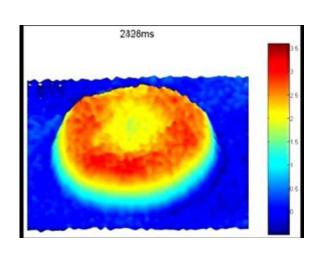
KITP, Santa-Barbara June 21, 2011

Effective Temperature of Active systems: Red Blood Cell Membrane Fluctuations



Nir Gov



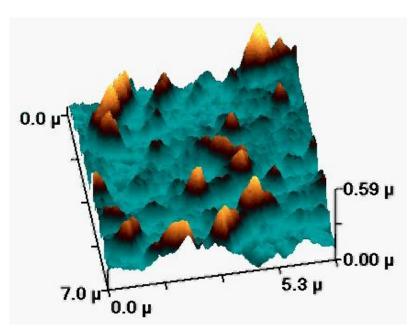


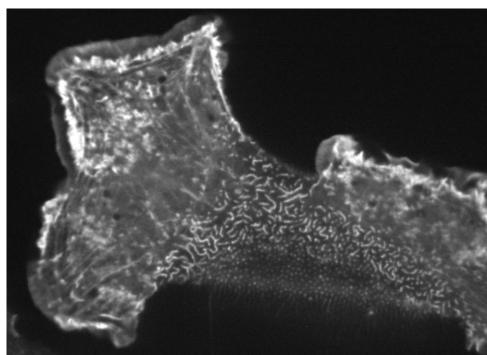


Outline:

- Motivation: using "effective temperature" in an "active"-thermodynamics scheme to describe patterns in biological systems.
- Red-blood cell: recent experiments showing non-thermal nature of the fluctuations.
- Comparing to a simple quantitative model.
- Actin-driven membrane clusters.

Motivation:





Active Microvilli on the upper surface of cells (Movie curtsey of Bechara Kachar)

Our treatment of this system in terms of "thermodynamic" phase transitions driven by "effective temperature":

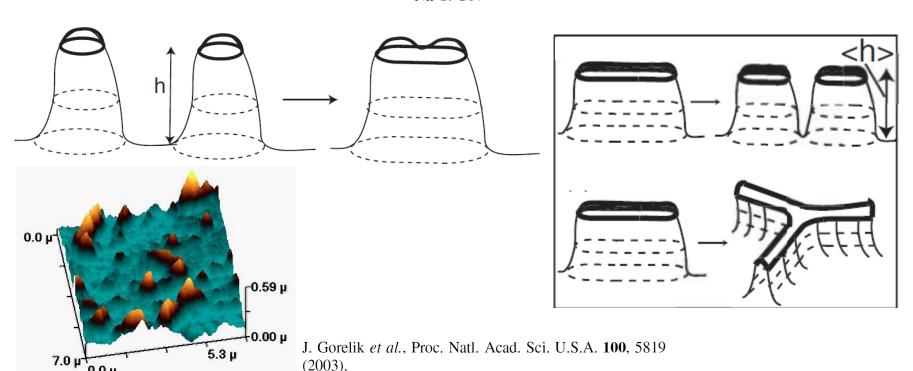
PRL 97, 018101 (2006)

PHYSICAL REVIEW LETTERS

week ending 7 JULY 2006

Dynamics and Morphology of Microvilli Driven by Actin Polymerization

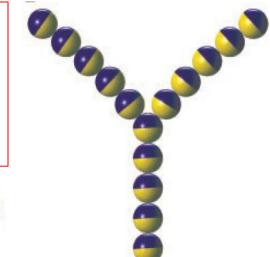
Nir S. Gov

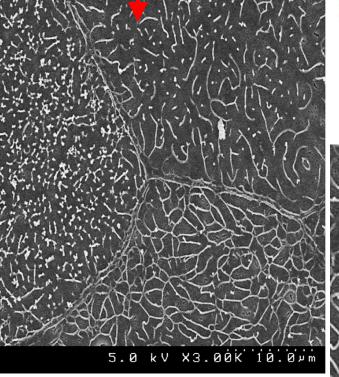


J. Gorelik *et al.*, Molec. Cell. Endocrin. **217**, 101 (2004).

Microvilli: Spatial distribution/patterns

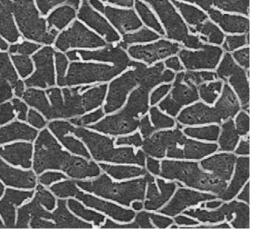
 Linear aggregates due to positive spontaneous curvature of tip complex







T. Tlusty & S. Safran; Science 290 (2000) 1328

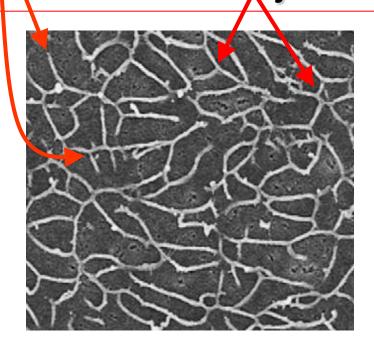


2D dipolar fluid, network of worm-like micelles etc.

Zilman, A; Safran, S.A.; Sottmann, T.; Strey, R.; Langmuir, 20 2199 (2004).

Microvilli: Spatial distribution/patterns

- Assume single height of MV: <h>
- Excluded volume interactions
- Defects: free ends and 3-fold junctions



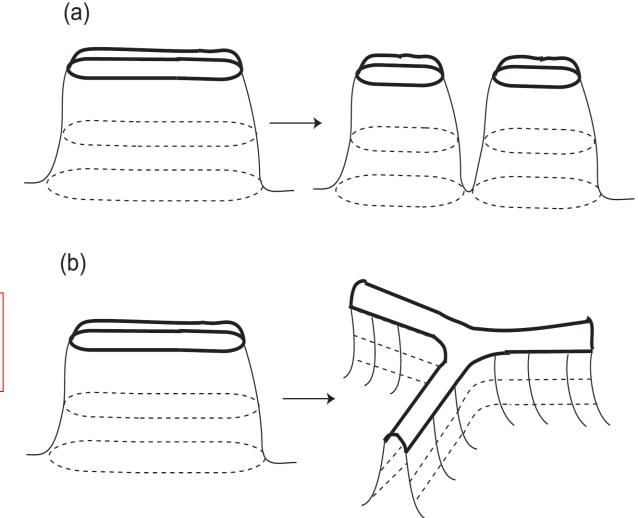
Microvilli: Energy of defects

$$E_{end} \approx \frac{2\pi\kappa h}{R} - \frac{\pi\kappa}{8}$$

Increases with *h*

$$E_{junct} \approx \frac{\pi \kappa h}{6R} + \frac{2\pi \kappa}{15}$$

Increases more slowly with *h*



Free energy of gas of defects

$$F(\phi)/k_B T_{eff} = (1 - \phi) \ln (1 - \phi) + \phi_e (\ln \phi_e - 1) + \phi_j (\ln \phi_j - 1) + \phi_e \epsilon_e + \phi_j \epsilon_j - \frac{1}{2} \phi_e \ln \phi - \frac{3}{2} \phi_j \ln \phi$$

 ϕ is the area fraction of the MV.

 ϕ_e , ϕ_j are the area fraction of the ends and 3-fold junctions respectively.

