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## Local Yield and Compliance in Active Cell Monolayers

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The rheology of biological tissue plays an important role in many processes, from organ formation to cancer invasion. Here, we use a multi-phase field model of motile cells to simulate active microrheology within a tissue monolayer. When unperturbed, the tissue exhibits a transition between a solid-like state and a fluid-like state tuned by cell motility and deformability – the ratio of the energetic costs of steric cell-cell repulsion and cell-edge tension. When perturbed, solid tissues exhibit local yield-stress behavior, with a threshold force for the onset of motion of a probe particle that vanishes upon approaching the solid-to-liquid transition. This onset of motion is qualitatively different in the low and high deformability regimes. At high deformability, the tissue is amorphous when solid, it responds compliantly to deformations, and the probe transition to motion is smooth. At low deformability, the monolayer is more ordered translationally and stiffer, and the onset of motion appears discontinuous. Our results suggest that cellular or nanoparticle transport in different types of tissues can be fundamentally different and point to ways in which it can be controlled.

The dynamics of cells in dense tissues is important for understanding many biological processes, including embryonic development [1], cancer metastasis [2], and wound healing [3]. It underlies the epithelialmesenchymal transition observed in vivo [4–6], in which stationary epithelial cells change to a more motile, mesenchymal phenotype. Experiments have also demonstrated a transition from glassy, or solid-like, to liquid dynamics in epithelial monolayers both in vitro [7–12] and in vivo [7, 13]. Theoretical work on various models of dense tissues, including multi-phase field [14], Voronoi [15, 16], vertex [17–19], and cellular Potts models [20, 21], has shown that this melting transition can be driven by the interplay of cell surface tension, cell motility, and active noise. An important question is whether the solidto-liquid transition has an impact in tissue function in health and disease. Theory and experiments have begun to address this issue by exploring the rheological and mechanical properties of biological tissues, which have key consequences to their macroscopic biophysical behavior [13, 22-31]. A mechanistic and quantitative understanding of the impact of cell surface tension and cell motility on the rheology and transport properties of biophysical tissues is, however, still lacking.

To shed light on this aspect, we study the local response of the tissue to the drag of an embedded colloidal probe. Constantly forced probes and oscillatory active microrheology [32] have been used to study the local material response in a wide variety of active and passive systems, including colloidal suspensions [33–37], biological tissues [23, 38], and active disks [39–41]. While distinct from macrorheology that measures the material response on macroscopic scales, the two methods often yield qualitatively similar behavior when used to probe the rheology of complex fluids [42]. Active microrheology also provides a promising and nondestructive technique for understanding how cells in dense tissues generate spatially localized forces and transmit them to large scales.

Using a multi-phase field model [14, 43–50] of cells, we show that solid-like tissues exhibit a finite threshold for the onset of motion of an embedded probe pulled at a constant force. In passive systems of rigid particles, the existence of a finite threshold to probe motion correlates with a yield stress at the macroscopic scale [38]. Although no macrorheology data are available for our system, our finding suggests that our model tissue may behave as a yield stress material even in the presence of noisy cell motility [22, 51]. A finite yield stress has indeed been reported in biological tissues [13] and in simulations of sheared vertex models [28].

The onset of probe motion depends on cell deformability, a measure of **cell-edge** tension. Near onset, velocityforce curves become sharper for rigid monolayers, and the probe's instantaneous velocity behaves differently. At high deformability, this velocity is sharply and evenly distributed around its mean as the probe smoothly squeezes through compliant neighboring cells, resulting in small local yield stress. At low deformability, the probe needs to displace cells within its vicinity to move, resulting in velocity distributions with fat tails and large local yield stress. These differences correlate with the structural topology of the solid-like state, which is near crystalline for rigid cells, but glassy and defect-ridden for soft cells.

