Mesoscopic Model of Actin-Based Propulsion

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Abstract

Two theoretical models dominate current understanding of actin-based propulsion: microscopic polymerization ratchet model predicts that growing and writhing actin filaments generate forces and movements, while macroscopic elastic propulsion model suggests that deformation and stress of growing actin gel are responsible for the propulsion. We examine both experimentally and computationally the 2D movement of ellipsoidal beads propelled by actin tails and show that neither of the two models can explain the observed bistability of the orientation of the beads. To explain the data, we develop a 2D hybrid mesoscopic model by reconciling these two models such that individual actin filaments undergoing nucleation, elongation, attachment, detachment and capping are embedded into the boundary of a node-spring viscoelastic network representing the macroscopic actin gel. Stochastic simulations of this 'in silico' actin network show that the combined effects of the macroscopic elastic deformation and microscopic ratchets can explain the observed bistable orientation of the actin-propelled ellipsoidal beads. To test the theory further, we analyze observed distribution of the curvatures of the trajectories and show that the hybrid model's predictions fit the data. Finally, we demonstrate that the model can explain both concave-up and concave-down force-velocity relations for growing actin networks depending on the characteristic time scale and network recoil. To summarize, we propose that both microscopic polymerization ratchets and macroscopic stresses of the deformable actin network are responsible for the force and movement generation.

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Introduction

Cell migration is a fundamental phenomenon underlying wound healing and morphogenesis [1]. The first step of migration is protrusion – actin-based extension of the cell's leading edge [2]. Lamellipodial motility [3] and intracellular motility of the bacterium *Listeria monocytogenes* [4] are two prominent model systems that in the past decades have added considerably to our understanding of the protrusion based on growth of actin networks. These *in vivo* systems are complemented by *in vitro* assays using plastic beads [5] and lipid vesicles [6] that, when coated with actin accessory proteins, move much the same way as the *Listeria* pathogen.

Here we examine computationally the mechanics of growing actin networks. This problem has a long history starting from applying thermodynamics to understand the origin of a single filament's polymerization force [7]. The notion of polymerization ratchet led to the derivation of an exponential force-velocity relation (Figure S1 in Text S1) for a rigid filament growing against a diffusing obstacle [8]. Then, elastic polymerization ratchet model [9] was proposed for flexible actin filaments. This model evolved into tethered ratchet theory, in which a dynamic balance between surface-pushing growing filaments and motionresisting attached filaments (Figure 1A) governs the protrusion [10]. These early theories considered independent single filaments. However, actin filaments do not grow individually, but evolve interdependently as a network by branching sideways from each other [11]. Mathematical treatments and computer simulations of branching and nucleation [12,13] of filaments growing against an opposing force, which treated the dendritic actin network as a mechanically rigid body, predicted various force-velocity relations. Those ranged from concave-down (velocity of protrusion being insensitive to the load up to a threshold and plunging to a stall at a critical opposing force) to concave-up (more or less exponential decrease of the velocity with the growing load) relations (see Figure S1 in Text S1). These theoretical efforts culminated in detailed agent-based threedimensional (3D) models of growing networks of rigid filaments propelling *Listeria* pathogen [14,15].

In parallel to these microscopic theories, macroscopic elastic propulsion model [16,17] suggested that the curved surface of the pathogen is not merely pushed, but squeezed forward by an elastic stress. This stress is developed from the stretching of the outer layer of actin gel by the growth of the gel near the inner surface (Figure 1B). This model treated the actin network as an isotropic elastic continuum and did not explicitly consider the microscopic mechanism of force generation at the surface. As a result, a concave-up force-velocity relation for the actin-propelled spherical bead was derived [18], predicting an initial rapid decay with opposing force followed by a region of slower decay of velocity. This prediction was confirmed by using a cantilever setup for beads coated with the actin polymerization activator N-WASP and moving in a pure-protein medium [18]. On the other hand, when the force-velocity relation of an actin network growing against a flat surface was measured using the cantilever method, it was found that the growth velocity was constant at small forces but dropped rapidly at higher forces [19] as predicted by some microscopic ratchet theories.

Author Summary

There are two major ideas about how actin networks generate force against an obstacle: one is that the force comes directly from the elongation and bending of individual actin filaments against the surface of the obstacle; the other is that a growing actin gel can build up stress around the obstacle to squeeze it forward. Neither of the two models can explain why actin-propelled ellipsoidal beads move with equal bias toward long- and short-axes. We propose a hybrid model by combining those two ideas so that individual actin filaments are embedded into the boundary of a deformable actin gel. Simulations of this model show that the combined effects of pushing from individual filaments and squeezing from the actin network explain the observed bi-orientation of ellipsoidal beads as well as the curvature of trajectories of spherical beads and the force-velocity relation of actin networks.

Note that the widely used terminology could be confusing as the elastic propulsion theory is sometimes called mesoscopic rather than macroscopic. Both terms are justified: the macroscopic mechanics is described using continuum theory, but an actin layer of a few microns thin is certainly a mesoscopic system. The model we present is mesoscopic in the sense that it spans from the microscopic level of individual filaments to the macroscopic level of continuous description of an actin gel. The model is also hybrid because it takes into account both local discrete forces and global network stress. We will mostly use the term "hybrid" throughout the paper.

The first simple attempt to use hybrid modeling of the lamellipodial edge was recently made in [20], where the actin network was divided into a semiflexible region near the membrane and a gel-like region at the back. Near the membrane, semiflexible filaments are assumed to produce entropic forces against both the membrane and the gel. In the back, the viscous gel deforms in response to stresses both from frontal filaments and internal contractions, causing retrograde flow. Because the semiflexible region is assumed to be supported by the gel region, the moving speed of the membrane is determined by the coupling between the two regions. This model was able to reproduce both concave-up and concave-down shapes of the force-velocity relation. Since this model considered only a one-dimensional strip of actin gel, it did not address the effects of surface geometry.

Besides the force-velocity relation, the non-zero curvatures of the trajectories of motile objects [21] is another important observable. A pioneering microscopic ratchet-based model, which investigates how randomly distributed actin filaments propel a cigar-shaped pathogen, predicted that the resultant bacterial trajectories have curvature values following a Gaussian distribution with zero mean [22]. This conclusion was challenged by a number of studies. One of them showed helical movements that were explained as a result of a non-vanishing torque that arises from a persistent actin-induced off-center force [23]. Another study did not result in helical paths of beads, but rather showed a highly varying curvature of trajectories which has a Gaussian distribution, albeit with a sharp peak at zero curvature [24]. In contrast, a third study indicated that the distribution of the curvatures of trajectories deviated significantly from Gaussian, which was explained by a cooperative breaking of filaments tethered to the bead [25]. All theories used to explain these experiments were microscopic; elastic propulsion model was never applied to these phenomena.

Below, we describe observations of ellipsoidal, rather than spherical, beads that cannot be explained by either microscopic or macroscopic model. This, as well as the complex force-velocity relation and curvature distribution described above, hints that perhaps a hybrid model with individual actin filaments pushing from the surface of a macroscopic deformable actin gel can explain the experiments better. Recent experiments and theory [26,27] demonstrated that disassembly and breaking of the actin gel are as important as the elastic deformations in generating propulsion. Therefore, we developed a model of a node-spring viscoelastic network representing the actin gel with individual pushing and pulling filaments embedded into the network boundary. Simulations of this in silico hybrid network showed that the combined effects of the macroscopic viscoelastic deformation and microscopic ratchets can explain both concave-up and concave-down force-velocity relations for growing actin networks, bistable orientation of the actin-propelled ellipsoidal beads, and peculiar curvature distributions for the actin-propelled trajectories of the beads

Results

Computational Model

We developed a two-dimensional (2D) simplification of a 3D hybrid model (Figure 1C), which incorporates both arrays of dynamic actin filaments at the surface-tail interface and the bulk deformable actin gel behind the interface. Filament arrays are embedded into the boundary of the deformable actin gel, which is coarse-grained into a network of nodes interconnected by elastic springs. Individual filament arrays at the surface-tail interface switch between pushing the obstacle surface and attaching to it. The existing filaments are constantly becoming a part of the network and dynamically expanding the actin gel, while nascent filament arrays are created around the surface via a mixture of nucleation and branching processes. The actin network undergoes disassembly, which is treated by removing the nodes and springs at a constant rate, as well as by rupturing crosslinks at a critical stretching force. The deformations of the network as well as the elastic filament forces cause both translational and rotational motion of the bead. The model reproduces the steady motion of beads propelled by treadmilling actin tails behind the beads (Video S1). Further details about the model assumptions, equations, numerical simulations and model parameters are described in the Materials and Methods and Text S1.

Orientation of Ellipsoidal Beads

Recently, with our experimental collaborators, we reported observations of the ellipsoidal beads that were uniformly coated with an actin assembly-inducing protein (ActA) [28] and moved in the plane between two parallel coverslips (see the Materials and Methods below). Surprisingly, roughly half of the time the beads moved along their long axes, and another half – along their short axes (Figure 2, A and B), with infrequent switches between these orientations.

To see whether the two existing models of actin propulsion can explain this result, we simulated the motion of actin-propelled ellipsoidal beads as described in the Materials and Methods. Elastic theory predicts that squeezing of an ellipsoidal bead introduces a torque orienting the bead with its long axis parallel to the actin tail (see Figure S2 and Figure S6 in Text S1). In agreement with this prediction, when we decreased the autocatalytic branching of actin and attachment forces, so that the actin gel exerted almost uniform normal stress on the bead surface, the model resulted in a propulsion along the bead's long axis (Video



Figure 1. Schematics of the models. (A) Tethered ratchet model. Actin filaments (gray) can attach to the obstacle surface (black line) via attachment sites (yellow) and exert pulling forces (f_a). Detached filaments can elongate by assembling actin monomers (red) onto their barbed ends and exert pushing forces (f_f) via a Brownian ratchet mechanism. Detached filaments are eventually capped by capping proteins (blue) and stop interacting with the obstacle. (B) Elastic theory. An elastic actin network (gray) propels a curved obstacle (black) with 'squeezing' forces (red arrows). (C) Hybrid model incorporating both discrete filaments (green lines: free filaments; red lines: attached filaments; yellow circles: attachment sites) and deformable network (blue lines), which is treated as a node-spring meshwork. Filaments are created along the surface of the bead (gray) and immediately anchor to the network in an undeformed state. Filaments exert forces on the bead as well as the network. The network is nodes, together with connected springs, are removed from the network at a constant rate to represent the disassembly of the network (black lines). (D–E) Simulation

snapshots of an actin-propelled bead (gray circle) during (D) symmetry breaking and (E) steady movement. Green lines: interacting filaments. Blue lines: stretched network springs. Red lines: compressed network springs. Bars: 1µm. doi:10.1371/journal.pcbi.1002764.g001

S2). On the other hand, when we simulated a network of rigid branching filaments pushing the bead, the propulsion was always along the short axis, so the bead moved sideways (Video S3). This change in the preferred orientation is caused by a subtle bias in how the actin network spreads along the bead surface: if the bead's orientation is skewed relative to the actin tail's axis, filament branching are more likely to happen near the tail-facing flatter surface where there is a higher number of existing filaments. As a result, more filaments push the bead sideways from the actin tail, shifting the filament-contacting region from the curved surface to the flatter one. Eventually, most filaments branch against the flatter part of the surface, orienting the bead with its long axis normal to the tail axis (see Figure S7 and detailed calculations in Text S1).

Thus, the elastic propulsion model predicts that beads only move along their long axes, while microscopic ratchet model predicts that beads only move along their short axes, and neither model can explain the observation. In contrast, the full hybrid model predicts that the bead can move in both orientations due to the combination of the elastic squeezing and the geometric spreading of actin and switch infrequently between them (Video S1, Figure 2, C and D, Figures S5 and Figure S8 in Text S1), in agreement with the observation (Figure 2, A and B). For more insight into this phenomenon and to generate predictions for experiment, we investigated numerically how the fraction of beads moving with a certain orientation depends on the geometric, mechanical and kinetic parameters.

Bead's aspect ratio. The simulation results of the effects of a bead's aspect ratio (at constant area of the bead) on its orientation are shown in Figure 2E. Beads with aspect ratios greater than 2 are more likely to move along their long axes, whereas movement along the short axes arises in beads with aspect ratios smaller than 2. For a spherical bead, motion has no preference along any axis (in this case the initial direction of axes is arbitrarily defined), as expected. This can be qualitatively explained as follows: for a highly elongated bead, the elastic squeezing action from the sides is greater, plus the actin network is more likely to rupture near the highly curved poles of the bead, which together orients the bead and tail axes in parallel. For a less elongated bead, the elastic torque becomes smaller, while the geometric effect spreading actin along flatter side of the bead persists. In Text S1, we show that the above results can be explained by the nonlinear dependence of the overall rotation on the aspect ratio of beads.

Network's stiffness. We vary the Young's modulus of the actin network by varying the spring constant in our model as described in Text S1. The effects of network stiffness on the orientation of the bead with aspect ratio of 2 is shown in Figure 2F. We find that when the actin gel is very soft (Y < 1kPa) or very stiff (Y > 10 kPa), the bead prefers moving sideways, along its shortaxis. On the other hand, when the network has an intermediate stiffness (Y = 1 - 10kPa), the bead can move along either axis with similar probability. Indeed, for a very stiff network, the elastic deformation becomes negligible. Pushing and reorientation of individual filaments determine the bead's motion along its shortaxis, consistent with the microscopic model. For a network with intermediate stiffness, the network squeezing effect, which align the bead to move along its long-axis, is comparable to the pushing and reorientation effects of the filaments, so the bead has similar chances to choose either orientations. For a very soft network, the network is highly deformable and thus is less likely to provide enough squeezing force to align the bead to move along its longaxis. In Text S1, we also show the results for beads with different aspect ratios. As beads' aspect ratio increases from 1.5 to 2.5, the preferred orientation shifts from short to long axis if the network has an intermediate stiffness (see Figure S9 in Text S1). For much softer or stiffer networks, beads always prefer moving along their short axes.

Effect of filament attachments. The effect of the ratio of the number of attached to the number of pushing filaments, N_a/N_f , on bead's orientation is shown in Figure 2G. As N_a/N_f ratio increases, the bead is more likely to move along its long-axis: when more attached filaments pull on the bead, the bead moves slower and have a denser network around it, and the elastic squeezing effect is strong. At a low N_a/N_f ratio, most filaments are pushing and few are pulling. The bead moves fast and tends to leave the network behind, so the squeezing from the sides becomes small, elastic effect is negligible, so the bead moves along its short axis. At $N_{\rm a}/N_{\rm f} \approx 0.37$, the bead has similar chances to move with either orientation. Although the attachment dependence of orientations depends on the balance between torques from free and attached filaments, it is challenging to find a simple analytical formula. It is because the nonlinear actin-remodeling-induced turning of the actin tail also plays an important role (see Text S1), which impedes a clearer physical picture of how N_a/N_f affects the orientation of beads.

