



## *Active Audition Using Coupled Oscillators*

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University of Nottingham

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# *Active Audition*

## *Using Coupled Oscillators*

*Nonlinearity in Biological Systems*

*The Feed-Forward Network*

*Experimental System*

*Other Filter Networks*

# Nonlinearity in Nature

Nature economises by using nonlinear phenomena:

- Turing patterns in morphogenesis;
- synchronisation of oscillations:
  - heart muscle,
  - fireflies;
- Central Pattern Generators (CPG) for locomotion<sup>1</sup>:

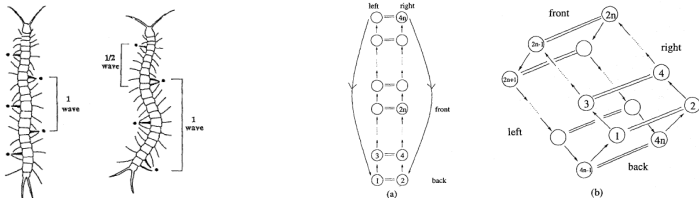


Fig. 1. (a) Schematic:  $4n$ -cell network for gait in  $2n$ -legged animals. Only cells  $1, \dots, 2n$  are connected to legs. (b) Folding up the network to eliminate long-range connections creates a structure with repeated modules, differing slightly at the two ends.

<sup>1</sup> "A modular network for legged locomotion", Golubitsky, Stewart, Buono, & Collins, *Physica D* (1998)

## *Nature Does It Better!*

Animal visual and auditory systems have very good filtering characteristics:

- Can isolate signal from “noisy” background
- Able to discriminate specific frequencies
- Very good dynamic range (several orders of magnitude)
  - Difficult to achieve in devices
    - ⇒ Current amplifiers have linear response

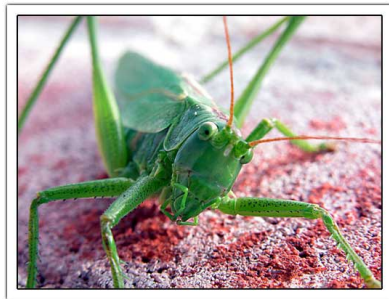
# Animal Auditory Systems

Active detection involved in mammalian hearing:

- Nonlinear growth  
⇒ large dynamic range

Involvement of Hopf bifurcation in insect hearing

- Active audition
- Coupling of limit cycles for small signal amplification

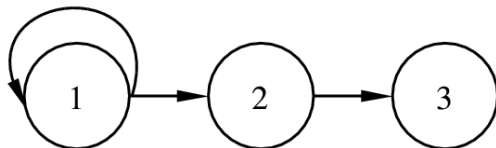


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"Limit Cycles, Noise, and Chaos in Hearing."

R. Stoop, J.-J. V.D. Vyver, and A. Kern. *Microsc. Res. and Techn.*, **63:400–412**, 2004.

# The Feed-Forward Network



- Coupled systems have the form:

$$\dot{x}_1 = f(x_1, x_1, \lambda)$$

$$\dot{x}_2 = f(x_2, x_1, \lambda)$$

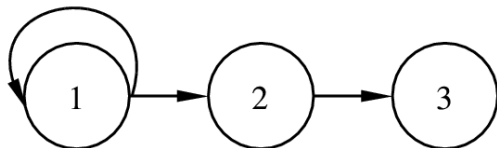
$$\dot{x}_3 = f(x_3, x_2, \lambda)$$

- $\lambda$  is Hopf bifurcation parameter

"Some curious phenomena in coupled cell networks."

M. Golubitsky, M. Nicol, and I. Stewart. *J. Nonlin. Sci.*, **14(2)**:207–236, 2004.

# The Feed-Forward Network



- Amplitude growth of unforced system:

$$A_1 = 0$$

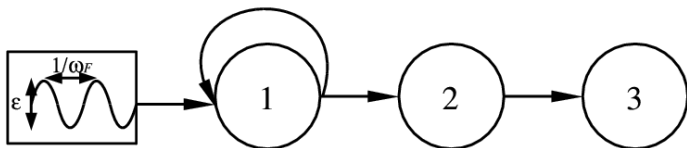
$$A_2 \sim \lambda^{\frac{1}{2}}$$

$$A_3 \sim \lambda^{\frac{1}{6}}$$

"Some curious phenomena in coupled cell networks."

