) and F = 0.50, 2 and 4 (in units of k_BT/l_{min}). **b** Speed of the crescent-shaped vesicle, scaled by E_{ad} . We calculate the speed as the displacement of COM per MC step (divided by E_{ad}) and then normalize all the values by the maximum speed found for the range of parameters shown here, where the maximum value of the speed is 0.164 l_{min} per MC step. For large E_{ad} but small F, the crescent vesicles exhibit diffusive behaviour (Fig. 24). c Spontaneous transition from crescent shape to two-arc shape (viewed from above), demonstrating the transient nature of the motile shapes. Note the protein aggregates (red) along the vesicle edge. In the inset, we show the cross-sectional view of a motile crescent-shaped vesicles. The red dot shows the location of the high protein density. d Examples of asymmetric two-arc shapes (viewed from above), which exhibit weak residual motility. Below each shape, we also mention the ratio of smallest to largest protein cluster. For both (c, d), we use $E_{ad} = 3.0 k_B T$, $\rho = 3.45\%$ and $F = 4 k_B T / l_{min}$

In Fig. 9b, we plot the average velocity of the crescent shapes, calculated from the simulations, divided by an effective friction coefficient that is assumed to be linear in E_{ad} . (The vesicle speed before this scaling is shown in Fig. 23 of Appendix K.) Note that also the two-arc shapes are weakly motile, as the protein aggregates at each end of the cell are not identical in size and there is a small residual force (Fig. 9d and Movie 6). The crescent shapes exhibited persistent motility with a well defined velocity in the high force regime (Movie 8), while for weak active forces, they exhibited diffusive motility (see Movie 9 and Fig. 24 of Appendix L).

The region of crescent shapes in Fig. 9a is bounded by two transition lines. The lower line denotes the line below which the proteins do not form large clusters. In this regime, the proteins form disordered small clusters, and the vesicle remains approximately hemispherical. Above this line, the proteins form one or two large aggregates, thereby enabling the formation of the crescent or two-arc shapes. Above the transition line, the large adhesion energy or strong active forces induce the sufficiently high curvature at the vesicle contact line, which concentrates the proteins and drives the formation of large aggregates. This is similar to the pancake (and two-arc) transition line denoted in Fig. 7, where increasing E_{ad} corresponds to higher ρ at the contact-line region. Note that the direct protein–protein interaction strength w plays a minor role in this transition, which can occur even for $w = 0 k_B T$ (Fig. 25a of Appendix M).

The upper transition line that bounds the crescent shapes regime in Fig. 9a can be estimated by comparing the bending and adhesion energies of a two-arc shape versus the crescent shape. Compared to the crescent shape, the two-arc shape has a lower adhesion energy, since the elongated cylindrical part is more weakly adhered as it is devoid of curved proteins. It is also more strongly curved compared to the circular shape of the crescent vesicle. On the other hand, the work done by the active forces that elongate the two-arc vesicle counts as a negative energy contribution. The net difference between the two classes of shapes can be approximately written as

$$\Delta W = -NFL + 2\pi RL \frac{\kappa}{2R^2} + E_{\rm ad} \Delta A \tag{6}$$

where *R*, *L* are the radius and length of the cylindrical segment of the two-arc shape, *N* is the number of proteins that pull the membrane at the two ends of the cell, and ΔA is the difference in adhered area between the two-arc and crescent shape. We first minimize with respect to the radius *R*, taking the total area of the cylindrical segment to be conserved $A_{cyl} = 2\pi RL$. We find that $R = 2\pi \kappa / (NF)$. We substitute this value in Eq. (6) and calculate the critical adhesion energy at which $\Delta W = 0$

$$\Delta W = 0 \to E_{\rm ad} = \frac{A_{\rm cyl}}{2\kappa\Delta A} \left(\frac{NF}{2\pi}\right)^2 \tag{7}$$

We assumed here for simplicity that ΔA is constant along this transition line, which is approximately obeyed by the simulation results (Fig. 26, Appendix N). The relation in Eq. (7) appears to capture correctly the essence of the transition between the two shapes, as shown in Fig. 9a. We fit Eq. (7) with simulation data points and obtain the relation $E_{ad} \simeq 2.04 F^2$ that matches well with the simulation. We also estimate this prefactor of F^2 by calculation ΔA and A_{cyl} from simulation and obtain a value $\simeq 1.96$ close to the value obtained by fitting the curve (see Fig. 26 for details). In the regime where crescent shapes appear, they are more stable (Fig. 9a) and propagate faster (Fig. 9b), as E_{ad} increases. This arises in our model due to the higher curvature at the leading edge when the adhesion is stronger, which stabilizes the leading edge protein aggregate, as demonstrated in Appendix P. When comparing the motile shapes that our model produces, we note that they bear similarity to the shapes of different motile cells [64]. Similar to experimental observations [65–67], we predict a maximum of the migration speed as function of the adhesion strength (Fig. 9b). These results indicate that the coupling of curved proteins that recruit the actin polymerization, and adhesion, can self-organize into a spontaneously motile shape. However, these ingredients give rise to rather delicate and transient motility, which can either disappear spontaneously (Fig. 9c) or when confronted with an external perturbation (Fig. 27, Appendix O).

