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Competing elastic and viscous gradients determine directional cell migration

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ABSTRACT

Cell migration regulates central life processes including embryonic development, tissue regeneration, and tumor invasion. To establish the direction of migration, cells follow exogenous cues. Durotaxis, the directed cell migration towards elastic stiffness gradients, is the classical example of mechanical taxis. However, whether gradients of the relaxation properties in the extracellular matrix may also induce tactic responses (viscotaxis) is not well understood. Moreover, whether and how durotaxis and viscotaxis interact with each other has never been investigated. Here, we integrate clutch models for cell adhesions with an active gel theory of cell migration to reveal the mechanisms that govern viscotaxis. We show that viscotaxis is enabled by an asymmetric expression of cell adhesions that further polarize the intracellular motility forces to establish the cell front, similar to durotaxis. More importantly, when both relaxation and elastic gradients coexist, durotaxis appears more efficient in controlling directed cell migration, which we confirm with experimental results. However, the presence of opposing relaxation gradients to an elastic one can arrest or shift the migration direction. Our model rationalizes for the first time the mechanisms that govern viscotaxis and its competition with durotaxis through a mathematical model.

1. Introduction

Cell migration determines key biological processes such as embryonic development, tissue regeneration, wound healing, and tumor invasion [1–3]. For decades, there has been increasing interest in understanding how cells organize themselves to migrate. There is also growing concern about controlling cell migration, as it may allow us to arrest tumor metastasis [4–6], enhance tissue regeneration, and design better biomimetic materials [7,8]. Three forces cooperate to enable cell migration on two-dimensional (2D) substrates (see Fig. 1). First, the F-actin network, along with myosin motors that pull on actin filaments, creates an active viscoelastic flow, or retrograde flow [9, 10]. Second, the F-actin network continuously polymerizes, pushing the cell membrane outward [11,12], creating a differentiated actin network compared to the contractile actomyosin network. These two competing actin networks, the first moving inwards and the latter outwards, determine the protruding velocity of the cell contour and, therefore, cell migration. Third, cells create adhesions that link the intracellular actomyosin network with the extracellular matrix (ECM). Cell adhesion is mediated by molecules that sense and respond to the mechanical properties of the ECM [13–15]. Through the formation and disassembling of adhesion complexes, cells tune the friction between the intracellular network and the ECM.

But then, how does a cell organize itself to determine the direction of migration? Most cells require stimuli to break the symmetry in the intracellular force generation or extracellular force transmission to enable directed cell migration. Otherwise, cells would just spread with symmetric distributions of F-actin retrograde flow, polymerization, and adhesion formation [16,17]. Mechanical [3,18–20] and chemical signals [21,22] have been well studied. In terms of mechanical cues for cell migration, which we analyze here, most studies have focused on durotaxis, the motion of cells towards elastic stiffness gradients of the ECM [18,19,23,24]. Durotaxis is expressed across different cell types, including fibroblasts [25], smooth muscle cells [26], neurons [24], and cancer cells [27]. When cells are placed on ECM with an elastic stiffness gradient, they establish an asymmetric adhesive state [28,29], with one side of the cell more adhesive than the other. In response to this friction gradient between the cell and the substrate, the retrograde flow also polarizes [29] and establishes a prospective cell front and rear. Moreover, the direction of the adhesion gradient determines whether the cell front orients towards the positive or negative elastic stiffness gradient [29].

However, extracellular matrices *in vivo* are not purely elastic but also present viscous properties [30]. The viscoelasticity of the ECM

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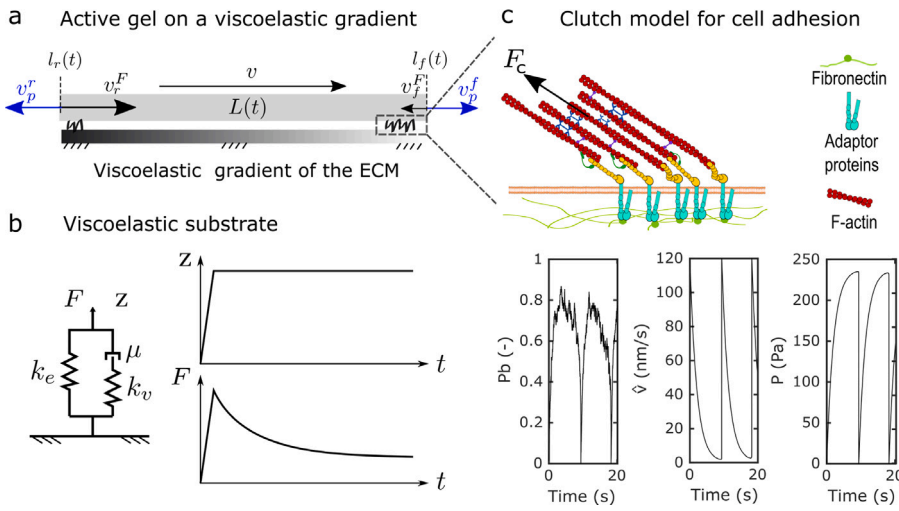