Minimize with respect to independent defects' concentrations:

$$\phi_j = \phi^{3/2} e^{-\epsilon_j}$$

$$\phi_e = \phi^{1/2} e^{-\epsilon_e}$$

Formation of networks

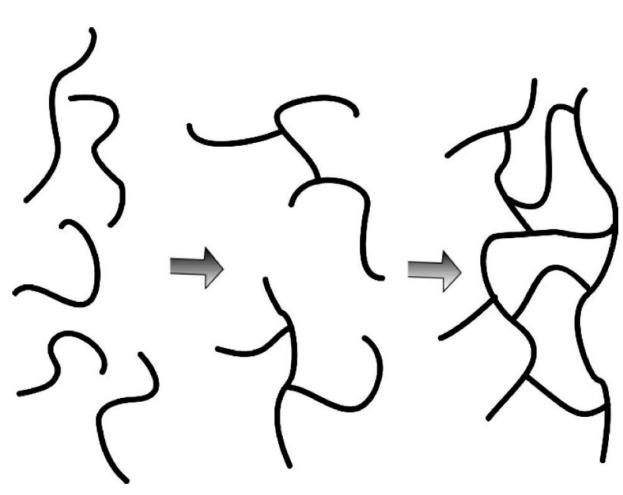
If the MV height increases, junctions multiply over ends:



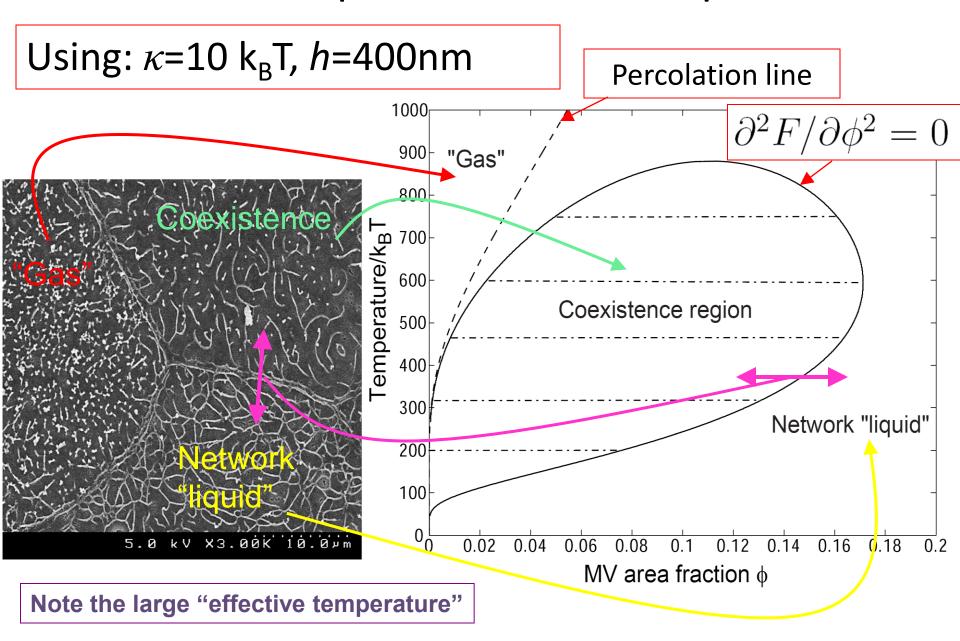
Phase transition to a connected network:

$$\partial^2 F/\partial \phi^2 = 0$$

Spinodal



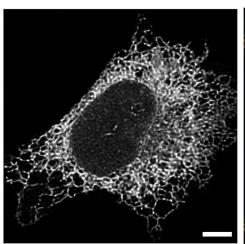
Microvilli: Spatial distribution/patterns

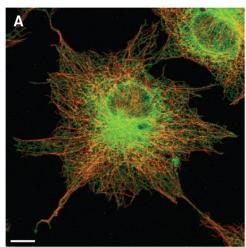


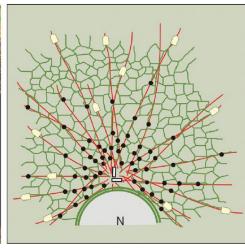
Motivation: Dynamic morphology of motor-driven membrane tubules (ER, golgi)

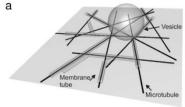
In-vivo:

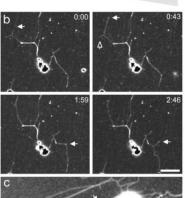
Vedrenne 2006; Jokitalo 2007

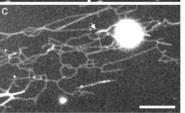






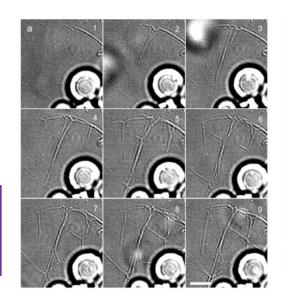


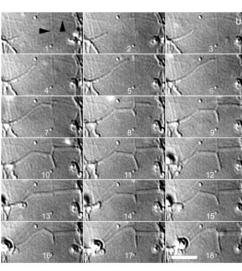




In-vitro:

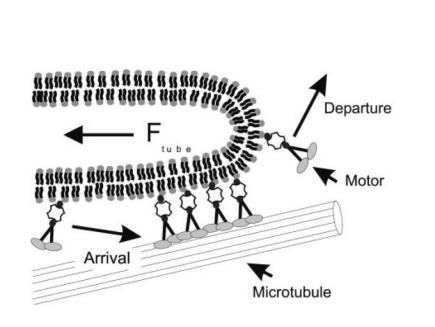
Bassereau 2002,2004; Dogterom, 2003

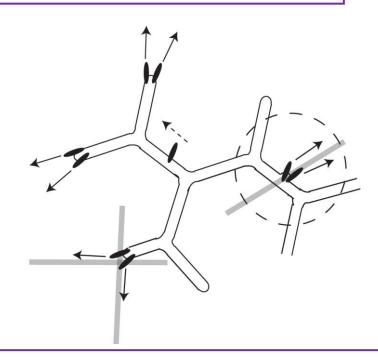




Our model: network phase transitions with "hotter" tips

Motors accumulate at the tubules tips → Higher effective temperature





Motors pull the tubules tips → random motion on the background network of MTs

Phases of membrane tubules pulled by molecular motors;

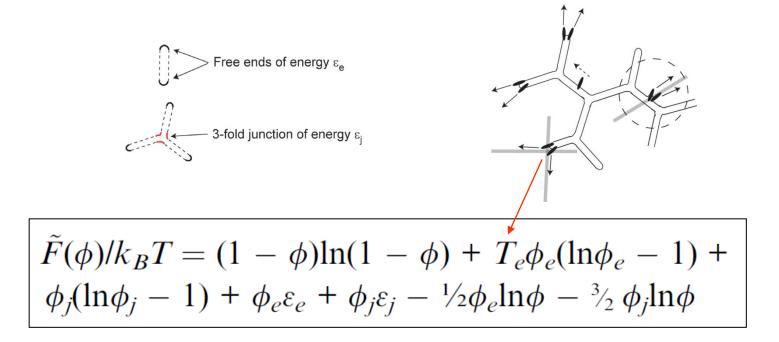
N. S. Gov*

www.rsc.org/softmatter | Soft Matter

Note Matter | Soft Matter

Soft Matter | Soft Matter

Our model: network phase transitions with "hotter" tips



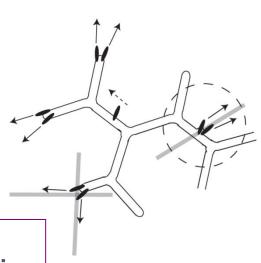
- Activity is limited to just one specie (structure).
- Different "effective temperatures" in different parts of the network.
- Do not equilibrate.