Trajectory of Actin-Propelled Spherical Beads

To further test the hybrid model, we simulated the motion of actin-propelled spherical beads (Figure 3, A and C). We recorded the 2D 'in silico' trajectories of the beads and compared them to the experimental observations (see the Materials and Methods). We examined two possible mechanisms for the nucleation of new filaments: autocatalytic branching and spontaneous nucleation. We found that each mechanism alone does not produce the observed motion of the bead (see Video S4 and Video S5). Only a combination of the two mechanisms leads to realistic motion of the bead (see Video S6 and details in Text S1). Note that the trajectories are easy to visualize by looking at the actin tails that represent the most recent parts of the trajectories, see Figure 3, B and D). Our typical simulation results (Figure 3, A and E, Video S7) illustrate that in general the trajectories are mildly curved, as observed in some cases experimentally (Figure 3B). However, in other cases the experimental observations (Figure 3D) show that once in a while the beads stop, get surrounded by a dense actin 'cloud', and then break through the cloud and resume movement in a new direction.

Indeed, the model predicts that when the detachment rate of actin filaments becomes low and a greater fraction of filaments is attached to the bead surface, beads start to have pulsatory motion due to temporary entrapment by the actin gel (Figure 3C and Video S8), which occurs frequently in this regime. The explanation is that when filaments detach rapidly and thus do not generate great pulling forces, beads move quickly and can hardly be trapped, but at low detachment rate, beads slow down significantly by the strong pulling forces, which increases their chances to be trapped into the actin gel. Both our simulations and observations from our collaborators show that beads often make sharp turns during their escapement from the surrounding actin gel (Figure 3, C and D), causing the switching between the low- and high-



Figure 2. Motion of actin-propelled ellipsoidal beads. (A–B) Fluorescent images show actin tails of the motile beads. The dark ellipsoidal shapes at the fronts of the tails illustrate bead's propulsion along its (A) long-axis and (B) short-axis. The detailed statistics of phase contrast images reported in [28] confirm that roughly halves of the beads move in each orientation. Bars: 1µm. (C–D) Simulation snapshots of the same bead moving along its (C) long-axis and (D) short-axis at different time moments. Black circle: bead. White: actin networks with each node being a Gaussian-blurred dot of 0.1µm in decay width. Bars: 1µm. (E–G) Probability distribution of bead's orientation as a function of (E) bead's aspect ratio, (F) Young's ($0 \le \theta < 30^\circ$). Red squares: bead moves at a skewed orientation ($30^\circ \le \theta < 60^\circ$). Blue triangles: bead moves along the short-axis ($60^\circ \le \theta < 90^\circ$). doi:10.1371/journal.pcbi.1002764.g002

curvature trajectories. As a result, the trajectories show spatially separated segments of low and high curvatures (Figure 3F).

To obtain the distribution of the curvatures of the trajectories, we smoothed the simulated bead's trajectory to remove the high frequency noises and calculated (see Text S1 for details) that the curvature distribution is close to Gaussian (Figure 4A) for fastmoving beads in the wide range of parameters. This indicates that the turning of the fast-moving bead is likely to be driven by random events in the protruding actin network.

When the detachment rate is low, we find that the curvature distribution becomes sharply peaked at zero (Figure 4B), in agreement with both our observation (Figure 4B) and previous results [24]. Since the low- and high-curvature trajectories are typically separated in this regime, this sharp peak near zero is due to bead moving in a rapid-and-smooth fashion, while the slowly decreasing distribution at higher curvatures is caused by bead moving in a slow-and-jagged fashion. Furthermore, we find that the distribution is close to a Gaussian at higher curvature, indicating that the highly curved segments of trajectories are also likely to be caused by the random fluctuations in the actin network.

We found that the predicted characteristic value of the rootmean-square curvature, $k_{\rm rms} \sim 0.1 \mu m^{-1}$ (Figure 4C), is of the same order of magnitude as our observations (Figure S17 in Text S1) and available measurements [4,24,25]. We investigated how the filament attachments affect the value of $k_{\rm rms}$ (Figure 4C) and found that $k_{\rm rms}$ is insensitive to $N_a/N_{\rm f}$ for $N_a < N_{\rm f}$. However, the curvature increases rapidly with $N_a/N_{\rm f}$ for $N_a > N_{\rm f}$, consistent with the idea that excessive attached filaments cause frequent trapping of the bead leading to highly curved trajectories.

We also studied how the bead radius, R, affects $k_{\rm rms}$ (Figure 4D) and found that decreases as the bead size increases. This result is in agreement with the experimental observations reported in [4,25]. Interestingly, this results is also consistent with our experimental observation on the orientation-dependent turning of the trajectories of ellipsoidal beads (Figure S17 in Text S1): ellipsoidal beads moving along their long-axes are less likely to keep their current direction of motion comparing to those moving along their shortaxes. A possible interpretation is that the former are mostly pushed at their sharp ends where the radius of curvature is low. Similar to a spherical bead with small R, this will lead to a high $k_{\rm rms}$ in the trajectory and thus will be less likely for the bead to keep the current direction of motion. Together, the above results can be explained as follows: larger beads are propelled by a greater number of filaments, so relative fluctuations in the actin network go down and thus the beads fluctuate less in their motion. These findings suggest that the fluctuation in the number of actin filaments is likely the factor determining the curvature, so we developed a simple model to understand and test such mechanism.

Two possible mechanisms may contribute to the turning of beads' trajectory: turning induced by elastic and ratchet torque, and turning induced by actin tail-reorientation (see Text S1). Because of the symmetry of the spherical bead, the torque-induced rotation found in the ellipsoidal beads is negligible. Our simulations also confirm that a micron-sized spherical bead rarely rotates about its center during its motion. Therefore, the reorientation of the tail along the bead surface is likely to be the main cause of the trajectory turning. Thus, we consider a simplistic model in which a bead of radius R is propelled by N randomly distributed filaments at its rear, so the filament number difference between the left and right sides of the bead is on the order of \sqrt{N} . In other words, \sqrt{N} out of N filaments tend to push the bead off the current direction by an angle $\sim \pi/4$ while the rest tend to push along the current direction of motion. The change in the direction of motion is expected to be $\Delta\theta \approx (\pi/4)(\sqrt{N}/N) = \pi/4\sqrt{N}$. The typical time τ_0 over which the directional bias persists is the turnover time of the actin network, which we estimate in Text S1. Then, the typical angular velocity of the turning is $\omega_{\rm rms} \approx \Delta \theta / \tau_0$, and the root-mean-square value of the curvature is $k_{\rm rms} = \omega_{\rm rms} / v_{\rm b} \approx \pi / 4 \sqrt{N} v_{\rm b} \tau_0$. One thus expects a linear relation between $1/k_{\rm rms}$ and $\sqrt{N}v_b\tau_0$ with a slope of $4/\pi$. To test whether this simple conclusion is correct, we used simulations of the hybrid model to obtain the values of $k_{\rm rms}$, N, $v_{\rm b}$ and τ_0 . We plotted the simulation results for $1/k_{\rm rms}$ as a function of $\sqrt{N}v_{\rm b}\tau_0$ for various values of attachment, detachment, capping and nucleation rates, as well as of actin gel elastic constant, together with the predicted linear relation, and found very good agreement except for low values of the detachment rate (see Figure 4E, Figure S10 and Figure S11 in Text S1). The higher-than-expected values of $k_{\rm rms}$ obtained from the simulations with low detachment rates are caused by the entrapment of beads into the actin gel, as mentioned above. Thus, macroscopic elastic effects influence the trajectory only in the limiting case of too many attached filaments. Otherwise, stochastic microscopic filament-ratchets are responsible for the curvature of trajectories.

Note that in contrast to our results, a non-Gaussian distribution of the curvatures of trajectories of the beads was observed in [25]. According to the model in [25], the torque balance alone determines the turning of the bead, while in our model both torque and redistribution of actin around the bead determine the trajectory. This difference suggests that the redistribution of actin probably does not play an important role in the experiments in [25]. One possibility is that the actin tail always interacts with a fixed side of the bead in these experiments, which can result from an asymmetric coating of the bead surface by the actin-nucleation promoting factors. Also note that the autocorrelation function of the simulated curvature of trajectories always decays rapidly at a sub-micron distance (see Figure S12 and details in Text S1). This result differs from the observed long-range correlation of about 10µm [24], which is possibly caused by additional long-ranged bias in the actin network near the bead-tail interface.

Force-Velocity Relation of Actin Networks

We simulated growth of an actin pedestal against flat elastic cantilever and force-clamped spherical bead, as in experiments

[18,19], respectively (Video S9 and Video S10). The hybrid model in these cases was used as described above, with the following differences: 1) We first generated undeformed node-spring pedestal underneath the surface to be pushed. 2) All actin network nodes were free to be positioned by the force balances (the nodes in the network did not become immobile when they were more than a few microns away from the surface) except at the very bottom. The layer of the nodes at the very bottom was immobilized. 3) The motion of the cantilever or bead was determined by the balance between the pushing/pulling forces from the filaments touching the surface and either a) the elastic restoring force from the cantilever proportional to cantilever's deflection, or b) clumped force from the bead. The speed of the cantilever or bead, V, was then obtained by dividing the displacement increment of the surface by the time interval. Calibration of the model in these numerical experiments is described in Text S1. Simulation snapshots are shown in Figure 5, A and B and Figure S16 in Text S1.

The simulated force-velocity relation predicted by the hybrid model for the flat cantilever is compared to the experimental data [19] in Figure 5C. We scale the cantilever force F by $F(V_{1/2})$, which is the force at half of the maximum cantilever speed and scale V to best match the rest of the data. The prediction agrees very well with the observed concave-down force-velocity relation. To quantitatively understand this result, we develop an analytical 1D theory in Text S1 and find that continuing reduction of the network stiffness due to the network disassembly during a long time of the experiment plays an important role in the shape of the force-velocity relation. A network undergoing significant disassembly in the aged gel sections recoils under a high load, reducing both net protrusion rate of the actin network pushing the cantilever and the maximum force that the network can sustain. These factors cause the rapid downturn in the force-velocity relation. Our 1D analytical result (V can be approximated as $V \approx V_0 \sqrt{1 - F/F_{\text{stall}}}$ in relevant parameter range) is shown in Figure 5C and is in very good agreement with both experimental data and simulation of the 2D hybrid model.

We then used the hybrid model to simulate the force-velocity relation for the force-clamped bead. In this case, the force-velocity relation is concave-up, in good agreement with the observations [18] (Figure 5D, Figure S15 in Text S1). Qualitative explanation for this shape is that the velocities in this experiment were measured on a minute time scale before the network significantly disassembles (over a few minutes). Therefore, the network's recoil is negligible in this case and the force-velocity relation is similar to that of individual filaments. From our 1D calculation for V under constant load F (see Text S1), we find а $V = [1 - (F/YA) \exp(kt)]v$, where k is proportional to the disassembly rate constant of the network and $t \approx 45s$ is the age of the network when V is measured in our simulations, and $v = v_0 \exp(-F/Nf_0)$ is the average velocity of N individual filaments. This analytical result is also shown in Figure 5D, in very good agreement with the simulation results of the hybrid model.

To investigate the effect of the filament attachments to the surface on the force-velocity relations, we varied the value of the attachment rate to change the ratio of the number of attached to the number of pushing filaments, N_a/N_f . The simulated force-velocity relations for different ratios are shown in Figure S13 in Text S1. For both cantilever and force-clamped experiment, we find that increasing the fraction of attached filaments decreases both velocity and stall force without changing the qualitative shape of the force-velocity curve, consistent with the idea that attached filaments counteract the pushing filaments. Finally, to confirm that



Figure 3. Trajectories of actin-propelled spherical beads. (A) Simulation snapshot of the hybrid model. Black circle: bead. White: actin network. Bar: 2µm. (B) Fluorescent images of actin tails behind 0.5μ m beads. Bar: 2µm. (C) Simulation snapshots of bead with $R=0.5\mu$ m and $k_d^0=0.5s^{-1}$. Time interval is 100 s. Bar: 2µm. (D) Sequential snapshots of an observed bead that is temporarily trapped by its actin tail. Time interval is 20 s. Bar: 2µm. Courtesy of J. Theriot's lab. (E–F) Ten simulated bead's trajectories (colored lines) starting from the same origin (black dot) with (B) default values of parameters (see Table S1 in Text S1) and (C) same as (B) but with low value of detachment rate $k_d^0=0.5s^{-1}$. Each simulation represents 3600 s in real time. doi:10.1371/journal.pcbi.1002764.g003



Figure 4. Trajectory curvature of actin-propelled spherical beads. (A) Probability distribution of the normalized trajectory curvature for default values of parameters (open red circles), twice the value of attached to pushing filament ratio (green pluses) and twice the bead radius (dotted line), compared to a Gaussian distribution (solid black line). (B) Probability distribution of the normalized trajectory curvature with $k_d^0 = 0.5 s^{-1}$ (circles) compared with experimental results (bars). (C) Dependence of the root-mean-square curvature on the attached to pushing filament ratio varied by varying k_a (open circles) and k_d^0 (solid circles). (D) Dependence of the root-mean-square curvature on the bead's radius. (E) Dependence of the inverse root-mean-square curvature on $\sqrt{N}v_b\tau_0$. Solid gray line: analytical prediction. Symbols: values of $\sqrt{N}v_b\tau_0$ changed by varying k_a (solid black square), k_c (solid red circle), k_d^0 (open red circle), k_n (solid green up-triangle), k_s (open green up-triangle), R (solid blue down-triangle) and v_0 (open blue down-triangle). doi:10.1371/journal.pcbi.1002764.g004

it is the actin dynamics rather than the shape of the surface that determines the force-velocity relation, we swapped the shapes of the flat cantilever and round bead used in the two experiments. We considered two cases: a slow-growing actin network against a curved surface of a cantilever, and a fast-growing actin network against a flat force-clamped object. The simulation results shown in Figure S13 and Figure S15 in Text S1 illustrate that the force-velocity relations in both experiments remain qualitatively the same (concave-down and concave-up, respectively). Therefore, the shape of the surface does not appear to affect the overall shape of the force-velocity relation.