M. Golubitsky, M. Nicol, and I. Stewart. *J. Nonlin. Sci.*, **14(2)**:207–236, 2004.

## With Periodic Input



- Forced network represented by:

$$\dot{x}_1 = f(x_1, x_1 + \epsilon \cos(\omega_F t), \lambda)$$

$$\dot{x}_2 = f(x_2, x_1, \lambda)$$

$$\dot{x}_3 = f(x_3, x_2, \lambda)$$

- $\lambda$  held constant at Hopf Bifurcation



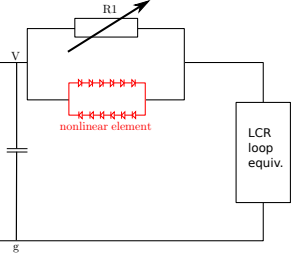
# Experimental Electronic Oscillators

Modified *van der Pol* oscillators:

- LCR loop with nonlinearity from chain of diodes.



Circuit Schematic:



- Fixed-point response undergoes Hopf bifurcation before period-doubling cascade to chaos.
- Can connect units to make network of coupled oscillators.

## Model of Oscillators

- 3 Degree-of-freedom system:

$$\dot{x}_n = \gamma[g(y_n - x_n) - \alpha_0 + \alpha_1(x_n - \sigma x_m)]$$

$$\dot{y}_n = -z_n - g(y_n - x_n)$$

$$\dot{z}_n = y_n - \rho z_n$$

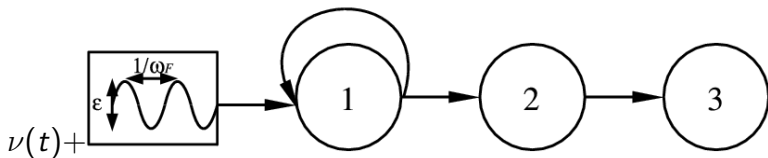
- Has cubic nonlinearity:

$$g(V) = \beta_1 V + \beta_3 V^3$$

"The origins of chaos in a modified Van der Pol oscillator."

J.J. Healey, D.S. Broomhead, K.A. Cliffe, R. Jones, T. Mullin. *Physica D*, 1991.

## With (noisy) Periodic Input



- Forced network represented by:

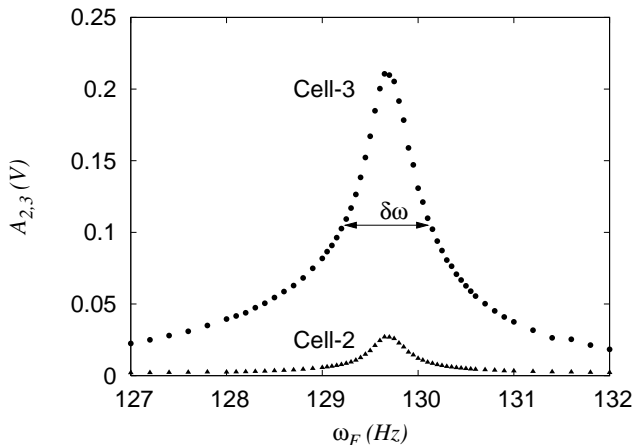
$$\dot{x}_1 = f(x_1, x_1 + \epsilon \cos(\omega_F t) + \nu(t), \lambda_1)$$

$$\dot{x}_2 = f(x_2, x_1, \lambda_2)$$

$$\dot{x}_3 = f(x_3, x_2, \lambda_3)$$

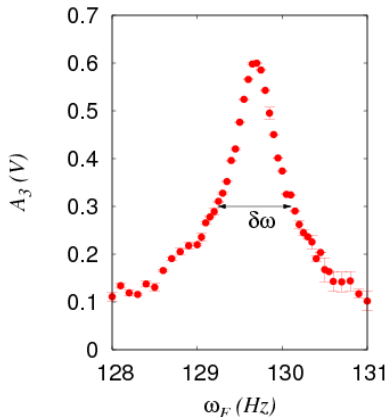
- $\lambda$  held constant *near* Hopf Bifurcation ( $\omega_1 \approx \omega_2 \approx \omega_3$ )