Nevertheless, we can compare some of our results with observations of motile cells. First, our observation of a leading edge that spontaneously splits into two arcs (Fig. 9c) is reminiscent of very similar dynamics observed in motile cells [68–70]. Note that in cells, there are mechanisms that allow the cell to regain motility by converting one of the two arcs into a new leading edge, which we do not describe here. Specifically, as cells in the two-arc shape elongate beyond a critical length, they are likely to polarize [71].

Our predicted transition from two-arc to motile-crescent phenotypes when the actin force is reduced (solid yellow line in Fig. 9a) may explain the observation made in [72] whereby knocking-down one of the actin nucleators had a very similar effect on the shape and motility of cells. A similar trend was observed in [56], where decreasing the amount of Rac-GTPase, which activates down-stream actin nucleators [73], stabilizes a single leading edge and converts the cell to persistent motility. The lower transition line (dashed green line in Fig. 9a), from the motile-crescent to the non-motile phenotypes when the adhesion strength is reduced, can be compared to the experimentally observed loss of motility below a critical substrate concentration of adhesion molecules [74].

Finally, our model may suggest a natural explanation of the experimental observation that the leading edge of motile cells becomes more persistent and stable when their lamellipodia extend into a narrow slit [75]. Within our model, the confinement by the narrow slit increases the curvature of the leading edge and therefore stabilizes the aggregation of the curved active proteins (see Appendix P, Fig. 28).

Within the wider context of active-matter systems, our motile vesicles can be compared to recent works that have shown similar symmetry breaking that is driven by self-organization of active elements [76].

4 Discussion

We have shown here how interacting curved membrane proteins, passive and active, affect the process of vesicle spreading and adhesion. We find that large density of passive-curved proteins can greatly enhance the adhesion of vesicles on low adhesion substrates. Coupling the curved proteins with active protrusive forces extends this enhancement to lower densities of curved proteins. By spontaneously self-organizing curved proteins at the cell–substrate contact line, the active forces drive a shape transition into a flat geometry with high adhered area and robust spreading. At very low densities of curved proteins, the protrusive activity can stabilize either spindle-like elongated cells, or motile crescent shapes.

Our simplified model does not contain all the complexities of a real cell, which strongly affect its final adhered shape. One such component, the network of stress fibres, is known to determine the cell shape in many cell types [12]. In addition, the cytoskeleton and internal organs (such as the nucleus) hinder the shape changes of the cell and exert volume constraints. Future extensions of our model can include additional components of the cell adhesion process. For example, we could add non-uniform adhesion that is activated closer in proximity

to the curved proteins, to describe the activation of adhesion by actin retrograde flow [1,77–79]. Nevertheless, our model describes many features of spreading cells, allowing to relate the observed cell spreading dynamics and the cell shape to the parameters of the model.

Observations in living cells emphasize the central role played by actin polymerization during cell spreading and adhesion. These observations suggest that in living cells, the membrane density of highly curved proteins is relatively low, and cells are not likely to be in the regime where a high density of curved proteins alone drives the spreading and adhesion (Fig. 2). Loading the membrane with a large density of such curved proteins may be problematic for the cell and limit its ability to dynamically control and modify its spreading and adhesion strength. Our model demonstrates that by having a low bare adhesion, and low density of curved proteins, the cell can achieve robust and dynamic adhesion by activating the protrusive force of actin polymerization, in a highly localized and self-organized pattern. The spontaneous aggregation of the curved proteins along the cell–substrate contact line, driven by the actin-induced forces (and attractive direct interactions between the proteins), provides a highly controllable mechanism for cell spreading and adhesion.

In addition to non-motile steady-state shapes of adhered vesicles, we found that in the low ρ regime, the vesicles may form a polarized, crescent shape, that is motile (Fig. 9). This motile vesicle resembles the shapes of motile cells that depend on adhesion [80] and demonstrates that the combination of curved proteins that recruit the actin polymerization, and adhesion, provides a minimal set of ingredients needed for motility. However, in order to make the polarization that drives the motility robust and persistent (as opposed to transient), cells have evolved additional biochemical feedbacks of various types [81–83]. Our model does not contain many components that play important roles in cell motility, such as contractility, and more realistic treatment of the actin–adhesion coupling, such as catch and slip-bond dynamics. Our results, however, highlight that curvature-force coupling, with adhesion, provides the basic coarse-grained components that can self-organize to spontaneously break the symmetry and form a motile system.

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A Simulation details

The time evolution of the vesicle in our MC simulations consists of [36,44]: (1) vertex movement and (2) bond flip. In the vertex movement, a vertex is randomly chosen and attempts to move by a random length and direction within a sphere of radius *s* drawn around the vertex. In the bond flip movement, a single bond is chosen, which is a common side of two neighbouring triangles. The bond connecting the two vertices in diagonal direction is cut and reestablished between the other two, previously unconnected vertices. In order to satisfy self-avoidance, the ratio of maximum and minimum bond length, i.e. $l_{max}/l_{min} = 1.7$, and

the maximum possible displacement of a vertex in a given attempt is taken to be s = 0.15 in units of l_{min} .