*Model.* We describe a tissue monolayer using a multiphase field model with N cells, each represented by a scalar field  $\phi_i(\mathbf{r})$ . Phase field models incorporate cell shape deformation (a measure of tissue fluidity [15, 17]) and allow for cell intercalation and density inhomogeneities, and they capture many properties of dense tissue layers [45, 52, 53]. The free energy of the system is

given by

$$\mathcal{F} = \sum_{i=1}^{N} \left[ \int d^2 \boldsymbol{r} \left( \frac{\alpha}{4} \phi_i^2 (\phi_i - \phi_0)^2 + \frac{K}{2} (\boldsymbol{\nabla} \phi_i)^2 \right) + \lambda \left( 1 - \int d^2 \boldsymbol{r} \frac{\phi_i^2}{\pi R^2 \phi_0^2} \right)^2 + \epsilon \sum_{i < j=1}^{N} \int d^2 \boldsymbol{r} \phi_i^2 \phi_j^2 \right].$$
(1)

The first term sets  $\phi_0 = 2$  and 0 in the interior and exterior of each cell, respectively. The second term penalizes gradients in the phase with a stiffness K. These two terms determine the interfacial thickness  $\xi = \sqrt{2K/\alpha}$  and the cell-edge tension  $\sigma = \sqrt{8K\alpha/9}$ , which is in turn controlled by cortex contractility and cell-cell adhesion. The third term is a soft constraint on the cell area, with the preferred area set to that of a circle of radius R = 12. Finally, the fourth term models steric repulsion ( $\epsilon = 0.1$ ) by penalizing cell overlap.

Cell dynamics is overdamped due to friction with the substrate and is governed by the equation

$$\frac{\partial \phi_i}{\partial t} + \boldsymbol{v}_i \cdot \boldsymbol{\nabla} \phi_i = -\frac{1}{\gamma} \frac{\delta \mathcal{F}}{\delta \phi_i} , \qquad (2)$$

where  $\gamma = 10$  is an inverse mobility. Cell motility enters through advection by the cell self-propulsion velocity  $\mathbf{v}_i = v_0(\cos\theta_i, \sin\theta_i)$ . As in active Brownian particle models, we assume that, in isolation, all cells move at the same speed  $v_0$ , while the direction of motion  $\theta_i$  is randomized by noise at rate  $D_r$ ,  $d\theta_i(t) = \sqrt{2D_r} dW_i(t)$ , where  $W_i(t)$  is a Wiener process and  $D_r = 10^{-4}$ . This minimal version of the model has been shown to capture the organization of epithelial monolayers [53]. We quantify cellular activity through the Péclet number  $\text{Pe} = v_0/(RD_r)$ , with  $v_0/D_r$  the cells' persistence length. Both  $v_0$  and  $D_r$  can be mapped to physical values via mean squared displacement (MSD) data of cells.

When cells interact, they may change their area (at a cost  $\lambda$ ), overlap (cost  $\epsilon \xi R$ ), or deform their perimeter and shape (cost  $\sigma R$ ). We quantify cell deformability via the dimensionless parameter  $d = \epsilon \xi R/(\sigma R)$  and vary it from 0.3 to 6.0 by changing  $\sigma$  for fixed  $\xi = 2$ . The compressibility  $\chi = \lambda/(\epsilon \xi R)$  characterizes the competition between area changes and overlap and is fixed to  $\chi = 125/3$ , giving polydisperse systems without cell overlap (physically corresponding to extrusion out of the plane in a cell monolayer [14]). Further details of implementing the model are discussed in the Supplementary Materials (SM) and in [14].

We embed in the tissue a probe particle described by a rigid phase field  $(d = 0.015, \chi = 2500)$  of the same size as the cells and subject to the same free energy, so that it remains circular at all times. The probe is pulled at a constant force F along the x axis, and we measure its velocity as  $v_b(t) = \frac{x_b(t+\Delta t)-x_b(t)}{\Delta t}$ , with  $x_b(t)$  the instantaneous x position of the probe, over intervals of  $\Delta t = 0.01D_r^{-1}$  for a range of values of d and Pe.