The "effective temperature" depends on the number of motors:

$$T_e \propto \langle v^2 \rangle \propto \left(1 - \frac{F_0}{F_m}\right)^2$$

$$F_m = F_s n_b$$

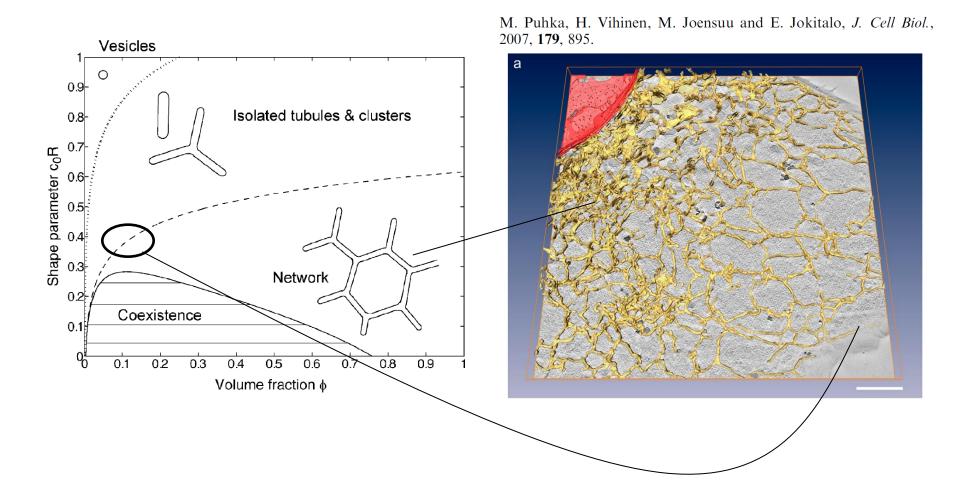
 F_s is the stall force of each motor n_b is the average number of motors at the tips



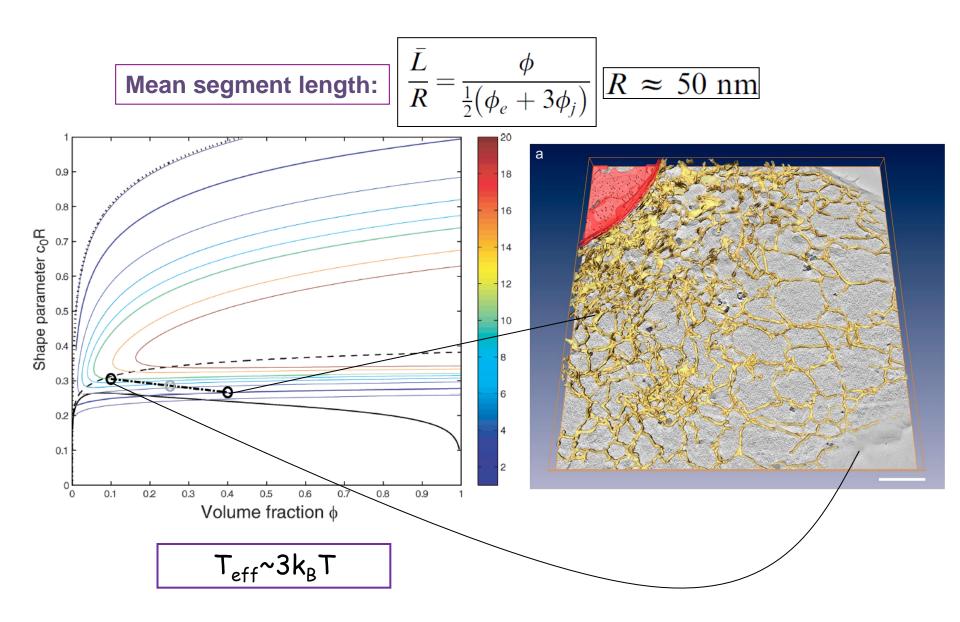
We can treat two cases:

- Constant n_b and T_e (saturation of motors).
- Average number of motors gets diluted as a function of the density of ends.

Our model: network phase transitions with "hotter" tips



Comparing to observations:



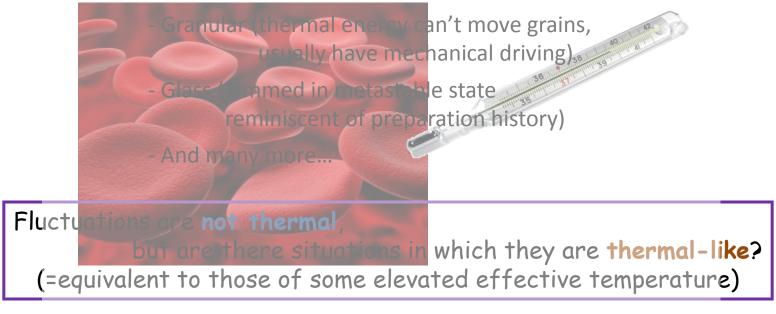
Can effective temperature describe non-equilibrium steady state?

Live matter:

Molecular motors consume ATP and generate fluctuations that can be much larger than thermal fluctuations

→ far from thermodynamic equilibrium

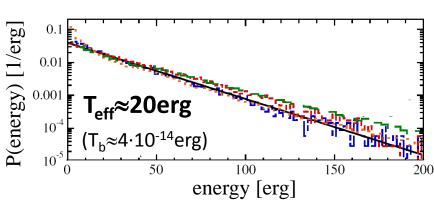
<u>Dead non-equilibrium systems</u>:



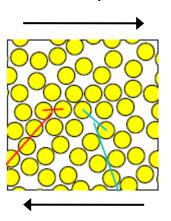
Thermal-Like (1): $P(E) \approx \exp(-E/T_{eff})$

Air fluidized ping-pong balls (model for granular matter)

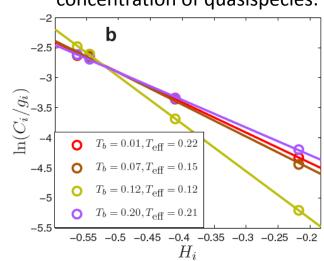




Sheared amorphous solid



concentration of quasispecies:

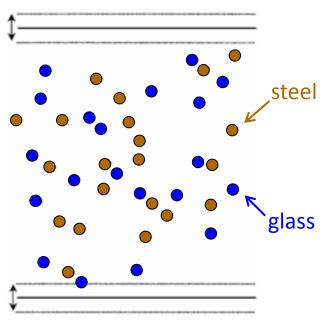


Boue, Hentschel, Procaccia, Regev, Zylberg (2010)

Abate & Durian (2008)

Thermal-Like (2): T_{eff} equilibrates at contact ?

Vertically shaken box of grains



<E> not useful as effective temperature

Feitosa & Menon (2002)

But sometimes can identify operational temperature that controls direction of energy flow and eventually equilibrates

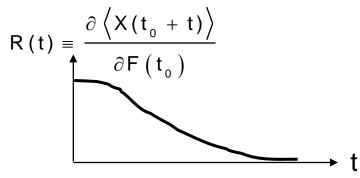
Shokef, Shulkind, Levine (2007)

Thermal-Like (3): Fluctuation-Dissipation Relations

Correlation (fluctuation):

$C(t) \equiv \langle X(t_0 + t)X(t_0) \rangle - \langle X \rangle^2$

Response (dissipation):



• Equilibrium: Correlation = Temperature x Response

Callen & Welton (1951)

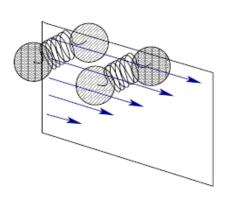
Far from equilibrium:

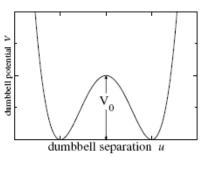
- Define
$$T_{eff} = \frac{Correlation}{Response}$$

- Does T_{eff} depend on: observable? waiting time (measurement frequency)?
- Is **T**_{eff} related to other effective "temperatures" ?