# Experimental Response



"Sensitive Signal Detection Using a Feed-Forward Oscillator Network"  
N.J. McCullen, T. Mullin and M. Golubitsky, *Phys. Rev. Lett.*, **98**, 254101 (2007)

# Frequency Response



- Band-width:  
 $\delta\omega \sim 1\% \omega_H$ 
  - $Q \sim 100$
- Narrow passband

“Sensitive Signal Detection Using a Feed-Forward Oscillator Network”  
N.J. McCullen, T. Mullin and M. Golubitsky, *Phys. Rev. Lett.*, **98**, 254101 (2007)

# Signal Amplification & Noise Filtering

$$\text{Amplification (dB)} = 20 \log_{10} \left( \frac{V_{\text{out}}}{V_{\text{in}}} \right)$$

- Input:  $\varepsilon \sim 5 \times 10^{-4} \text{ V}$

Output:  $A_3 \sim 1 \text{ V}$

$$\approx 66 \text{ dB}$$

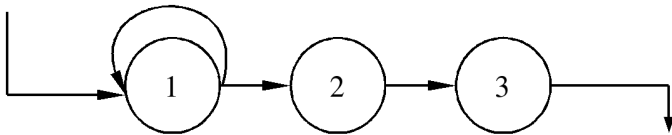
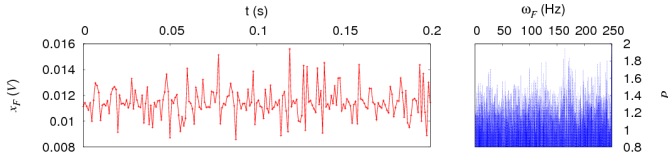
- Signal recovery (*dynamic reserve*):

Noise:  $\nu \sim 5 \times 10^{-3} \text{ V}$

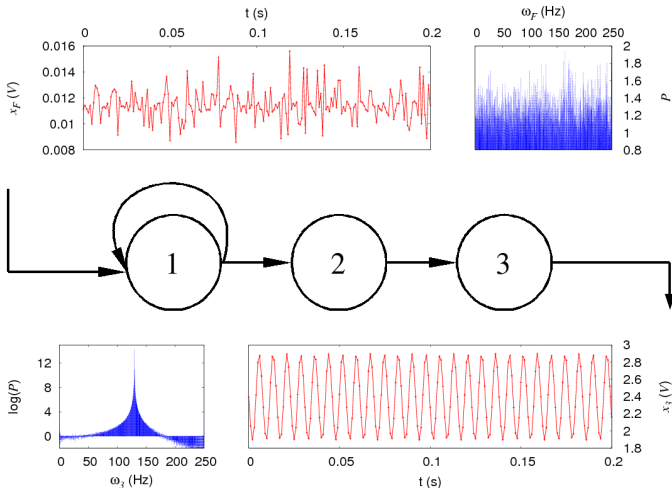
Signal:  $\varepsilon \sim 5 \times 10^{-4} \text{ V}$