Fig. 1. (a) Sketch of the main forces acting in cell migration velocity (v). A contractile actomyosin flow, (v^F black arrows), competes with protrusive forces at the front ($l_f(t)$) and rear ($l_r(t)$) of the cell (v^p , blue arrows). At the cell-ECM interface, intracellular forces are transmitted extracellularly through a friction force that appears due to adhesion mechanisms. (b) A standard linear model describes the viscoelastic behavior of the ECM, determined by k_e , k_v , and μ . On the right are the force and displacement curves of a relaxation test. (c) Detail of an adhesion complex, made of adaptor proteins (top) and results of a clutch model (bottom). Results show the probability of bound binders, P_b , showing cycles of formation and rupture of the adhesion complex, the velocity of the actin filaments, \hat{v} , and traction forces on the substrate, P .

mediates several cell functions, including the formation of adhesion complexes [31–34], cell differentiation [34,35], proliferation [34,36], lamellipodial and filopodial protrusion [37], and cell spreading [31–33,38]. Most studies have analyzed the effect of homogeneous viscous properties of the ECM on cell function. How cells migrate along gradients in the relaxation properties of the ECM has only been preliminarily analyzed experimentally, without exploring the underlying physical processes that determine viscotaxis [39] or through physical models that neglect the heterogeneous internal retrograde flow and actomyosin distribution [40], which is cause and effect of directed cell migration. Here, based on the same principles that drive durotaxis, we reveal through physical models mechanisms of cell viscotactic migration in 2D. Moreover, because elastic and relaxation gradients may appear simultaneously *in vivo* and *in vitro*, we analyze how durotaxis and viscotaxis compete with each other, which has not been addressed by any previous work. A clear understanding of how elastic and viscous gradients affect each other can allow us to better engineer biomaterials for specific biological functions.

In this work, we first describe the mathematical models used for cell adhesion (the clutch model) and for the cell motility (an active gel model). Next, we discuss how we prepared the gel and tested mechanically. We finish the methods section by describing cell culture, time lapse microscopy and cell migration analysis of our work. The, in our results, we first show the cell adhesion behavior as a function of the elasticity and viscoelasticity of the ECM, which we later use to propose a mathematical model of single cell viscotaxis. Then, we explain theoretically how viscotaxis appear and show that viscotaxis can compete with durotaxis to control cell migration. Finally, we conclude discussing the main results of our work.

2. Materials and methods

2.1. Clutch model for cell adhesions based on Monte Carlo simulations

We use previous clutch models to understand the response of cell adhesion to the viscoelasticity of the ECM [29,41–43] (Fig. 1(b-c)). It considers several molecular clutches that attach to the ECM on one side and to the adaptor talin rod on the other. At its other end, talin is linked to actin filaments pulled by myosin motors. The computation of the clutch model relies on repeated random sampling, which we solve by a Monte Carlo (MC) simulation, during which many events of engagement and disengagement occur, resulting in cycles of formation and rupture of adhesion complexes (see Fig. 1c). We use a constant time step, $\Delta t = 0.005$ s, and a final time of $t_f = 100$ s, which was shown to

provide accurate results [43]. Then, the MC simulations are averaged over time to obtain the results at specific mechanical properties of the ECM.

During the cycling process of cell adhesion, the actomyosin network pulls on the adhesion molecules thanks to the contractile forces of the myosin motors. The actin velocity, \hat{v} , is given by the force-velocity relation

$$\hat{v} = v_u (1 - F/F_{stall}), \quad (1)$$

where v_u is the free velocity of the actin flow. F_{stall} is the stall force of the myosin motors, being $F_{stall} = n_m F_m$, where F_m is the force required to stall the activity of one myosin motor and n_m the number of motors in the system. F is the reaction force in the substrate, which balances the force on all the molecular clutches, $F = \sum_{i=1}^{n_{eng}} F_{c,i}$, being n_{eng} the number of engaged clutches. The displacement of the engaged clutches is computed as $\Delta z = \hat{v} \Delta t$, and the displacement of the substrate at the current time step, z^{n+1} , is obtained by solving the balance of forces between the n_{eng} engaged molecular clutches and the substrate, from where we can later obtain F .

The force at each i th clutch, $F_{c,i}$, is given by $F_{c,i} = \kappa_c (z_{c,i} - z_{sub})$, where κ_c is the stiffness of each molecular clutch (see [41–43] for details) and $z_{c,i}$ is the displacement of the i th molecular clutch, z_{sub} is the displacement of the substrate. Once F is computed, the cell traction can be obtained, $P = F/\pi a^2$, where (πa^2) is the area occupied by a circular adhesion complex.

Moreover, once the force at each clutch, $F_{c,i}$, is computed, we can calculate the binding and unbinding events at each molecular clutch. The attachment of the n_c molecular clutches to the ECM, which represents the integrin-ECM link, follows a catch-bond behavior [42,44]. Several molecular clutches bind to the ECM with a constant rate k_{on} , and unbind with a dissociation rate k_{off}^* , that depends on the force on each molecular binder, F_c , as

$$k_{off}^* = k_s^{off} e^{(F_c/F_b^{slip})} + k_c^{off} e^{(-F_c/F_b^{catch})}, \quad (2)$$

where the first and second terms represent a slip and catch bond, respectively. k_s^{off} and k_c^{off} and F_b^{slip} and F_b^{catch} are the unloaded dissociation rates and the characteristic bond rupture forces in the slip and catch pathways, respectively.