Discussion

Complexity of the relation between geometry of the curved surface, molecular pathways of actin polymerization against this surface and resulting force [29] indicates that the actin-based force-generation is a multi-scale phenomenon, understanding of which requires a combination of macroscopic and microscopic mechanisms. We developed such hybrid model of the actin network growing and pushing against rigid surfaces, in which actin filaments interacting directly with the surface are treated as



Figure 5. Simulated force-velocity relation of actin networks. (A–B) Snapshots of hybrid model simulations. Blue: obstacles. White: actin networks. Dark gray: rigid substrate. Bars: 1µm. (A) Actin network grows continuously against a flat cantilever with force being proportional to the deflection. (B) Actin network grows against a spherical bead, with force being clamped for each velocity measurement. (C–D) Simulated force-velocity relation compared with the data. (C) Computational results corresponding to the setup in (A). Red circles: experimental data from [19]. Solid line: hybrid model simulation. Dashed line: prediction of the 1D theory in Text S1. Dotted line: approximate analytical formula $V = V_0 \sqrt{1 - F/F_{stall}}$. (D) Computational results corresponding to the setup in (B). Red circles: experimental data from [18]. Solid line: hybrid model. Dashed line: prediction of the 1D theory in Text S1. doi:10.1371/journal.pcbi.1002764.g005

tethered-ratchet filaments, while other filaments are considered implicitly as parts of viscoelastic node-spring network.

The elastic propulsion theory predicts that squeezing of the ellipsoidal beads orients them so that motility along the long axes ensues, while geometric effect of spreading of branching actin filaments results in beads moving along their short axes. Separately, the existing theories cannot explain the observed bi-orientation of the beads. Our hybrid model posits that the combination of the elastic squeezing and geometric spreading leads to bi-orientation and reversible switching between two orientations, in agreement with the observations. To test the hybrid theory in the future, we propose to vary the bead geometry and concentrations of actin accessory proteins, thus modulating the network stiffness and interactions with the surface. Our model makes specific, nontrivial and testable predictions (see Figure 2, E-G) for such experiments.

The hybrid model reproduces the observed order of magnitude of curvatures of the trajectories in 2D and suggests that switching between the low- and high-curvature trajectories is caused by the temporary entrapment of the beads in the actin gel. The model predicts a Gaussian distribution of the curvatures for fast-moving beads due to random fluctuations of filament numbers and redistribution of actin around the bead's surface. In agreement with observations, our simulations show an additional sharp peak at zero curvature in the curvature distribution for slowly-moving beads. Importantly, the model suggests that elastic effects have little impact on the distribution of trajectory curvatures for fastmoving beads, while for beads that tend to be trapped in the actin cloud due to frequent filament attachments, the elastic effects are responsible for deviations from Gaussian distributions.

The hybrid model posits that the qualitative difference between two force-velocity measurements [18,19] stems from the characteristic time difference: when the measurement is made over a long time interval [19], the viscoelastic recoil of the older, aging part of the network near the base of actin pedestal cancels protrusion and causes the concave-down force-velocity relation. On the other hand, when the force is clamped and the experiment is performed over shorter times [18], the concave-up force-velocity relation is predicted. A possible way to test our model is to use fluorescent speckle microscopy to measure the kymograph of material points of the actin network that move with the recoiling network away from the surface being pushed. We predict the resulting curves for two considered experiments in Figure S14 in Text S1. Note, that there are alternative explanations for the result [19]. For example, theory in [30] based on a representation of the actin network as a viscoelastic solid could predict a different kymograph. Finally, the model proposes that the shape of the surface does not qualitatively affect the shape of the force-velocity relation.

In the present form, our model has a number of limitations. The main one is that due to computational time limitations, we simulated the model in 2D as a simplification of a 3D system. So, rigorously speaking, all our results are applicable to cylindrical, rather than spherical objects. In Ref. [28], we already attempted the 3D modeling, albeit of an oversimplified model. Preliminary indications from that attempt are that most of the 2D model predictions survive in 3D. However, there are effects of higher dimension: 3D viscoelastic theory and experiment [27] suggest that ellipsoidal beads break through the actin cloud sideways, while [28] reports the observed lengthwise symmetry breaking of the ellipsoidal beads. This problem remains open, and thus more 3D modeling is necessary. In addition, helical and more complex trajectories of actin-propelled beads that have been observed in 3D environments [23,24] cannot be captured by our 2D model. Furthermore, our model is coarse-grained and neglects important fine-scale processes such as hydrolysis of ATP bound to polymerized actin [31–33], exact actin branching angles [34], indirect synergy between capping and branching [35], molecular details of the nano-scale protrusion [36] and dependence of the branching rate on filament bending [37]. Future incorporation of these details into the model will clarify molecular nature of the mixture of nucleation-based and autocatalytic actin growth posited in the model.

Due to these limitations, our model does not capture some observed effects. Notably, the simulations do not reproduce observed hysteresis in the growth velocity of actin networks under force [19], which likely depends on complex dynamic features of the network [34,38] that are not incorporated into our model. Similarly, not reproducing deviations from the Gaussian distribution of the curvatures of trajectories [25] likely means that some inhomogeneities in the distribution of actin nucleation promotingfactors not included into the model play an important role. These inhomogeneities and 3D effects also have to be built into the model to reproduce helical trajectories reported in [21,23].

Another open question is relation of our model to other theories of the actin-based propulsion. Those include microscopic models of propulsion by tethered actin filaments [39,40] that can in principle be used as boundary conditions for the viscoelastic actin gels and tested by simulations similar to those done here. Two mesoscopic models, very different from ours, were proposed recently. One of them considers excluded volume effects [41], another is a liquid of dendritic clusters model [42]; both of them successfully reproduce the concave-down force-velocity curve. It is likely that subtle physical effects on which these models are based complement elastic deformations and individual filament ratchet forces of our model. In the future, after including interactions of the filaments with cell membrane [43–46], contractile myosin effects [47] and more adequate actin rheology [48], our model can be applied to the general problem of cell protrusion.

Materials and Methods

Bead Motility Assays

Motility experiments on ellipsoidal beads were carried out in the lab of J. Theriot as previously described [28]. Briefly, 1-µm

carboxylated polystyrene microspheres (Polysciences, Warrington, PA) were placed in a viscoelastic matrix (6% polyvinyl alcohol), heated to $\sim 200^{\circ}$ C, and stretched uniaxially. The film containing the beads was cooled and dissolved using an isopropanol/water mixture to recover the beads before functionalizing their surfaces with carboxylate. Electron microscopy showed that the beads had average dimensions of $1.8\mu m \times 0.8\mu m$, with an average aspect ratio of 2.2. His-tagged ActA was purified and adsorbed on the surface of beads at saturating amounts. ActA-coated beads were then added to Xenopus laevis egg cytoplasmic extract, which was diluted to 40% of the original protein concentration. The slide chamber depth was restricted using 2-µm silica spherical beads. Note, that the ActA-coated motile beads were contained between two parallel coverslips and restricted from moving perpendicularly to the coverslips, and thus the trajectories of the beads were twodimensional. All time-lapse sequences taken during the steadystate bead motility were acquired between 2 and 4 h after preparing the slide. Phase-contrast and fluorescence images were acquired as described in [28].

Spherical beads were prepared in the lab of J. Theriot as previously described [5], which is similar to that for ellipsoidal beads except for the stretching treatment. Bead trajectories were recorded at 10 s intervals.

For both experiments, positions and orientations of beads were computed from phase-contrast images and assembled into tracks as described in [28]. Smoothing of the instantaneous angular velocity values of the beads was generated using a weighted average of five nearest neighbors and a cubic equation as described in [28]. The angular velocity fit-in was generated using a seventh-order polynomial function. The curvature was obtained by dividing the resulting angular velocity by the instantaneous linear speed of the bead.

Computational Model

In the hybrid model (Figure 1C), arrays of actin filaments interacting directly with the surface of the bead are treated as effective individual filaments, while other (not in touch with the surface) filaments are not modeled explicitly but rather treated as the network of elastic springs interconnected by nodes. The model is formulated and all simulations are done in 2D, which is a simplification of a 3D system. We assume that new filaments are created around the surface via a mixture of spontaneous nucleation, which has a spatially uniform rate along the bead surface, and autocatalytic branching processes, which has a rate proportional to the local density of existing filaments (not necessarily uniform in space). Separately, either of these processes produces a defective actin tail (see Figure S4 and discussion in Text S1). We also assume that newly created filaments immediately anchor to the network at their pointed ends which become new nodes of the network. In the simulations, this step is achieved by connecting each pointed end with undeformed springs to up to 4 neighboring nodes in the network that are within $0.1 - 0.3 \mu m$ from the pointed end (see Figure S3 in Text S1). Thus, creation of new filaments dynamically expands the actin network. We treat filaments as elastic springs that are created in an attached and undeformed state. When stretched, attached filaments produce resisting forces that are proportional to their deformations. Attached filaments undergo detachment with a rate that increases exponentially with the load force. After detachment, filaments become free and are able to elongate and produce pushing forces against the obstacle. Free filaments are treated as linear elastic springs with the rest length growing with the polymerization rate. This rate is a function of the load on the barbed end of the filament; the function is given by the individual filament forcevelocity relation that follows from the Brownian ratchet theory. The pushing force that a free filament exerts on the surface is computed as follows: at each time step, a virtual 'penetration' distance of the barbed end of the rest-length spring, corresponding to the filament, into the bead is computed. The filament is assumed to be deformed by this penetration distance, and respective elastic force is the pushing force. Free filaments can re-attach to the surface and get capped at constant rates.

Once capped, the filament is removed from the simulation, since in reality it will stop growing and cannot attach to the surface to exert pulling forces. However, the node corresponding to the pointed end of the filament remains, so this filament effectively becomes a part of the deformable network. We do not track the orientation of individual pushing filaments, but treat them as coarse-grained clusters of actual filaments that always push perpendicularly to the obstacle surface (see Figure 1D). As filaments exert forces on the obstacle, they also apply opposite forces to the elastic network that they are anchored to, causing network deformations (see Figure 1D). Similarly, the stress in the deformed network is transferred to the bead surface through the interacting filaments.

The deformation of the network is represented by the motion of nodes and springs in the network, which is obtained by moving all the nodes toward their force-equilibrium positions at each time step. For actin-propelled beads, we assume that the nodes in the network become immobile when they are more than a few microns away from the bead surface, representing the adhesion of the actin tail to the substrate. The bead moves and rotates to satisfy the force and torque balances from the filaments. For the force-velocity measurements, we fix the network at the bottom and allow all the rest nodes to move to reach force balance. The network undergoes disassembly, which is treated by removing the nodes and their connected springs from the network randomly with a rate proportional to the number of existing nodes. We have also included the effect of rupture of crosslinks by introducing a critical stretching force, above which the links break and get removed from the network. During the steady motion of beads, the creation and extinction rates of actin networks balance, causing a treadmilling actin tail behind the bead (Video S1). Effective viscoelastic behavior of the actin network emerges from the disassembly and breaking of the network. Further details about the model equations and parameters are described in Text S1.

Supporting Information

Text S1 Supplementary theoretical and computational methods. (PDF)

Video S1 Simulation of an actin-propelled ellipsoidal bead with mesoscopic model, in which both the

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macroscopic elastic deformation of the tail and the microscopic branching of filaments are included. (MOV)

Video S2 Simulation of an actin-propelled ellipsoidal bead with macroscopic elastic model alone, in which branching of individual filaments is not included. (MOV)

Video S3 Simulation of an actin-propelled ellipsoidal bead with microscopic filament model alone, in which the elastic deformation of the tail is ignored. (MOV)

Video S4 Simulation of an actin-propelled spherical bead with mesoscopic model, with all new filaments being created via autocatalytic branching. (MOV)

Video S5 Similar to Video S4, except that all new filaments are created via spontaneous nucleation. (MOV)

Video S6 Similar to Video S4, except that half of the new filaments being created via autocatalytic branching and the other half via spontaneous nucleation. (MOV)

Video S7 Simulation of an actin-propelled spherical bead with mesoscopic model. (MOV)

Video S8 Similar to Video S7, but with a lower detachment rate of $k_d^0 = 0.5 s^{-1}$. (MOV)

Video S9 Simulated force-velocity measurement for actin pedestal pushing elastic cantilever. (MOV)

Video S10 Simulated force-velocity measurement for a force-clamped actin tail growing from spherical bead. $\rm (MOV)$

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Author Contributions

Conceived and designed the experiments: JZ AM. Performed the experiments: JZ AM. Analyzed the data: JZ AM. Contributed reagents/ materials/analysis tools: JZ AM. Wrote the paper: JZ AM.

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Supporting Information for the manuscript 'Mesoscopic Model of Actin-Based Propulsion'

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General description of the model

We model actin networks in a coarse-grained fashion similar to Ref. [1]. Near the bead surface, actin filaments are treated as individual Hookean springs with one end pinned to the rest of the network and the other interacting directly with the bead surface (see Figure S3). Away from the bead surface where actin filaments do not touch the bead surface, actin networks are coarse-grained into a 2D node-spring network with springs of the same stiffness. At the filament-network interface, individual filaments are anchored to the network with their minus-ends connected to nearby nodes of the network. We assume that these individual filaments generate forces according to the Brownian ratchet theory [2,3]. As filaments exert forces on the bead, the same amount of forces will also be transferred back and deform the supporting network. The deformed network in turn applies stress to the bead surface through interacting filaments. Therefore, the distribution of actin forces along the bead surface is determined by the coupling between interacting filaments near the bead surface and the supporting networks away from the bead surface.

The dynamics of actin filaments are modeled as a stochastic process. Nascent filaments are generated at the bead surface via a mixture of spontaneous nucleation with a spatially uniform rate and autocatalytic branching process with a rate proportional to the local density of existing model filaments. Newly created filaments are assumed to be immediately incorporated into the existing network by turning their pointed ends to new nodes of the network (see Figure S3). This step is achieved by connecting each nascent pointed end with up to 4 neighboring nodes in the network with undeformed springs. We impose the following rules for the choice of neighboring nodes: each neighboring node is within a 0.05 to 0.8 μ m distance from the nascent node to mimic the sub-micron mesh size of actual actin networks; to maintain a uniform network structure, no nodes are allowed to have more than 8 connections and the cosine of angle between each pair of connections is restricted to be less than 0.9; if more than 4 neighbors satisfy these rules, the nearest 4 from the nascent node are chosen. After connecting to 4 neighbors, each nascent node is allowed to be connected by other new nodes according to the same rules. Thus, creation of new filaments dynamically expands the actin network.

Free filaments can be capped, upon which filaments are removed from the simulation, since in reality they will stop growing and cannot attach to the surface to exert pulling forces. But the nodes corresponding to the pointed ends of the filaments remain. So, capped filaments effectively become part of the deformable network. Free filaments can also attach to the surface of the bead. Once attached, the filaments stop elongating and their barbed ends are associated with the surface at the contact position. When stretched, attached filaments produce resisting forces proportional to their deformations. Attached filaments undergo detachment with a rate that increases exponentially with the load force. After detachment, filaments become free again and are able to elongate and produce pushing forces against the obstacle.