$$\text{Noise-Signal Ratio} \approx 20 \text{ dB}$$

# Noise Filtering & Signal Recovery

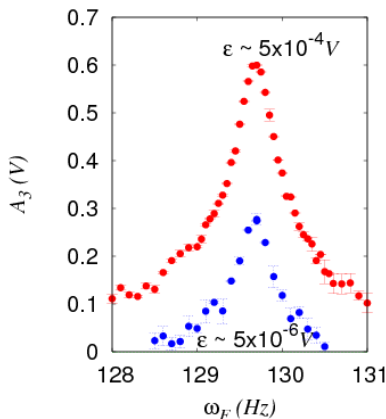


# Noise Filtering & Signal Recovery



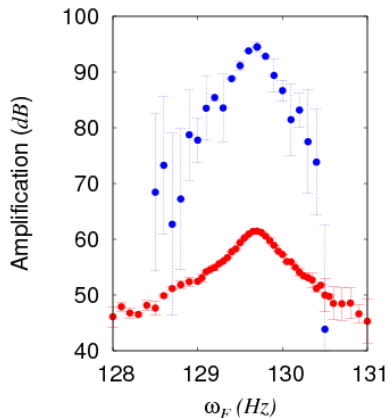
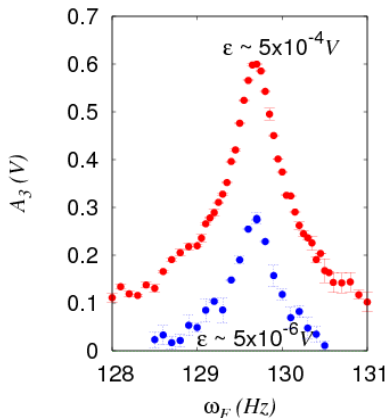


## Small Signal Response



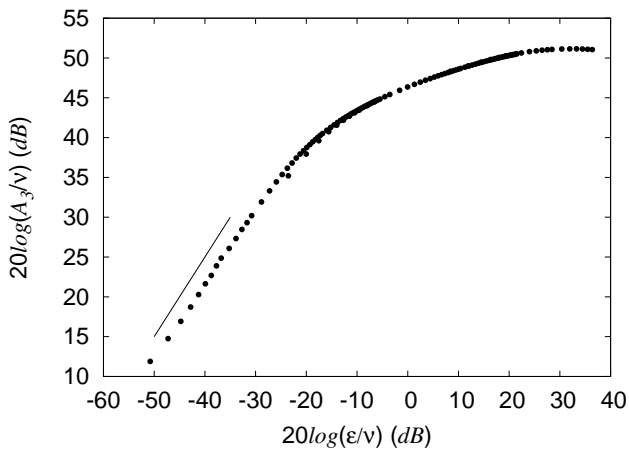
- $\epsilon \sim 5 \times 10^{-4} V$   
 $\nu \sim 5 \times 10^{-3} V$   
 $SNR \approx 20dB$
- $\epsilon \sim 5 \times 10^{-6} V$   
 $\nu \sim 5 \times 10^{-3} V$   
 $SNR \approx 60dB$
- Good signal recovery
- Nonlinear response – good dynamic compression

# Non-Linear Amplification



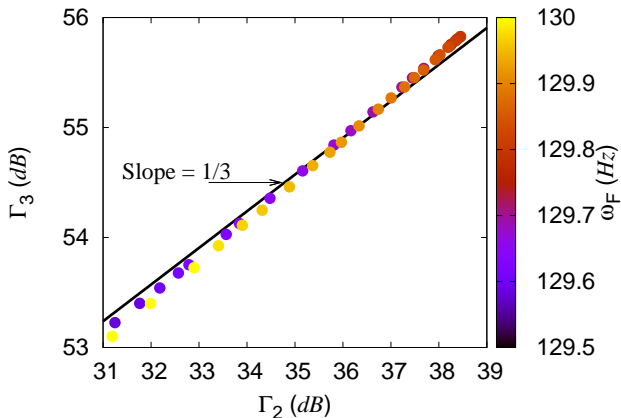
- Large dynamic range.