We use Metropolis algorithm to update our system. Any movement that increases the energy of the system by an amount ΔE occurs with rate $\exp(-\Delta E/k_BT)$; otherwise, if the movement decreases the system energy, it occurs with rate unity. We let the system evolve according the above rule and wait till the system reaches steady state. All the average quantities are measured after the system reaches steady state.

In the simulations presented in this paper, we use the following model parameters: total number of vertices, N = 1447, the bending rigidity $\kappa = 20 k_B T$, the protein–protein attraction strength $w = 1 k_B T$. The width of the potential, Δz , is taken to be l_{\min} . Among all the N vertices, N_c of them are occupied by curved membrane proteins. The spontaneous curvature at all N_c vertices is taken to be $c_0 = 1 l_{\min}^{-1}$, unless stated otherwise. We chose this set of parameters to be in the interesting regime where the curved proteins form aggregates and exhibit a force-driven phase separation into a pancake-like shape [36].

B Comparison of simulated and detailed numerical solutions of the adhered vesicle shape

In this section, we compare the results of our MC simulations for the shapes of adhered protein-free vesicles, with detailed numerical solutions that appeared recently in Ref. [23, 50]. In the detailed numerical solutions, the parameters used are \tilde{w} , the scaled adhesion strength, and v, the reduced volume. The parameter \tilde{w} is defined as, $\tilde{w} = E_{ad}R_s^2/\kappa$, where E_{ad} is the adhesion energy per unit adhered area and R_s is the radius of a spherical vesicle with same volume as the original. Since in our model we define E_{ad} as the adhesion energy per vertex, we properly scaled it before comparison. In [23, 50], the reduced volume v is fixed; however, in our model, we cannot fix v before the adhesion and spreading dynamics. In order to access different values of v for the same \tilde{w} , we use the osmotic pressure difference $p = p_{\text{inside}} - p_{\text{outside}}$ that adds one more energy term -pV to Eq. (5), where V is the total volume of the vesicle [36]. In Fig. 10, we show the comparisons of the shapes of the vesicle from our simulation and the detailed numerical solution (as given in Fig. 5 of ref. [23]). The small differences between the two calculations in the regions of the high curvature rim can be most visibly noticed furthest away from these parts, which is along the flatter top part of the vesicle. This is the reason that in this region of low curvature, the separation between the two calculations is most noticeable. Nevertheless, the shapes of the detailed numerical solutions are comparable to our MC simulations, and the agreement is very reasonable, thereby validating the MC approach.



Fig. 10 Comparison of the results of MC simulation with detailed numerical solutions [23,50]. The red circles are for simulation results, and the blue boxes are for detailed numerical solution. **a** $\tilde{w} = 6.4$, v = 0.545, **b** $\tilde{w} = 6.4$, v = 0.75, **c** $\tilde{w} = 6.4$, v = 0.85 and **d** $\tilde{w} = 6.4$, v = 0.95. For detailed numerical solution, the data are extracted from Fig. 5 of Ref. [23] using the 'digitize image' tool from 'OriginLab' software

C Analytical model

We now present an analytic calculation of the adhered shape of the vesicle, in the presence of curved proteins and active forces. This calculation correctly describes the qualitative features that we found in the simulations, but fails quantitatively. The main failure is the use of protein–protein interactions that are good for the dilute limit (Eq. A3) and do not capture the large density increase at the contact line as in the simulations. In regimes where the protein–protein interactions are not playing an important role, for example, when the active force is large, we find quantitative agreement (Figs. 14 and 15).

We assume the average shape of the vesicle consists of three parts: (1) the base area, which is having a circular shape, with radius R_b , (2) the annulus part curving around the circular base, which is the part of a torus, with radius of the tube R_t , and (3) the spherical cap, which is a part of sphere, with radius R_c (see Fig. 11). θ is the angle between the vertical line passing through the centre of the sphere (OQ) and the line joining the centre of sphere and the torus (OP), as shown in Fig. 11. We neglect any thermal fluctuation in the shape of the vesicle. Total area of the vesicle $A = A_b + A_t + A_c \simeq \pi R_b^2 + 2\pi R_t R_b (\pi - \theta) + 2\pi (1 - \cos \theta) R_c^2$, where A_b denotes the area of the base, A_t is the area of the annulus part (torus), and A_c is the area of the spherical cap. Total area A is taken to be constant [26].

