Hydrodynamics of transiently cross-linked actin networks: theory, numerics, and emergent behaviors

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> > Vancouver, May 2023



Outline

Cytoskeleton

Overdamped Langevin dynamics

Discrete fibers Elasticity Hydrodynamics

Fluctuating discrete fibers

Cross-linked actin gels

Conclusions and future work

Additional details

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Importance of actin cytoskeleton

Dynamic cross-linked network of slender filaments

- Morphology \leftrightarrow mechanical properties of cell
- Dictate cell's shape and ability to move and divide



Fibers involved in cell mechanics



 L_p =persistence length, L =fiber length, $a = \epsilon L$ =fiber radius, ϵ =slenderness ratio

Cytoskeletal rheology



Ahmed and Betz. PNAS. (2015)

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Actin filament *fluctuations* used for

- Sensing
- Motility
- Stress release (untying knots!)

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Key point: actin filaments are semiflexible $\ell_p\gtrsim L$

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- Spectral methods!



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Statics: Gibbs-Boltzmann distribution

 $\mathbf{X} \in \mathbb{R}^{N}$ = finite dimensional DOFs with energy function $\mathcal{E}(\mathbf{X})$.

Stationary distribution (probability of observing a state)



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- ▶ Prob. depends on ratio of energy with $k_B T$ (thermal energy)
- Dynamics must be time-reversible with respect to µ_{GB}

Dynamics: (Overdamped) Langevin equations

Commonly-used model for micro-structures immersed in liquid

$$\frac{\partial \mathbf{X}}{\partial t} = \underbrace{-\mathbf{M}(\mathbf{X}) \frac{\partial \mathcal{E}}{\partial \mathbf{X}}(\mathbf{X})}_{\text{Deterministic}} + \sqrt{2k_BT} \underbrace{\mathbf{M}(\mathbf{X}) \circ \mathbf{M}^{-1/2}(\mathbf{X})}_{\text{Mixed Strato-Ito}} \underbrace{\mathcal{W}(t)}_{\text{White noise}}$$

► **M**(**X**) is SPD mobility operator, encoding (hydro)dynamics

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Converting to Ito form gives

$$\frac{\partial \mathbf{X}}{\partial t} = -\mathbf{M} \frac{\partial \mathcal{E}}{\partial \mathbf{X}} + \underbrace{k_B T \left(\partial_{\mathbf{X}} \cdot \mathbf{M}\right)}_{\text{Stochastic drift term}} + \sqrt{2k_B T} \underbrace{\mathbf{M}^{1/2} \mathcal{W}(t)}_{Multiplicative \text{ noise}}$$

Goal is to write and solve such an equation for fibers

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Create "fiber" out of beads (blobs) and springs ► DOFs: X_{i} = bead positions



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Big problem: need small Δt to resolve stiff springs



Replace springs with rigid rods



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$$\mathbf{X}_{\{i\}} = \mathbf{X}_{\mathsf{MP}} + \Delta s \sum_{\mathsf{MP}}^{i} \boldsymbol{ au}_{\{k\}}$$

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- Small lengthscales come from *hydrodynamics* of long blob-link chain



Big idea: mix continuum and discrete



"Bending fluctuations in semiflexible, inextensible, slender filaments in Stokes flow" by O. Maxian et al., 2023, **ArXiv:2301.11123** https://github.com/stochasticHydroTools/SlenderBody

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- Mix of new methods + existing rigid body methods

Blob link and spectral



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- Can apply discrete blob-link methods (Brennan Sprinkle) for constrained *discrete* Langevin equation
- Combine with continuum methods for elasticity and hydrodynamics

Continuum part: energy

Fibers resist bending according to curvature energy functional

$$\mathcal{E}_{\mathsf{bend}}\left[\mathbb{X}(\cdot)\right] = rac{\kappa}{2} \int_0^L \partial_s^2 \mathbb{X}(s) \cdot \partial_s^2 \mathbb{X}(s) \, ds$$

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- $\kappa = \text{bending stiffness}$
- $\ell_p = \kappa/(k_B T)$ defines a "persistence length"
- Fibers bend on this length, shorter than this straight
- Hope for spectral methods when $\ell_p \simeq L$ (actin)



