# The role of chaos and noise in hair cell sensitivity

KITP Physics of Hearing June 6, 2017

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# Phenomenology: Specs for the mechanical detector

```
sensitivity
       0.3 nm displacement
robustness
       6 orders of magnitude in
       pressure
temporal resolution
       10 µs inter-aural time
       difference
frequency range
       20 Hz - 20 kHz
```



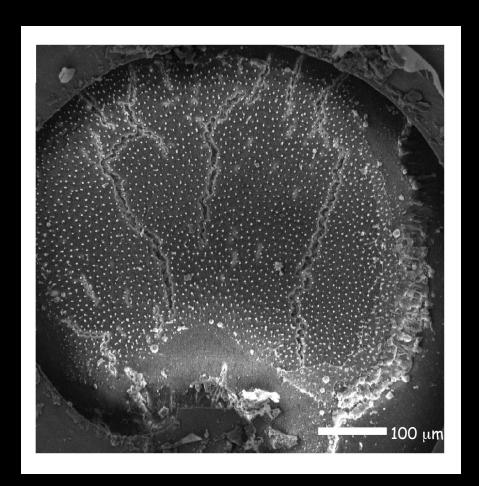
M. Konishi, California Institute of Technology

## Introduction

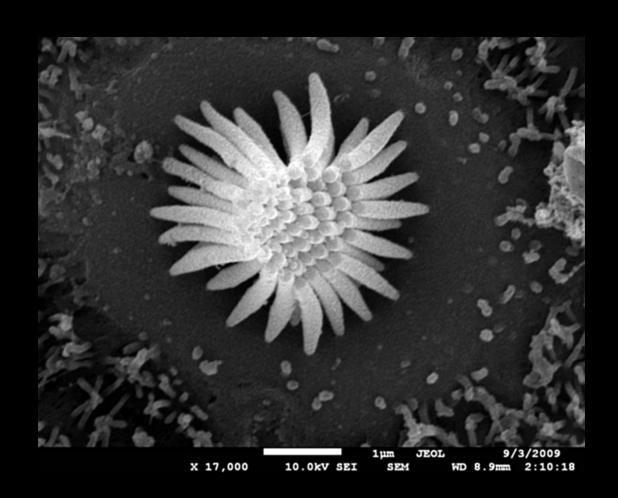
### North American bullfrog



### sacculus, top-down view



### hair cell, bullfrog sacculus





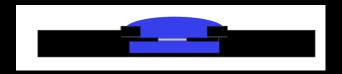
Acoustic isolation booth



Olympus optical microscope

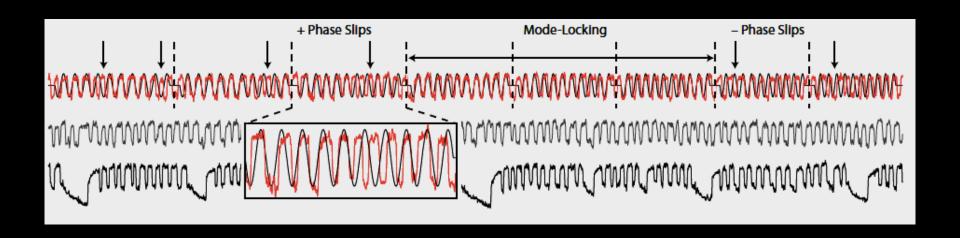


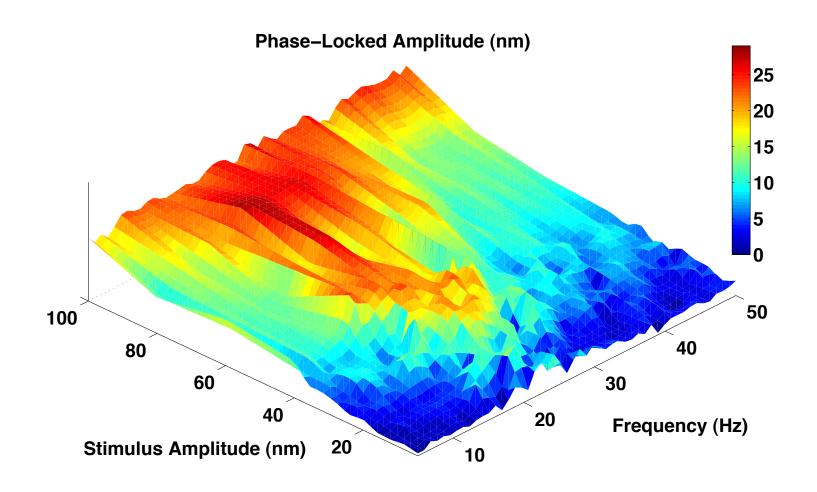
Photron FASTCAM SA1.1 1024 x 1024 pixels 5400 fps



2-compartment chamber artificial perilymph and endolymph

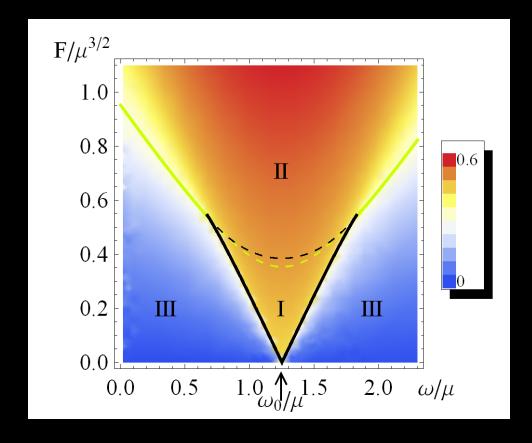
# A small mechanical stimulus can entrain spontaneous oscillations.





$$\dot{z} = (\mu + i\omega_0)z - |z|^2 z + Fe^{i\omega t}$$

Theoretical phase diagram



The system can support a SNIC (saddle-node on invariant circle), a supercritical Hopf, or a multi-critical (Bogdanov-Takens) bifurcation.