Let ρ be the density of the spontaneous curvature c_0 , ρ_c be the density on cap, and ρ_t be the density on the annulus, such that $\rho A = \rho_t A_t + \rho_c Ac$. Here, we assume that bottom part of the vesicle does not contain proteins, which is also seen in the simulations. Now, the adhesion energy is given by,

$$W_A = -E_{\rm ad}\pi R_b^2,\tag{A1}$$

the bending energy is given by,

$$W_b = \frac{1}{2}\kappa A_t \left(\frac{1}{R_b} + \frac{1}{R_t} - c_0\rho_t\right)^2 + \frac{1}{2}\kappa A_c \left(\frac{2}{R_c} - c_0\rho_c\right)^2,$$
 (A2)

the protein-protein nearest neighbour attraction energy is of the form,

$$W_d = -\frac{w}{2} (A_c \rho_c^2 + A_t \rho_t^2),$$
(A3)

the energy due to active force is,

$$W_F = -FR_t \rho_c A_c - FR_b \rho_t A_t, \tag{A4}$$

Fig. 11 Schematic representation of the analytical model. R_c is the radius of the spherical cap, R_t is the radius of the annulus part (torus), and R_b is the radius of the circular disc at the base. θ is the angle between the line perpendicular to the plane 'OQ' and the line joining the centre of sphere 'O' and the point 'P', where the spherical cap and torus section meet



and finally, the entropy is,

$$S = -A_c \{\rho_c ln(\rho_c) + (1 - \rho_c) ln(1 - \rho_c)\} - A_t \{\rho_t ln(\rho_t) + (1 - \rho_t) ln(1 - \rho_t)\},$$
(A5)

where E_{ad} is the adhesion energy per unit adhered area and κ is the bending rigidity. Note that the entropy is only due to the thermal fluctuation of proteins and any entropy due to the thermal fluctuation in the vesicle shape is not considered here. In the calculation of entropy, we assume that only the spherical cap of the vesicle and the annulus part (torus part) contain proteins, while the base of the vesicle does not contain proteins, which is also seen in simulations. Since the slope of the surface changes continuously along the angle θ , the slope at the contact point of torus and spherical cap should be the same. This gives us a constrains, $R_c \sin \theta = R_b + R_t \sin \theta$. The free energy is given by,

$$F = W_b + W_A + W_d + W_F - TS \tag{A6}$$

We assume the total area A to be a constant. We then minimize the free energy (Eq. A6), in the (R_b, ρ_t, θ) plane, and express other parameters in terms of these three parameters. More explicitly, we solve the equations, $\frac{\partial F}{\partial R_b} = 0$, $\frac{\partial F}{\partial \rho_t} = 0$, and $\frac{\partial F}{\partial \theta} = 0$ with the constraint $\frac{\partial^2 F}{\partial R_b^2} > 0$ and $\frac{\partial^2 F}{\partial \rho_t^2} > 0$, $\frac{\partial^2 F}{\partial \theta^2} > 0$. Among several solutions, we consider the physical one. In the analytical model, we define E_{ad} as the adhesion energy per unit of adhered area

In the analytical model, we define E_{ad} as the adhesion energy per unit of adhered area (having dimension of energy/length²), while, in the simulation, we define it as the adhesion energy per adhered number of vertex (with dimension of energy). In order to compare the simulation and analytical results, we properly scale E_{ad} such that the definition becomes consistent in both the cases. The value of the parameters used here is: $A = 2200 l_{min}^2$, which is approximately the average area of a unstretched vesicle in our simulation, $c_0 = 1.0 l_{min}^{-1}$, $\kappa = 20 k_B T$, $w = 1.0 k_B T$. The value of $k_B T$ is taken to be unity.

For passive case (F = 0), we compare our analytical results for the cross-sectional shape of the vesicles with different ρ in Fig. 12. We note that the effect of increasing ρ is not very strong in the analytical model. We show the comparison of adhered fraction, density of proteins in the curved regions (ρ_t) and the different energies in Fig. 13. We note that the fraction of adhered area increases with E_{ad} similar to our simulations. With increasing E_{ad} , the vesicle becomes more and more flat and tends to the value 1/2 for large enough E_{ad} (Fig. 13a). The analytical prediction is, however, lower than the simulation results. We also measure the density of curved proteins in the annulus part, ρ_t . As E_{ad} increases, ρ_t also increases and tends to unity for simulations; however, the analytical prediction is very low (Fig. 13b). This indicates that for large E_{ad} , most of the proteins are aggregated in the curved annulus region. In our simulation, we also note that for large E_{ad} , we do have a pancake-like phase, where all the proteins are clustered in the curved region. We also measure the fraction $A_{\rm ad}/A$ as a function of ρ for given $E_{\rm ad}$ (Fig. 13c). We note that similar to the simulation results, our analytical model also shows non-monotonic variation in A_{ad}/A with ρ ; however, here also, the quantitative comparison is not very well. Finally, we also show the variation of ρ_t with ρ , which also show an increase similar to simulation results (Fig. 13d).

We also compare the different energies in the lower panel of Fig. 13 for simulation and analytical cases. We note that the energy values are quite different, but the maximum difference is the protein–protein interaction energy (Fig. 13g), due to which increasing ρ is not very sensitive in our analytical model. Thus, we conclude that because of the simplicity of the analytical model, the quantitative comparison is not so good; however, it could describe the qualitative features of our system very well. Next, we compare the results for the active case.