Discretize inner product on Chebyshev grid

$$\begin{aligned} \mathcal{E}_{\mathsf{bend}} \left[\mathbb{X}(\cdot) \right] &= \frac{\kappa}{2} \int_0^L \partial_s^2 \mathbb{X}(s) \cdot \partial_s^2 \mathbb{X}(s) \, ds \\ &= \frac{\kappa}{2} \left(\mathbf{E}_{N_x \to 2N_x} \mathbf{D}^2 \mathbf{X} \right)^T \mathbf{W}_{2N} \left(\mathbf{E}_{N_x \to 2N_x} \mathbf{D}^2 \mathbf{X} \right) \\ &= \frac{\kappa}{2} \left(\mathbf{D}^2 \mathbf{X} \right)^T \widetilde{\mathbf{W}} \left(\mathbf{D}^2 \mathbf{X} \right) \\ &= \mathbf{X}^T \mathbf{L} \mathbf{X} \end{aligned}$$

• Upsampling to grid of size $2N_x$ to integrate *exactly*

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Li et al. Geophys. J. Int. (2017).

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Force density
$$\mathbf{f} = \widetilde{\mathbf{W}}^{-1} \mathbf{F}$$
 (FEM: $\langle \mathbf{X}, \mathbf{f} \rangle = \mathbf{X}^T \mathbf{F}$)

Fluid dynamics of an immersed fiber

Immersed blob continuum hydrodynamic model (without Brownian fluctuations):

$$\nabla \pi (\mathbf{r}, t) = \eta \nabla^2 \mathbf{v} (\mathbf{r}, t) + \int_0^L ds \mathbf{f}(s, t) \delta_a (\mathbb{X}(s, t) - \mathbf{r})$$
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For the discrete case just replace integrals by sums over blobs.

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- Define the positive semi-definite hydrodynamic kernel

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where \mathbb{G} is the Green's function for (periodic) Stokes flow.

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where G is the Green's function for (periodic) Stokes flow.Choosing a surface delta function

$$\delta_{a}(\mathbf{r}) = \left(4\pi a^{2}\right)^{-1} \delta\left(r-a\right)$$

gives the Rotne-Prager-Yamakawa (RPY) kernel.

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- Converting between continuous force densities f(s) to discrete forces F (Galerkin projection), we get a mobility matrix

$$\mathbf{U}=\widetilde{\mathbf{M}}\mathbf{F}$$

Applying mobility



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Discrete time: solve for α = (Ω, U_{MP}), rotate by ΩΔt, update midpoint

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$$\begin{split} \mathbf{K} \boldsymbol{\alpha} &= \widetilde{\mathbf{M}} \left(-\mathbf{L} \mathbf{X} + \mathbf{\Lambda} \right) \\ \mathbf{K}^{T} \mathbf{\Lambda} &= \mathbf{0}, \end{split}$$

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Deterministic dynamics (eliminate Λ)

$$\partial_t \mathbf{X} = -\widehat{\mathbf{N}} \mathbf{L} \mathbf{X}, \qquad \widehat{\mathbf{N}} = \mathbf{K} \left(\mathbf{K}^T \widetilde{\mathbf{M}}^{-1} \mathbf{K} \right)^{\dagger} \mathbf{K}^T$$
Deterministic dynamics

Close system by introducing Lagrange multiplier forces $\pmb{\Lambda}$

- No work done for inextensible motions (principle of virtual work)
- Constraint $\mathbf{K}^{\mathsf{T}} \mathbf{\Lambda} = \mathbf{0}$ (comes from L^2 adjoint of \mathbf{K})

Results in saddle point system for α and $\pmb{\Lambda}$

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Apply $\widehat{\mathbf{N}}$ via iterative saddle pt solve with block-diagonal preconditioner.