# Feedback process

#### Bursting behavior



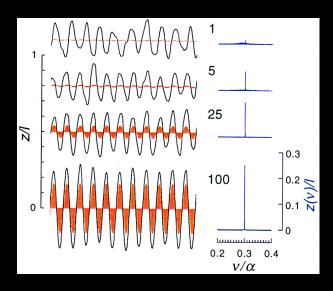
Limit cycle oscillations are interspersed with quiescent intervals. This indicates more complex dynamics than a simple limit cycle.

Camalet et al proposed that the system is self-tuned to the vicinity of the critical point.

Calcium feedback maintains the hair cell near the Hopf bifurcation, on the oscillatory side.

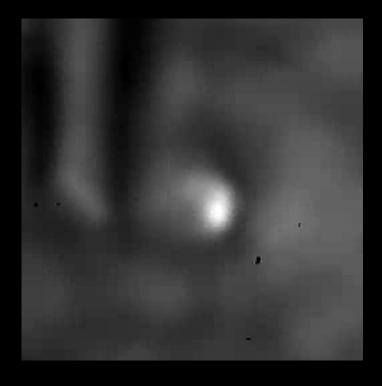
$$\frac{1}{C}\frac{\partial C}{\partial t} = \frac{1}{\tau} \left( \frac{x^2}{\delta^2} - 1 \right)$$

self-tuned critical oscillations

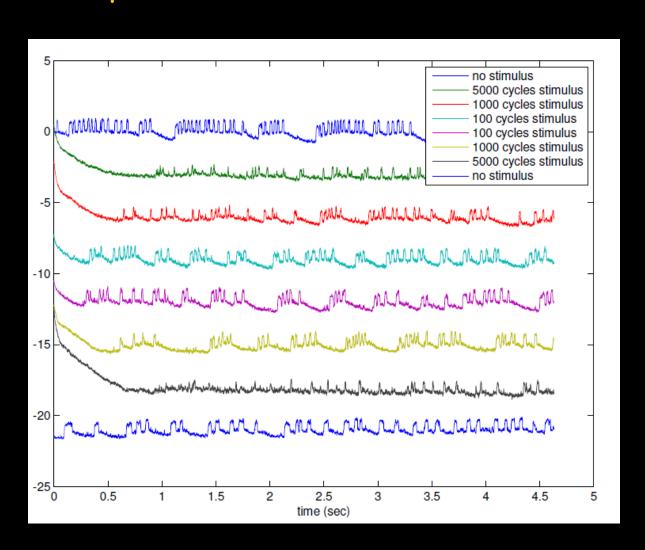


Response of a system with n = 2,000 motors to a sinusoidal force at frequency v = 0.3a, close to the hair bundle's characteristic frequency.

### Experiments on dynamic feedback



# Over-stimulation leads to transient suppression of the spontaneous oscillation.

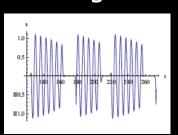


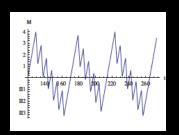
# Subcritical Hopf bifurcation with a feedback on the control parameter

$$\frac{dz}{dt} = z(\mu - i\omega_0 + A|z|^2 - B|z|^4) + f_D + f_A \cos(\omega_f t)$$

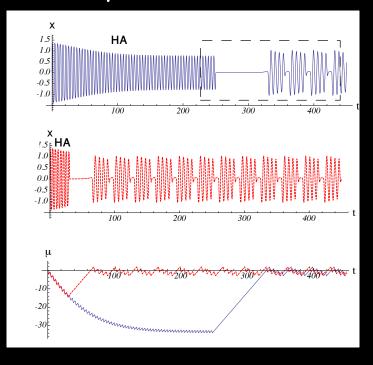
$$\frac{d\mu}{dt} = k_{\rm on} - k_{\rm off} \Theta(x - x_0)$$

#### bursting behavior





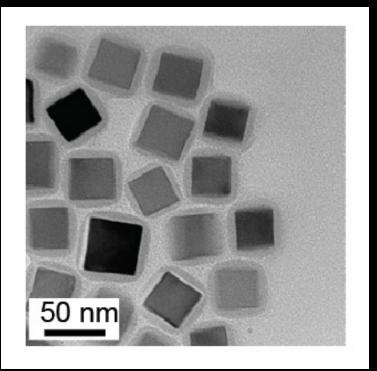
#### recovery from overstimulation

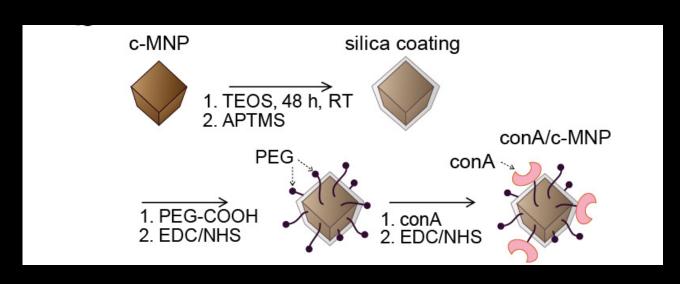


In this regime, feedback tunes the system away from criticality, in the limit cycle regime.