Fig. 12 Comparison of the shape of vesicle for simulation results and analytical results for passive case with $E_{ad} = 0.50 k_B T / l_{min}^2$ and various ρ . Red circles are for the MC simulation results, and blue line is for the analytical results



Fig. 13 Results for analytical model for passive case (F = 0) and comparison with simulation. Red circles are for simulation results, and blue line is for analytical results. **a** Fraction of adhered area with adhesion strength E_{ad} for $\rho = 10.36\%$. The adhered area increases and tends to 1/2 for large E_{ad} . **b** The density of curved proteins in the annulus part of the vesicle (ρ_t) as a function of E_{ad} for $\rho = 10.36\%$. It shows that the density ρ_t increases and tends to unity for large E_{ad} . Here also, the analytical prediction is smaller than the simulation results. **c** Fraction of adhered area with the protein density ρ for a given E_{ad} . We note that the analytical prediction also shows non-monotonic variation as seen in the simulation. **d** ρ_t with ρ for given E_{ad} . **e** The adhesion energy (W_A) as a function of ρ . **f** The bending energy (W_b) as a function of ρ . **g** The protein–protein interaction energy (W_d) as a function of ρ . **h** The total energy (W) as a function of ρ . For **c–h**, we use $E_{ad} = 0.50 k_B T/l_{min}^2$. For analytical results, we use here $A = 2200 l_{min}^2$, which is the average area of a unstretched vesicle in our simulation, $c_0 = 1 l_{min}^{-1}$, $\kappa = 20 k_B T$, $w = 1.0 k_B T$. For analytical results, $k_B T$ is taken to be unity. For MC simulations, the other parameters are same as Fig. 2

In the active case, we compare the cross-sectional shape of the vesicle for a given ρ and different values of F in Fig. 14. We note that the effect of increasing F is very effective in analytical model. We also compare other results in Fig. 15. We note that the adhered fraction is very close to our MC simulations in the large F region (Fig. 15a). In this case also, the energy values are not very comparable (see Fig. 15c–g).



Fig. 14 Comparison of the shape of vesicle for simulation results and analytical results for active case with $\rho = 10.36\%$, $E_{ad} = 0.40 k_B T/l_{min}^2$ and various F. Red circles are for simulation results, and blue line is for analytical results



Fig. 15 Results for analytical model for active case and comparison with simulation. Red circles are for simulation results, and blue line is for analytical results. **a** Fraction of adhered area as a function of *F*. **b** The density of curved proteins in the annulus part of the vesicle (ρ_t) as a function of *F*. **c** The adhesion energy (W_A) as a function of *F*. **d** The bending energy (W_b) as a function of *F*. **e** The protein–protein interaction energy (W_d) as a function of *F*. **f** The active energy due to cytoskeleton forces (W_F) as a function of *F* g The total energy (W) as a function of *F*. Here, we use $\rho = 10.36\%$ and $E_{ad} = 0.40 k_B T / l_{min}^2$. Other parameters are same as Fig. 13

D Passive vesicle with proteins having zero spontaneous curvature

In Fig. 16, we show our results for a passive vesicle with proteins having zero spontaneous curvature, i.e. $c_0 = 0$. This serves as a verification of our calculation: since the proteins and the membrane are identical, we indeed find that the adhered area remains constant with the density of proteins, only depending on E_{ad} .



Fig. 16 Microstate of vesicle and cluster distributions for passive case with flat proteins ($c_0 = 0$). The background colour shows the fraction of adhered area. For the snapshots, we use $\rho = 3.45\%$, 10.36%, 17.27%, 24.18% and $E_{ad} = 0.75$, 1.5, 2.5 (in units of k_BT). The other parameters are the same as Fig. 2

E Linear stability analysis for budding transition and comparison with the contour for $\langle N_{cl} \rangle = 2$

In [36], an expression for the critical temperature (T^c) is derived using linear stability analysis (Eq. 6 of [36]), below which the proteins will start forming aggregates (buds) [84]. We use this expression and obtain the critical force F^c as a function of ρ and other variables as, $F^c = \frac{12w}{I_{\min}^2 c_0} \frac{1}{(1-1/\rho R_0)} \left(\frac{k_B T}{12w\rho(1-\rho)} - 1\right)^2$. Here, $1/R_0$ is the mean curvature at the site of the curved membrane protein. In the limit $R_0 \to \infty$, the expression for F^c will turn out to be,

$$F^{c}(R_{0} \to \infty) \to \frac{12w}{l_{\min}^{2}c_{0}} \left(\frac{k_{B}T}{12w\rho(1-\rho)} - 1\right)^{2}$$
(A7)

D Springer



Fig. 17 The critical force F^c obtained by linear stability analysis (Eq. A7) using the protein density at the contact line is compared with the line where $\langle N_{cl} \rangle = 2$. The other transition lines are as in Fig. 7

We use the above equation to calculate the F^c for our case and compare this line with the contour, where mean cluster $\langle N_{cl} \rangle = 2$. Since the budding forms along the contact line with the adhesive substrate, where the protein density is higher (ρ_t , say) than the average ρ (see, for example, Fig. 3a and Appendix C), we use in Eq. (A7) the value of ρ_t obtained from the simulations to calculate the critical force F^c and plot it as a function of the average ρ (see Fig. 17). We note that the line is almost vertical, and in the large *F* regime, it is in between the pancake transition (see Fig. 7) and the line $\langle N_{cl} \rangle = 2$. Qualitatively, the shape of this analytic line and its dependence on the density at the contact line describe the transition of the proteins into small aggregates. The pancake transition at larger values of ρ has qualitatively the same shape, but of course cannot be captured by the linear stability analysis.