Free filaments interacting directly with the bead are treated as Hookean springs that are created in an unattached and undeformed state. The rest lengths of those free filaments grow at the polymerization rate, which depends on the load on the barbed end of the filament. The load-dependent polymerization rate is given by the force-velocity relation of individual filaments that follows the Brownian ratchet theory. The pushing force that a free filament exerts on the surface of bead is generated by filament bending. Since the bending force is roughly proportional to the shortening of the projected length of the filament along the undeformed axis, we approximate the pushing force to be the virtual 'penetration' distances of the barbed ends of the undeformed filaments into the bead. The penetration, of course, does not take place in reality. It is an approximation of the bending effect of actual pushing filaments which presses against bead's surface and generate elastic forces. Respective spring constant of the filaments is assumed to be the same as that of the network springs. Since the average orientation of force-generating filaments is locally normal to the bead surface, we assume the orientation of model filaments to be perpendicular to the local bead surface. Therefore, the angular spring element at the filament-node connection is ignored and filaments are allowed to pivot about their pointed ends to maintain the normal direction.

Filaments are assumed to be anchored to the node-spring network at the back. The deformation of the network is represented by the motion of nodes and springs in the network, which is obtained by moving all the nodes toward their force-equilibrium positions at each time step. For actin-propelled beads, we assume that the nodes in the network become immobile when they are more than 1 μ m away from the nearest point on the bead surface, representing the adhesion of the actin tail to the substrate. The bead moves and rotates so that both the total force and the total torque from the model filaments to the bead are zero. The stress in the network influences the motion of the bead, the resulting force on the bead comes from the nontrivial force balance between the gel and the filaments. The network stress also affects the local growth rate of embedded filaments via the force-velocity relation, modifying the local property of filament springs and thus the force on the bead. If the deformation of the network is ignored, filaments are effectively embedded onto a rigid surface and are mutually independent, which is equivalent to the ratchet model. On the other hand, if the detailed microscopic filament dynamics such as the local force-velocity relation is ignored and the stress is assumed to be uniform along the bead surface, such boundary condition makes our model equivalent to the elastic propulsion model.

Although there is no angular springs connecting the nodes in the network and the elastic springs can pivot freely about the nodes, the network can still sustain shear, compression and stretch. The model gives rise to the bulk elasticity of the actin gel because on average there are 4 links per node so that the links-to-nodes ratio is 4. Studies (e.g. Ref. [4]) have shown that a network is able to sustain shear, compression and stretch if the links-to-nodes ratio is greater than the spacial dimension. For our 2D network, the links-to-nodes ratio is greater than 2. Therefore, our network is rigid and can sustain shear even without angular stiffness to the springs.

For the force-velocity measurements, we fix the network nodes at the bottom to the surface and allow the rest of the nodes to move to reach the force balance. The network undergoes disassembly, which is treated by randomly removing nodes and their connected springs from the network at a rate proportional to the number of existing nodes. We have also included the effect of rupture of crosslinks by introducing a critical stretching force, above which the links break and get removed from the network. On time scales of the order of a few tens of seconds (determined by the slow disassembly rate constant of about 0.01 s^{-1}), the network is elastic and can withstand compression, shear and stretch. On longer time scales, the network disassembles to a significant extent and starts flowing slowly, which resembles the viscoelastic behavior of Maxwell materials.

Simulation Procedures

At the beginning of the simulation, a thin layer of spring-node network is created around the bead (or below the cantilever) as the initial foundation of the network. The nodes in the network are distributed randomly in the region with a density k_n/lv_b^* , where k_n is the total nucleation rate of filaments, l is the length of the bead-network interface and v_b^* is the estimated speed of bead. The initial connection of springs in the network is obtained using a Delaunay triangulation algorithm. All springs are created in an undeformed state.

The simulation time step is chosen to be $\Delta t = 0.1$ s. At each time step, a total number of $[k_n \Delta t]$ new

nodes are created along the surface of the bead (the fractional part, $k_n \Delta t - [k_n \Delta t]$, will be carried over to the next time step), representing the pointed ends of nascent filaments. Among them, half are assumed to be created via autocatalytic branching, the rate of which is proportional to the local density of existing network nodes; the other half are assumed to be created via spontaneous nucleation, the rate of which is independent of the density of existing filaments but is uniform along the surface of the load. To include the "brushing" effect for actin-propelled beads, we further bias the spontaneous nucleation toward the back of the bead surface such that the front-to-back ratio is 1:2. Once created, each node is immediately connected to up to 4 neighboring nodes by undeformed elastic springs, representing the anchoring of the filaments into the network. For a network of N nodes, a total of $[k_{\text{dis}}N\Delta t]$ randomly selected nodes, together with their connected springs, are removed from the simulations in each Δt , representing the disassembly of the network (similarly, the fractional part will be carried over to the next time step). We have also included the rupture of networks in the model. Once a network spring is stretched beyond a 15 pN force, it is removed from the simulation.

The dynamics of filaments is considered as a Poisson process. If a free filament remains in contact with the bead surface for an average time of $1/k_a$ where k_a is the attachment rate constant, it converts to an attached filament, the barbed end of which binds to the surface at the contact point. If a free filament remains unattached for an average time of $1/k_c$ where k_c is the capping rate constant, it is considered to be capped. Attached filaments cannot elongate nor can be capped, but can exert pulling forces on the bead surface. The pulling force from each attached filament is determined by the relative displacement from the attachment point to the position of the tip if the filament is undeformed. The time that a filament remains attached is calculated as follows: at each time step, the probability that the filament will detach increases by $k_d \Delta t$, where k_d is the detachment rate depending on the current load of the filament. Once the probability reaches 1, the filament is considered to detach and become free.

We do not track the orientation of individual pushing filaments, but treat them as coarse-grained clusters of actual filaments that always push perpendicularly to the obstacle surface. The lengths and loading forces of filaments are computed self-consistently as follows: at each time step, the equilibrium position of each filament is calculated by balancing the elastic forces from both the bead's surface and the node-spring network that the filament is attached to. To ensure the entire network reaches force balance, the above procedure is repeated multiple times until the variation in total elastic energy is less than 1% of the average value. Then, the growth rate for each filament is computed from the force-velocity relation and the filament length is updated accordingly. At the next time step, new position of each filament is found, and all the above steps repeat. Simultaneously, positions of the bead and all nodes are updated. To speed up the relaxation time for the network to reach force balance in the cantilever experiments, we further divide the entire network into 10 segments of equal length along its length and impose the condition that the total force on filaments across each interface is equal to the external force on the cantilever. The simulation code is written in C and the graphics is rendered using OpenGL. Simulations are performed on a cluster of 64 Xeon 2.4 GHz CPU cores. The typical simulation time for each individual simulation is a few hours per CPU core.

Choice of Parameters

Our 2D network represents a slice of the 3D network. Due to computer time limitations, we simulate only a small fraction of the network with about 100 interacting filaments at the network's boundary. From Eqs. 5 and 7 below, we estimate that choosing $k_n/k_c = 20 \ \mu m^{-1}$ leads to about 60 free filaments around a $R = 1 \ \mu m$ bead. For tractable numerical simulations, we choose $k_n = 2 \ \mu m^{-1} s^{-1}$ and $k_c = 0.1 \ s^{-1}$. We find that the numerical results are insensitive to the actual values of k_n and k_c as long as their ratio is fixed. There is no direct measurement of k_a , so we choose the rate constant $k_a = 1 \ s^{-1}$ characteristic for molecular association rates in the cell. We find that our simulation results are insensitive to the actual value of k_a , but the ratio of k_a to k_d^0 is important. Our results show that micron-sized spherical beads often get trapped into the actin gel for $k_{\rm d}^0 < k_{\rm a}$ but can have consistent motion at $k_{\rm d}^0 > k_{\rm a}$. The simulations also show that ellipsoidal beads obtain orientational bi-stability, so that the probabilities to move lengthwise and sideways are the same, at $k_{\rm d}^0 \approx 2.7k_{\rm a}$, therefore, we choose $k_{\rm d}^0 = 2.7 \text{ s}^{-1}$.

The value of the linear spring constant $k_{\rm s}$ of springs in the 2D network is estimated from the Young's modulus (Y) of a 3D network. We assume that our 2D network has a similar mesh size (ξ) to that in the 3D network. Since the compression modulus of the 2D node-spring network has the same order of magnitude as the spring constant of individual springs in the network [5], we estimate $k_{\rm s} \approx \xi Y$. The value of ξ in the simulations can be obtained from $k_{\rm n}$ and $v_{\rm b}$. Since actin-propelled spherical beads in our 2D simulations have characteristic speed $v_{\rm b} \approx 0.03 \ \mu {\rm m/s}$ and $k_{\rm n} = 2 \ \mu {\rm m}^{-1}{\rm s}^{-1}$, each second there will be an average of 2 nodes created in a 1 $\mu {\rm m} \times 0.03 \ \mu {\rm m}$ domain near the bead surface. Then, the average node-node distance (mesh size) is $\xi \approx \sqrt{0.03/2} \approx 0.1 \ \mu {\rm m}$. Therefore, to represent a 3D network with $Y = 3 \ {\rm kPa}$, we choose $k_{\rm s} = \xi Y \approx 300 \ {\rm pN}/\mu {\rm m}$ in our 2D node-spring network.

The value of $v_0 = 50$ nm/s is estimated as an upper limit of the observed speed of $v_b \approx 30$ nm/s for micron-sized spherical beads. These beads typically form actin tails of a few microns long. For a tail of $l = 4 \ \mu m$ long, the network disassembly rate is estimated as $k_{dis} \approx v_b/l \approx 8 \times 10^{-3} \text{ s}^{-1}$. It corresponds to a characteristic life time of about 100 s of the actin network.

Autocatalytic Branching versus Spontaneous Nucleation

There are two possible mechanisms for the nucleation of new filaments: autocatalytic branching and spontaneous nucleation. In the simulation, we keep the global nucleation rate, which is assumed to be proportional to the size of the bead, a constant. We have tested these two mechanisms individually with simulations (see Figure S4, A and B), and found that each mechanism alone does not produce the observed motion of the bead. With just autocatalytic branching, simulations show that filaments quickly concentrate into a narrow tail behind the moving bead (Video S4), which is different from experimental observations. The reason is that new filaments are more likely to be created near the region with denser existing filaments, causing a positive feedback for the accumulation of filaments into a narrow tail. With just spontaneous nucleation, new filaments are created uniformly around the bead surface. Simulations show that an initially asymmetric actin cloud quickly develops into a uniform 'cocoon' around the bead, stopping the bead's motion (Video S5). To produce the consistent motion of bead with the width of the tail being comparable to the bead's size, we combine the autocatalytic branching and spontaneous nucleation of filaments. By choosing a global branching rate density of $k_{\rm n}/2$ and a total spontaneous nucleation rate density of $k_n/2$, we find that the bead can move consistently with a wide tail similar to the observations (Video S6, Figure S4C). The branching process is modeled by generating nascent model filaments with a local rate proportional to the density of nearby (averaged within a window of 0.1 micron width) filaments. Note that we are not positing, of course, that the nucleation is Arp2/3 independent; the combination of the nucleation and branching is simply a convenient modeling way to capture both spreading tendency of the growing actin network and autocatalytic character of this growth.

For the actin tail, a low-density core has been reported [6]. Our model, actually, predicts this effect for a simple geometric reason: as the bead is propelled forward, all actin growing on the side of the bead ends up in the margin of the actin tail, while actin growing at the rear end of the bead is left in the core of the tail. Because the side surface of the bead has a much smaller projected area onto the cross section of the tail than the rear surface does, a similar density of actin around the bead will cause a higher density of actin in the margin of the tail than in the core. We did not investigate the mechanical consequences of that effect: it could in principle stiffen the tail to some extent because effectively it increases the density of the tail; it is also likely that in the experimental system the effect is partially due to the increased alignment in filaments in the tail margins [6] comparing to those in the core, which is beyond the scope of our model.

Our model also does not include the recently discovered increased branching rate in highly bent

filaments [7]. Qualitatively, this effect means that the local actin production rate is a growing function of the local stress. According to our calculations, the stress is highest near the edge of the tail-bead interface. Increasing the actin density there will lead to increased local force on the sides of the bead, which is supposed to bias the bead to move along its long axis. Furthermore, the increased actin density probably also causes the stiffening of the actin network near the margin of the tail, which is likely to increase the biased motion of the bead along its long axis. However, the spatial resolution of our simulations and model geometry are too crude for careful investigation of this effect. The impact of this important phenomenon on the actin-based propulsion is left for future investigation.

Orientation of Actin Propelled Ellipsoidal Beads

The beads in the experiment [8] were confined in a chamber of only 2 μ m height, which is comparable to the size of the bead. Therefore, both the bead's motion and the actin network can be regarded as 2D. In the following simulations of our 2D mesoscopic model, each data point is obtained from at least 100 individual simulations with each being 10⁴ s long. Therefore, each data point is averaged over 10⁶ s and the error is expected to be within 10%.

We define the bead's orientation angle θ to be the angle between the bead's long-axis and the axis of its immediate tail. The simulated $v_{\rm b}$ - θ relation is shown in Figure S5. We find that beads moving along their long-axes are slightly slower than those moving along their short-axes. Beads moving along their long-axes have a broader distribution of speeds, most of which range from 10 nm/s to 30 nm/s. Beads moving along their short-axes have a much smaller spread of speeds, which range from 25 nm/s to 35 nm/s. The orientation of an ellipsoidal bead with respect to its tail is determined by both the torque-induced rotation of the bead and the motion-induced reorientation of the tail around the bead. Below, we develop a semi-analytical continuous model that gives qualitative insight to the problem and allows better understanding of the numerical simulation results reported in the main text.

Torque-induced rotation of the bead

To find the torque applied to the bead by its tail, we first ignore the macroscopic elastic deformation of the tail and calculate the microscopic forces exerted by individual actin filaments. Then, we consider a concentrated force on the side of the bead to balance the sideways forces from all the individual filaments, representing the macroscopic elastic reaction of the tail. The total torque on the bead is then obtained from these two forces.