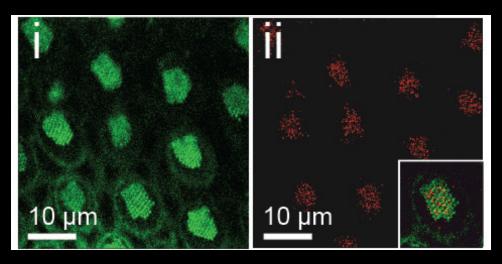
# High-order mode-locking

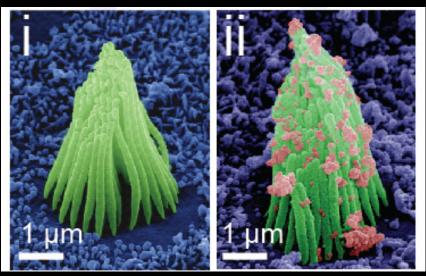
#### magnetic nanoparticles

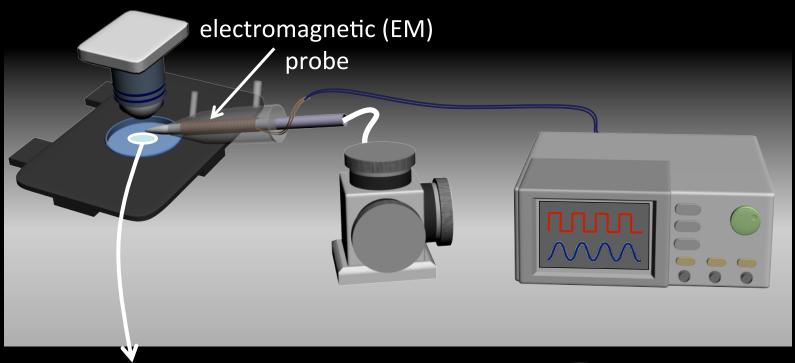




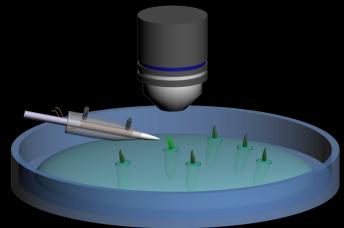
#### attachment to hair bundles



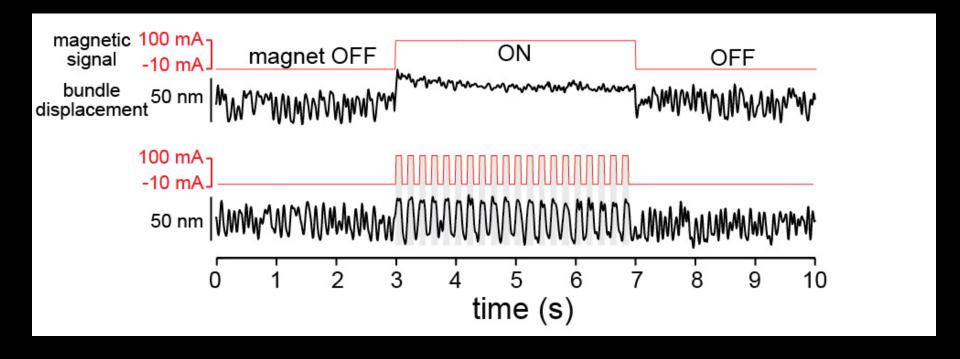




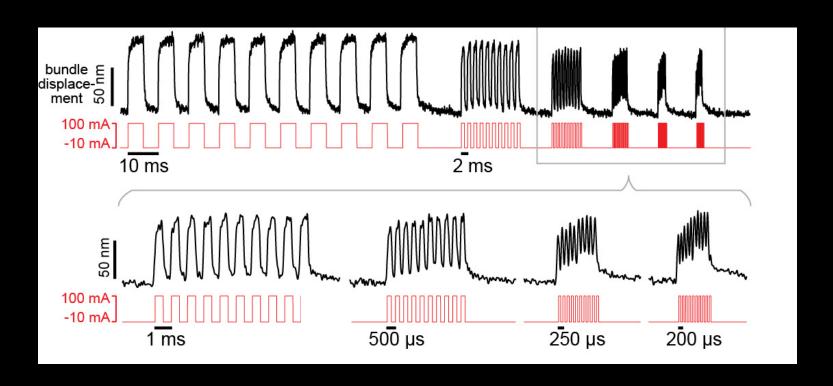
remote actuation



#### bundle response

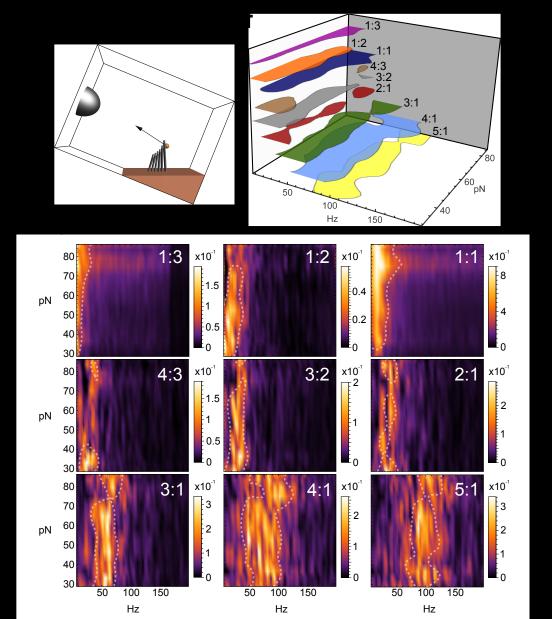


#### High-frequency stimulus



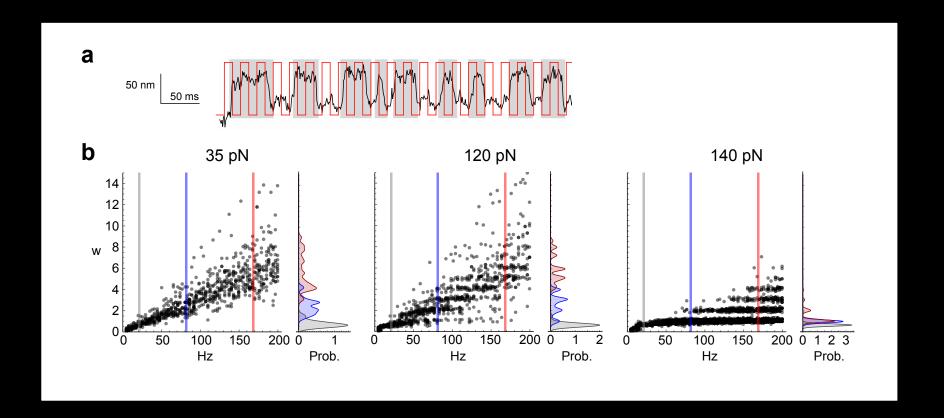
Lee et al, ACS Nano, 8, 6590 (2014)