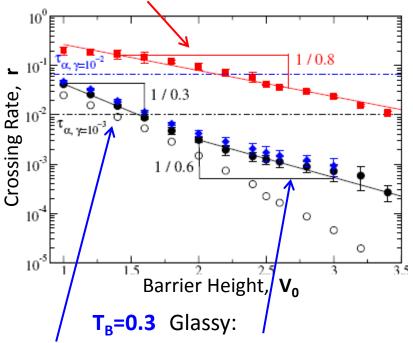
Thermal-Like (4): T_{eff} Determines Reaction Rates

Double-well dumbbell in sheared glassy fluid





 $T_B=0.8$ Thermal: $r \propto exp(-V_0/T_B)$



small V₀:

high V₀:

bath dominates:

driving dominates:

 $r \propto \exp(-V_0/T_B)$

 $r \propto exp(-V_0/T_{eff})$, $T_{eff}=0.6$

(FD gives T_{eff}=0.65 ≈0.6)

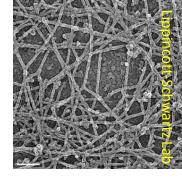
In Vitro Acto-Myosin Network

Micro-rheology (μ m bead + optical tweezers):

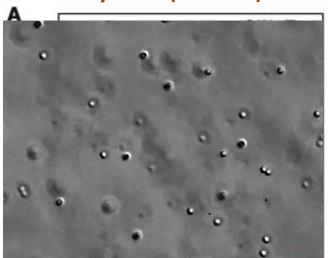


Passive: measure spontaneous fluctuations \rightarrow power spectrum $C(\omega)$

Active: apply periodic force, measure resulting displacement \rightarrow response function $\alpha(\omega)$



Only actin (thermal)



Beads pardly maye

Fluctuation-dissipation theorem works: $\omega C(\omega) = 2k_B T\alpha''(\omega)$

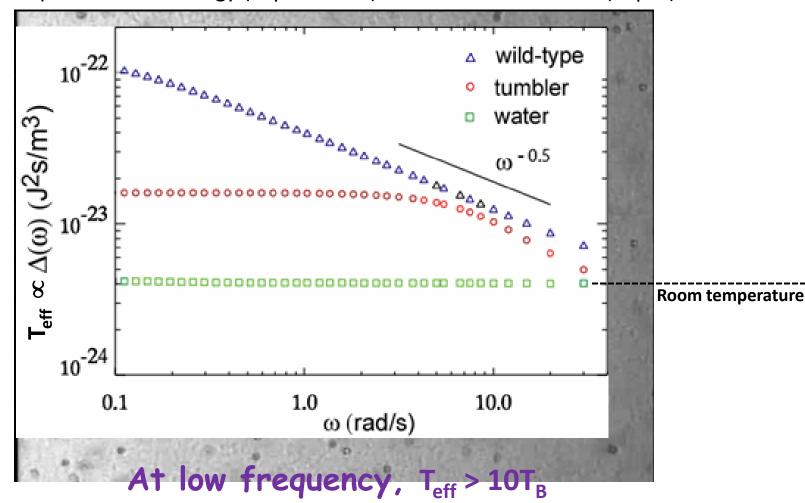
6.8hr after introduction of myosin ("live")

Beads move much more

Enhanced fluctuations at low frequency: $C_{\text{non-eq}}(\omega) > 10x C_{\text{eq}}(\omega)$ Response hardly effected: $\alpha_{\text{non-eq}}(\omega) \approx \alpha_{\text{eq}}(\omega)$

Bacterial Bath

Two-point microrheology (~1μm beads) in solution with E. Coli (~3μm)



Even Genes do it....

84

Biophysical Journal Volume 91 July 2006 84-94

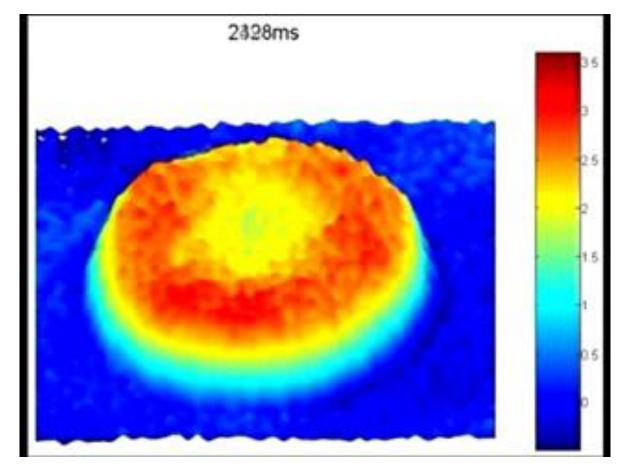
Effective Temperature in Stochastic Kinetics and Gene Networks

Ting Lu,*§ Jeff Hasty,† and Peter G. Wolynes*†§

...But lets get back to biological matter

Red Blood Cell Membrane Fluctuations

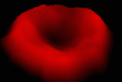
Cell Waltz:



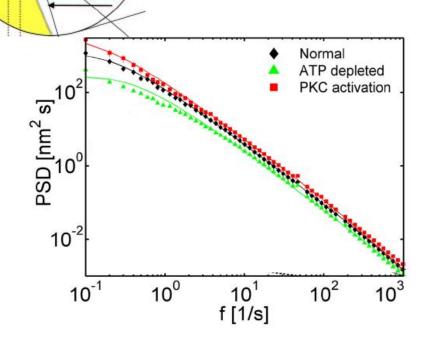
Gabriel Popescu
Quantitative Light Imaging Laboratory
<u>University of Illinois at Urbana-Champaign</u>
<u>Department of Electrical and Computer Engineering</u>
http://light.ece.illinois.edu/

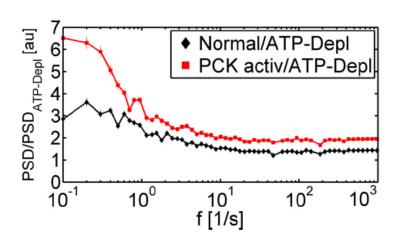
Red Blood Cell Edge Fluctuations:

Recent experiments



Position: y(t) \rightarrow Power spectrum: PSD(ω) = $\int \langle y(t)y(0)\rangle e^{i\omega t}dt$

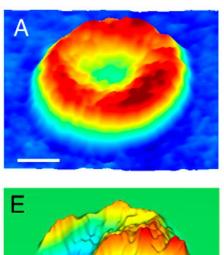


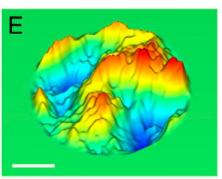


Fluctuations larger than thermal by 3(normal)-6(PKC activated), but cannot infer $T_{\rm eff}$ without response measurement...

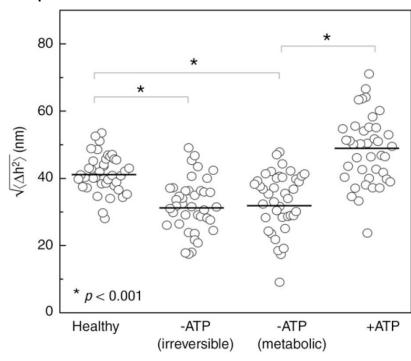
Red Blood Cell Edge Fluctuations: Recent experiments

High resolution optical measurements of the membrane displacement field:





Amplitude of the displacement field depends on the ATP content:

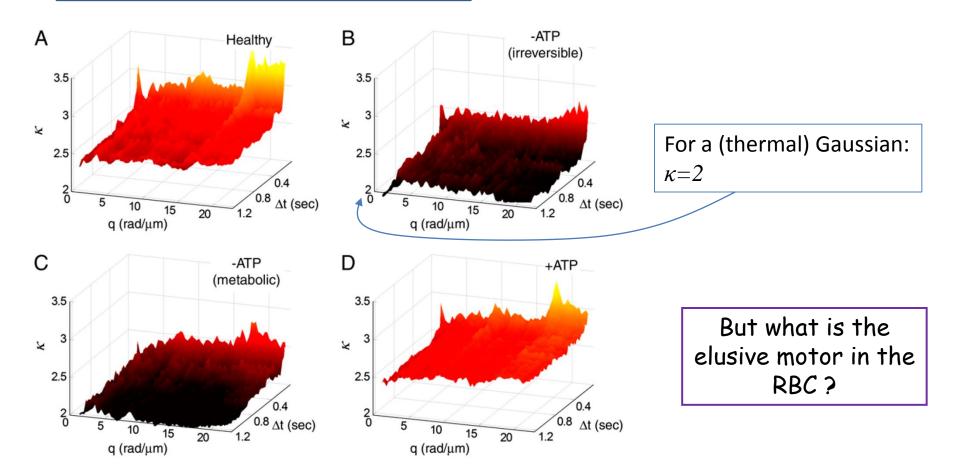


But how do we know that they are non-thermal? (i.e. not due to changes to the elastic constants)

Red Blood Cell Edge Fluctuations: Recent experiments

Measure the Kurtosis, non-Gaussianity of the fluctuation distribution:

$$\kappa = \langle |h(q,\Delta t) - h(q,0)|^4 \rangle / \langle |h(q,\Delta t) - h(q,0)|^2 \rangle^2$$



Can we explain these observations using a simple theoretical model?

