## Stall, Spiculate, or Run Away: The Fate of Fibers Growing towards Fluctuating Membranes

D. R. Daniels,<sup>1</sup> D. Marenduzzo,<sup>2</sup> and M. S. Turner<sup>1</sup>

<sup>1</sup>Department of Physics, University of Warwick, Coventry CV4 7AL, United Kingdom

<sup>2</sup>SUPA, School of Physics, University of Edinburgh, Mayfield Road, Edinburgh EH9 3JZ, United Kingdom

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We study the dynamics of a growing semiflexible fiber approaching a membrane at an angle. At late times we find three regimes: fiber *stalling*, when growth stops, *runaway*, in which the fiber bends away from the membrane, and another regime in which *spicules* form. We discuss which regions of the resulting "phase diagram" are explored by (i) single and bundled actin fibers in living cells, (ii) sickle hemoglobin fibers, and (iii) microtubules inside vesicles. We complement our analysis with 3D stochastic simulations.

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Semiflexible polymer fibers, making up the cytoskeleton, interact with fluctating membranes continuously in living cells [1]. The polymerization of filaments such as actin, with persistence lengths  $l_p \sim 10 \ \mu$ m, can deform the outer plasma membrane of the cell, giving rise to protrusions that can be sheetlike (lamellipodia) or more localized (filopodia) [1]. Forces are thought to arise through polymerization at the fiber tips [2,3]. A similar mechanism is thought to drive growth of sickle hemoglobin fibers, [4], as well as microtubules, such as can be grown in artificial vesicles [5].

While the phenomenon of Euler buckling of a fiber of fixed length impinging on a solid obstacle at an angle is well studied [see, e.g., [6] and references therein], the case in which the elastic fiber is growing, and the obstacle is a fluctuating membrane, have so far received much less attention, despite its more direct relevance to biological systems. Thus here we propose a set of equations of motion that describe the coupled dynamics of a growing semiflexible polymer close to a fluctuating membrane (Fig. 1). We complement this treatment with full three-dimensional dynamic Monte Carlo simulations (3DMCS). Our main focus is on the dynamic regimes attained at late times. We find that fibers may (i) stall, (ii) run away, i.e., bend away from the membrane, or (iii) cause the formation of tubular membrane spicules. What differentiates our approach from earlier work is the explicit description of the flexibility of both the membrane and the polymer [3,6-9], which allows us to include all three fates of the fiber.

The Hamiltonians governing the membrane and the polymer elasticity, respectively  $H_m$  and  $H_p$ , are given by:

$$H_m = \frac{1}{2} \int d^2 r [\kappa_m (\nabla_\perp^2 u)^2 + \sigma (\nabla_\perp u)^2]$$
  

$$H_p = \frac{\kappa}{2} \int_0^L ds \left(\frac{\partial \theta}{\partial s}\right)^2,$$
(1)

where  $\kappa_m$  and  $\sigma$  denote the membrane rigidity and surface tension, respectively, and are typically  $\kappa_m \sim 10^{-19}$  J and  $\sigma \sim 10^{-4}$  Jm<sup>-2</sup> for biomembranes, *u* measures the normal deviation of the membrane from local flatness, which

we take to be the plane z = 0,  $\kappa = k_B T l_p \equiv l_p / \beta$  is the polymer bending rigidity, L is its (instantaneous) length, and  $\theta(s, t)$  is the angle between the local direction of the fiber at arc length position s and the plane z = 0 at time t, see Fig. 1. The probability distribution of the membrane displacement can be calculated from the conditional partition function that it is at fixed height  $z_m$  at one point. This is here approximated by [10]  $Z_m = \exp(-Az_m^2)$ , where  $A = \frac{2\pi\sigma\beta}{\log(1+\frac{\sigma\Omega}{\kappa_m\pi^2})}$ ,  $\Omega$  being the area of the "frame" supporting the membrane patch under consideration. A measures the membrane "softness" ( $A \rightarrow \infty$  corresponds to a hard wall), and typically  $A/\beta \sim 10^{-4}$  J m<sup>-2</sup> [10]. The partition function  $Z_m$  can be integrated over all allowed  $z_m$  to obtain the entropic normal force acting on the fiber tip. We perform a saddle point approximation on  $H_p$  in Eq. (1), and consider the adiabatic limit in which, at all t, the fiber is in equilibrium. We seek to solve the following coupled equations