Phase-locked regimes at n:m frequency ratios form highly overlapping Arnold Tongues.



Levy et al, *Sci. Rep.,* **6**, 39116 (2016)

#### Ensemble response to higher frequency stimuli



The hair bundle synchronizes to the signal at different frequency ratios, flickering between different modes of entrainment.

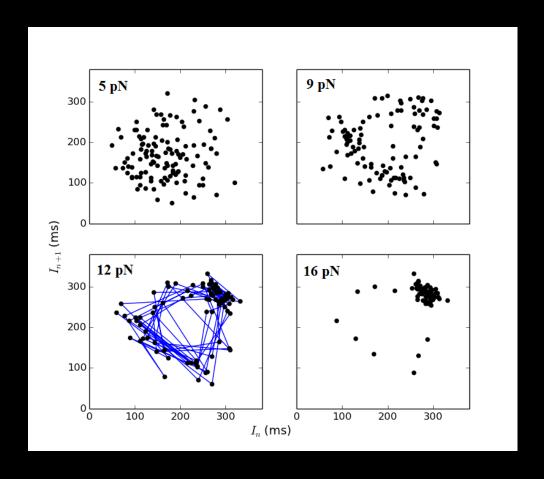
## Chaos in bundle dynamics

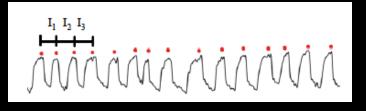
Do hair bundle dynamics exhibit chaos?

If so, how is it affected by external stimuli?

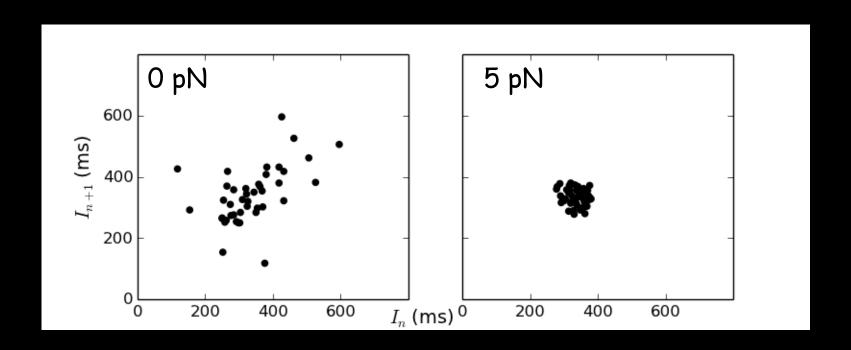
Does it aid in achieving sensitivity of detection?