Yes, and its just out:

PRL **106**, 238103 (2011)

PHYSICAL REVIEW LETTERS

week ending 10 JUNE 2011

Effective Temperature of Red-Blood-Cell Membrane Fluctuations

Eyal Ben-Isaac, YongKeun Park, Gabriel Popescu, Frank L. H. Brown, Nir S. Gov, ** and Yair Shokef**, and Yair Shokef**,

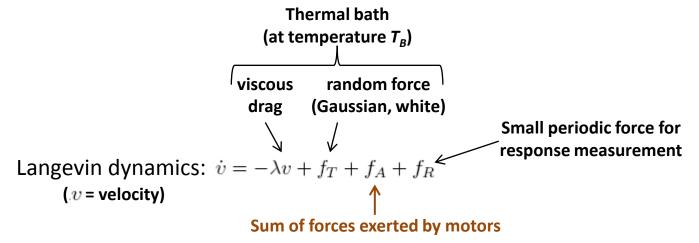
Minimal Model for Active Fluctuations

(of Red Blood Cell Membranes)

```
"Particle" ( = Degree of freedom, spatial mode, ... )

N<sub>m</sub> "Motors" ( = Elements that occasionally apply force )

(one dimension)
```



Each motor:

- turns on as Poisson process with average waiting time au
- exerts constant force f_o in random direction
- turns off after time $\Delta \tau$ (typically constant)
- uncorrelated from other motors (in direction and timing)

Minimal Model for Active Fluctuations

(of Red Blood Cell Membranes)



Linear differential equation: $\dot{v} = -\lambda v + f_T + f_A + f_R$



Solution is superposition: $v(t) = v_T(t) + v_A(t) + v_R(t)$ of solutions to: $\dot{v_A} = -\lambda v_A + f_A$

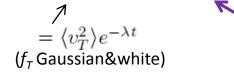
$$\dot{v_T} = -\lambda v_T + f_T$$

$$\dot{v_A} = -\lambda v_A + f_A$$

 $\dot{v_B} = -\lambda v_B + f_B$

Consequences for FD measurement:

- i) Response independent of bath & motors: $f_R = F_0 e^{i\omega t} \longrightarrow \langle \delta x(t) \rangle = \chi_{xx}(\omega) F_0 e^{i\omega t}$ with: $\chi_{xx}(\omega) = \frac{1}{\omega(i\lambda \omega)}$
- ii) $v_T \& v_A$ uncorrelated $\rightarrow \langle v(t)v(0)\rangle = \langle v_T(t)v_T(0)\rangle + \langle v_A(t)v_A(0)\rangle$



 $=\langle v_T^2 \rangle e^{-\lambda t}$ We're left with calculating active part of fluctuations



*#2: Direction of force uncorrelated (different motors & different pulses of same motor)

$$\langle v_A(t)v_A(0)\rangle = \underbrace{\frac{N_m \Delta \tau}{\tau + \Delta \tau}}\!\!\langle v_p(t)v_p(0)\rangle$$

$$v_p(t) = \frac{\text{velocity change}}{\text{following single pulse}}$$
 Average number of pulses per unit time

$$v_p(t) = rac{ ext{velocity change}}{ ext{following single pulse}}$$

And after not that much algebra...
$$T_{eff}(\omega) = T_B + \frac{N_m v_0^2 \lambda \left[1 - \cos(\omega \Delta \tau)\right]}{(\tau + \Delta \tau) \omega^2}$$

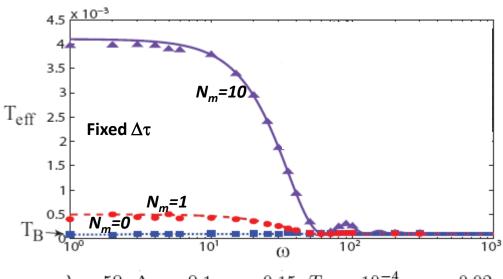
 $(v_0 \equiv f_0/\lambda)$

Effective Temperature

$$T_{eff}(\omega) = T_B + \frac{N_m v_0^2 \lambda \left[1 - \cos(\omega \Delta \tau)\right]}{(\tau + \Delta \tau)\omega^2}$$

Straightforward to generalize to variable pulse length $T_{eff}(\omega) = T_B + \frac{N_m v_0^2 \lambda \langle 1 - \cos(\omega \Delta \tau) \rangle}{(\tau + \langle \Delta \tau \rangle) \omega^2}$

$$P(\Delta \tau)$$
=Poisson $\Rightarrow f_A(t)$ =shot noise [Gov 2004] and: $T_{eff}(\omega) = T_B + \frac{N_m v_0^2 \lambda}{(\tau + \langle \Delta \tau \rangle) \left(\omega^2 + \frac{1}{\langle \Delta \tau \rangle^2}\right)}$



$$\lambda = 50, \, \Delta \tau = 0.1, \, \tau = 0.15, \, T_B = 10^{-4}, \, v_0 = 0.02$$

Are Active Fluctuations Thermal-Like?

Velocity fluctuations

amplitude > thermal
$$\langle v^2 \rangle = \langle v_T^2 \rangle + \langle v_A^2 \rangle = T_B + \frac{N_m v_0^2 \left(\lambda \Delta \tau - 1 + e^{-\lambda \Delta \tau} + e^{-\lambda \Delta \tau} \right)}{\lambda (\tau + \Delta \tau)}$$

is their nature thermal-like? (is the system effectively in equilibrium at $T_{eff} = \langle v^2 \rangle$?)

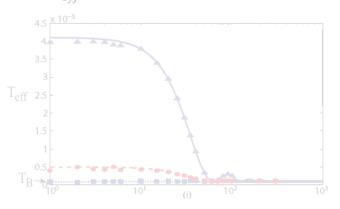
1) Fluctuation-dissipation ratio:

depends on frequency: $T_{eff}(\omega)$

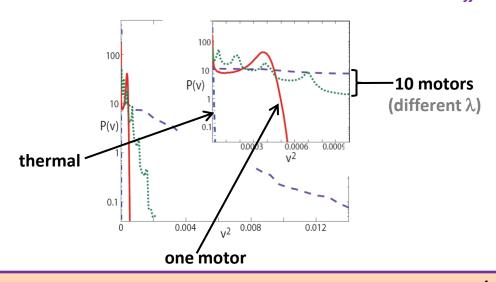
 $T_{eff}(\omega)$ =const. only in thermal limit

but:

$$T_{eff}(\omega) \rightarrow const.$$
 for small ω



2) Velocity distribution, $P(v) \approx exp(-v^2/T_{eff})$?