$$0 = \left[\kappa \frac{\partial^2 \theta(s, t)}{\partial s^2} - f \cos(\theta(s, t))\right]$$
(2)

$$\frac{\partial L(t)}{\partial t} = \delta\{k_{\rm on}e^{\left[-\beta f(\Delta)\delta\sin(\theta(L(t),t))\right]} - k_{\rm off}\}$$
(3)

$$\Delta(t) = -d + \int_0^{L(t)} ds \sin(\theta(s, t))$$
(4)

$$\beta f(\Delta) = 2\sqrt{\frac{A}{\pi}} \frac{\exp(-A[\Delta(t)]^2)}{1 - \exp[\sqrt{A}\Delta(t)]}.$$
(5)

Here  $k_{on,off}$  are, respectively, the rates of polymerization



FIG. 1 (color online). A growing fiber [of length L(t)] is incident onto a membrane, anchored to some distant frame.

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and depolymerization at the fiber tip, d and  $\Delta$  the initial and instantaneous distances between the fiber tip and the membrane frame,  $\delta$  the increase in length upon addition of a monomer, while  $f(\Delta)$  is the force exerted by the membrane on the fiber tip [10]. We assume constant rates  $k_{\text{on.off}}$ but time varying rates could be included to model, e.g., actin concentration fluctuations. The fiber is treated as if clamped at one end  $\theta(s = 0, t) \equiv \theta(s = 0) \equiv \theta_0$ , into the cytoskeletal mesh, while the end at s = L(t) is free,  $[\partial \theta(s, t)/\partial s]_{s=L(t)} = 0$ . Equation (5) has been derived by assuming that the membrane and the fiber only interact via excluded volume and that this can be introduced at a single point (the fiber tip) [10]. This may fail for a highly bent fiber that often contacts the membrane far from its tip [11]. We solve Eqs. (2)–(4) numerically, via a standard Euler relaxation algorithm and finite difference discretization. The solutions for the system of Eqs. (2)–(5) fall into two classes. The fiber can either (a) grow until it stalls, or (b) undergo a runaway transition [8]. This is distinct from buckling, which is a purely equilibrium phenomenon. The physical parameters determining the system dynamics are  $\sqrt{A}\delta$ ,  $k_{\rm on}/k_{\rm off}$ ,  $\frac{\kappa\delta}{k_{\rm a}Td^2}$ , and  $d/\delta$ . Equation (2) neglects fluctuations around the average fiber shape (see below for a discussion of the effect of these). Throughout we work at physiological temperature T.

Figure 2 shows a cut of the "phase diagram": for  $\theta_0 > \theta_c$  the fiber stalls, otherwise it is bent away by the membrane. Here  $\theta_c$  is established by variation of  $k_{\rm on}/k_{\rm off}$ , for parameters typical of actin fibers in cells (caption).

As the incidence angle approaches the critical threshold from below, the growth of the fiber is strongly nonlinear at intermediate times [see Fig. 3(a)]. This is because the growth rate is reduced by a factor exponential in  $f(\Delta)$ [see Eq. (2)]. This force bends the tip [Eq. (1)] and as a result the growth speeds up again, as the factor  $\sin(\theta[L(t), t])$  decreases [Eq. (2)]. Far from the transition line this behavior is not found and the fiber growth is nearly linear at all times, see Fig. 3(a).

The physics of the transition between the metastable stalled and the runaway state is controlled by the *tangential* 



FIG. 2 (color online). Plot of the critical angle  $\theta_c$  (solid line) below which runaway occurs, as a function of  $k_{\rm on}/k_{\rm off}$ , for actinlike parameters (d = 100 nm,  $\kappa = 10k_BT \mu m$ ,  $\sqrt{A\delta} \sim$ 0.8,  $\delta = 2.5$  nm). (The runaway state on the right comes from 3DMCS with  $\theta_0 = 45^\circ$ ,  $k_{\rm on}/k_{\rm off} = \infty$  and  $\sqrt{A\delta} = 0.4$ .)