#### Poincare maps

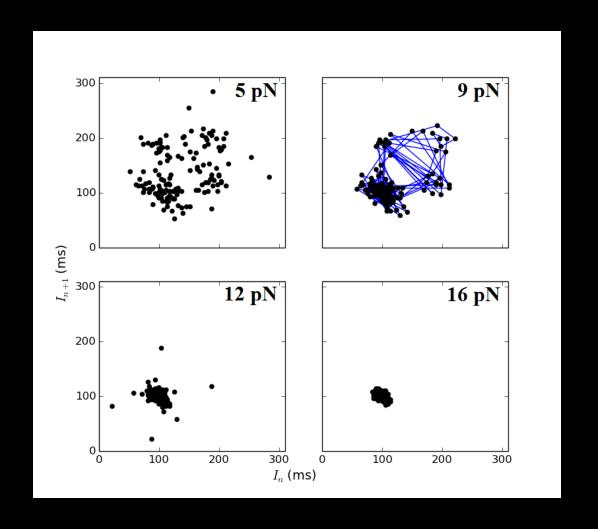




below resonance: quasiperiodic transition



#### on resonance

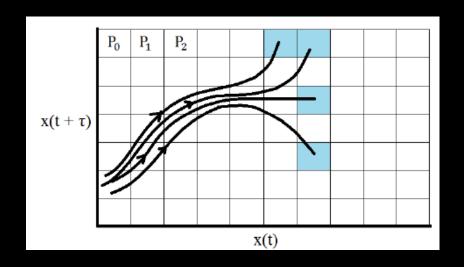


above resonance: multimode locking

#### Kolmogorov entropy

$$S(t) = -\sum_{n=0}^{all\ boxes} P_n \log(P_n)$$

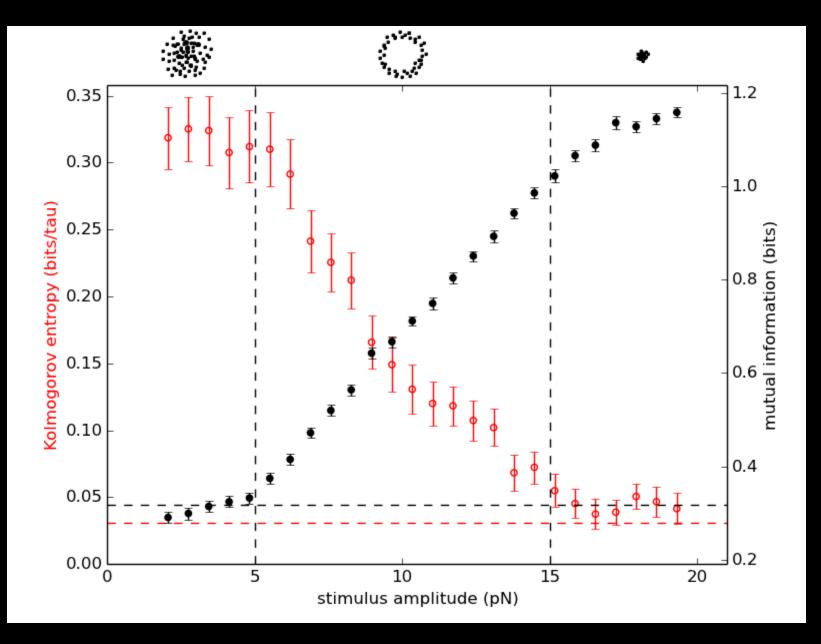
$$K = \left\langle \frac{dS(t)}{dt} \right\rangle$$



K- entropy measures the degree of chaos in the system. It corresponds to the sum of positive Lyapunov exponents.

# Mutual information between a signal (X) and response (Y)

$$M_{XY} = \sum_{x \in X} \sum_{y \in Y} P(x, y) \log \left( \frac{P(x, y)}{P(x)P(y)} \right)$$



#### Experimental findings

Actively oscillating hair bundles exhibit a chaotic attractor.

Chaoticity is reduced by the application of a signal. The steepest reduction of Kolmogorov entropy and steepest gain in mutual information is observed in the transition from chaos to regular limit cycle.