Quantify deviation from Gaussian by Kurtosis $\kappa = \frac{\langle v^4 \rangle}{\langle v^2 \rangle^2}$

$$(\kappa_{Gaussian} = 3)$$

Kurtosis ($\kappa \equiv \frac{\langle v^4 \rangle}{\langle v^2 \rangle^2}$)

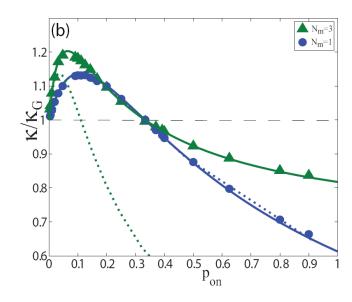






Solution: Assume $v_p \approx 0$ by the time next pulse starts (\rightarrow neglect cross term)

Valid only for $N_m=1 \& \lambda \tau >> 1$:



Kurtosis ($\kappa \equiv \frac{\langle v^4 \rangle}{\langle v^2 \rangle}$)

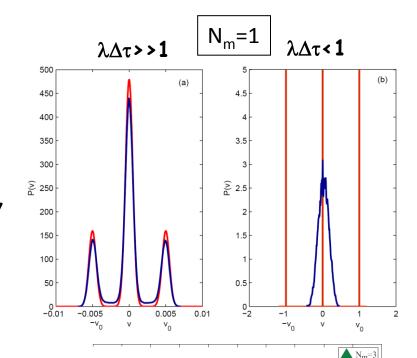
For multiple motors, we use another description:

Assume each motor immediately generates $v_0 = f_0/\lambda \ (\rightarrow \lambda \Delta \tau >> 1)$

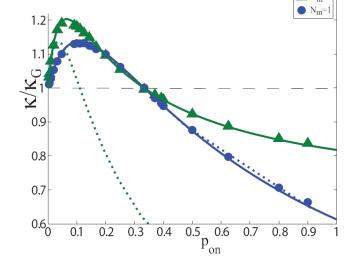
1

P(v) is sum of shifted thermal Gaussians (weighted according to combinatoric probability that a given number of motors are simultaneously on)

Probability of each motor to be on: $p_{on} = \frac{\Delta \tau}{\tau + \Delta \tau}$

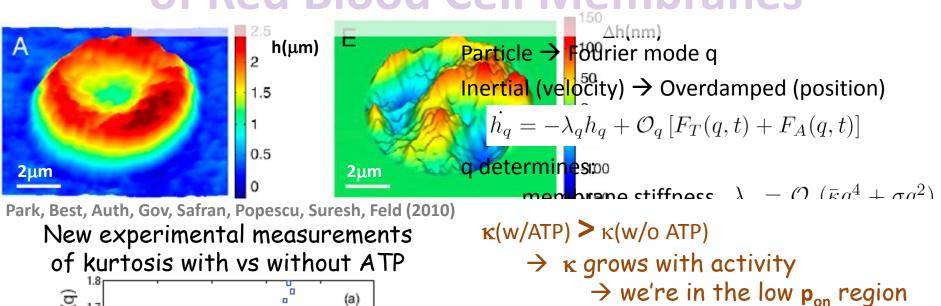


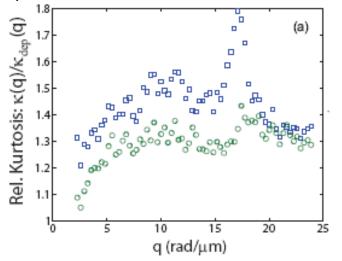
- Perfect agreement with simulations
- Non-monotonic dependence of κ on activity (p_{on})
- ullet Can retain κ_{Gaussian} even when far from equilibrium

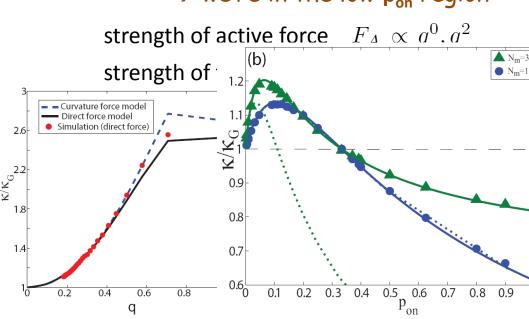


 $\lambda \Delta \tau > 1$

Minimal Model for Active Fluctuations of Red Blood Cell Membranes

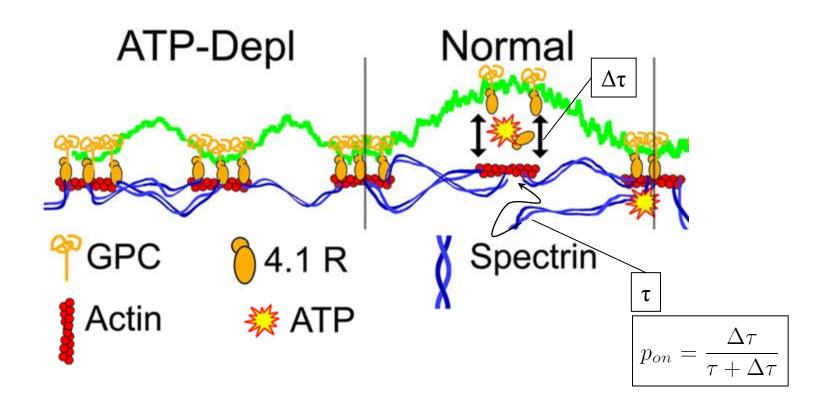






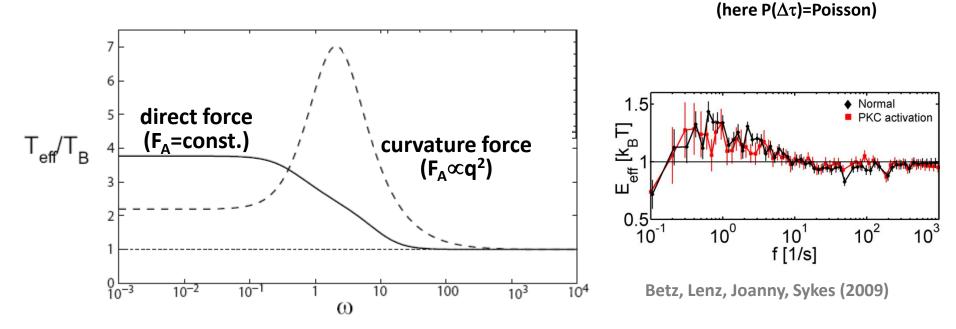
The analysis can teach us about the physical properties of the elusive motor:

- Low p_{on} \rightarrow the RBC membrane motor has a long recovery time
- Supports a model of the ATP-driven activity through filament dissociations



Minimal Model for Active Fluctuations of Red Blood Cell Membranes

(Local) fluctuation-dissipation measurement → integrate over q



- Calls for experiments that would measure also response and not only fluctuations in RBC
- Would be interesting to see if indeed $T_{eff}(\omega)$ is non-monotonic? (preliminary data indicate monotonic behavior).

Take-Home Messages on the Non-Equilibrium Nature of Active Fluctuations

- 1. When using fluctuations to quantify deviation from equilibrium, need to compare to appropriate response (via the fluctuation-dissipation formalism)
- 2. Kurtosis may be misleading in characterizing deviation from equilibrium: Gaussian values may result from large N_m effects; in such cases $T_{eff}(\omega)$ still shows strong frequency dependence
- **3. Kurtosis** vs. **activity** is non-monotonic
- 4. $T_{eff}(\omega)$ vs. activity and frequency may be non-monotonic

Suggestions for our experimental collaborators...