Mechanosensitivity is promoted by talin unfolding, which induces vinculin recruitment and subsequent integrin clustering [42]. This process of integrin crowding is usually termed adhesion reinforcement. We introduce talin reinforcement by considering talin unfolding according to Bell's model at a rate k_{unf}^* [42]. Then, it can either refold again or vinculin can bind to it at a force-independent rate k_{onv} . If talin unfolds,

Table 1

Left: Parameters adopted for the clutch model of cell adhesion. The model parameters for the catch bonds with talin reinforcement are obtained from [42,43]. The unbinding rate is considered to follow a cycle of mechanical reinforcement, following $k_{off}^* = 8.10^{-4} e^{(F_r/8.16)} + 10.14 e^{(-F_r/6.24)} + 900 e^{(-F_r/0.01)}$ [42]. Right: Parameters adopted for the cell migration model and related references. * indicates that the value was adjusted in this work.

Clutches parameter	Migration parameters		
a (nm)	1700	μ^F (kPa s)	10 [48,49]
n_c	1200	η_0 (kPa s/ μm^2)	0.05 [48,49]
κ_c (pN/nm)	1000	ζ (kPa)	0.05 [47,48]
k_{om} ($\mu\text{m}^2/\text{s}$)	2.11×10^{-4}	k	0.1 [49]
d_{int} (int / μm^2)	300	D_F (μ m/s)	0.3 [48,50]
F_m (pN)	2	D (μ m/s)	0.4 [48,50]
n_m	800	k_d	0.1 [51,52]
v_u (nm/s)	110	k_p	0.1 [51,52]
k_{omv} (s^{-1})	1×10^8	v_0^p (μ m/s)	0.55 [53]
int_{add} (int / μm^2)	24	L_b (μm)	7 *
m_r (int / μm^2)	15 000	τ_{stall} (nN/ μm)	0.4 *
Δt (s)	0.005		
t_f (s)	100		

it can either refold again or vinculin can bind to it. Then, integrin density increases by $int_{add} = 24$ integrins/ μm^2 and the binding rate of integrins results in $k_{on} = k_{om}d_{int}$, where k_{om} is the true binding rate characterizing each integrin-fibronectin bond, and d_{int} is the density of integrins in the adhesion complex. We do not allow integrin density to go above a maximum integrin density, m_r , determined by the separation between integrins (see [43] for details). If the clutch unbinds before vinculin binds to talin, integrin density is decreased by int_{add} , reflecting the fact that adhesions lose integrins if force application is decreased [45,46].

To model the viscoelastic behavior of the ECM, we use the Maxwell representation of a Standard Linear Solid (SLS) model such that the stress-strain relation is given as

$$F + \mu/k_v \dot{F} = k_e z_{sub} + \mu(k_v + k_e) \dot{z}_{sub}/k_v. \quad (3)$$

k_e is the long-term stiffness, k_v is the relaxation stiffness, which represents the drop to the long-term stiffness as the material relaxes, $\dot{z}_{sub} = \hat{v}$, and μ is the viscosity of the ECM (see Fig. 1(b)). The time derivatives are discretized using a backward Euler method, which results in an equation for z_{sub}^{n+1} as a function of F^{n+1} .

Here, we assume that the friction between the cell and the ECM is $\eta = P/\hat{v}$ [29,47], so friction changes as a function of the ECM stiffness similar to how actin velocity and tractions change. This relation assumes that strong and stable adhesions, which are represented by large traction forces, induce large friction in comparison to small and weak adhesion complexes.

All model parameters related to the clutch model are summarized in Table 1.

2.2. Active gel model and numerical solution of the system of equations

Recently, we and others have shown that durotaxis emerges from an asymmetry in the cell adhesion strength [28,29]. Hence, our results on these friction gradients due to gradients in the relaxation properties of the ECM strongly suggest that single cells may also express viscotaxis.

To analyze the exposure of single motile cells to relaxation gradients of the ECM, we use an active gel model of cell migration [29, 47,49,54]. We consider a 1D domain, Ω , with moving coordinates $x(t) \in [l_r(t), l_f(t)]$, where $l_r(t)$ and $l_f(t)$ represents the rear and front boundaries of the cell and, therefore, the cell length is determined as $L(t) = l_f(t) - l_r(t)$ (Fig. 1). The retrograde flow is modeled with a contractile viscous gel in contact with the ECM. The constitutive relation for the stress in the active fluid is given as

$$\sigma^F = \mu^F \partial_x v^F + \zeta \rho^F \rho^M. \quad (4)$$

v^F is the velocity of the retrograde flow, μ^F is the shear viscosity, ζ the active contraction exerted by the myosin motors and ρ^M and ρ^F are the densities of myosin motors and F-actin, respectively (see below). The balance of linear momentum for the active gel is then

$$\partial_x \sigma^F = \eta^F v^F. \quad (5)$$

We assume zero stresses on the cell boundaries. The right-hand side represents the friction between the intracellular network and the ECM, where the clutch model for cell adhesion described above couples with the active gel model for cell migration. The friction parameter is $\eta^F = \eta_0 + \eta$, where η is described above and $\eta_0 = 0.05$ kPa·s/ μm^2 is added to the effective friction η as baseline friction of the retrograde flow with the surrounding cytoskeletal structures.