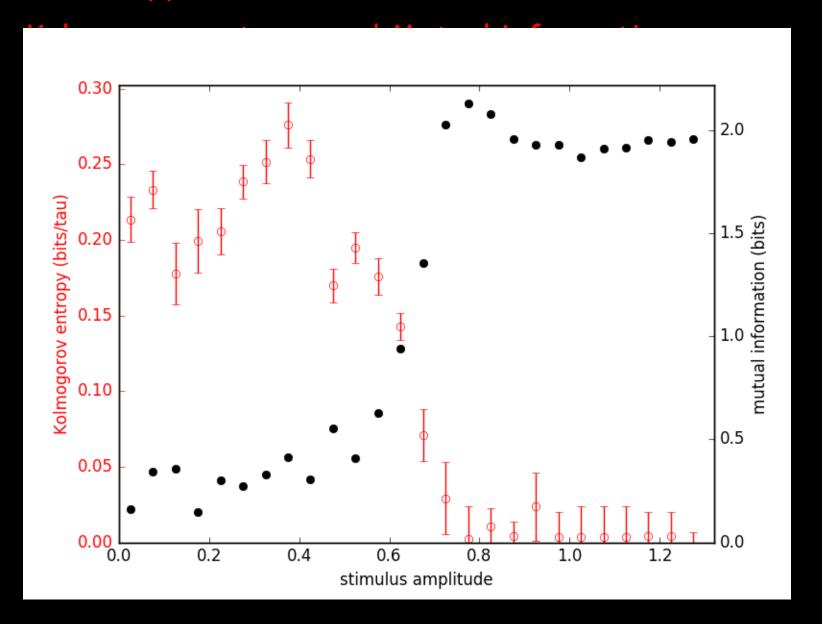
#### Theoretical model

$$\frac{dz}{dt} = z(\mu - i\omega_0 + A|z|^2 - B|z|^4) + f_A \cos(w_d t).$$

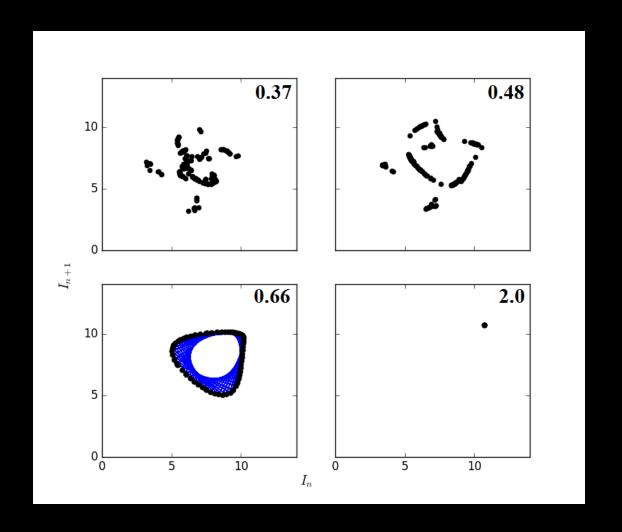
$$\frac{d\mu}{dt} = k_{on} - k_{off}\Theta(x - x_0) + f_A$$

Does this simple model capture the chaotic structure of the measured bundle dynamics?

#### K-entropy and MI: numerical simulations



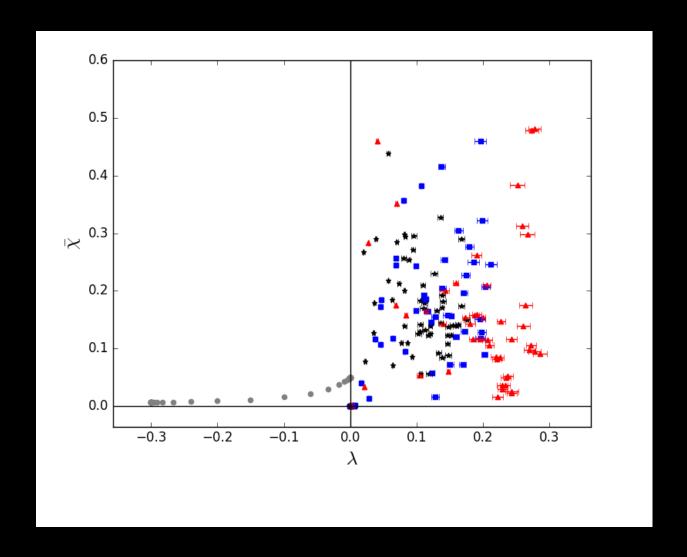
#### Poincare maps: numerical simulations



increasing stimulus amplitudes, below resonance

#### How does chaos affect the sensitivity of response?

- -Vary parameters in the model, and determine the Lyapunov exponents. This provides a simple metric for the degree of chaos in the bundle.
- -Calculate the sensitivity of the response  $\chi$ , which measures the phase locked amplitude of the response, for a given forcing strength.



High gains are observed even at extremely small forcing amplitudes ( $f_A$ =10<sup>-5</sup>). Blue, red, and black points correspond to variations in parameters  $k_{on}$ ,  $k_{off}$ , and  $x_o$ . Grey points represent variations in A, in the limit cycle regime. Plot shows scaled sensitivity, defined as  $|\chi-\chi_o|/\chi_o$ .

# Summary

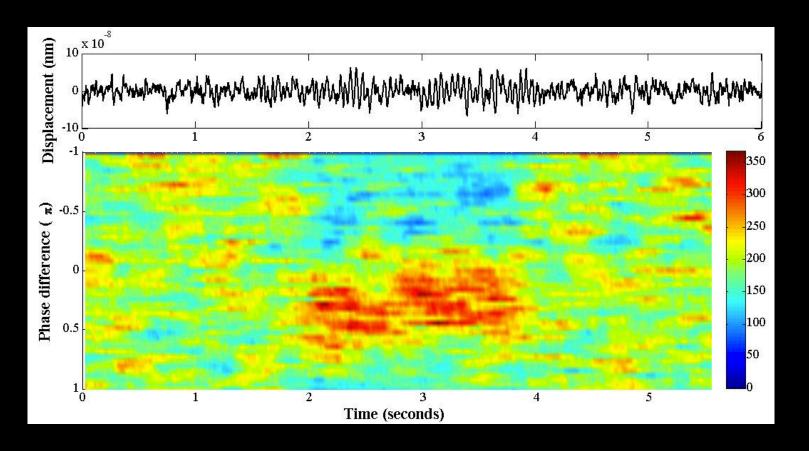
Active bundle motility exhibits chaos.