Figure 1. A typical velocity-force curve for a hard probe particle in a glassy tissue [(d, Pe) = (3.0, 0.1)] showing three dynamical regimes [from left to right: caging (brown), stick-slip (green), and moving freely (purple)]. Upper inset: the relative strength of the velocity fluctuations decreases above the critical force. Lower inset: a snapshot of the simulation setup.

We characterize the solid- or liquid-like state of the system by studying the long-time behavior of cells' MSD, with  $MSD(t) \sim t^{\alpha}$  (see SM). In the solid-like state the cells behave subdiffusively ( $\alpha < 1$ ), whereas in the liquid-like state they move diffusively ( $\alpha = 1$ ; Figs. S1 and S2).

Threshold force and local yield stress. In our solidlike tissues, a finite threshold force  $F_c$  is required for the probe to move at a non-zero velocity (Fig. 1). In colloidal suspensions, the threshold force probed by microrheology can be related quantitatively to the macroscopic yield stress [42]. While the detailed form of such a relation has not been established for the case of deformable particles, this suggests that the behavior of  $F_c$  should be at least qualitatively similar to that of the tissue yield stress.

A typical velocity-force curve for our rheological probe is shown in Fig. 1. We identify three dynamical regimes. At low forces, the probe rattles within its cage but is unable to escape (light brown region). At greater forces (green region), it deforms its neighbors strongly enough to escape the cage but can be temporarily trapped in new cages, resulting in stick-slip motion. As the force increases further, the probe no longer spends any time caged – its instantaneous velocity becomes finite at all times, and the velocity-force curve turns almost linear. We identify the threshold force  $F_c$  as that at which the average long-time displacement of the bead's position  $\Delta x_b = x_b (200 D_r^{-1}) - x_b (20 D_r^{-1})$  equals *R*. The precise choice of the cutoff, or a definition based on the long-time exponent with which displacement grows with time, does not affect the qualitative behavior of  $F_c$  as a function of Pe and deformability (Figs. S3–S5). Below  $F_c$ , the probe is either completely caged or engages in very rare stickslip motion. Just above  $F_c$ , it instead moves substantially through the tissue, in frequent stick-slip or steady mo-



Figure 2. Probe velocity  $v_b$  versus applied force F from varying cell motility and deformability. (a) Velocity-force curves at high deformability (d = 3.0) versus Pe. Inset: The threshold force  $F_c$  versus Pe. Circles denote a glassy state with a subdiffusive MSD, whereas squares indicate a liquid system with a diffusive MSD. (b) Velocity-force curves at Pe = 0.1 for various deformability (d = 0.3, 0.75, 1.5, 3.0, and 6.0). Inset:  $F_c$  versus d. All points correspond to the tissue being in a glassy state. (c)–(f) Normalized histograms of  $v_b$  for d = 3.0 and 0.3 for forces F just below and above  $F_c$ . The values above  $F_c$  are chosen as close as possible to give comparable values of  $F/F_c$ .

tion. The strength of velocity fluctuations relative to the mean decreases for  $F > F_c$  (Fig. 1, upper inset), which is further evidence for a dynamical transition associated with local yielding.

To examine the effect of activity, we vary Pe at fixed deformability. The resulting velocity-force curves are shown in Fig. 2(a) for highly deformable cells (d = 3.0). Increasing activity leads to a smoother transition at the onset of motion. This is qualitatively similar to the thermal rounding observed in depinning phenomena [54], although in our system the probe velocity is zero over a finite range of applied forces for small Pe, indicating that the threshold force  $F_c$  is non-zero even in the presence of noise. Specifically,  $F_c$  and the associated local yield stress decrease with Pe, but remain finite within the precision of our simulations until Pe = 0.4 [Fig. 2(a), inset]. This is also the point at which the tissue melts, as shown by MSD data (Fig. S1), suggesting the existence of a finite local yield stress can be used to characterize the global solid-like or fluid-like state of the tissue.