To compute the velocity of actin network polymerization against the membrane, which we consider as a separated F-actin structure, we use previous models (see [53,55,56] for details) where actin polymerization decreases when the membrane tension increases as $v^p = v_0^p [1 - \tau(L(t))/\tau_{stall}]^8$ from a free-growth velocity v_0^p . τ_{stall} is a tension required to stall the polymerization of the actin network. The membrane tension is calculated as a linear Hookean spring, $\tau(L(t)) = k(L(t) - L_b)$, $L(t) < L_b$, where k is the spring constant and L_b accounts for the resting length and the buffer membrane length of the cell membrane. The model assumes zero compressive stresses. The outward polymerization velocities, $v_{r,f}^p$, compete with the inward retrograde flow velocity, $v^F|_{r,f}$, at the cell rear and front. This competition makes the cell ends expand or retract with velocity $\dot{l}_{r,f}(t) = v_{r,f}^p - v^F|_{r,f}$, respectively (Fig. 1) and the migration velocity is defined as $v = (\dot{l}_r(t) - \dot{l}_f(t))/2$, the mean value of the front and rear velocity of the cell. The distribution of the F-actin density, $\rho^F(x, t)$ is modeled through the following transport equation,

$$\partial_t \rho^F + \partial_x (w \rho^F - D_F \partial_x \rho^F) = k_p - k_d \rho^F, \quad (6)$$

where the right-hand side includes the polymerization and depolymerization terms with rates k_p and k_d , respectively [52], D_F is the diffusive parameter of the F-actin. Similarly, the myosin motors bound to the F-actin network [57], ρ^M , as

$$\partial_t \rho^M + \partial_x (w \rho^M - D \partial_x \rho^M) = 0, \quad (7)$$

where D is the effective diffusion parameter [49,50].

F-actin and bound myosin motors are also drifted in the cell frame with velocity $w = v^F - v$. We impose zero fluxes on the cell boundaries to reflect that no F-actin or myosin motors can enter or leave the cell domain.

To solve the system of PDEs described above, we use a staggered finite element method to discretize the system in space, and an implicit second-order Crank–Nicholson method to discretize the equations in time [58,59]. To avoid undesired oscillations from the numerical solution of the parabolic equations if the problem becomes convective dominant, i.e. $Pe > 1$, we include the Stream-Upwind Pretrov Galerkin (SUPG) stabilization term. This strategy allows us to use finite elements of constant size $h = l_f(t)/N$, where N is the number of elements and, consequently, keep the number of elements of our domain constant. The complete finite element and time discretization have been presented previously [57]. All model parameters related to the migration model are summarized in Table 1.

2.3. Gel preparation and mechanical testing

All the experimental procedures and experimental data described in this work for the gel mechanical properties are taken from a previous publication [39]. Viscoelastic properties, represented by the storage modulus (G') and loss modulus (G''), were measured for each gel. Creep measurements were also performed with both gels where constant shear stress, σ_0 , was applied and strain γ was measured for an hour.

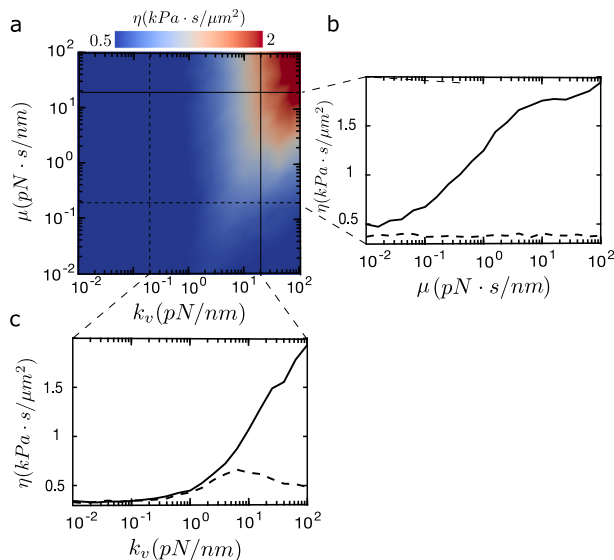


Fig. 2. (a) Friction of the cell-ECM adhesion, η , for $k_e=1$ pN/nm and a range of values of the relaxation stiffness, k_e , and viscosity, μ . (b) Friction as a function of the viscosity, μ , for $k_e=0.2$ pN/nm (dash line) and $k_e=20$ pN/nm (solid line). (c) Friction as a function of the relaxation stiffness, k_e , for $\mu=2$ pN·s/nm (dash line) and $\mu=20$ pN·s/nm (solid line).

Here, we fit the experimental compliance ($J = \gamma(t)/\sigma_0$) with the compliance expression of a SLS model,

$$J(t) = \frac{1}{k_e} \left(1 - \left[\frac{k_v}{k_e + k_v} \right] \exp\left(-\frac{k_e k_v}{\eta(k_e + k_v)} t\right) \right), \quad (8)$$

using the non-linear least squares fitting algorithm in MATLAB. Since the initial compliance $J(0) = 1/(k_e + k_v)$ is known and is equal for both high-loss and low-loss gels (as seen from the experimental data), $k_e + k_v$ was constrained to remain constant for the two fits.

2.4. Cell culture, time lapse microscopy and cell migration analysis

Again, the experimental data described in this work for the cell culture are taken from a previous publication [39]. In short, umbilical cord human Mesenchymal stem cells (UC-hMSCs) between passages 4 and 7 were used for the experiments. Then, the paths of the cells were tracked using the ImageJ software (National Institutes of Health, Bethesda, USA) plugin with manual tracking developed by Fabrice Cordelières at Institut Curie, Orsay, France, and further migration analysis was done using the “Chemotaxis and Migration Tool” plugin developed by IBIDI Software. We refer to our previous work for details [39].