force on the fiber tip  $f_t(L)$  [Fig. 3(b)]— $f_t$  is related to the normal force in Eq. (5) via a factor  $\sin(\theta(L))$  to be determined from Eqs. (2)–(5). If the thermodynamic stall force  $f_{\text{stall}} = (k_B T/\delta) \log(k_{\text{on}}/k_{\text{off}})$  is above the maximum of  $f_t$ the fiber runs away; otherwise, it stalls. However, as  $f_t(L)$ vanishes for very long fibers, the stalled state is, in fact, metastable and the fiber may still run away provided it can "tunnel" through the free energy barrier present. Using transition state theory, we can estimate the time required for such a tunneling event as  $\Delta \tau = \tau_0 \exp(\beta \int_{L_1}^{L_2} dL f_t)$ where  $\tau_0 \sim$  ms is a typical microscopic relaxation time and  $L_1$  and  $L_2$  are given by intercepts of the force curve with the thermodynamic stall force, see Fig. 3(b). Figure 3(c) shows a representative plot of  $\Delta \tau$  versus  $\theta_0$ , with actinlike parameters.

Actin fibers in cells can be biochemically capped [1]. If the tunneling time is > than the inverse capping rate, typically <1 s, growth will be halted. Tunneling from the metastable stalled state may thus often be negligible.

While Eqs. (2)–(5) have to be solved numerically, one can employ a Gaussian approximation for the fiber tip fluctuations, controlled by  $H_p$  in (1), which permits some analytic analysis and, in particular, yields an explicit formula for  $f_t(L)$ .

To achieve this, starting from Eq. (1), we adopt a standard path integral method [10], and compute the first two moments of the probability distribution for the fiber tip position



FIG. 3 (color online). For 3 values of  $\theta_0$  (subscript dropped for readability) we show (a) the fiber length as a function of time, and (b)  $f_t$  as a function of length. Here  $k_{on}/k_{off} = 5$  (other parameters as Fig. 2), so the fiber is stalled for  $\theta_0 = 75^\circ$  and runs away at the two smaller  $\theta_0$ 's. This diagram serves to show that *all* stalled states are metastable. The analytical prediction for the adiabatic longitudinal force (dotted line) is compared to the numerics for  $\theta_0 = 45^\circ$ . The time needed to tunnel the barrier to runaway growth is proportional to the exponential of an energy barrier, being the area of the colored region for  $\theta_0 = 75^\circ$  in (b). The linear-logarithmic plot of this tunneling time as a function of  $\theta_0$ , found by an application of Kramers' theory, is shown in (c). From top to bottom,  $k_{on}/k_{off} = 1.5$ , 3, 5, and 10.

$$\langle z_p \rangle_0 = 2\kappa \sin\theta_0 [1 - \exp(-\lambda)]$$
 (6)

$$\langle z_p^2 \rangle_0 = 4\kappa^2 \{\lambda + \exp(-\lambda) - 1 \\ - \frac{\cos 2\theta_0}{12} [3 + \exp(-4\lambda) - 4\exp(-\lambda)] \}, \quad (7)$$

where  $\lambda = L/2\kappa$  and the subscript 0 denotes the fact that these are derived in the absence of a membrane. Using these moments we can approximate the distribution of heights  $z_p$  of the tip of the semiflexible polymer by a Gaussian distribution,  $Z_p = \exp[-B(z_p - \langle z_p \rangle_0)^2]$ , where  $B = \frac{1}{2} \frac{1}{\langle z_p^2 \rangle_0 - \langle z_p \rangle_0^2}$ . This approach is appropriate provided the force on the fiber is  $\ll$  the Euler buckling threshold,  $\pi^2 \kappa / (4L^2)$ . So far we have calculated *separately*: (i) the membrane deformation, and (ii) the fiber tip distributions. We now introduce the steric *interaction* between the rod and membrane as follows:

$$Z_{\text{tot}} = \int_{-\infty}^{\infty} dz_m \int_{-\infty}^{\infty} dz_p \,\mathcal{U}(z_m - z_p) Z_m Z_p$$
$$= \frac{1}{2} \bigg[ 1 - \operatorname{erf} \bigg( \frac{\langle z_p \rangle_0 - d}{\sqrt{1/A + 1/B}} \bigg) \bigg], \tag{8}$$

where  $\mathcal{U}(x) = 1$  if x > 0 and 0 otherwise.