F Simulations with balanced total vertical force

The active force may in general act in a direction that tries to de-adhere the vesicle from the adhesive surface. In order to cancel this effect, we apply an external force in the vertical direction (along z-direction), when the net vertical force acts upward (that tends to de-adhere the vesicle). We note that even after applying the external force, see Fig. 18, there is no qualitative change in the results. The benefit of applying this external force is that we could now explore much smaller E_{ad} which could not be explored before, due to the de-adhesion of vesicle from the substrate.



Fig. 18 Microstates and cluster distribution of vesicle for active case with balanced total vertical force. The external force is applied to all the vesicle nodes, such that it balances the net vertical force when it acts in the upward direction (*i.e.* when it acts against the adhesion process). We show the snapshots and cluster distribution of the vesicle with $E_{ad} = 0.20, 0.75, 1.5$ (in units of k_BT) and $\rho = 3.45\%, 10.36\%, 17.27\%$ and 24.18%. The green dashed line denotes the transition to a pancake-like shape. The red dashed vertical line denotes the density for the pancake transition for a free vesicle (without adhesion, [36]). Compared to the calculation without applying a balancing external force (Fig. 4), we do not observe any qualitative change except for the fact that in this case, we could explore much smaller E_{ad} values. Other parameters are the same as in Fig. 4

G Active vesicle with zero spontaneous curvature proteins

In this section, we show our results for the active case with proteins having zero spontaneous curvature. The shape of the vesicle is very dynamic in this case and changes with time. We show few snapshots of the vesicle in Fig. 19a. The shapes shown in this figure should not be assumed to be a steady-state shape. We also show the dynamic nature of the vesicle in Fig. 19b, where we show the snapshot for a given density ($\rho = 10.36\%$) at different instants of time, for few values of E_{ad} . In Fig. 19c, we plot the fraction of adhered area with time,



Fig. 19 Results for active case ($F = 4 k_B T/l_{min}$) with proteins having zero spontaneous curvature. **a** Microstate of vesicle and cluster distributions for different values of ρ and E_{ad} . We show the snapshots for $\rho = 3.45\%$, 6.91%, 10.36%, 13.82%, 17.27% and $E_{ad} = 3, 4, 5$ (in units of $k_B T$). **b** The dynamic nature of the vesicle for a given density 10.36% and $E_{ad} = 3, 4, 5, 6$ (in units of $k_B T$). **c** Variation of adhered fraction with time along with snapshots. We use here $\rho = 10.36\%$ and $E_{ad} = 0.50 k_B T$. The other parameters are the same as in Fig. 4

and also the snapshots near the plot. This plot also explains the dynamic nature of the vesicle (see Movie 11).

H Spreading dynamics and time-dependent shapes of vesicles

Here, we show our results for the dynamics of spreading of the vesicles, by plotting the cross-sectional shapes and snapshots with time (Fig. 20). We study three different cases: a protein-free vesicle (Fig. 20a), a vesicle with passive proteins (Fig. 20b) and a vesicle with active proteins (Fig. 20c). For the protein-free vesicle, we chose a large adhesion energy $E_{ad} = 5.0 k_B T$ such that the vesicle could spread significantly. For the passive vesicle, we chose a small adhesion energy $E_{ad} = 0.50 k_B T$ and $\rho = 13.82\%$, in the regime where the curved proteins dominate the spreading dynamics. For the active case, we use $F = 4 k_B T / l_{min}$, $E_{ad} = 0.50 k_B T$ and a comparably smaller density of proteins $\rho = 10.36\%$, where the active forces dominate the spreading. For each of the three cases, we plot (i) the cross section of adhered area, (ii) the side view of the vesicle and (iii) the three-dimensional view of the vesicle.



Fig. 20 Spreading dynamics. **a** Spreading of a protein-free vesicle. Here, we choose $E_{ad} = 5 k_B T$. (i) The bottom view of the adhered area with time, showing that the vesicle adhere quickly. (ii) The side view of the vesicle, showing how the cross-sectional area decreases with the adhesion of vesicles. (iii) Three-dimensional view of the vesicle with time. **b** Spreading of passive vesicle with $\rho = 13.82\%$ and $E_{ad} = 0.50 k_B T$. Panels (i), (ii) and (iii) are the same as above. The adhered area grows uniformly from the beginning. **c** Spreading of an active vesicle, with $\rho = 10.36\%$, $E_{ad} = 0.50 k_B T$ and $F = 4 k_B T/l_{min}$. In the beginning, the growth of adhered area is slow and then accelerates and finally the vesicle takes the shape of a pancake. The unit of time (*t*) is taken as 2×10^3 MC steps

I Quantifying pancake transition by measuring the fraction of largest cluster

In Fig. 21, we show our results for the fraction of largest cluster as function of ρ for active case with different values of *F* and a small value of $E_{ad} = 0.50 k_B T$. We note that for large *F*, there is a sharp jump in the value of the fraction at the pancake transition (dashed vertical line in Fig. 21a); however, for small *F*, the fraction does not show any big jump. In order to quantify the pancake transition for small *F*, we choose a threshold value of the fraction, above which we assume the shape to be a pancake. By monitoring the data of Fig. 21, we choose the threshold value to be 0.60, above which the shape looks like a pancake.