Discrete Langevin equation

Deterministic dynamics + time reversibility \rightarrow Langevin equation

$$\partial_{t} \mathbf{X} = -\underbrace{\widehat{\mathbf{NLX}}}_{\text{Backward Euler}} + \underbrace{k_{B} T \partial_{\mathbf{X}} \cdot \widehat{\mathbf{N}}}_{\text{Midpoint integrator}} + \underbrace{\sqrt{2k_{B} T} \widehat{\mathbf{N}}^{1/2}}_{\text{Saddle point solve}} \mathcal{W}(t)$$

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- Drift term captured *in expectation* via solving at the midpoint (Brennan/Aleks)
- $\widehat{\mathbf{N}}^{1/2}$ captured via saddle point solve

$$\begin{split} \mathbf{K} \boldsymbol{\alpha} &= \widetilde{\mathbf{M}} \left(-\mathbf{L} \mathbf{X} + \mathbf{\Lambda} \right) + \sqrt{\frac{2k_B T}{\Delta t}} \widetilde{\mathbf{M}}^{1/2} \mathbf{W} \\ \mathbf{K}^T \mathbf{\Lambda} &= \mathbf{0}, \\ \Rightarrow \boldsymbol{\alpha} &= \mathsf{Deterministic} + \sqrt{\frac{2k_B T}{\Delta t}} \widehat{\mathbf{N}}^{1/2} \mathbf{W} \end{split}$$

▶ $\mathbf{W} \sim \mathcal{N}(0,1)$

$$P_{\mathsf{eq}}\left(\bar{\boldsymbol{\tau}}\right) = Z^{-1} \exp\left(-\mathcal{E}_{\mathsf{bend}}(\bar{\boldsymbol{\tau}})/k_B T\right) \prod_{p=1}^{N} \delta\left(\boldsymbol{\tau}_{\{p\}}^{T} \boldsymbol{\tau}_{\{p\}} - 1\right)$$

The overdamped Langevin equation is in detailed balance wrt the distribution

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- Here: present supporting numerical results

Samples from GB: free fibers



for finite N which disappears as N increases

Using the Langevin integrator to sample



to MCMC for smallest Δt

Reported in terms of longest relaxation timescale

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Using the Langevin integrator to sample



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- Reported in terms of longest relaxation timescale
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- Unchanged with ℓ_p (modes are stiffer, but fewer required)

Relaxation of fiber to equilibrium



Blob-link vs. spectral

Relaxation of fiber to equilibrium



Blob-link vs. spectral

Getting a good approximation to mean end-to-end distance?

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Blob-link vs. spectral

- Getting a good approximation to mean end-to-end distance?
- Is special quadrature doing what we want it to?

Quantifying relaxation $(\hat{\epsilon} = 10^{-2})$



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Spectral results approach blob-link with increasing N

Quantifying relaxation $(\hat{\epsilon} = 10^{-2})$



- Spectral results approach blob-link with increasing N
- Can extend spectral to smaller $\hat{\epsilon}$, but not blob-link!

Quantifying relaxation $(\hat{\epsilon} = 10^{-3})$



Outline

Cytoskeleton

Overdamped Langevin dynamics

Discrete fibers Elasticity Hydrodynamics

Fluctuating discrete fibers

Cross-linked actin gels

Conclusions and future work

Additional details

Dynamics of bundling in cross-linked actin networks

Couple the fibers to moving cross linkers (CLs, elastic springs)

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Dynamics of bundling in cross-linked actin networks

Couple the fibers to moving cross linkers (CLs, elastic springs)

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CLs bind fibers, pulling them closer together; ratcheting action creates bundles

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Goal is to explore the role of the bending flucts

- Intuition: fluctuations increase binding frequency
- How small does ℓ_p have to be?
- Strategy: simulate fibers with #1 and #2 only, compare to fluctuating



Movie:
$$\ell_p/L = 10$$



Movie:
$$\ell_p/L = 1$$



Bundling statistics

Statistics confirm movies



Bundling statistics





• $\ell_p/L = 100$: similar to rigid

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- ▶ $\ell_p/L = 1$: speed-up due to semiflexible bending fluctuations
- Actin in vivo: $\ell_p/L \approx 30$

Bundling with sterics

Number of contacts reduced by 99% using "soft" erf potential (Gaussian force)

• But $5 \times$ time step reduction required



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 Resolve hydrodynamics and elasticity with continuum interpolant