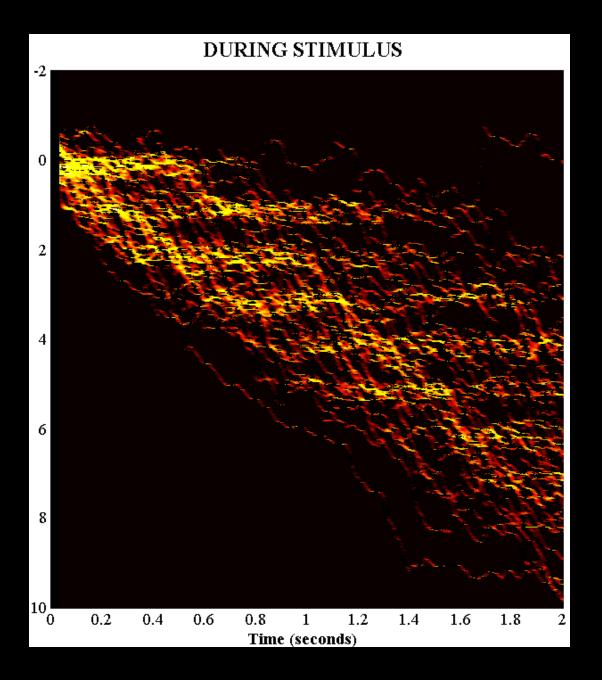
Degree of chaos is reduced by the application of an external signal. The quasi-periodic transition from chaos corresponds to the steepest gain in mutual information.

Numerical simulations indicate that weakly chaotic regime could be highly sensitive.

# Effects of stochastic noise

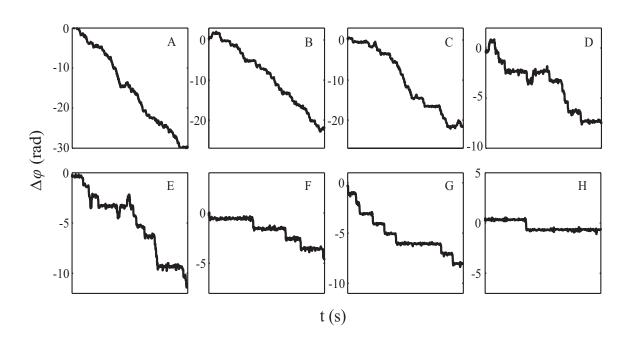
## Phase-locking to low-amplitude sinusoidal stimuli





Roongthumskul, Y. et al, Phys. Rev. Lett., 110, 148103 (2013).

# Phase slips

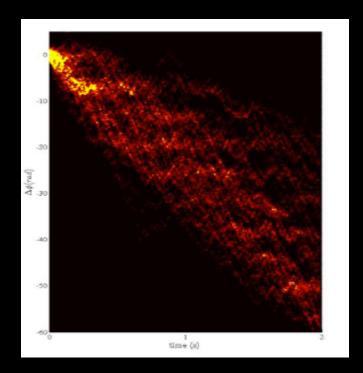


amplitudes: 0.2, 0.35, 0.5, 0.6, 0.7, 0.8, 1.0, 1.2 pN

# Stochastic Adler equation

$$\frac{d\Delta\phi(t)}{dt} = -\Delta\omega + \epsilon \mathrm{sin}(\Delta\phi(t)) + \eta(t), \label{eq:deltaphi}$$

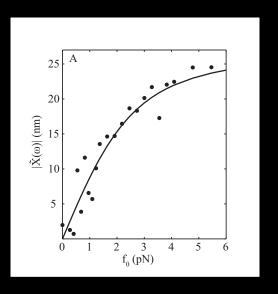
$$\langle \eta(t)\eta(t')\rangle = 2T\delta(t-t')$$



numerical simulation

## Stochastic Adler equation

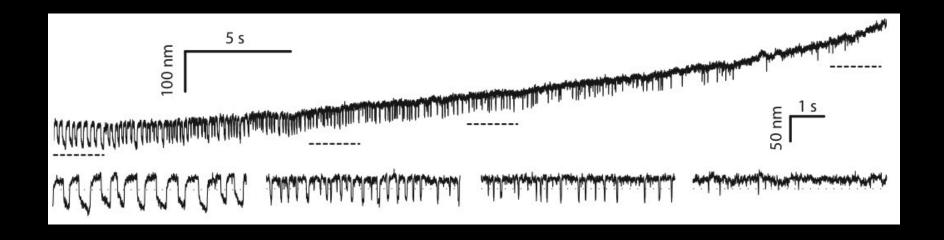
At low stimulus amplitudes: growth of the phase-locked component with driving force is well described by the Adler equation.