3. Results

3.1. Adhesion behavior as a function of the elasticity and viscoelasticity of the ECM

We first analyze the cell adhesion behavior for substrates of different long-term stiffnesses, relaxation stiffnesses, and viscosities (Fig. 2). Changes in long-term stiffness are related to durotaxis. In agreement with previous models [29,42], the friction increases as we increase k_e (see Fig. 2(a)). To analyze the viscoelastic effects, we fix the long-term stiffness, $k_e=1$ pN/nm, and analyze the effect of the relaxation stiffness k_v and viscosity μ . We show an increase in the friction between the cell and the substrate as we increase k_v and μ (Fig. 2(b)). For a relaxation stiffness lower than ≈ 1 pN/nm, friction vanishes for all values of ECM viscosities, $\mu < 0.5$ pN·s/nm (Fig. 2(c)). For values of k_v bigger than ≈ 1 pN/nm, friction increases as the viscosity of the ECM increases (Fig. 2(c)). For constant values of viscosity, we show a transition for

friction values. For viscosities larger than ≈ 10 pN·s/nm, we observe monotonically increasing values of friction, that reach ≈ 2 kPa·s/μm². For viscosities smaller than ≈ 4 pN·s/nm, we see a biphasic behavior. Friction increases up to ≈ 0.7 kPa·s/μm² at $k_v \approx 10$ pN/nm, and then it decreases, describing a negative gradient for the relaxation stiffness (Fig. 2(c)).

Our results confirm previous data on how cell adhesion responds to the elastic stiffness of the ECM [29,41,42], showing that cells migrate towards positive gradients of friction created by the asymmetric strength in cell adhesions [28,29]. When cells express talin reinforcement, as in our model, this migration occurs towards the positive gradient of the elastic stiffness [29,42]. Further, we show that an increase in the viscosity for constant values of relaxation stiffnesses behaves equivalently to a stiffness increase in pure elastic substrates with cells expressing talin reinforcement [42]. However, an increase in the relaxation stiffness induces, for increasing values of viscosity, a transition from an adhesion behavior reminiscent of non-reinforced adhesion complexes to reinforced ones (Fig. 2(c)).

3.2. Theory predicts viscotaxis in single cells

We simulate cells placed on substrates of length L_s equal to 200 and 1000 μm (Fig. 3). To obtain values of friction in the moving coordinate system that represents the migrating cell, k_e , k_v , and μ become functions of space that follow a linear relation with positive (e.g. xk_e/L_s) or negative slope (e.g. $k_v(L_s - x)/L_s$). Because the absolute viscoelastic properties in which cells are initially located modify the friction they experience, we also analyze three different initial locations. In these three samples, we fix the long-term stiffness to $k_e = 1$ pN/nm and we vary independently k_v and μ from 10^{-2} to 10^2 (Fig. 2b-c). We consider that cells undergo viscotaxis if the migration velocity is larger than $v = 1$ nm/s, otherwise we assume that they spread and remain stationary. Cells on the 200 μm sample express the strongest viscotactic response compared to the 1000 μm sample, which did not express viscotaxis (Fig. 3). In all cases, the strongest viscotactic response is obtained for cells located at the largest gradient of the sample. Therefore, to analyze the differences between the viscous properties of these matrices in detail, we focus on the 200 μm sample Fig. 3(a).

Cells initially located at the center of the sample show a persistent positive viscotaxis with velocities of ~ 5 nm/s for samples of varying k_v and fixed $\mu=2$ and 20 pN·s/nm. Same behavior is observed for samples of varying μ and $k_v \approx 20$ pN/nm. On the other hand, cells initially located at the center of the sample but of a constant $\mu=0.02$ pN·s/nm remained stationary because there was no friction gradient for the cells to polarize. The same behavior is observed for samples of varying μ and $k_v \approx 0.02$ pN/nm (see Fig. 2b-c). However, when cells are initially located at that same middle spot but for samples of varying k_v and constant $\mu = 2$ pN·s/nm, they express negative viscotaxis as they move towards negative gradients of the viscosity, which correspond to regions where the friction gradient is negative (Fig. 2c).

Our results show that in most cases cells migrate towards the positive gradients of the relaxation parameters k_v and μ of the ECM (Fig. 3), i.e. expressed positive viscotaxis. However, there are specific combinations of viscous properties that induce negative viscotaxis. Our results suggest, in agreement with previous results on durotaxis [28, 29], that gradients in the relaxation stiffness of the ECM can express both positive and negative viscotaxis. However, gradients in μ can only induce positive viscotaxis. All these results are explained by the adhesion strength shown in the previous section (Fig. 2). In other words, our results indicate that cells will always migrate with the cell front oriented with the strongest adhesion or, equivalently, towards positive gradients of friction [29]. The asymmetric adhesion forces induce asymmetric retrograde flow which, given the constant polymerization velocity at both cell edges, establishes the cell front.