According to the tethered ratchet model [3], the elongation of free filaments generates pushing forces and the stretching of attached filaments produces pulling forces. Thus, we consider two populations of actin filaments at the microscopic level, free and attached. We treat the barbed-end density of free filaments (ρ_f) and attached filaments (ρ_a) as continuous functions along the bead surface. In our calculations, we consider the dynamics of filaments including branching, attachment, detachment and capping: new filaments branch off from existing filaments near the bead surface; the barbed ends of filaments can either attach to or detach from the bead surface; filaments switch between these two states with certain rates; the barbed ends of free filaments can be capped by capping proteins and thus stop their dynamics. In this section, we treat the actin tail as an infinitely rigid network. Since any part of the rigid tail that is in front of the bead will stop the bead's motion, we further assume that filaments exist only at the back of the bead (the bead-tail boundary, P₁ and P₂, is where the surface tangents are parallel to \vec{v}_b , see Figure S6A). This assumption is consistent with the observed lower density of actin networks in front of the moving beads. All kinetic processes described above determine the actin (densities ρ_a and $\rho_{\rm f}$) dynamics governed by the equations:

$$\frac{\partial \rho_{\rm a}}{\partial t} = k_{\rm n} - k_{\rm d} \rho_{\rm a} + k_{\rm a} \rho_{\rm f} \tag{1}$$

$$\frac{\partial \rho_{\rm f}}{\partial t} = k_{\rm d} \rho_{\rm a} - (k_{\rm a} + k_{\rm c}) \rho_{\rm f},\tag{2}$$

where k_n , k_a , k_d and k_c are the average rate constants for nucleation (per unit length along the bead surface), attachment, detachment and capping of filaments, respectively. The estimated values of k_n , k_a and k_c are based on previous work [3,9] and are listed in Table S1. The value of k_d , however, depends on the relative motion between the attached filament and the bead surface. We approximate the previous calculation [3] of k_d as follows:

$$k_{\rm d} = \frac{k_{\rm d}^0}{\int_0^\infty x \exp[ux + (1 - e^{ux})/u] \,\mathrm{d}x} \approx k_{\rm d}^0 \left(1 + \frac{v_{\rm b}}{2v_{\rm c}}\right),\tag{3}$$

where $k_d^0 = 2.7 \text{ s}^{-1}$ is the zero-force detachment rate and $u = v_b/v_c$ is the scaled relative velocity. Here, $v_c = f_b k_d^0/k_s \approx 30 \text{ nm/s}$ is a velocity scale with $k_s = 300 \text{ pN}/\mu\text{m}$ being the spring constant of the attachment bond and $f_b \approx 10 \text{ pN}$ being the strength of the bond [3]. For the typical value of $v_b \approx 30 \text{ }\mu\text{m/s}$, we have $k_d \approx 1.5k_d^0$. This approximation introduces an error less than 10% for $v_b < 5v_c = 150 \text{ nm/s}$.

At the steady state, Eqs. 1 and 2 give:

$$\rho_{\rm a} = \frac{k_{\rm a} + k_{\rm c}}{k_{\rm d}} \frac{k_{\rm n}}{k_{\rm c}},\tag{4}$$

$$\rho_{\rm f} = \frac{k_{\rm n}}{k_{\rm c}}.\tag{5}$$

Therefore, the number of attached $(N_{\rm a})$ and free $(N_{\rm f})$ filaments are:

$$N_{\rm a} = \frac{s_0}{2}\rho_{\rm a},\tag{6}$$

$$N_{\rm f} = \frac{s_0}{2} \rho_{\rm f},\tag{7}$$

where $s_0 \approx 4.8 \ \mu m$ is the perimeter of the ellipse and the factor 1/2 is from the assumption of filaments nucleation being restricted to half of the surface. The total number of filaments is

$$N = N_{\rm a} + N_{\rm f} = \frac{k_{\rm a} + k_{\rm c} + k_{\rm d}}{k_{\rm d}} \frac{k_{\rm n}}{k_{\rm c}} \frac{s_0}{2}.$$
(8)

We checked by numerical simulations that $N_{\rm a}/N_{\rm f} \approx k_{\rm a}/k_{\rm d}^0$ in a wide range of parameters (the fitted slope of the straight line to the $N_{\rm a}/N_{\rm f}$ vs $k_{\rm a}/k_{\rm d}^0$ relation is ≈ 0.94). Thus, in the simulations we change $N_{\rm a}/N_{\rm f}$ by varying the value of $k_{\rm a}$.

The viscous drag on the bead is negligible compared to the actin propulsion forces. To calculate the actin propulsion force on the bead, we define the bead's geometry in its own frame-of-reference as $x^2/a^2 + y^2/b^2 = 1$, where A=0.5 μ m and b=1 μ m are the short- and long-axes of the bead, respectively; we also define a one-dimensional (1D) curvilinear coordinate s with origin at x = 0 and y = b in the bead frame (see Figure S6A) and the positive direction being clockwise along the bead surface. Let \hat{n}_s be the unit outward normal vector of the bead surface at s, its value at point (x, y) on the bead surface is $\hat{n}_s = (x^2/a^4 + y^2/b^4)^{-1/2}(x/a^2, y/b^2)^{\mathrm{T}}$. We assume that free filaments push perpendicularly against the bead surface following the prediction of the Brownian ratchet theory [2]:

$$\vec{f}_{\rm f} = f_0 \ln(v_0/v_\perp)(-\hat{n}_s),$$
(9)

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where $f_0 \approx 1.5$ pN is the force scale, $v_0 = 50$ nm/s is filaments' zero-load polymerization speed, and $v_{\perp} = |\vec{v}_{\rm b} \cdot \hat{n}_s|$ is the relative velocity between the bead and filament in the normal direction. The pulling force from an attached filament can be estimated [3] as

$$\vec{f}_{a} \approx -k_{s} \vec{v}_{b}/k_{d}.$$
(10)

Then, the total force from all the filaments is

$$\vec{F}_{\rm fil} = \int_0^{s_0} (\rho_{\rm f} \vec{f}_{\rm f} + \rho_{\rm a} \vec{f}_{\rm a}) \,\mathrm{d}s.$$
(11)

Because of the different directions of pushing and pushing forces (see Figure S6B), the resulting $\vec{F}_{\rm fil}$ always has a non-zero component perpendicular to the direction of $\vec{v}_{\rm b}$, if $\vec{v}_{\rm b}$ is not parallel to any axes of the bead. This force component will push the bead sideways, causing an additional opposing force from the tail in that direction. Defining the tail's frame-of-reference X-Y such that the Y-direction is always parallel to $\vec{v}_{\rm b}$ (see Figure S6), this opposing force can be expressed as

$$\vec{f}_{\rm opp} = -\left(\vec{F}_{\rm fil} \cdot \hat{e}_X\right) \hat{e}_X,\tag{12}$$

where \hat{e}_X is the unit vector along the X-direction. For reasons of simplicity, we assume that f_{opp} is caused by free filaments that are concentrated at the opposing side of the bead-tail boundary (P₁ in Figure S6A).

We define the positive direction of torque to be the direction of increasing θ (clockwise for Figure S6A). From the forces calculated above, the total torque on the bead can be obtained as

$$\vec{T} = -\int_{0}^{s_{0}} \vec{r}_{s} \times \left[\rho_{\rm f} \vec{f}_{\rm f} + \rho_{\rm a} \vec{f}_{\rm a} + \vec{f}_{\rm opp} \delta(s - s')\right] \mathrm{d}s,\tag{13}$$

where \vec{r}_s is the displacement from the bead center to a point on the bead surface at s (see Figure S6A), δ is the Dirac delta function, and s' is the location of \vec{f}_{opp} in the *s*-coordinate. The torque-induced angular velocity of the bead is

$$\omega_1 = \mu_{\rm r} \vec{T} \cdot \hat{e}_z,\tag{14}$$

where $\mu_{\rm r}$ is the rotational mobility of the bead and $\hat{e}_z = \hat{e}_x \times \hat{e}_y$ is a unit vector in the z-direction. To estimate $\mu_{\rm r}$, we first consider a spherical bead with a comparable radius \sqrt{ab} . As the bead rotates at angular velocity ω , $N_{\rm a}$ attached filaments will pull the bead along the tangent of the surface to resist the motion with an average force per filament $f_{\rm a} \approx k_{\rm s}\omega R_0/k_{\rm d}$ (see Eq. 10). The torque generated by these filaments is $T_0 = N_{\rm a}f_{\rm a}\sqrt{ab}$. Then, the rotational mobility of this spherical bead is $\mu_{\rm r,0} = \omega/T_0 \approx$ $k_{\rm d}/N_{\rm a}k_{\rm s}ab \approx 1.2 \times 10^{-4} \text{ pN}^{-1}\mu\text{m}^{-1}\text{s}^{-1}$. For an ellipsoidal bead, the resisting force from the filaments will have both tangential and normal components, due to the asymmetric shape. The normal components of the resisting forces will slow down the rotation further. We thus introduce a correction factor 0 < c < 1to obtain the rotational mobility of ellipsoidal beads: $\mu_{\rm r} = c\mu_{\rm r,0} \approx ck_{\rm d}/N_{\rm a}k_{\rm s}ab$. We treat c as a fitting parameter to get the bi-stability of the orientation of the ellipsoidal beads (see below). Generally, one would expect that a stiffer network will have a higher c because it generates opposing normal forces more effectively.

By numerically solving Eqs. 9–14, we find that ω_1 is always negative for $0 < \theta < 90^{\circ}$ (Figure S6D). This indicates that the bead always tends to move along its long-axis.

Actin-remodeling-induced turning of tail around the bead

In addition to the torque-induced rotation of the bead, the reorientation of the tail around the bead surface can also lead to relative rotation between the bead and its tail. This reorientation of the tail To understand this effect quantitatively, we consider a bead with initial direction of motion being close to its long-axis. In the bead's frame-of-reference, we define points P_1 and P_2 to be the left and right boundaries of the tail on the bead surface, respectively, and θ to be the angle between line P_1P_2 and the short-axis of the bead (x-axis in Figure S7A). Angle θ describes the direction from which the tail pushes the bead. We assume that the pushing filaments generate a uniform pressure on the rear half of bead between points P_1 and P_2 . The torque generated by this pressure is zero due to symmetry. Therefore, in the lab frame, the bead will not rotate about its center but simply move along the direction of the pushing force. Because the pushing pressure is uniform, the force components that are parallel to line P_1P_2 cancel out, which leaves the pushing force perpendicular to line P_1P_2 . Thus, the bead tends to move in the direction perpendicular to line P_1P_2 (\vec{v}_b in Figure S7A). As the bead moves along, the actin tail keeps remodeling itself, so that the tail always interacts with the bead from behind. The bead-tail boundary will then shift gradually from P_1P_2 to $P'_1P'_2$, where the tangents of the bead surface are parallel to \vec{v}_b (see Figure S7B). The angle between line $P'_1P'_2$ and the x-axis, θ' , can be found as follows. Since the bead's direction of motion is $\vec{v}_b = v_b(\sin \theta, \cos \theta)^T$, the normal to the bead surface at P'_1 is $\hat{n}'_1 \propto (x'_1/a^2, y'_1/b^2)^T$, where x'_1 and y'_1 are the x- and y-coordinates of point P'_1 , respectively. Since $\vec{v}_b \perp \hat{n}'_1 = 0$, which gives $x'_1 \sin \theta/a^2 + y'_1 \cos \theta/b^2 = 0$. We get

$$\theta' = \tan^{-1} \left| \frac{y_1'}{x_1'} \right| = \tan^{-1} \left(\frac{b^2}{a^2} \tan \theta \right).$$
(15)

Because $\theta' > \theta$ for all $0 < \theta < 90^{\circ}$, the bead-tail boundary will keep tilting until the bead is moving along its short-axis. Although the bead does not rotate in the lab frame, the direction from which the tail interact with the bead changes continuously, causing relative rotation between the bead and its tail. If the bead moves close to its short axis, one finds opposite results: $\theta' < \theta$ for all $0 < \theta < 90^{\circ}$ (see Figure S7, C and D), consistent with the result that the bead prefers moving along its short-axis.

The angular velocity of this rotation can be obtained by estimating the time required for remodeling the actin tail. Stability analysis of Eqs. 1 and 2 shows that the characteristic turn-over rate for actin is

$$k_0 = \frac{1}{2} \left[(k_{\rm a} + k_{\rm c} + k_{\rm d}) - \sqrt{(k_{\rm a} + k_{\rm c} + k_{\rm d})^2 - 4k_{\rm c}k_{\rm d}} \right] \approx \frac{k_{\rm c}k_{\rm d}}{k_{\rm a} + k_{\rm c} + k_{\rm d}}.$$
 (16)

The approximate relation holds for $(k_{\rm a} + k_{\rm c} + k_{\rm d})^2 \gg 4k_{\rm c}k_{\rm d}$. We estimate the turn-over time of actin to be twice the inverse of k_0 :

$$\tau_0 \approx \frac{2}{k_0}.\tag{17}$$

For the parameter values listed in Table S1 and $k_{\rm d} \approx 1.5 k_{\rm d}^0$, we find $\tau_0 \approx 25$ s.

Then, the angular velocity of the bead with respect to its tail can be estimated as

$$\omega_2 = \frac{\mathrm{d}\theta}{\mathrm{d}t} \approx \frac{\theta' - \theta}{\tau_0} \approx \frac{k_{\mathrm{c}}k_{\mathrm{d}}}{2(k_{\mathrm{a}} + k_{\mathrm{c}} + k_{\mathrm{d}})} \bigg[\tan^{-1} \left(\frac{b^2}{a^2} \tan \theta\right) - \theta \bigg]. \tag{18}$$

The result is shown in Figure S7E. Since $\omega_2 > 0$ for $0 < \theta < 90^\circ$, θ will keep increasing until it reaches 90°, which corresponds to the bead's moving along its short-axis.

We have also performed stochastic simulations to study the actin-remodeling-induced rotation of tail. In the simulations, we let individual filaments nucleate at the rear half of the bead and push against it. We treat filaments as elastic springs and explicitly track the dynamics and deformation of each individual filament. To eliminate the effect of torque-induced rotation, we do not allow the bead to rotate in the lab frame, but allow it to move according to the direction of the total spring force exerted on it. We find that even if the orientation of the bead in the lab frame is fixed, the bead always tends to change its direction of motion such that it moves along its short-axis. We plot the relative angular velocity of the bead with respect to its tail as a function of the angle (Figure S7E), and find good agreement with our analytical prediction.

Bead's overall rotation relative to its tail

The bead rotation with respect to its tail is determined by both the torque from the tail and the motioninduced reorientation of the tail. The torque-induced rotation describes the rotation of the bead when the orientation of the tail is fixed in the lab frame, while the motion-induced reorientation of the tail describes the turning of the tail when the orientation of the bead is fixed in the lab frame. The overall angular velocity of the bead with respect to its tail can be expressed as the sum of Eqs. 14 and 18:

$$\omega \approx \omega_1 + \omega_2. \tag{19}$$

Experiments show that half of the beads moving along their long-axes and the other half moving along their short-axes. This indicates that $\theta = 0$ and 90° are the stable points for rotations. We hypothesize that ω should have a sigmoidal shape: $\omega < 0$ for $0 < \theta < 45^{\circ}$ and $\omega > 0$ for $45^{\circ} < \theta < 90^{\circ}$. We find that choosing c = 0.53 gives such a shape (Figure S8). This indicates that if a bead initially moves in a direction close to its long-/short-axis, it will keep moving along its long-/short-axis. The critical orientation at which beads have approximately equal chances to take either orientation is about 45° .

For a lower value of parameter c, i.e. c = 0.4, which represents a lower rotational mobility and thus a stiffer network, ω becomes mostly positive. Then, the bead tends to rotate to $\theta = 90^{\circ}$. This result is consistent with our simulation of the mesoscopic model (see Figure 2F in the main text): beads propelled by a stiff network tend to move along its short-axis. For higher values of c, our calculations show that the fraction of negative ω always increases with c, indicating increased probability of motion along the long-axis. This contradicts our simulation results of the mesoscopic model (see Figure 2F in the main text). Our explanation is that free filaments push less efficiently when they are anchored to a softer network. Since this effect is not included in the above calculations, our analytical model probably works best in the regime of high network rigidity.