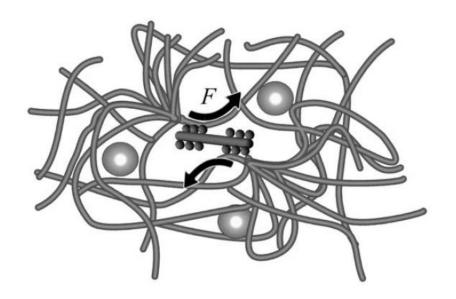
<u>Timo Betz (Curie)</u>: Measure response of red blood cell membrane to deduce $T_{eff}(\omega)$ and see if it's non-monotonic



<u>Paul Park (KAIST)</u>: Increase activity or decrease wavevector to identify situations in which kurtosis decreases with activity

Recent observation of non-monotonous kurtosis:

In-vitro actin-myosin gel:

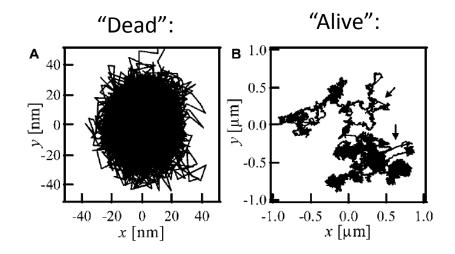


Cite this: Soft Matter, 2011, **7**, 3234

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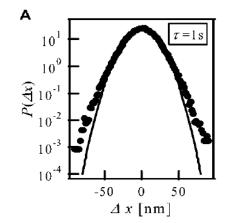
Non-Gaussian athermal fluctuations in active gels†

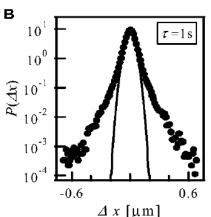
Toshihiro Toyota, David A. Head, Christoph F. Schmidt and Daisuke Mizuno**a



Van-Hove correlations:

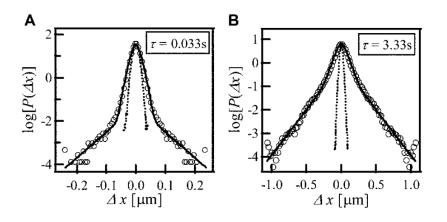
$$P(\Delta x(\tau)), \ \Delta x(\tau) = x(t+\tau) - x(t)$$





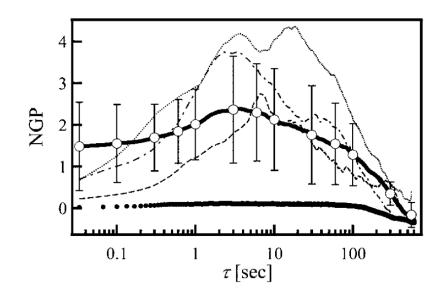
Recent observation of non-monotonous kurtosis:

Distribution of velocity increment depend on the lag-time:



Non-Gaussianity Parameter:

$$NGP = \frac{\left\langle \Delta x(\tau)^4 \right\rangle}{3\left\langle \Delta x(\tau)^2 \right\rangle^2} - 1,$$

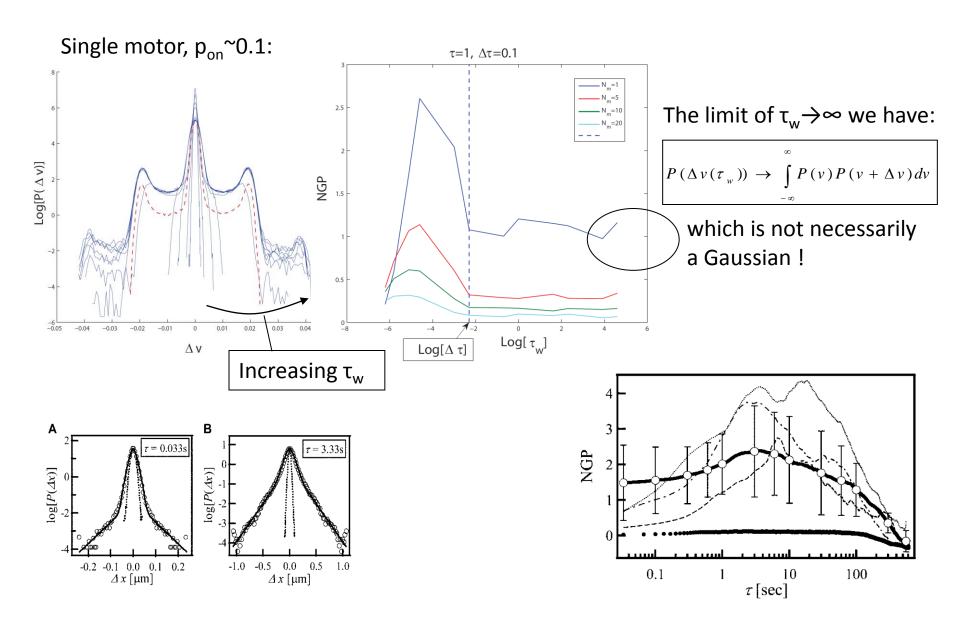


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Non-Gaussian athermal fluctuations in active gels†

Toshihiro Toyota, a David A. Head, Christoph F. Schmidt and Daisuke Mizuno

Comparing to our simple model:



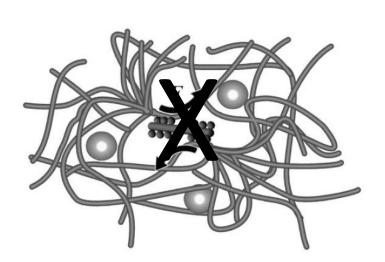
Comparing to our simple model:

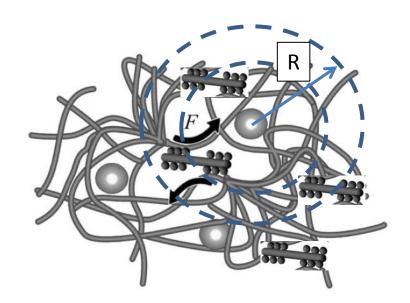
 \Rightarrow

• The bead is NOT affected by only one proximal motor, but by the whole spatial distribution of motors:

• Numerous motors: $N_m \sim R^2$

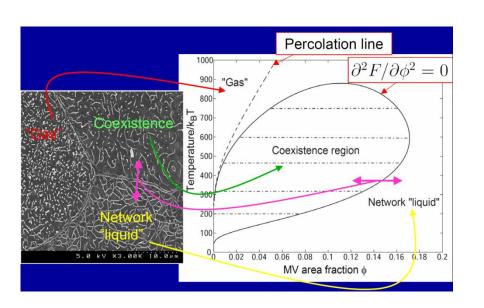
• But weaker: $f_0 \sim 1/R^2$

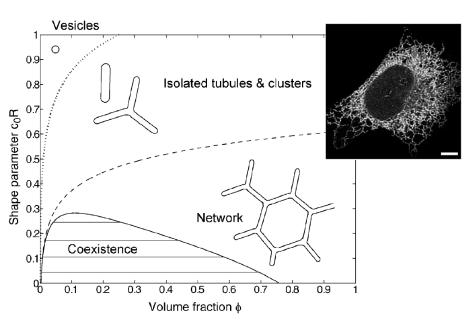




We're now calculating this spatially-extended problem

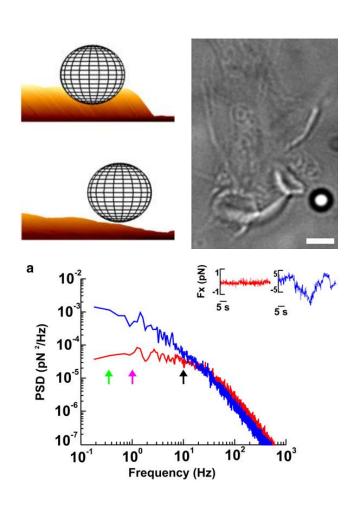
The future: how to describe phase transitions with active fluctuations?





- Is there a critical effective temperature for a phase transition, especially when the components have different effective temperatures?
- What are the critical exponents near such a transition (active-RG)?