3.3. Viscotaxis is mediated by intracellular asymmetric motile forces

To get a deeper understanding of how viscotaxis emerges and progresses, we analyze the intracellular motile forces that coordinate

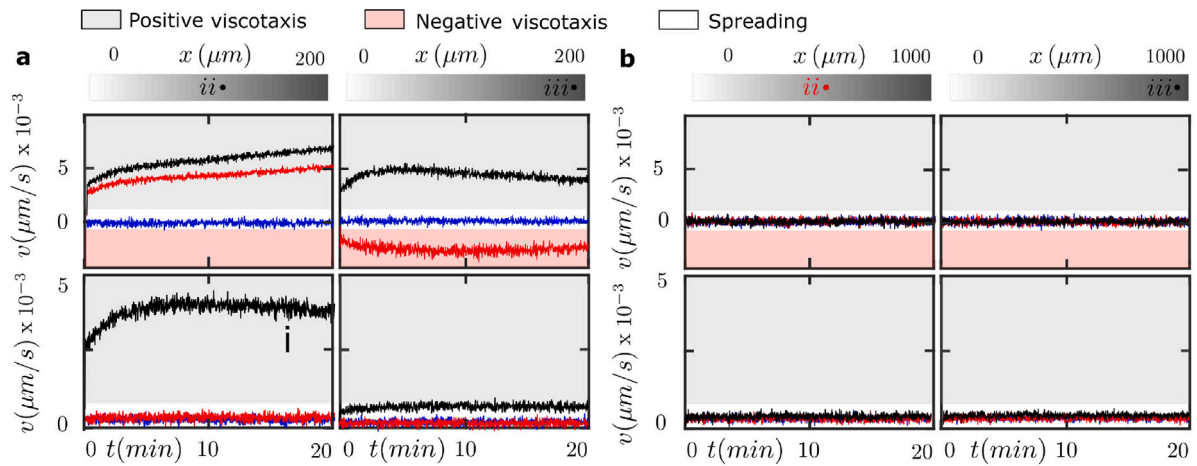


Fig. 3. Migration velocity over time for substrates of 200 μm (a) and of 1000 μm (b) in length. Left and right columns are for cells located at points ii and iii, respectively. Cells located at point i did not migrate (data not shown). For each substrate, results in the first row are for fixed values of μ to 0.02 (blue), 2 (red), and 20 (black) pN·s/nm while cells migrate on a substrate of varying k_v . In the second row, we fixed values of k_v to 0.02 (blue), 0.2 (red), and 20 (black) pN/nm while cells migrate on a substrate of varying μ .

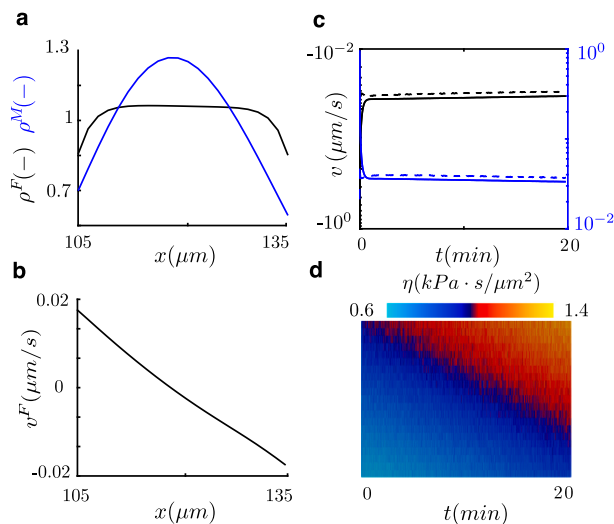


Fig. 4. For the black line case (i in Fig. 3a, bottom-left) we show the evolution of intracellular variables in space and time. At steady state, (a) actin (black) and myosin (blue) densities and (b) retrograde flow, (c) polymerization velocity (solid) and the retrograde velocity at the cell membrane (dash) in time, and (d) kymograph of the friction η .

cell migration in space and time. We focus on the case that showed the strongest viscotactic response (sample with a viscous gradient of 200 μm in length, fixed $k_e=0.1$ pN/nm and $k_v=20$ pN/nm, and cells initially located at $\mu=20$ pN·s/nm). As cells migrate, they travel through regions of different viscosities and, therefore, the friction computed through the clutch model changes in space and time (Fig. 4d). This heterogeneous friction along the cell creates an asymmetric retrograde flow (Fig. 4b, which competes with the constant polymerization velocity v^p at the cell ends (Fig. 4c). The right end protrudes faster and, therefore, represents the cell front. The asymmetric retrograde flow also polarizes the actomyosin network (Fig. 4a). All other cases of viscotaxis described above exhibit similar results, with the model variables polarized towards the positive or negative direction, and at a smaller or larger extent, depending on the strength of the cell friction. Because viscotaxis and durotaxis emerge from the same force principles, the strength of the cell adhesion and, therefore, the strength

of the asymmetric friction values, our results are in agreement with the behavior observed during durotaxis [28,29].

3.4. Competition between viscotaxis and durotaxis

Then, we wonder how viscotaxis competes with durotaxis. Gradients of the elastic stiffness may coexist with gradients of the relaxation properties of the ECM *in vivo*. Therefore, it is important to understand how these two different but coexisting mechanical signals may control cell migration. To do so, we take our previous model of durotaxis [29] and put it in competition with our current model of viscotaxis. We name this cooperative response as viscoelastotaxis.

We use again the strongest viscotactic response described above. However, we let the long-term stiffness k_e change to enable durotaxis. We also use the strongest durotactic response for a sample of 200 μm in length where the long-term stiffness changes between 10^{-2} to 10^2 pN/nm. We simulate matrices where the long-term and viscosity stiffness change along the same direction or opposite to each other. For aligned viscoelastic and elastic gradients, the friction profile is similar to pure viscotaxis (Fig. 5a), although the migratory ability is enhanced and cells reach a maximum velocity of 6 nm/s. However, when the two mechanical gradients of the ECM are in opposite directions, cells may express positive, negative, or null viscoelastotaxis. We show a minimum in friction at ≈ 1 pN/nm relaxation stiffness (Fig. 5(a). We term this spot diverging stiffness. Cells placed initially on the left of the diverging stiffness express negative viscoelastotaxis while cells on the right express positive durotaxis. Cells located at the diverging stiffness would tend to migrate away from it contrary to durotaxis, where an optimum rigidity marks a goal location for the cells to migrate [29].