It is reassuring that for completely rigid fibers we recover the corresponding result derived in Ref. [10]. Using  $Z_{\text{tot}}$  one can calculate, e.g., the tangential force acting on the tip  $\beta f_t(L) = -\frac{\partial \log(Z_{\text{tot}})}{\partial L}$ . This can be directly compared with the full numerical treatment [see Fig. 3(b), in which the comparison is shown for a fiber with  $\theta_0 = 45^\circ$ ]. For small incidence angle, up to  $\theta_0 \approx 55^\circ$  (with the parameter values of Figs. 2 and 3), the agreement is good, breaking down gradually as the initial incidence angle approaches normal incidence. The smoother force rise in the analytics for  $\theta_0 = 45^\circ$  is due to the inclusion of tip fluctuations, which do not alter the value of the maximum. (We note that if the membrane is softer then the agreement persists to a larger angle.) To see why the analytics eventually break down, we note that invoking a Gaussian tip distribution amounts to replacing the fiber with a spring with a Hookean constant *B*, which becomes stiffer with  $\theta_0$ . For  $\theta_0$  not too close to 90°,  $B \simeq \frac{3\kappa\beta}{2L^3\cos^2(\theta)}$ , in agreement with the treatment of Ref. [6]. Our combined treatment of fiber tip and membrane fluctuations using a Gaussian distribution can be seen as the natural generalization of the elastic fiber model of Refs. [3,6] to the case of a fluctuating soft membrane. As the incidence angle becomes close to normal, intuition suggests that the tip fluctuations will become "one sided" and the Gaussian approximation may then become poor.

We note from Fig. 2 that in an eukaryotic cell [where  $k_{\rm on}/k_{\rm off} \sim 100$  [3]],  $\theta_c \sim 86^\circ$  for an actin fiber. Thus the majority of fibers in a cytoskeletal actin network should eventually run away from the membrane. Fibers stall at smaller  $\theta_0$  if the initial fiber-membrane separation is smaller (than d = 100 nm). Electron microscopy of the

actin network [12] reveals that some of the fibers *are* bent into a submembrane "thatchwork," which may help the cytoskeleton sustain stress although might contribute less efficiently to motility. However in lamellipodia and filopodia, observed at the leading edge of a moving cell, the fibres are actively pushing with their tips pointing towards the membrane [13]. It is then natural to ask what "countermeasures" a moving cell takes to avoid run away.

One efficient strategy is to combine many fibers into a thicker, thus stiffer, bundle. If *n* fibers are cross linked into one bundle, e.g., by the Ena or VASP proteins [13], the aggregate can still be described as a single fiber obeying Eqs. (2)–(5), up to a rescaling  $\delta \rightarrow \frac{\delta}{n}$ ,  $k_{\text{on,off}} \rightarrow nk_{\text{on,off}}$ , and  $\kappa \rightarrow n^2 \kappa$ , which amounts to assuming that the fibers are strongly cross linked. As a result of bundling both stalling and runaway occur at larger membrane forces.

Figure 4 shows how the dynamic "phase diagram" of Fig. 2 gets modified by bundling. Here we have taken n =10, which may be a reasonable assumption for small filopodia *in vivo* [7]. Solving Eqs. (2)–(5) shows that  $\theta_c$  decreases with *n*, so that the stalling regime widens (Fig. 4). More importantly, a stiffer fiber, or a bundle with larger *n*, will deform the membrane more. As a result if *n* is large enough, and  $\theta_0$  is close to 90°, nonlinear membrane deformation into tubular spicules [9] may occur before runaway. We adopt a rough test for when spicules will be formed that is related to the breakdown of the linear membrane Hamiltonian (1), specifically that the maximum average membrane gradient exceeds unity  $\langle |\nabla_{\perp} u|_{\max} \rangle > 1$ . It can be shown [10] that this spiculation condition can be translated to a condition on the average membrane displacement, namely, that it exceeds  $\langle z_m \rangle = d + \frac{1}{2A} \frac{\partial \log(Z_{\text{tot}})}{\partial d}$ , which can be calculated from (8)  $\langle z_m \rangle - d = \frac{5\pi\beta}{2A} \sqrt{\kappa_m \sigma}$ . Inserting appropriate physical values we estimate that spicules form only if the (maximum) membrane displacement is at least  $\sim 100$  nm or, equivalently, that the normal membrane force is  $\sim 80 \text{ pN}$  [14]. Note that the boundary between spicule formation and fiber runaway is not sensitive to the polymerization rate, unlike the boundary between spicule formation and stalling. Thus, for physiological



FIG. 4 (color online). Phase diagram for a bundle of n = 10 actin fibers, with parameters scaled from those in Fig. 2 to this bundle size (see text). The insets are 3DMCS with parameter as in Fig. 2 except the spicule for which  $\sqrt{A\delta} = 0.1$ .

parameters, there is only a finite range of incidence angle for which a bundled actin fiber can form a filopodium.