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- Incorporate nonlocal interactions between fibers (hydrodynamic+steric)
- More rigorous justification of GB (continuum limit?)
- Apply to rheology of actin networks

Rheology – effect of fluctuations

High $\ell_p = 17$ (actin): not much difference in bundle shapes in deterministic (left) vs. fluctuating (right)



Turnover time set to 60% of bundling time (match rheology)

Rheology – smaller ℓ_p

High $\ell_p = 1.7$: major difference in deterministic (left) vs. fluctuating (right)





Rheology – hydrodynamic interactions

Deterministic & fluctuating - no difference in morphology



fluctuating fibers without (left) and with (right) hydro

Rheology – hydrodynamic interactions

Deterministic & fluctuating - no difference in morphology



fluctuating fibers without (left) and with (right) hydro But difference in stress (need formula for Brownian stress)???

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Special quadrature vs. direct quadrature

Compare to direct quadrature on Chebyshev grid, giving an **symmetric positive definite** (SPD) mobility matrix

$$\left(\widetilde{\mathsf{M}}^{(\mathsf{direct})}\mathsf{F}\right)_{\{i\}} := \sum_{j} \widetilde{\mathsf{M}}^{(\mathsf{RPY})}_{\{i\},\{j\}}\mathsf{F}_{\{j\}}$$



Direct quadrature abysmal failure for $\hat{\epsilon} = 10^{-3}$

Special quadrature vs. oversampled quadrature

Given force on N point grid

Construct Galerkin SPD mobility matrix on oversampled grid:

$$\widetilde{\mathbf{M}}_{\mathsf{ref}} = \widetilde{\mathbf{W}}^{-1} \mathbf{E}_u^{\mathcal{T}} \mathbf{W}_u \widetilde{\mathbf{M}}_{\mathsf{RPY}, u} \mathbf{W}_u \mathbf{E}_u \widetilde{\mathbf{W}}^{-1}$$

- Apply $\widetilde{\mathbf{W}}^{-1}$ to get force density
- Upsample to N_u pt grid with matrix \mathbf{E}_u
- Oversampled RPY quad on upsampled grid with weights W_u
- Downsample velocity in L^2 with matrix $\widetilde{\mathbf{W}}^{-1} \mathbf{E}_u^T \mathbf{W}_u$.
- $N_u \approx 0.4/\epsilon$ required for engineering (2 digits) accuracy

Special vs. oversampled quadrature: convergence



Special quadrature vs. local drag



Local drag is other theory which scales with $\hat{\epsilon}$

Special quad better for $\hat{\epsilon}=10^{-2}$

Temporal convergence: local drag vs. special quad



Local drag requires time step 4–10 times smaller ($\hat{\epsilon} = 10^{-3}$)

Coarse-graining: geometric perspective

Solve the quadratic programming problem

$$\begin{pmatrix} \boldsymbol{\tau} \\ \boldsymbol{\mathsf{X}}_{\mathsf{MP}} \end{pmatrix} = \operatorname{argmin} \left\| \boldsymbol{\mathsf{X}}^{(\mathsf{SB})} - \boldsymbol{\mathsf{X}}^{(\mathsf{BL})} \right\|_{2}^{2} = \left\| \boldsymbol{\mathsf{E}}_{S \to B} \boldsymbol{\mathcal{X}} \begin{pmatrix} \boldsymbol{\tau} \\ \boldsymbol{\mathsf{X}}_{\mathsf{MP}} \end{pmatrix} - \boldsymbol{\mathsf{X}}^{(\mathsf{BL})} \right\|_{2}^{2}$$
$$\boldsymbol{\tau}_{\{p\}}^{T} \boldsymbol{\tau}_{\{p\}} = 1, \qquad p = 1, \dots, N$$

where $\mathbf{E}_{S \to B}$ samples $\mathbb{X}(s)$ at the blob-link locations.



Experimental measurements vary widely



Variety of measurements due to morphological changes

Morphology can vary over time and with $\mathsf{CL}/\mathsf{actin}$ concentration

- \blacktriangleright Changing network morphology \rightarrow changing shear modulus
- Viscoelastic moduli should be steady state properties



Falzone et al. Nat. Commun. (2012)