Finally, we use previous experimental results [39] to validate our computational model. Cells were located in substrates of different viscous and elastic properties. In summary, two drops of pre-polymer solutions, which we also tested mechanically, are placed in contact and diffuse with each other to form a relaxation gradient (see [39] and Materials & Methods for details). The frequency sweep test showed that these materials have the same storage modulus (G') but different loss moduli (G''). From the small amplitude oscillation regime, we show that the elastic moduli were nearly the same for both gels, which also translates to equal short-term for both gels (see Fig. 6a). These two polymers were also tested in a creep test for applied stress of $\sigma_0=10$ Pa. High loss and low loss gels deform equally at short time scales ($t < 2$ s). Fitting of the material parameters to the SLS model

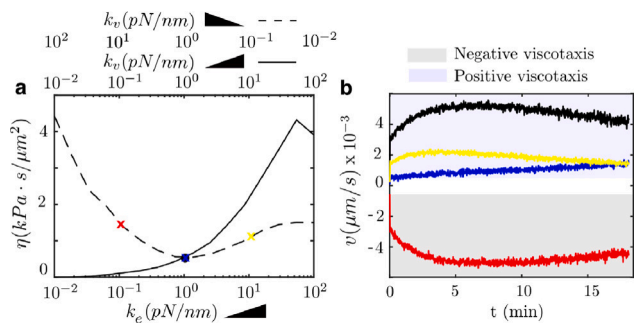


Fig. 5. (a) Effective friction for the aligned elastic and relaxation gradients (solid line) and opposing elastic and relaxation gradients (dash line). Gradient direction is specified by a triangle. Friction increases monotonically for increasing values of the elastic stiffness, while it presents a concave shape with a minimum at ≈ 1 pN/nm , where the diverging rigidity localizes. (b) Migration velocities of single cells in a sample of $200 \mu m$ in length exposed to aligned and opposing durotactic and viscotactic signals. Black line corresponds to the case of aligned gradients. For opposing cues, cells are initially located at the red cross ($k_e=0.1$ pN/nm and $k_v=10$ pN/nm), blue cross ($k_e=1$ pN/nm and $k_v=1$ pN/nm) and yellow cross ($k_e=10$ pN/nm and $k_v=0.1$ pN/nm) in panel a. Colors in velocities in panel b correspond to these colors in panel a.

positive gradient of the long-term modulus, in opposite directions to the viscous gradients (Fig. 6 c). Then, we simulate the same viscoelastotaxis case. Our results reproduce the migration towards the positive gradient of the long-term modulus (see control case, Fig. 6d).

To further explore the model results, we performed several simulations to predict how visco-elastotaxis would behave if the material properties changed. We set each of the viscoelastic parameters constant and leave the others as the control case (Fig. 6d). Our results show that if we keep k_e or k_v and k_v constant migration direction is reversed. A closer look into the migration velocities indicates that the opposing gradients in k_e and k_v act as competing mechanical stimuli. When one of these parameters is kept constant, the migration direction increases by one order of magnitude, indicating that in the control case, they were acting against each other. When μ was fixed, we observed a mild change in migration velocity. These results indicate that the relaxation time scale is far from the timescale of the adhesion cycle determined by the clutch model. Indeed, when k_e and k_v are fixed, migration velocity decreases by one order of magnitude.

4. Discussion

A deep understanding and precise control of cell migration are key for medicine and bioengineering as it may allow us to not only understand how tumor cells invade and metastasize [4,5] or how cells orchestrate tissue regeneration [1,60], but also to engineer cell migration for better biomimetic tissue designs [61,62].

In this work, we have shown through physical arguments how single cells may express viscotaxis, as previously shown by an experimental study. Most living tissues are viscoelastic; therefore, cells migrating across these materials feel a combination of viscoelastic properties. Understanding how gradients in the relaxation properties of the ECM may impact cell migration is a fundamental question in biology, medicine, and bioengineering.

Here, we show that the same physical mechanisms that enable durotaxis dictate viscotaxis. Our results show that gradients of the relaxation properties of the ECM may activate an oriented cell migration thanks to an asymmetric adhesion strength, or cell-ECM friction. We also show that specific combinations of viscoelastic properties may induce positive and negative viscotaxis. Specifically, gradients in the viscosity of the ECM always induce positive viscotaxis when the relaxation stiffness is large enough compared to the long-term stiffness, or no migration at all if the relaxation stiffness is negligible because no relaxation of the material occurs at the time scales of the cellular adhesion. However, gradients in the relaxation stiffness show both positive and negative viscotaxis. If the relaxation stiffness is smaller or similar compared to the long-term stiffness, cells will migrate with a weak positive viscotaxis, because the material's relaxation will also be weak. As the values of the relaxation stiffness increase, positive viscotaxis is enhanced when a large viscosity of the material allows for material relaxation. However, if the viscosity is low compared to the time scale of cell adhesion, the effect of high relaxation stiffness is hindered.