The aspect-ratio dependence of beads' orientation (see Figure 2 in the main text) can be explained by the nonlinear dependence of beads' angular speed on the aspect ratio (see Eqs. 13, 14 and 18). Note that the aspect ratio has two contributions to ω_1 : one is through s_0 and the other is through term \vec{r}_s , both of which depend nonlinearly on the aspect ratio. Numerical calculation shows that both ω_1 and ω_2 increases with the aspect ratio. But ω_1 has a concave-up shape and ω_2 has a concave-down shape. As a result, ω_2 increases more rapidly with the aspect ratio than ω_1 does if the aspect ratio is close to 1, leading to an increased chance for the beads to move along their short axes. For aspect ratio greater than 2, the trend is the opposite, causing an increased chance for the beads to move along their long axes. Since spherical beads do not have any preference on orientations, a peak of probability for beads moving along their short axes can be formed between aspect ratios 1 and 2.

We have also studied how the network's stiffness affects the orientation of beads of different aspect ratios (see Figure S9). For networks of intermediate stiffness (Y = 1-8 kPa), the probability for beads to move along their long axes increases significantly from about 20% to 80% as the aspect ratio increases from 1.5 to 2.5. But for softer or stiffer networks, the probabilities of orientations of beads are insensitive to beads' aspect ratio. Our explanation is that only at intermediate stiffness the elastic forces matter. When this is the case, making the bead more elongated makes the long axis preferred, as shown in the main text.

For the effect of filament attachments on the orientation of beads, both free and attached filaments produce torques to align the beads along their long axes (see Figure S6, C and D), while the actinremodeling-induced turning always aligns the beads along their short axes (see Figure S7E). Increasing the ratio of N_a/N_f while keeping $N_a + N_f$ constant raises the fraction of torque from attached filaments, the magnitude of which increases more rapidly with θ near $\theta = 0$ (see Figure S6C), biasing the extreme value of ω_1 toward $\theta = 0$ (see Figure S6D). On the other hand, ω_2 is not affected by N_a/N_f . The combined effect is that the range of θ with a negative ω increases, leading to a higher chance for beads to move along their long axes. Finally, note that if we integrate the angular velocity of the beads over the orientation angle, the integral has the form of a double-well potential, which can be considered as an energy landscape for the over-damped movement of the beads. Adding effective angular diffusion could lead to the double-peaked probability distribution. This argument was also used in [8] to estimate the frequency of beads' turning.

Our numerical experiments described below indicate that the network is elastic up to a time scale of a few tens of seconds. Only on longer time scales does the network flow. The slowest bead's movement we deal with take place with rate ~ 30 nm/s. In about 100 s, the bead is propelled by a few microns, so the weak and flowing part of the network is a few bead lengths away from the bead surface. Stresses and strains so far away from the bead are irrelevant for the bead propulsion, as previous experimental and theoretical studies demonstrated. The crucial layer of actin gel is the closest layer, the thickness of which is similar to the bead's size. In this layer, the network is created within ~ 30 s and is elastic.

Trajectory of Actin-Propelled Spherical Beads

In the simulations, each data point was obtained from 200 individual simulations with each being 3600 s long. Therefore, the error is expected to be less than 10%. The average speed of simulated bead was about 0.03 μ m/s. To obtain the curvature distribution of the trajectory $P(\kappa)$, we first smooth the simulated bead's trajectory with a Gaussian smoothing function. We choose a smoothing window size of about 1 μ m to remove the high frequency noises. We then calculate the local curvature of the trajectory from the 2 neighbors that are 2.5 μ m from each side of that location. These window sizes are chosen to be comparable to the observed curvature of about 0.1 μ m⁻¹ [10, 11].

In the main text, we derived the equation:

$$\frac{1}{\kappa_{\rm rms}} \approx \frac{4}{\pi} \sqrt{N} v_{\rm b} \tau_0. \tag{20}$$

The typical time τ_0 over which the directional bias persists is the turn-over time of the actin network, which we estimate to be $\tau_0 \approx 2(k_{\rm a} + k_{\rm c} + k_{\rm d})/k_{\rm c}k_{\rm d} \approx 25$ s for $k_{\rm a} \sim k_{\rm d} \gg k_{\rm c}$ and the parameter values listed in Table S1. Here, we estimate $k_{\rm d} \approx 1.5k_{\rm d}^0$. Then, the typical angular velocity of the turning is $\omega_{\rm rms} \approx \Delta\theta/\tau_0$, and the root-mean-square value of the curvature is $\kappa_{\rm rms} = \omega_{\rm rms}/v_{\rm b} \approx \pi/4\sqrt{N}v_{\rm b}\tau_0$.

To check whether our simulation results agree with the above relation, we obtain the values of $\kappa_{\rm rms}$, N and $v_{\rm b}$ directly from simulations. From Eq. 17 and $k_{\rm d} = (k_{\rm a} + k_{\rm c})N_{\rm f}/N_{\rm a}$ (see Eqs. 4–7), τ_0 is estimated to be

$$\tau_0 \approx \frac{2N}{k_{\rm c} N_{\rm f}},\tag{21}$$

where $N_{\rm f}$ is also obtained directly from simulations. We have varied $k_{\rm a}, k_{\rm c}, k_{\rm d}^0, k_{\rm n}, k_{\rm s}, R$ and v_0 individually to see if Eq. 20 holds (see Figure 4E in the main text). The simulated results of how $N, v_{\rm b}, \tau_0$ and $\kappa_{\rm rms}$ depend on these parameters are shown in Figures S10 and S11. Since changing any one of $k_{\rm a}, k_{\rm c}, k_{\rm d}^0$, $k_{\rm n}, k_{\rm s}, R$ and v_0 potentially changes the values of $N, v_{\rm b}$ and τ_0 , it is challenging to obtain an explicit expression of how $\kappa_{\rm rms}$ depends on these individual parameters. Nevertheless, our simulation results provide a qualitative understanding of how individual parameters affect $\kappa_{\rm rms}$.

i) Increasing $k_{\rm a}$ leads to a linear increase in both N (see Eq. 8) and τ_0 (see Eq. 21), but causes a decrease in $v_{\rm b}$ due to increased number of attached filaments (see Eq. 6). The total effect on $\kappa_{\rm rms}$ becomes small.

ii) Increasing k_c causes a decrease in both N and τ_0 in a roughly inverse fashion, because we choose $k_c \ll k_a \sim k_d$ (see Eqs. 8 and 17). Increasing k_c also causes a decrease in v_b , especially at high k_c .

This is because the ratio $N_{\rm a}/N_{\rm f} = (k_{\rm a} + k_{\rm c})/k_{\rm d}$ (see Eqs. 6 and 7) increases with $k_{\rm c}$, which leads to an increased pulling force and thus a decreased $v_{\rm b}$. With all three factors being decreasing functions of $k_{\rm c}$, $\kappa_{\rm rms}$ increases with $k_{\rm c}$.

iii) Increasing k_d^0 causes a decrease in both N and τ_0 , especially at low k_d^0 (see Eqs. 3, 8 and 17). v_b increases with k_d^0 because of fewer attached filaments at high k_d^0 (see Eq. 6). The overall effect is that $\kappa_{\rm rms}$ is an increasing function of k_d^0 .

iv) Increasing $k_{\rm n}$ gives a linear increase in N (see Eq. 8), but has little effect on $v_{\rm b}$ (no effects on $N_{\rm a}/N_{\rm f}$, see Eqs. 6 and 7) and does not affect τ_0 (see Eq. 17), leading to a slow decreasing in $\kappa_{\rm rms}$.

v) Increasing $k_{\rm s}$ causes a slow increase in $k_{\rm d}$ and a rapid increase in $f_{\rm a}$ (see Eqs. 3 and 10). Since $N_{\rm a}$ is inversely proportional to $k_{\rm d}$ and $N_{\rm f}$ is independent of $k_{\rm d}$ (see Eqs. 6 and 7), $N_{\rm a}$ decreases slowly as $k_{\rm s}$ increases. As a result, increasing $k_{\rm s}$ leads to a stronger resisting force from attached filaments, which decreases $v_{\rm b}$. Because $k_{\rm d}$ is insensitive to $k_{\rm s}$, τ_0 is also insensitive to $k_{\rm s}$ (see Eq. 17). The effect of $k_{\rm s}$ on $\kappa_{\rm rms}$ is thus very small.

vi) Increasing R leads to a linear increase in N (see Eq. 8) but has little impact on $v_{\rm b}$ and τ_0 . The small decrease in $v_{\rm b}$ is probably caused by the increased chance of filaments being created at the front half of the bead, which tends to slow down the motion of the bead. The overall effect of increasing R is to cause a slow down-turn in $\kappa_{\rm rms}$.

vii) Increasing v_0 linearly increases v_b , as expected. Increasing v_0 does not affect τ_0 but causes a decrease in N, which is due to the increased k_d (see Eqs. 3 and 6). Overall, $\kappa_{\rm rms}$ is a decreasing function of v_0 in the low velocity range, but becomes insensitive to v_0 in the high velocity range.

The above results can be subject to future experimental tests. Possible experimental approaches are: varying the surface density of N-WASP on the bead to change k_a and/or k_d^0 [12]; varying the concentration of capping proteins to change k_c ; altering the concentration of Arp2/3, which is critical for the formation of branched filaments, to vary k_n ; changing the concentration of cross-linking proteins to alter k_s ; changing the size of bead similar to [10]; and changing the concentration of free G-actin to alter v_0 .

Autocorrelation of trajectory curvature

We have checked the autocorrelation of the curvature as a function of bead's traveled distance, and find that the autocorrelation function always decays rapidly at a sub-micron distance (see Figure S12: the decay length is smaller than the window size of about 2.5 μ m that we choose to calculate the local curvature). This result is quite different from the observed long-range correlation of about 10 μ m [11]. One possible explanation is that in these experiments certain long-ranged spatial-temporal biases existed in the actin network at the actin-bead interface, which are not included in our model.

From the analysis in the main text, the correlation distance has to be close to $v_b \tau_0$. Then, it could be possible to get a long correlation distance with a very low value of k_c . We have tried a low value of $k_c = 0.01 \text{ s}^{-1}$ with which the correlation distance is expected to be about 9 μ m, but our simulation still shows a correlation distance less than 2 μ m. A possible explanation is that the effects of free filaments' growing away from the bead surface and being left behind the bead reduce the actual actin turn-over time τ_0 , causing a much smaller correlation distance. It is also possible that certain long-range interactions exist and have not been incorporated in our mesoscopic model.

Force-Velocity Relation of Actin Networks

In this section, we consider a semi-analytical 1D model that allows to derive approximate force-velocity curves for the growing actin networks and gives insight helping to understand the simulation results reported in the main text. We also investigate how the results depend on various changes that could be made to the model. To recapitulate the results reported in the main text, the network undergoing significant disassembly in the aged gel sections recoils under a high load, reducing both net protrusion rate of the actin network against the cantilever and the maximum force that the network can sustain. These factors cause the rapid downturn in the force-velocity relation. Another way to explain this effect is: the old, lowest part of actin pedestal starts to compress effectively creating a downward actin network flow. This flow cancels a large part of the upward polymerization speed at the network-cantilever interface, resulting in a decrease in the net rate which is equal to the polymerization rate minus recoil rate. So, the net speed of the cantilever will always be lower than the polymerization speed, unless the cantilever stops moving. Note, that the growth of the network can catch up only up to the limit because the polymerization rate is limited.

For the actin network growing against a flat cantilever, the average linear density of filaments along the obstacle is $\rho_1 = k_n/k_c = 20 \ \mu m^{-1}$ in our simulation. Due to the limitation of computation power, we choose the length of our flat obstacle to be $l = 5 \ \mu m$ such that the average filament number is about $\rho_1 l = 100$. To match the characteristic area density of filaments of $\rho_2 \approx 10^3 \ \mu m^{-2}$, the 2D network that we simulate represents a slice of 3D network with a depth of $d = \rho_1/\rho_2 \approx 0.02 \ \mu m$. Therefore, the flat obstacle in our simulation corresponds to a part of cantilever tip of area $A = ld \approx 0.1 \ \mu m^2$. Since the actual area of the cantilever tip used in [13] is about 400 μm^2 , the scaling of our simulation is 0.1/400 = 1/4000. We thus scale the spring constant of the cantilever in our simulation to be 1/4000 of the measured value of 30 pN/nm in the experiment: $k_{\text{lever}} = 7.5 \text{ pN}/\mu m$.

In the numerical simulations in the flat cantilever case, each of our simulations represents 180 s, which is longer than the average lifetime of a node $1/k_{\rm dis} \approx 120$ s. Therefore, the network disassembly is captured during the simulations. In each simulation, the value of V is sampled with 1 s interval, and then averaged with a Gaussian smooth function of 3 s width to reduce noise. $F_{\rm stall}$ is averaged over the F values at which V first becomes negative. Each data point in the force-velocity relation is averaged over at least 200 individual simulations, which limits the error to be less than 10% for each point.

For the cantilever experiment, we find $F_{\text{stall}} \approx 20 \text{ pN}$ if all the filaments are pushing $(k_a = 0)$. Since there are about 100 filaments upon stalling, each pushing filament experiences a force of only 20/100=0.2 pN, much lower than the piconewton force that a filament can exert [3]. Therefore, the network recoils at a speed similar to that of filament elongation: $v/v_0 = \exp(-f/f_0) \approx 0.88$. Our simulated stall force scales to a stall force of only 80 nN for the actual size of cantilever used in [13], which is about 1/4 of the measured stall force of 300 nN. This discrepancy is probably resulted from a relatively high value of k_{dis} that we used in the simulations, which causes a high rate of network recoil and thus reduces the maximum force that the network can produce. We are unable to simulate the network for such a low k_{dis} because of the computation time is forbidding.

In the numerical simulations in the force-clumped bead case, each simulation represents 60 s of real time. V is measured between 30 s and 60 s with a 1 s interval, so the average age of the network during measurement is 45 s. Since 60 s is shorter than the typical disassembly time of 120 s, the network recoil does not happen. For each point in the force-velocity plot, there are at least 200 individual simulations, representing a total measurement time of 100 min for each point. We are unable to obtain V at a strong pulling force because of the small number of attached filaments used in our simulations, which leads to the rapid detachment of the bead from the network. For the bead of radius $R = 1 \ \mu m$ as in [14], the number of simulated filaments is about $\pi R \rho_1 \approx 60$. We use the same depth of the network $d = 0.1 \ \mu m$. Thus, the network-contacting area of the bead surface in 3D is $\pi R d \approx 0.06 \ \mu m^2$ and the cross-section area of the network is $A \approx 2R d \approx 0.04 \ \mu m^2$. Since the actual surface area of half of the bead is $2\pi R^2 \approx 6 \ \mu m^2$, the scaling factor is about 0.06/6 = 1/100.