Fig. 21 Fraction of largest cluster with ρ for various values of F and $E_{ad} = 0.50 k_B T$. **a** $F = 2.0 k_B T/l_{min}$, **b** $F = 1.0 k_B T/l_{min}$ and **c** $F = 0.50 k_B T/l_{min}$. The vertical dashed line of (**a**) shows the pancake transition, which is a sharp transition. For (**b**) or (**c**), the pancake transition is not very sharp, and the shape is assumed to be a pancake when the size of largest cluster is at least 60 % of the total number of proteins

J Adhered area–volume relation

As the cells spread, their volume is observed to decrease [47,48]. We find similar dynamics in our model simulations. The steady-state relation between the vesicle volume and adhered area is also similar to the experimental observations, although we have explored a smaller range of values (see Fig. 22). Note that in cells, there are internal organelles, such as the large nucleus, that limit the decrease in volume and which our model does not describe. In addition, osmotic pressure and ion fluxes also contribute to the volume control in cells [85].



Fig. 22 Area-volume relation. **a** The variation of area and volume with time for an active vesicle. The red triangles are for the volume, and the blue circles are for the area. We use here $\rho = 10.36\%$, $E_{ad} = 0.50 k_B T$ and $F = 4 k_B T/l_{min}$. **b** The area-volume relation in the steady state for active case with $E_{ad} = 0.50 k_B T$ and two different values of ρ . The hollow magenta circles are for $\rho = 4.84\%$, and the green solid circles are for $\rho = 10.36\%$. We also show the snapshot of vesicles for both the ρ , for their highest area. Here, we vary F in order to access different areas and volumes in the steady state. We note that for larger ρ (which corresponds to the pancake shape), the system can access larger area and smaller volume in comparison with lower ρ (which corresponds to the two-arc elongated shapes)

K Speed of the crescent-shaped vesicle in the $E_{ad} - F$ plane

In Fig. 23, we show the speed of the crescent-shaped vesicle in the $E_{ad} - F$ plane, without scaling by E_{ad} (as is shown in Fig. 9b). We normalize the speed by the maximum value, where the maximum value of the speed is 0.328 l_{min} per MC steps. We note that the speed is maximum for large E_{ad} and large F region.



Fig. 23 Speed of the crescent-shaped vesicle in the $E_{ad} - F$ plane. Here, we calculate the speed as the displacement of COM per MC step and then normalize all the values by the maximum speed, where the maximum value of the speed is 0.328 l_{min} per MC step. For large E_{ad} but small *F*, the vesicle speed is zero, but it might show diffusive behaviour as well. The speed is maximum for large E_{ad} and large *F* region

L Mean square displacement of the crescent-shaped vesicle

In Fig. 24, we show the mean square displacement of the COM of the crescent-shaped vesicle with time, for $E_{ad} = 2.0 k_B T$, $\rho = 3.45\%$ and various values of F. We note that for large F, there is a finite speed which increases with F; however, for small F, the displacement grows diffusively.



M Effect of varying the protein-protein interaction strength w

Throughout the paper, we kept the value of the protein–protein interaction strength (w) to be fixed at $w = 1 k_B T$. In Fig. 25a, we show that even if we take $w = 0 k_B T$, the qualitative nature of the shapes of vesicles does not change. We still obtain the two-arc shapes or the crescent-like shapes. However, increasing w to a value such that $w \gg F \cdot l_{\min}$ changes qualitatively the shapes of the vesicle, as shown for $w = 10 k_B T$ in Fig. 25b (see Movie 12). The bud-like protein clusters are now solid-like and do not easily deform or break-up and do not merge over time.



Fig. 25 Snapshots of vesicle with various values of protein–protein interaction strength w. **a** For $w = 0 k_B T$, we obtain the two-arc and crescent-like shapes as found for the case of $w = 1 k_B T$ (Fig. 9). For (i), we use $E_{ad} = 2.0 k_B T$, $F = 4.0 k_B T/l_{min}$ and $\rho = 3.45\%$, and for (ii), we use $E_{ad} = 3.0 k_B T$, $F = 2.0 k_B T/l_{min}$ and $\rho = 3.45\%$. **b** For very large $w = 10 k_B T$, the vesicle forms small isolated clusters that do not break-up or merge after long time. Here, for (i), we use $E_{ad} = 2.0 k_B T$, $F = 3.0 k_B T/l_{min}$ and $\rho = 3.45\%$, and for (ii), we use $E_{ad} = 2.0 k_B T$, $F = 3.0 k_B T/l_{min}$ and $\rho = 3.45\%$, and for (ii), we use $E_{ad} = 2.0 k_B T$, $F = 4.0 k_B T/l_{min}$ and $\rho = 3.45\%$.