We also confronted viscotaxis and durotaxis and found that a diverging minimum in the cell friction makes cells migrate away from it, contrary to what happens with the optimum stiffness in durotaxis [28, 29]. Other mathematical models of durotaxis have also been used to explain how durotaxis emerged [63–66]. This diverging point appears due to the sum of the opposing gradients in the long term and relaxation stiffnesses, or friction. The point at which the minimum of these added contributions appears corresponds to the diverging minimum. Our results also indicated that durotaxis seems to be more efficient in controlling oriented cell migration than viscotaxis. However, a viscous gradient could also shift the direction of durotaxis, or inhibit it. When the relaxation timescale of the material is much larger than the adhesion timescale, or when the relaxation stiffness is low compared to the long-term stiffness, cells mostly sense the nearly elastic long-term

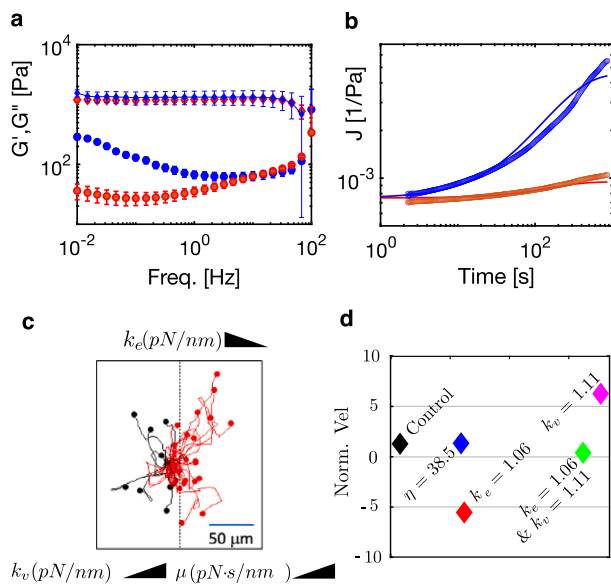


Fig. 6. (a) Experimental frequency sweep G' modulus (diamonds) and G'' modulus (circles) for Low Loss (blue) and High Loss (red) gels. (b) Compliance (J) of the Low Loss (blue) and High Loss (red) gels. The experimental compliance (circles) was fitted following the SLS model (lines). (c) A collection of tracks for many cells obtained from multiple independent experiments of hMSCs migrating on the gels with gradients in the viscoelastic properties. The material varies from $k_e = 1.06$ pN/nm , $k_v = 0.28$ pN/nm and $\mu=38.5$ $pN \cdot s/nm$ on the left to $k_e = 0.22$ pN/nm , $k_v = 1.11$ pN/nm and $\mu=46.2$ $pN \cdot s/nm$ on the right (scale bar $50 \mu m$). (d) Normalized velocities with respect to the control case in (c). Colors represent the control case in black, fixed μ in blue, fixed k_e in red, fixed k_e and k_v in green, and fixed k_v in magenta.

(Fig. 6b). showed that the first material has $k_e = 1.06$ pN/nm , $k_v = 0.28$ pN/nm and $\mu=38.5$ $pN \cdot s/nm$ and the second has $k_e = 0.22$ pN/nm , $k_v = 1.11$ pN/nm and $\mu=46.2$ $pN \cdot s/nm$. This represents a complex viscotactic state where gradients of long-term and viscous modulus and viscosity are established in opposite directions and the prediction of what direction cells would move towards is not clear.

Then, cells were seeded on the substrate and the migration direction was measured. 23 cells out of 33 analyzed migrated towards the

stiffness of the substrate. In these cases, the viscotactic response is weak and cell migration would be due to durotaxis or would not occur.

These opposing responses of viscoelastotaxis can be used for designing relaxation gradients of the ECM to either arrest or shift an initially oriented durotactic response (see Fig. 5). Or, the other way around, elastic stiffness gradients can be manipulated to change pure viscotactic responses, as shown in Fig. 5.

There is also limitation in our model that should be addressed in the future. The first one is due to the 1D approach we chose, which limits the analysis of shape changes in the cell or the study of migration in more complex environments. Well-established numerical methods could be used in the future to address migration in higher dimensions [67,68]. We also used a simple SLS model. Perhaps, certain ECMs are better reproduced with other viscoelastic models. Moreover, we focused exclusively on mechanical signals and, if they are not present, the cell would just spread symmetrically. However, there are always other signals that may also coexist with the mechanical gradients, and that can be responsible for the natural polarization of the cell. These signals can trigger downstream polarization of GTPases [69] that may self-polarize due to noisy stimuli, which would eventually polarize the downstream signals that, eventually, induce cell migration. Such interaction between mechanical and chemical signals should be addressed in the future.

In summary, we have added the effect of a viscous matrix to the notion of durotaxis and rationalized how viscotaxis works. Our model describes for the first time the competition between elastic and viscous gradients of the ECM and establishes a new, or more complex mechanical signal to control cell migration.

CRedit authorship contribution statement

Pablo Saez: Writing – review & editing, Writing – original draft, Software, Methodology, Investigation, Formal analysis, Conceptualization. **Pallavi U. Shirke:** Data curation. **Jyoti R. Seth:** Formal analysis. **Jorge Alegre-Cebollada:** Writing – review & editing, Conceptualization. **Abhijit Majumder:** Writing – review & editing, Supervision.

Declaration of competing interest

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

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