Network length and growth velocity

The scheme of the simplified 1D model is shown in Figure S14A. Suppose that at time t, the rest length of the actin pedestal is L and its total deformation is ΔL , then the length of the compressed pedestal is

$$h = L - \Delta L. \tag{22}$$

Because the rest length of the pedestal grows at the same speed as the filaments' polymerization speed v, we have $L = \int_0^t v(t') dt'$. Therefore, the cantilever's speed is

$$V = \frac{\mathrm{d}h}{\mathrm{d}t} = v - \frac{\mathrm{d}(\Delta L)}{\mathrm{d}t}.$$
(23)

In order to calculate ΔL , we divide the undeformed pedestal equally into M segments along its length, with $\delta = L/M$ being the length of each segment. For $M \gg 1$, the filament density ρ in each pedestal segment can be regarded as uniform. We assume that actin density ρ in each segment decreases with time as $d\rho/dt = -k_{\rm dis}\rho$, where $k_{\rm dis}$ is the disassembly rate of the network. Then, the density of filaments in segment-*i* (i = 1, ..., M) should decrease exponentially with the segment's lifetime τ_i : $\rho_i \propto e^{-k_{\rm dis}\tau_i}$. The network's Young's modulus is estimated to scale as $\rho^{2.2} - \rho^{2.5}$, depending on the property of the network [15, 16], so we choose the power of 2.5 assuming the network is densely cross-linked. Then, the Young's modulus for segment *i* can be written as $Y_i = Ye^{-k\tau_i}$, where *Y* is the Young's modulus of a newly created network and $k = 2.5k_{\rm dis}$ is a constant. Thus the spring constant of segment *i* is $k_{{\rm s},i} = Y_i A/\delta = (YA/\delta)e^{-k\tau_i}$. When the network is compressed by an external force *F*, the deformation of each segment Δl_i should be inversely proportional to its spring constant, but since segments cannot have negative lengths, Δl_i should also be limited by δ : $\Delta l_i = \min(F/k_{{\rm s},i}, \delta) = \min(\alpha \delta e^{k\tau_i}, \delta)$, where $\alpha = F/YA$. Therefore the total deformation of the network is

$$\Delta L = \sum_{i=1}^{M} \Delta l_i = m\delta + \alpha\delta \sum_{i=m+1}^{M} e^{k\tau_i} = x^* + \alpha\delta \sum_{i=m+1}^{M} e^{k\tau_i}, \qquad (24)$$

where m is the number of segments with deformations being the same as δ , and $x^* = m\delta$ is the rest length of these segments. It is easy to find that if m is nonzero, it satisfies the equation $\alpha e^{k\tau_m} = 1$, which leads to the definition of the characteristic lifetime of the network segments

$$\tau^* = \tau_m = -(\ln \alpha)/k. \tag{25}$$

Network segments with lifetimes greater or equal to τ^* will collapse to zero length due to compression.

In the continuum limit, we define the lifetime of a network segment at time t to be

$$\tau(x,t) = t - t_{\rm c}(x),\tag{26}$$

where x is the location of the segment in the undeformed network and $t_c(x) = \int_0^x dx' / v(x')$ is the creation time of the segment. Eq. 24 then becomes

$$\Delta L = x^* + \alpha \int_{x^*}^{L} e^{k\tau(x,t)} dx = x^* + \alpha e^{kt} \int_{x^*}^{L} e^{-kt_c(x)} dx.$$
 (27)

The value of x^* depends on the history of external force.

i) Constant F. We assume that the number of working filaments, N, is a constant. So, both the force per working filament, F/N, and the velocity of polymerization, v, are constants. Thus we have $t_c(x) = x/v$ and L = vt. For $t < \tau^*$, x^* should be 0, because no segments collapse to zero length. For $t \ge \tau^*$, x^* can be obtained from Eq. 26: $\tau^* = t - t_c(x^*) = t - x^*/v$. Therefore, x^* can be written as

$$x^* = \begin{cases} 0 & \text{if } t < \tau^*, \\ v(t - \tau^*) & \text{if } t \ge \tau^*. \end{cases}$$
(28)

Eq. 27 then becomes

$$\Delta L = \begin{cases} (\alpha v/k) \left(e^{kt} - 1 \right) & \text{if } t < \tau^*, \\ L - h^* & \text{if } t \ge \tau^*, \end{cases}$$
(29)

where

$$h^* = (v/k)(\alpha - \ln \alpha - 1) \tag{30}$$

is time-independent. From Eqs. 22, 23 and 29 we obtain

$$h(t) = \begin{cases} vt - (\alpha v/k)(e^{kt} - 1) & \text{if } t < \tau^*, \\ h^* & \text{if } t \ge \tau^*, \end{cases}$$
(31)

$$V(t) = \begin{cases} \left(1 - \alpha e^{kt}\right)v & \text{if } t < \tau^*, \\ 0 & \text{if } t \ge \tau^*. \end{cases}$$
(32)

Eq. 31 shows that h increases linearly with t in the initial stage, and then reaches a steady-state value h^* at τ^* when the network starts collapsing. The plots of F-dependence of initial V and the h-t relation are shown in Figure 5D in the main text and Figure S14C, respectively.

ii) Variable F. If F is proportional to the deflection of the cantilever, then

$$F = k_{\text{lever}} \Delta h, \tag{33}$$

where $\Delta h = h - h_{\min}$ is the deflection of the cantilever with h_{\min} being the initial length of the actin pedestal. Then v varies with time and $t_c(x)$ depends on the loading history of the cantilever. For $t < \tau^*$, because $x^* = 0$, we write Eq. 27 as

$$\Delta L = \alpha B,\tag{34}$$

where $B = \int_0^L e^{k\tau(x,t)} dx$. From Eq. 26 and the fact that $\partial L/\partial t = v$ and $t_c(L) = t$, B satisfies the equation:

$$\frac{\mathrm{d}B}{\mathrm{d}t} - kB = v. \tag{35}$$

From Eqs. 23, 33-35, we obtain the following relation for V:

$$\frac{\mathrm{d}V}{\mathrm{d}t} = \frac{\mathrm{d}^2h}{\mathrm{d}t^2} = \frac{(k\Delta h + 2V)[k_{\mathrm{lever}}vV + kYA(v-V)] + (k\Delta h + V)(k_{\mathrm{lever}}\Delta h - YA)(\partial v/\partial t)}{k_{\mathrm{lever}}v\Delta h - YA(k\Delta h + v)}.$$
(36)

The term $\partial v/\partial t$ in the above equation can be evaluated through

$$\frac{\partial v}{\partial t} = \frac{\partial v}{\partial F} \frac{\partial F}{\partial h} \frac{\partial h}{\partial t} = \frac{k_{\text{lever}} V}{N} \frac{\partial v}{\partial f} = -\frac{k_{\text{lever}} v V}{N f_0},\tag{37}$$

where f = F/N is the average force per filament and $v = v_0 \exp(-f/f_0)$ is the force-velocity relation of individual filaments. From Eqs. 23, 33, 36 and 37, we have

$$\frac{\mathrm{d}V}{\mathrm{d}F} = \frac{\partial V}{\partial t}\frac{\partial t}{\partial F} = \frac{1}{k_{\mathrm{lever}}V}\frac{\mathrm{d}V}{\mathrm{d}t} = \frac{(\beta F + 2V)[k_{\mathrm{lever}}vV + kYA(v-V)] + (\beta F + V)(YA - F)(k_{\mathrm{lever}}vV/Nf_0)}{k_{\mathrm{lever}}V[Fv - YA(\beta F + v)]},$$
(38)

where $\beta = k/k_{\text{lever}}$ is a constant. Then, function h(t) and the force-velocity relation can be obtained numerically from Eqs. 36 to 38 (see Figure S14D). For the case of $YA \gg F \approx Nf_0$ and $\beta F \gg v \approx v_0 \gg V$, Eq. 38 can be approximated as $dV/dF \approx -\beta v_0/V$, which gives the approximate force-velocity relation

$$V \approx V_0 \sqrt{1 - F/F_{\text{stall}}},\tag{39}$$

where V_0 is the network's velocity at F = 0 and $F_{\text{stall}} = V_0^2/2\beta v_0$ is the stall force (see Figure 5C in the main text). Parameter V_0 can be calculated as follows: right before the pedestal starts pushing against the

cantilever, it has length $L = h_{\min}$ in the undeformed state. Assuming that the network grows at a constant speed v_0 before deflecting the cantilever, then $B = B_0 = \int_0^L \exp(kx/v_0) dx = [\exp(kh_{\min}/v_0) - 1]v_0/k$. From Eqs. 23 and 34, one finds $V_0 = v_0/(1 + k_{\text{lever}}B_0/YA)$.

Eqs. 34-38 are valid only for $t < \tau^*$. One can find that the network will reach a steady state when t is sufficiently large. Defining $F^* = k_{\text{lever}}(h^* - h_{\min})$ and $\alpha^* = F^*/YA$ with h^* being the steady state position of the cantilever, Eq. 30 becomes

$$h^* = (v^*/k)(\alpha^* - \ln \alpha^* - 1), \tag{40}$$

where $v^* = v(F^*/N)$ is determined by the force-velocity relation of single filaments. Then, h^* can be found numerically from the above equation with a root-finding algorithm. Eq. 25 gives $\tau^* = -(\ln \alpha^*)/k$, which is roughly the time required for the network to reach the steady state. A simple way to explain the predicted effect: the old, lowest part of actin pedestal starts to compress effectively creating downward actin network flow. This flow cancels a large part of the upward polymerization at the network-cantilever interface. So, the net rate with which the network protrudes and pushes the cantilever decreases. Therefore, at a given force, which determines the polymerization rate, the net protrusion speed will be lower than the polymerization speed.

Kymograph

Based on the above calculations, we predict the time-lapse plot of the positions of actin network's material points, or, the kymograph of the actin speckles (Figure S14B). We find a time scale t^* and a length scale h^* such that the network grows continuously for $t < t^*$ until reaching h^* at $t \approx t^*$ (Figure S14, C and D). For $t > t^*$, the overall length of the actin pedestal will reach a steady state. For the force-clamping experiment, we find $t^* = -\ln(\alpha)/k$ and $h^* = (v/k)(\alpha - \ln \alpha - 1)$, where $k = 2.5k_{\text{dis}}$ is the decay rate constant of the Young's modulus of the network, $\alpha = F/YA$ and v is the average filament growth speed. For the cantilever experiment, t^* and h^* have similar formulas, but since α is no longer a constant, t^* and h^* can be found numerically with a root-finding algorithm.

i) Constant F. We assume that at time t_0 , a network component P is created underneath the cantilever with $h = h_{\rm P}^0$ (see Figure S14B). Because the rest length of the pedestal at t_0 is $L_{\rm P} = vt_0$, $h_{\rm P}^0$ can be obtained from Eq. 31 as

$$h_{\rm P}^0 = h(t_0) = \begin{cases} vt_0 - (\alpha v/k) (e^{kt_0} - 1) & \text{if } t_0 < \tau^*, \\ h^* & \text{if } t_0 \ge \tau^*. \end{cases}$$
(41)

Therefore, for $t_0 < \tau^*$, we have

$$t_0 = h_{\rm P}^0 / v - (\alpha + w_{\rm P}) / k, \tag{42}$$

where $w_{\rm P} = W[-\alpha \exp(kh_{\rm P}^0/v - \alpha)]$ with W(x) being the Lambert W function satisfying the equation $x = W(x)e^{W(x)}$.

For $t_0 \leq \tau^*$, at $t = t_0 + \tau_P$ when the lifetime of the network at P is τ_P , the deformation of the network between the bottom and P can be obtained from Eq. 27 as

$$\Delta L_{\rm P}(t) = x^* + \alpha e^{kt} \int_{x^*}^{L_{\rm P}} e^{-kx/v} dx,$$

=
$$\begin{cases} (\alpha v/k) (e^{kt} - e^{k\tau_{\rm P}}) & \text{if } t < \tau^*, \\ v(t - \tau^*) + (\alpha v/k) (e^{k\tau^*} - e^{k\tau_{\rm P}}) & \text{if } \tau^* \le t < t_0 + \tau^*, \\ L_{\rm P}(t) & \text{if } t \ge t_0 + \tau^*. \end{cases}$$
(43)

From Eqs. 25, 41-43, the position of P as a function of $\tau_{\rm P}$ can be found as

$$h_{\rm P}(\tau_{\rm P}) = L_{\rm P} - \Delta L_{\rm P} = \begin{cases} h_{\rm P}^0 - (v/k)(\alpha + w_{\rm P}) (1 - e^{k\tau_{\rm P}}) & \text{if } \tau_{\rm P} < \tau^* - t_0, \\ v(\tau^* - \tau_{\rm P}) - (\alpha v/k) (e^{k\tau^*} - e^{k\tau_{\rm P}}) & \text{if } \tau^* - t_0 \le \tau_{\rm P} < \tau^*, \\ 0 & \text{if } \tau_{\rm P} \ge \tau^*. \end{cases}$$
(44)

Noting that for $\tau_{\rm P} \ge \tau^*$, the network below point P collapses to 0. From Eq. 44, the velocity of point P can be obtained as

$$V_{\rm P}(\tau_{\rm P}) = \frac{\mathrm{d}h_{\rm P}}{\mathrm{d}\tau_{\rm P}} = \begin{cases} (\alpha + w_{\rm P})e^{k\tau_{\rm P}}v & \text{if }\tau_{\rm P} < \tau^* - t_0, \\ (\alpha e^{k\tau_{\rm P}} - 1)v & \text{if }\tau^* - t_0 \le \tau_{\rm P} < \tau^*, \\ 0 & \text{if }\tau_{\rm P} \ge \tau^*. \end{cases}$$
(45)

For $t_0 > \tau^*$, the network is at steady state. Therefore $h_{\rm P}(\tau_{\rm P})$ and $V_{\rm P}(\tau_{\rm P})$ should be the same as those for $t_0 = \tau^*$:

$$h_{\rm P}(\tau_{\rm P}) = \begin{cases} v(\tau^* - \tau_{\rm P}) - (\alpha v/k) (e^{k\tau^*} - e^{k\tau_{\rm P}}) & \text{if } \tau_{\rm P} < \tau^*, \\ 0 & \text{if } \tau_{\rm P} \ge \tau^*, \end{cases}$$
(46)

$$V_{\rm P}(\tau_{\rm P}) = \begin{cases} \left(\alpha e^{k\tau_{\rm P}} - 1\right) v & \text{if } \tau_{\rm P} < \tau^*, \\ 0 & \text{if } \tau_{\rm P} \ge \tau^*. \end{cases}$$

$$\tag{47}$$

The kymograph of a 1D network with F = 100 nN is shown in Figure S14C.

ii) Variable F. For F being proportional to the cantilever deflection, it is difficult to derive an analytical form for the motion of a material point in the actin network. We use 1D node-spring simulations to obtain the kymograph shown in Figure S14D. Similar to the case of constant F, h increases with t for $t < \tau^*$ and reaches a steady state for large t, but it has an overshoot near $t = \tau^*$ before reaching the steady state. This is caused by the fast actin growth at low forces, which produces a longer pedestal than what is expected at a constant force. One can also see that for $t < \tau^*$, speckle trajectories at variable force descend more rapidly than those at constant force because, as the force increases, it compresses the actin network more than a constant force does. At the steady state, however, the speckle trajectories have the same shape as those at constant force.