We know of at least two other mechanisms beyond fiber bundling which the cell may employ to avoid excessive runaway of actin fibers: (i) capping proteins [1], (ii) tethering of fiber tips to the membrane [6].

It is interesting to consider a series of *in vitro* experiments aimed at controlling cell motility via protein expression [15] in light of our results. These experiments showed that lamellipodia only form when capping proteins are present in the cell, and they can be thought of as a dense network of short and mostly stalled fibers. Depleting the cell of capping proteins, without decreasing the amount of Ena or VASP proteins, results in massive growth of filopodia, akin to spicules. Reducing the number of Ena or VASP proteins as well, leads on the other hand to the formation of membrane ruffles, which may be associated with extensive fiber runaway, as we predict for actin fibers polymerizing with cell-like conditions. All the states in our phase diagram can thus be obtained in a cell by regulating the concentrations of these key proteins.

The validity of our treatment is not limited to single and bundled actin fibers. Microtubules and sickle hemoglobin fibers may have parameters closer to  $\delta \sim 0.5$  nm and  $l_p \sim$ 0.1–1 mm. If we adopt  $d \sim 1 \,\mu$ m, comparable to the size of the cell, stalling occupies a smaller region in the dynamic "phase diagram," and runaway and spicule formation a larger region. This is in agreement with experiments [5].

Nonlinear membrane deformations, leading to spicule (or filopodia) formation cannot be described quantitatively using Eqs. (2)–(5). To check our approximate threshold for the onset of spicule formation, we have performed full 3DMCS, in which both membrane and fiber are discretized into connected "beads." A time step in the dynamic evolution consists of attempting to move the position of all beads in both the fiber and the membrane via local moves [see Refs. [8,16] for details on the algorithm]. A local move is accepted according to the Metropolis test with discretized versions of Eq. (1).

Examples of runaway state and spicule, found via our simulations, are shown as insets in Figs. 2 and 4. (Parameters are given in the legends.) For  $\theta_0 = 90^\circ$ , we confirm that there is a crossover between runaway and spiculation. For  $\sqrt{A\delta} \simeq 0.2$  this occurs when the persistence length of the polymers exceeds 1.5–2  $\mu$ m, in good agreement with 1.25  $\mu$ m found using our Gaussian approximation. In few cases for lower  $l_p$  values the fiber does not run away, but is "trapped" by the membrane fluctuations giving rise to a spicule. We also find that the runaway state (see Figs. 2 and 4) gives rise to a bump in the membrane which may account for the observation of ruffles [15]. Finally, if we require that a fiber does not runaway for 10<sup>8</sup> Monte Carlo steps, 3DMCS predict that the crossover to the runaway state in Fig. 1 occurs for  $\theta_c \simeq 85^\circ$  for  $k_{\rm on}/k_{\rm off} = 100$  [Eqs. (2)–(5) led to  $\theta_c \simeq 86^{\circ}$ ].

In conclusion, we have solved the dynamic equations of motion for a growing semiflexible polymer, incident onto a fluctuating soft membrane at an angle, and found a dynamic transition between fiber runaway and stalling. Given the kinetic polymerization rate of actin fibers in the cell, we predict that most single actin fibers should bend and run away from the membrane, and would not contribute to cell motility. This is in agreement with in vitro investigations under unphysiological conditions in which the behavior of cells lacking bundling and capping proteins was investigated. Moving cells seems to have taken "precautions" to stop this phenomenon from happening excessively, by bundling or capping fibers to render them stiffer. Our phase diagram can be generalized to the case of an actin bundle, and we show that in this case a third regime appears, in which the fiber deforms the membrane in a nonlinear fashion and spicules appear, which are akin to the filopodial protrusions observed in motile cells. It is intriguing that physiological values of the thermodynamic parameter  $\log k_{\rm on}/k_{\rm off}$  can be seen to lie in, or close to, the narrow range of values for which actin filipodia can explore all three different destinies. Finally, we show why microtubules and sickle hemoglobin fibers are more likely to form spicules or to run away than to stall.

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