To examine the effect of deformability, we fix Pe = 0.1and vary d, such that the system remains solid-like for all values of d considered (Fig. S2). Figs. 2(b) and S7 show that the onset of motion changes qualitatively depending on cell-edge tension (or deformability). Tissues composed of cells with low tension are highly compliant and can adapt to the deformation induced by the probe simply through cell-shape changes. This gives a smooth, continuous onset of motion and low local yield stress. In contrast, rigid cells that resist deformation result in a sharp, almost discontinuous onset of motion and large local yield stress, as in this case the probe needs to push aside its neighbors to start moving. The decrease of threshold force with increasing deformability can be understood by assuming that  $F_c \sim k_{\rm eff}$ , where  $k_{\rm eff}$  is the effective spring constant felt by a caged particle. A calculation shows that  $k_{\rm eff} \sim 1/d$  (see SM), consistent with data shown in the inset of Fig. 2(b). A more detailed analysis may require considering many-body interactions, as in foams [55]. The qualitative difference in the behavior at low and high deformability becomes apparent when plotting histograms of the probe's instantaneous velocities, which are much broader and exhibit fatter tails for low d, especially in the vicinity of  $F_c$  [Figs. 2(c)–(f) and S8].

Deformation patterns close to the probe. As the probe is dragged around the tissue, it can substantially deform cells nearby. To quantify the extent of such deformations, we consider the deformation tensor  $S_i$  [45], where

$$S_{i,\alpha\beta} = -\int d^2 \boldsymbol{r} \left[ (\partial_{\alpha}\phi_i)(\partial_{\beta}\phi_i) - \frac{\delta_{\alpha\beta}}{2}(\partial_{\gamma}\phi_i)^2 \right]. \quad (3)$$

This tensor has eigenvectors  $\hat{n}_i^e$  and  $\hat{n}_i^c$  with eigenvalues  $s_i$  and  $-s_i$ , respectively, where  $s_i = \sqrt{S_{i,xx}^2 + S_{i,xy}^2}$  gives the magnitude of the deformation.  $\hat{n}_i^e = (\sin \varphi_i, -\cos \varphi_i)$  points along the axis of greatest elongation, whereas  $\hat{n}_i^c = (\cos \varphi_i, \sin \varphi_i)$  is along the axis of greatest compression, and  $\varphi_i$  is the angle between  $\hat{n}_i^c$  and the x axis [Fig. 3(a)]. Using this tensor, we measure the degree of deformation of each cell in the direction from the probe by defining the radial compression field

$$C(\mathbf{r}) = \sum_{i} s_{i} H(\phi_{i}(\mathbf{r}) - \phi_{0}/2) \cos\left(2(\alpha_{i} - \varphi_{i})\right), \quad (4)$$

where H is the Heaviside function and the field is smoothed to interpolate values on cell boundaries. Here,



Figure 3. Quantifying cell deformation around the probe. (a) Schematics explaining the radial compression field  $C(\mathbf{r})$ , computed based on the alignment of the cell compression axis  $\hat{\mathbf{n}}_i^c$  with the vector  $\hat{\mathbf{u}}_i$  pointing from the center of the probe (blue) to that of the cell (yellow). (b) Heatmap of  $C(\mathbf{r})$  for d = 3.0, Pe = 0.1, and  $F = 0.93F_c$ , showing the axis of cell elongation  $\hat{\mathbf{n}}_i^e$ . (c) Profiles of  $C(\mathbf{r})$  along the probe's center in the x direction, i.e.,  $\langle C(x, y = y_b) \rangle$ , for d = 0.3 and 3.0 with Pe = 0.1. (d) Absolute values of the minima and maxima of  $\langle C(x, y = y_b) \rangle$  versus F for parameters as in (c).