Effects on individual filament force-velocity relations, attachments, geometry and stiffness

We have examined effects of the exact form of the filament force-velocity relation, attachment rate, surface geometry and actin network stiffness on the resulting force-velocity relation of the actin network. For simplicity, we consider only the experiment with the force-clamping setup.

We start with a simple case in which all filaments are pushing, not attached (by setting $k_a = 0$) and growing against a flat obstacle from the boundary of the infinitely stiff network. To see how the shape of the force-velocity relation of individual pushing filaments affects the shape of the force-velocity relation of the network, we have tried both concave-up and concave-down shapes for the force-velocity relation (see Figure S1). These two shapes represent the predictions from the Brownian ratchet theory [3] and the end-tracking theory [17,18], respectively. The simulated network's force-velocity relation under these two conditions is shown in Figure S15A. We find that the force-velocity relation of the network has a similar shape to that of the individual filaments, indicating that forces are shared roughly equally among pushing filaments. This is confirmed by the simulation results showing that the force always has a very narrow distribution (half-width < 0.5 pN) before the network is stalled (Figure S15, B and C).

Next, we investigate the effect of filament attachments by setting $k_{\rm a} = 1 \text{ s}^{-1}$. We find that the shape of the network's force-velocity relation becomes insensitive to the shape of the force-velocity relation of individual pushing filaments (see Figure S15D), similar to the previous findings [9]. There are two factors contributing to the shape of the force-velocity relation. One is that attached filaments pull more strongly in the high velocity regime but less so in the low velocity regime, causing a more significant reduction in velocity at low forces. The other factor is that the forces exerted by the pushing filaments have a much broader distribution (see Figure S15, E and F), smothering the effect of shape of the force-velocity relation of individual filaments. We hypothesize that the broadening of the force distribution of is caused by the dynamic conversion between the states free and attached filaments. As free filaments elongate toward the obstacle, they are compressed by the obstacle if the filaments make contact. When free filaments later become attached to the obstacle, they stop polymerizing but keep their compressions. As the net growth of the filament network continues to displace the obstacle, the initial compression in the attached filaments is gradually relieved until the filaments detach again. This dynamic conversion between the deformation states of free and attached states thus creates a broad distribution of forces. We have also noticed that networks with a concave-down-shaped force-velocity relation for single filaments tend to have a wider distribution of forces than those with a concave-up-shaped force-velocity relation. The reason is that for filaments with a concave-down-shaped force-velocity relation, their growth velocity is insensitive to changes in force when the force is less than the stall force. Therefore, at a given velocity, pushing filaments with a concave-down-shaped force-velocity relation have a wider range of values of forces than those with a concave-up-shaped force-velocity relation.

To see the effect of the surface geometry, we replace the flat surface with a spherical one in two simulations described above and find that the shapes of the force-velocity relations under the considered conditions are similar to those corresponding to the flat surface. Therefore, the geometry of the surface does not play an important role in the shape of the force-velocity relation of the network. We also notice that the velocity tends to be high near F = 0 (see Figure S15, G and J). The reason is that at F = 0the pushing filaments on the two sides of the spherical surface generate a strong squeezing effect, which causes a much higher velocity. This squeezing effect is rapidly suppressed when the force increases. The squeezing effect can also be observed from the biased distribution of forces toward the high values (see Figure S15, H–I and K–L).

For a deformable network with a fixed disassembly rate and both pushing and attached filaments, the compression of the actin pedestal underneath the obstacle slows down the net protrusion of the network, especially at high forces. Therefore, velocity decreases more rapidly with force at high force, causing a slightly concave-up force-velocity relation for both flat and spherical surfaces (see Figure S15, M and P). The stall force for the deformable actin network is also lower than that for the stiff network. The shape of the force-velocity relation of individual pushing filaments, however, does not have strong impact on the shape of the force-velocity relation of the network, similar to the results for the stiff networks. From the distribution of forces for individual pushing filaments (see Figure S15, N–O and Q–R), we find that the force on the pushing filaments in deformable networks is generally lower than that in stiff networks, even near the stall. This shows that the stall of a deformable network's growth does not necessarily represent the stall of all pushing filaments; it could also indicate a dynamic balance between the network growth and network compression and/or disassembly. Figure S16 shows the simulations' snapshots in which the structures of the model actin network, as well as stress and strain distributions, can be seen.

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Table

Symbol	Definition	Value	References
$k_{\rm a}$	Filament attachment rate constant	$1 \mathrm{s}^{-1}$	assumed
$k_{ m c}$	Filament capping rate constant	$0.1 \ {\rm s}^{-1}$	assumed
$k_{ m d}^0$	Filament detachment rate at zero-force	$2.7 \ {\rm s}^{-1}$	assumed
$k_{\rm n}$	Filament nucleation rate	$2 \ \mu m^{-1} s^{-1}$	assumed
$k_{ m s}$	Spring constant of filament attachment	$300 \text{ pN}/\mu\text{m}$	assumed
$k_{ m dis}$	Network disassembly rate	$8 \times 10^{-3} \text{ s}^{-1}$	assumed
k	Decay rate constant of Young's modulus	$2.5k_{ m dis}$	(11, 12)
a	Bead's short-axis	$0.5~\mu{ m m}$	(2)
b	Bead's long-axis	$1 \ \mu \mathrm{m}$	(2)
v_0	Filament's free-polymerization speed	50 nm/s	assumed
f_0	Force scale	1.5 pN	(3)
k_{lever}	Spring constant of cantilever	30 pN/nm (in analytic calc.)	(9)
		$7.5 \text{ pN}/\mu\text{m}$ (in simulations)	
A	Network's cross-section area	$400 \ \mu m^2$ (in analytic calc.)	(9)
		$0.1 \ \mu m^2$ (in simulations)	
Y	Young's modulus of nascent network	10 kPa (in analytic calc.)	(9)
		3 kPa (in simulations)	
$k_{ m d}$	Average filament detachment rate	varies	
v	Filament's average growth velocity	varies	
$v_{\rm b}$	Bead velocity	varies	
V	Cantilever's velocity	varies	
L	Network's rest length	varies	
ΔL	Total network deformation	varies	
h	Length of deformed network	varies	
h^*	Steady-state length of deformed network	varies	
x^*	Rest length of collapsed network	varies	
$t_{ m c}$	Creation time of a network segment	varies	
au	Lifetime of a network segment	varies	
$ au^*$	Characteristic lifetime of a network segment	varies	
$ au_0$	Turn-over time of actin filaments	varies	

Table S1. Model variables and parameters.

Model variables and parameters.

Figures



Figure S1. Hypothesized possible shapes of the force-velocity relation for individual actin filaments. Solid line: concave-up shape with $v/v_0 = \exp(-f/f_0)$. Dashed line: concave-down shape with $v/v_0 = 1 - (f/f_s)^4$, where $f_s = 3$ pN is the stall force.



Figure S2. Schematic of the elastic model. Squeezing forces (red arrows) from an elastic actin tail (gray) tend to rotate an elliptic bead (black) to move along its long-axis (blue arrow).



Figure S3. Schematic of filament nucleation in the mesoscopic model. Actin filaments (green lines) are anchored to the node-spring network (blue lines and black solid circles) at their pointed ends. (A) A new filament (green dashed line) is created near the bead surface (gray rectangle) with pointed end represented by a black open circle. (B) The nascent filament is anchored to the network by connecting its pointed end to 4 nearby nodes with springs (dashed blue lines), which also expand the network.



Figure S4. Simulation snapshots of actin-propelled spherical beads (black circles) with $R = 1 \ \mu m$. White indicates the density of pointed ends of actin filaments. (A) Filaments are created via branching. (B) Filaments are created via spontaneous nucleation. (C) Filaments are created via both branching and spontaneous nucleation. The total branching rate is chosen to be the same as the total rate of spontaneous nucleation.



Figure S5. Scatter plot of simulated beads' speed vs. orientation angle (between the direction of propulsion and long axis). The lengths of the short and long axes of ellipsoidal beads are $a = 0.5 \ \mu m$ and $b = 1 \ \mu m$, respectively. Circles: 2000 data points taken from 100 individual simulations each representing 10^4 s of real time.



Figure S6. Torque-induced rotation of bead. (A) Schematic of the bead (ellipse) and its tail (gray). (B) Schematic of the distribution of pushing (red) and pulling (blue) forces along the bead surface. (C) Calculated torques (solid red circles: from free filaments' pushing and additional opposing force, open blue circles: from attached filaments' pulling). (D) Calculated torque-induced angular velocity with mobility coefficients of c = 0.53 (solid circles) and c = 0.4 (open circles).



Figure S7. Tail-reorientation-induced rotation of the bead with respect to its tail. (A–D) Schematics of the elliptic bead pushed by uniformly distributed filaments in the bead's frame-of-reference. The pushing forces are perpendicular to the bead surface. (A) Initially, the bead is moving roughly along its long-axis. The bead-tail boundary P_1P_2 is tilted by θ from the bead's short-axis. The direction of the bead velocity v_b is then determined by the total pushing force from the filaments. (B) After the bead moves, the tail remodels and forms new contact region behind the bead, resulting in new bead-tail boundary $P'_1P'_2$ with $\theta' > \theta$ (unstable orientation). (C–D) The bead moves roughly along its short-axis, resulting in $\theta' < \theta$ (stable orientation). (E) Approximated (line) and simulated (circles) ω_2 - θ relation. Inset: schematic of bead's rotation in the tail's frame-of-reference.



Figure S8. Calculated total angular velocity of the bead with respect to its tail as a function of θ . The mobility coefficients of the beads are 0.53 (solid circles) and 0.4 (open circles). Inset: schematic of bead's rotation in the tail's frame-of-reference.



Figure S9. Simulated probability distribution of beads' orientation as a function of Young's modulus of actin networks. Bead has an aspect ratio of 1.5 (A) and 2.5 (B). Black circles: bead moves along the long-axis ($0 \le \theta < 30^\circ$). Red squares: bead moves at a skewed orientation ($30^\circ \le \theta < 60^\circ$). Blue triangles: bead moves along the short-axis ($60^\circ \le \theta < 90^\circ$).



Figure S10. Simulated variables N, $v_{\mathbf{b}}$, τ_0 and $\kappa_{\mathbf{rms}}$ as functions of parameters $k_{\mathbf{a}}$, $k_{\mathbf{c}}$, $k_{\mathbf{d}}^0$ and $k_{\mathbf{n}}$.



Figure S11. Simulated variables N, $v_{\mathbf{b}}$, τ_0 and $\kappa_{\mathbf{rms}}$ as functions of parameters $k_{\mathbf{s}}$, R and v_0 .



Figure S12. Simulated autocorrelation of the trajectory curvature, κ , vs. traveled distance. Solid black line: with default values of parameters. Dashed red line: doubling $k_{\rm a}$. Dotted blue line: doubling R. Dot-Dashed green line: $k_{\rm d}^0 = 0.5 \text{ s}^{-1}$.



Figure S13. Simulated force-velocity relation. (A) Similar to the setup in Figure 4A of the main text, but with a concave-down shaped force-velocity relation for individual pushing filaments (solid line), or with an obstacle geometry as in Figure 4B of the main text (dashed line). (B) Similar to the setup in Figure 4B, but with a concave-down shaped force-velocity relation for individual pushing filaments (solid line), or with an obstacle geometry as in Figure 4A (dashed line). (C) Cantilever experiment with a flat surface and $N_a/N_f = 0.18$ (solid line), 0.37 (dashed line) and 0.74 (dotted line). (D) Force-clamping experiment with a spherical surface and $N_a/N_f = 0.18$ (solid line), 0.37 (dashed line), 0.37 (dashed line).



Figure S14. Calculated kymograph of actin gels under load. (A and B) Schematic of the 1D network model. (A) Actin pedestal (blue) is compressed by flat cantilever (grey) with force F. In the undeformed state, the pedestal has length L and grows with velocity v. Under compression, the network has length h and grows with velocity V. Network segment of length x^* at the bottom of the undeformed network is compressed to zero-length because of its low stiffness. (B) Motion of a speckle P (white circles) in the network. From left to right: undeformed network at $t = t_0$, compressed network at $t = t_0 + \tau_P$. Point P moves down from t_0 to $t_0 + \tau_P$ due to the recoil of the network below it. (C and D) Calculated coordinate of the leading edge of the actin network (solid lines) and traces of 8 speckles (dashed lines, P_1 - P_8) as functions of t for a constant force (C) and for a varying force with the magnitude being proportional to the cantilever displacement (D).



Figure S15. Force-velocity relation and distribution of forces from force-clamping simulations. Left column: force-velocity relation. Solid circles: pushing filaments have a concave-up force-velocity relation (as in Figure S1). Open circles: pushing filaments have a concave-down force-velocity relation. Middle and right columns: distribution of forces from pushing filaments that have either a concave-up force-velocity relation (middle column) or a concave-down force-velocity relation (right column). Colors indicate different values of force, which are marked with arrowheads of the same colors in the corresponding plots in the left column. (A–L) Assuming the network is infinitely stiff, deformable filaments push against either a flat surface (A–F) or a spherical surface (G–L). (A–C, G–I) All filaments are pushing ($k_a = 0$). (D–F, J–L) Filament attachments are included. (M–R) With a deformable network and attachments, filaments push against either a flat surface (M–O) or a spherical surface (P–R).



Figure S16. Simulation snapshots corresponding to Figure 4 A and B in the main text. Network springs are shown as colored lines with red representing compressed links and blue representing stretched links. Active filaments are lines perpendicular to the obstacle surface with green being free filaments and blue being attached filaments. Plates and bead are shown in gray. Bars: 1 μ m.



Figure S17. Observed average cosine value of the angle at which ellipsoidal beads move at given time. The angle is measured from beads' initial directions as a function of time. Red: beads moving along their long-axes. Blue: beads moving along their short-axes. The average cosine is close to zero when the beads make roughly a quarter of a circle. Knowing respective time and average linear speed, we estimate the average trajectory curvature to be about 0.1 μ m. Note, that beads moving along their long axes curve faster; these beads also move with a slower linear speed. Thus, their trajectory curvature is higher.