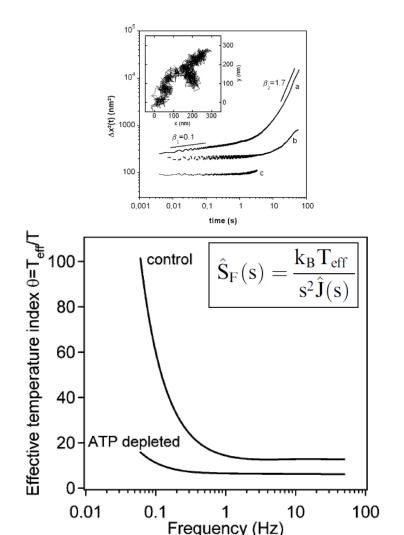
Actin-myosin-driven cellular shape fluctuations





Force Generation in Lamellipodia Is a Probabilistic Process with Fast Growth and Retraction Events

Rajesh Shahapure,[†] Francesco Difato,^{†‡} Alessandro Laio,[†] Giacomo Bisson,[†] Erika Ercolini,^{†§} Ladan Amin,[†] Enrico Ferrari,[¶] and Vincent Torre^{†‡}*



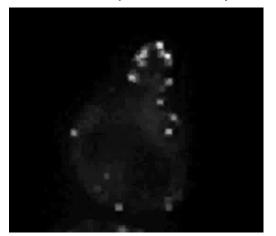
Power spectrum of out-of-equilibrium forces in living cells: amplitude and frequency dependence

François Gallet,* Delphine Arcizet,† Pierre Bohec and Alain Richert

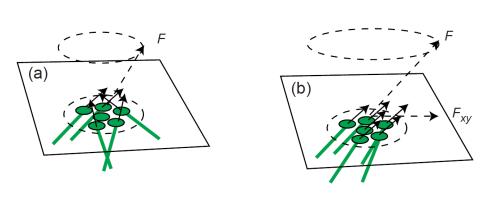
Soft Matter, 2009, **5**, 2947–2953

Detailed model of the Active Fluctuations of actin-driven membrane patches and protrusions

Motion of actin patches in yeast cell



Model: random and bundled actin



Smith, Swamy, Pon (2001)

• Each patch has different number of pushing actin filaments, i.e. number of motors **N**

C.M. mean-square velocity for patch of mass M (shot-noise force correlations, τ):

$$\langle F'(t)F'(t')\rangle = \frac{Ncf^2}{M^2}e^{-|t-t'|/\tau}$$

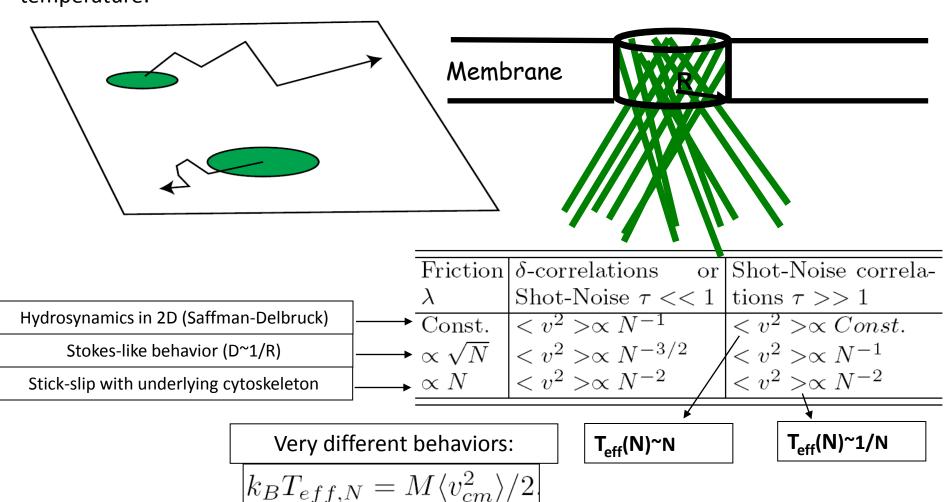
$$\langle v_{cm}^2 \rangle_{t \to \infty} = \frac{cf^2 \tau}{2M\lambda (1 + \lambda \tau/M)}$$

$$\langle F'(t)F'(t')\rangle_{thermal} = \frac{4k_BT\lambda}{M^2}\delta(t-t')$$

Thermal forces depend on the friction

Effective temperature of actin-driven membrane patches

Different forms of patch friction give different forms of effective temperature:



Size-distribution of actin-driven membrane patches (active thermodynamics)

Interacting patches of different effective temperatures:

$$F = \sum_{N} \rho_{N} \left[k_{B} T_{eff}(N) \ln \left(\rho_{N} \right) - \mu N + \gamma \sqrt{N} \right]$$

Minimizing this free energy with respect to the cluster size distribution:

$$\rho_N = Ae^{-\left[\frac{-\mu N + \gamma\sqrt{N}}{k_B T_{eff}(N)}\right]}$$

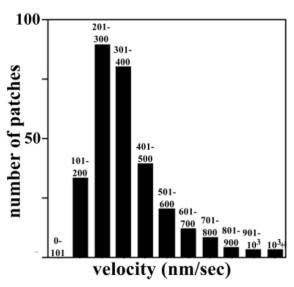
for dilute systems such that μ «0 and the system is far from phase separation (phase transition).

But is this a "kosher" procedure? Doe this actually happen?

Work in progress...

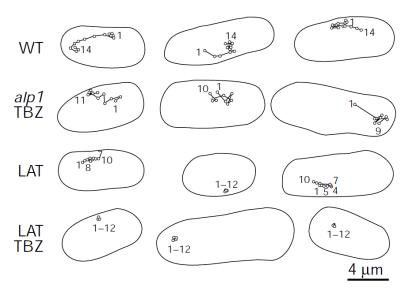
Comparison to observations:

Velocity distribution of patches:



Smith, Swamy, Pon (2001)

Actin drives the random motion:



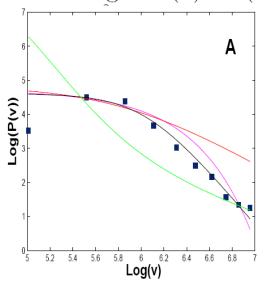
Chang (1999)

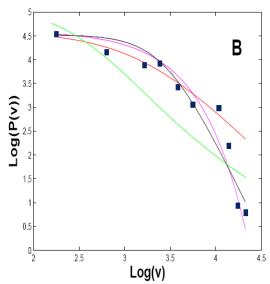
Comparison to observations:

Thermal case: $P(v) \propto (a + v^2)^{-1}$ (red)

Active cases: $T_{eff}(N) \propto N, N^2$ we get $P(v) \propto \exp(-v^2)$ (purple)

$$T_{eff}(N) \propto \sqrt{N} \text{ we get } P(v) \propto (a+v^2)^{-2}$$
 (black)





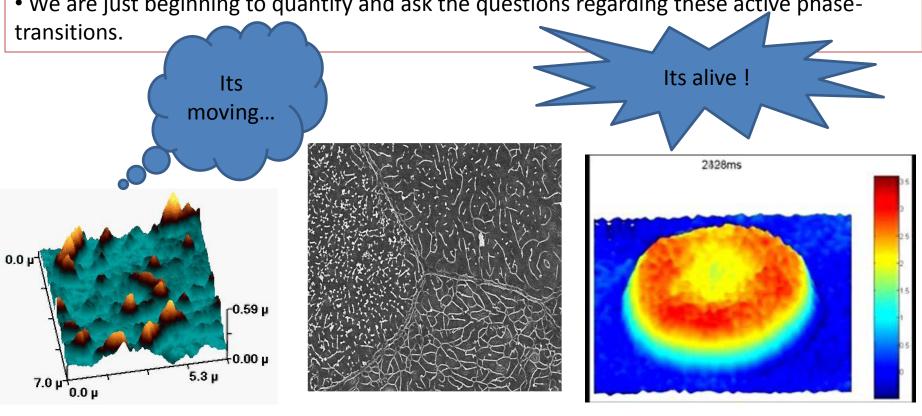


- An indication that the clusters are active
- May furthermore indicate what is the dominant friction mechanism

Conclusion:

- Active motion in living systems, driven by a variety of molecular motors, affects pattern formation
- The random motion may be treated as "effective temperature"?
- Example where Biological Physics motivates research into new non-equilibrium systems.

We are just beginning to quantify and ask the questions regarding these active phase-



Acknowledgements

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