 $\alpha_i$  is defined by the vector  $\hat{\boldsymbol{u}}_i = (\cos \alpha_i, \sin \alpha_i)$  pointing from the center of the probe to that of cell *i*. Positive or negative values of  $\mathcal{C}(\boldsymbol{r})$ , respectively, signify local compression or elongation along  $\boldsymbol{r}$ . Fig. 3(b) shows a snapshot of  $\mathcal{C}(\boldsymbol{r})$ , indicating a buildup of compression along x in front of the probe and a wake of elongation behind. The latter is reminiscent of the density voids found in the wake of a colloidal probe dragged through granular materials [56–62], suspensions of active hard spheres [40, 41], colloidal suspensions [63–65], and foams [66].

Compression and elongation are largest at about one cell length from the probe, independent of F [Fig. 3(c)], and the magnitude of the deformation increases with d. While compression remains roughly constant beyond  $F_c$ , as the probe only requires enough of a compression to escape its cage, the magnitude of elongation behind the probe is non-monotonic with F [Fig. 3(d)]. This behavior arises because elongation requires the probe to create free space where the cells behind it can expand. When the probe undergoes stick-slip motion, the large instantaneous forces create empty regions behind it. Instead, when the probe moves freely, the cells behind it follow the motion smoothly, hence their elongation decreases. The maximum elongation is found just at  $F_c$  for the low



Figure 4. Reduction in the number of disclinations  $N_d$  within the system over time at different deformability d. (a) Example time series of  $N_d$  for d = 0.3 and 3.0. Snapshots show the Delaunay triangulation of the system at  $tD_r = 0$  and 200. Five- and seven-fold disclinations are shown as blue and red circles, respectively, and the probe particle marked in gray. (b),(c) Time series showing the percentage change in  $N_d$  over time at various F for (b) d = 0.3 and (c) d = 3.0.

d case, but further away for high d, consistent with the former being a sharper transition, where the transitional stick-slip regime is narrower.

Defect statistics and topological healing. To identify the physical mechanisms underlying the behavior at different deformability, we analyze the topological structure of cell center packing in the solid-like state. Fig. 4 and Fig. S9 show that defects obtained by Delaunay triangulation of the cell centers of mass are strikingly different at different d. The system is more ordered for rigid than for deformable cells, and defects are rarer in the former case [S10(a) and (b)]. This is because at small d, cells try to minimize their perimeter by forming hexagonal shapes that can tile the plane regularly, whereas at high d, shape changes lead to a wider repertoire of possible emerging amorphous structures.

At all values of deformability, the probe's motion heals the system, reducing the number of defects over time [Figs. 4(b) and (c) and S10(a)]. The timescales associated with this topological healing, however, depend on deformability and are smaller for low d. Again, this points to a sharper transition for rigid monolayers, and to a more compliant response of softer ones. While the probe heals the system locally, global healing can be achieved by increasing activity [Figs. S10(c) and (d)]. The free motion of the probe therefore acts as noise in the system. The behavior is qualitatively similar to that of twodimensional extended systems pinned by quenched disorder, where a uniform external drive first depins the system, setting it into motion, and then heals it at large applied forces, restoring partial translational order [67, 68].

To conclude, we used simulations to probe the local mechanics in model cell monolayers. We found that the monolayer responds to local deformations like a yieldstress material even in the presence of noisy cell motility. We also showed that there is a fundamental relationship between the nature of the local yielding transition and microscopic cell properties such as cell-edge tension, as captured here by deformability, and cell motility. In monolayers of rigid cells local yielding requires cell displacement, resulting in a large threshold force. In contrast, monolayers of soft cells are compliant and yield locally through cell deformation [69], resulting in a smaller threshold force. As the surface tension of cancerous cells is thought to be larger than that of healthy tissues, these results suggest that intratissue dynamics may change significantly in disease, and it would be of interest to test this prediction experimentally – e.g., modifying  $\sigma$  by blebbistatin or cadherin knockouts. Our results are also relevant to recent dynamical measurements in Drosophila embryos based on embedding a probe inside a cell [38], or ferroelectric droplets in between neighboring cells [13], which suggest that local probes can provide quantitative information on local tissue rheology in vivo.

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