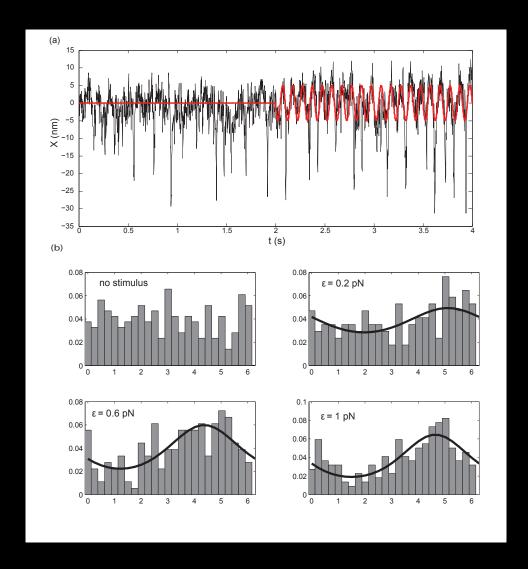
$$\left| \tilde{X}(\omega) \right| = r I_1 \left( \frac{\varepsilon}{T} \right) / I_0 \left( \frac{\varepsilon}{T} \right)$$

r = oscillation amplitude
I: modified Bessel functions

## Can the bundle amplify from the non-oscillatory state?



Near the transition between spontaneous oscillation and quiescence, the hair bundle exhibits sharp spike-like excursions.

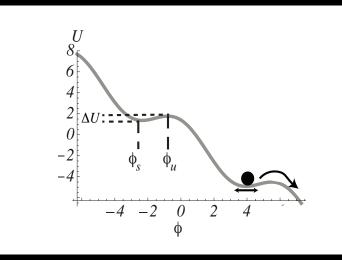


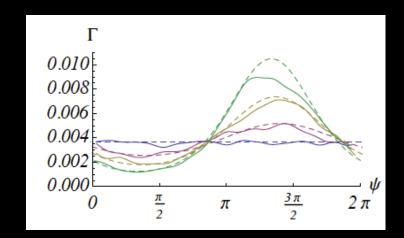
Without stimulus, the occurrence of spikes is stochastic. With an applied signal, they occur at a preferred phase.

Shlomovitz, R. et al, Interface Focus, 4, 2014022 (2014).

# Adler equation predicts phase slips (spikes) in the quiescent regime

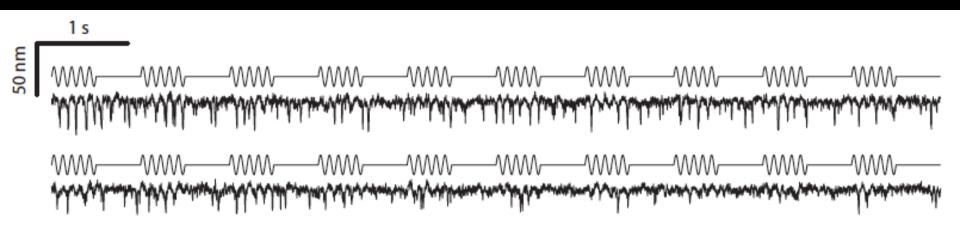
$$\dot{\phi} \simeq \omega_0 + F \sin(\phi) + \epsilon \sin(\phi - \omega_f t) + \sqrt{2D} \eta(t)$$





Preferential phase of spiking is predicted by the equations.

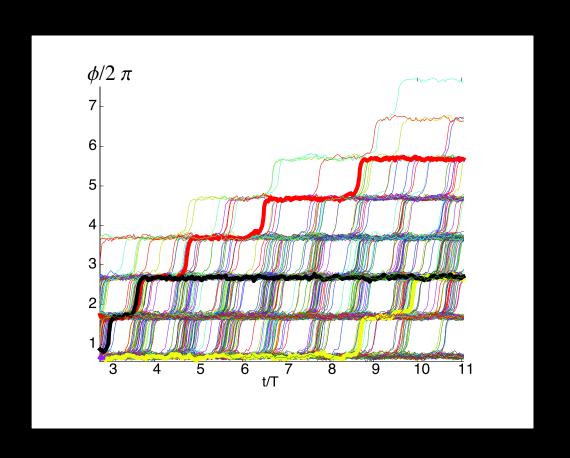
## Active response from the spiking regime



In the absence of a stimulus, the occurrence of spikes is stochastic.

Even very weak drives can phase-lock the spikes, leading to 10-100x enhancement in the amplitude of the bundle movement.

# Ensemble response



# Summary

Mode-locking to weak signals is well described by the stochastic Adler equation. The transition is characterized by the occurrence of phase slips.

Spiking regime allows for a significant enhancement of the signal. Occurrence of spikes from the quiescent state exhibits a preferential phase. This allows the ensemble to encode the frequency of the stimulus.

# Open problems

Interaction between noise and chaos

Role of both or either in coupled system

In vivo effects

## **Acknowledgements**

#### Current lab members

Dr. Sebaastian Meenderink Dr. Yuki Quinones Tracy Zhang Elizabeth Mills Justin Faber Janaki Sheth Jessica Lin

#### Former group members

Dr. Michael Levy

Dr. Roie Shlomovitz

Dr. Yuttana Roongthumskul

Dr. Lea Fredrickson

#### **Collaborations**

Magnetic nanoparticles
Prof. Jinwoo Cheon
Nonlinear dynamics
Prof. Robijn Bruinsma

#### Funding

National Science Foundation National Institute of Health Air Force Office of Scientific Research