N Difference in the adhered area of a crescent-shaped vesicle and a two-arc-shaped vesicle across the crescent to two-arc transition line (Fig. 9a)

The analytical calculation of the transition line (Fig. 9a) separating a crescent shape and two-arc shape (Eq. 7) depends on the value of ΔA , which is different in adhered area of the crescent-shaped vesicle and the two-arc-shaped vesicle across the transition line. Here, we plot the value of ΔA across this transition line as a function of E_{ad} as extracted from the simulations (Fig. 26a). The value of ΔA does not show any monotonic variation with E_{ad} and is approximately constant along the transition line (as was assumed in Eq. 7). The average value of ΔA is $\simeq 144.32$. The analytical calculation also contains the area of the cylindrical part of the vesicle, A_{cyl} . We also measure this area and note that this value is also roughly a constant along the transition line (Fig. 26b). The average value of this area turns out to be $A_{cyl} \simeq 1083.52$. We assume the number of proteins at each end of the cell to be N = 25, half of the total number of proteins. Since the unit of E_{ad} is different in simulations and analytical calculation, we properly scale it to make it consistent for both the cases. Using all these values, we obtain the prefactor of F^2 in Eq. (7) as $\simeq 1.96$. This value if very close to the value of 2.04 is obtained by fitting the simulation points along the transition line (Fig. 9a) with the equation.



Fig. 26 a The difference in the adhered area of a crescent-shaped vesicle and a two-arc-shaped vesicle across the crescent to two-arc transition line, ΔA (in units of l_{\min}^{2}), as a function of E_{ad} . We note that the value of ΔA does not show any monotonic variation with E_{ad} and is approximately constant along the transition line (as was assumed in Eq. 7). **b** The area of cylindrical part in a two-arc shape A_{cyl} (in units of l_{\min}^{2}), as a function of E_{ad} . This value also seems to be roughly a constant along the transition line

O Motile vesicle growing against an immobile barrier

In Fig. 27, we allow a motile crescent shape to hit a rigid non-movable barrier, placed perpendicular to the direction of motion of the crescent. We take a non-adhesive as well as an adhesive barrier. In both the cases, the crescent shape finally breaks into two-arc shape (see Movie 13 and Movie 14).



Fig. 27 Motile vesicle growing against an immobile barrier. **a** We plot the snapshots of vesicle with time for a non-adhesive barrier. **b** The snapshots of the vesicle with time for an adhesive barrier. **c** The side view of the vesicle for the adhesive case. We note that in both the adhesive and non-adhesive cases, the crescent-shaped vesicle breaks into two-arc shape. Here, we use $\rho = 3.45\%$, $F = 4 k_B T / l_{min}$ and $E_{ad} = 3.0 k_B T$. For the adhesive barrier also, we use $E_{ad} = 3.0 k_B T$

P Motile vesicle moving inside a narrow slit

In order to study the effect of confinement on the shape of the leading edge of the motile vesicle, we direct the motile vesicle into a narrow slit. This is motivated by the observation of wider and more persistent lamellipodia leading edge of a motile cell when it extends its lamellipodia into such a narrow slit [75].

The slit in the simulations consists of two flat surfaces: the bottom one is the same as the adhesive surface on which the vesicle is crawling, while the top one is a parallel non-adhesive surface, such that the vesicle gets confined between these two surfaces (see Fig. 28a and Movie 15). The width of the slit is chosen to be narrower than the thickness of the motile vesicle ($\sim 3l_{min}$).

We find that due to the confinement, the mean curvature of the leading edge increases (Fig. 28b) when the vesicle is stopped by the slit. This higher curvature at the leading edge manifests in reduced fluctuations of the proteins, and the proteins become more strongly confined within one large cluster (Fig. 28b, inset). The position of the leading edge as function of time is shown in Fig. 28c, showing that the vesicle gets stopped by the slit. Finally, we show in Fig. 28d the separation between the centre of mass of the vesicle and the leading edge, over time. This indicates that the vesicle gets stretched when it is stopped by the slit, and this separation increases.

Note that we use here a relatively small value of the active force ($F = 1.0 k_B T/l_{min}$), such that the vesicle is thick enough to be stopped by the slit. At a larger active force, the vesicle can be more strongly deformed and continue to crawl inside the slit.



Fig. 28 Motile vesicle moving inside a narrow slit. **a** The configurations of the vesicle moving inside a narrow slit, at different instants of time. The three panels show the vesicle from different views. The top surface is shown as transparent for a better view. **b** The mean curvature of the leading region of the vesicle before (green triangles) and after (blue circles) the vesicle enters the slit. The insets show the protein cluster-size distribution, before and after the vesicle gets stuck in the slit. **c** The position of the leading edge with time. **d** The separation between the position of the centre of mass of the vesicle (r_{com}) and the position of the leading edge ($r_{leading}$), with time. Here, we use $\rho = 3.45\%$, $F = 1 k_B T / l_{min}$ and $E_{ad} = 3.0 k_B T$. The slit width is taken to be $3l_{min}$

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