# Dynamic Compression



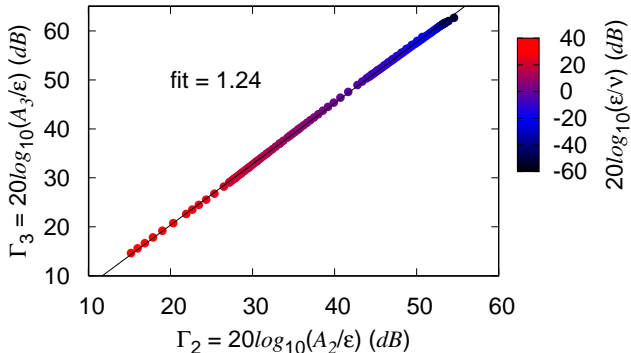
# Amplitude Growth (1)

Amplification against Driving **Frequency**:

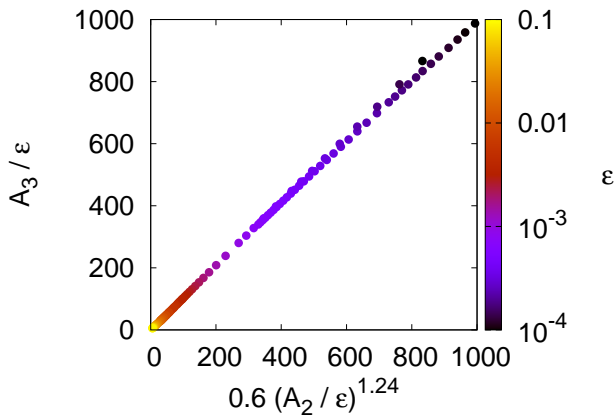


## Amplitude Growth (2)

Amplification against Driving **Amplitude**:

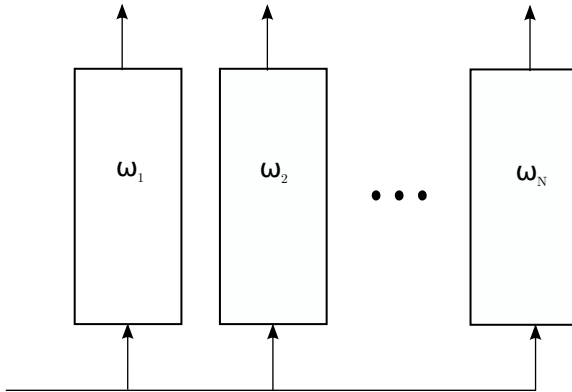


# Amplification in Cells 2 and 3



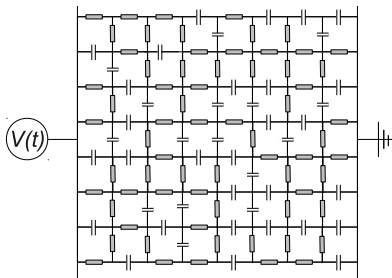
# More Complex Filter Networks

Multi-filter array:

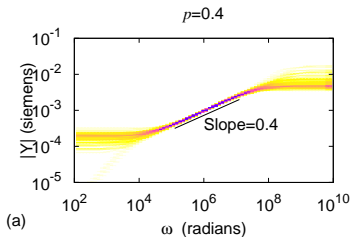
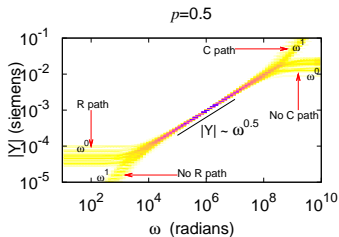


# More Complex Filter Networks

## Complex RC Networks:



"Emergent Behaviour in Large Electrical Networks"  
 Darryl P. Almond, Chris J. Budd and Nick J. McCullen,  
*Approximation Algorithms for Complex Systems: Proceedings of the 6th International Conference on Algorithms for Approximation, Ambleside, UK, 31st August-4th September 2009.* (Springer 2011)



(a)



## Summary

- Nonlinear effects are found frequently in natural systems,
- synchronisation and resonance are particularly useful,
- application in neuroscience and signal detection.
  
- Well controlled experiments invaluable to:
  - study effect real world imperfections & noise,
  - both guide and confirm theoretical work.
  
- Many potential avenues to investigate with coupled oscillator systems.