

# *Experimental study and control of optical pulses emitted by semiconductor lasers with feedback*

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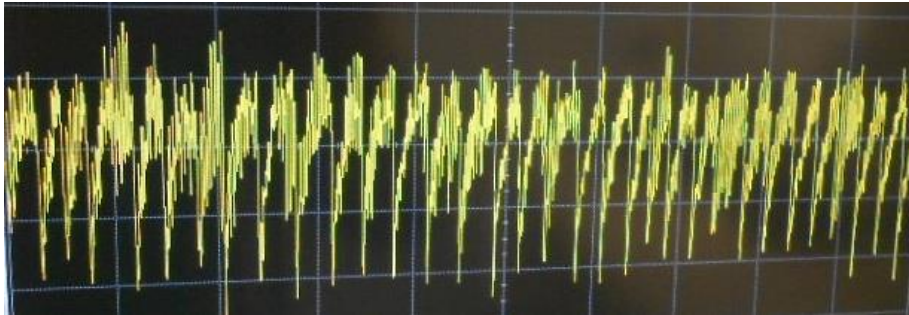
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- Characterization of optical spikes
- Control via small electric perturbations

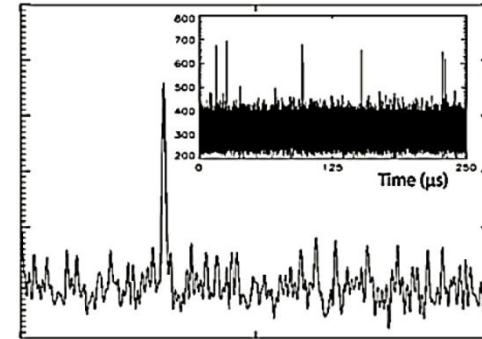
# Lasers provide “big data” for testing analysis tools and can be “toy models” for testing control strategies

- Diode laser with time-delayed optical feedback



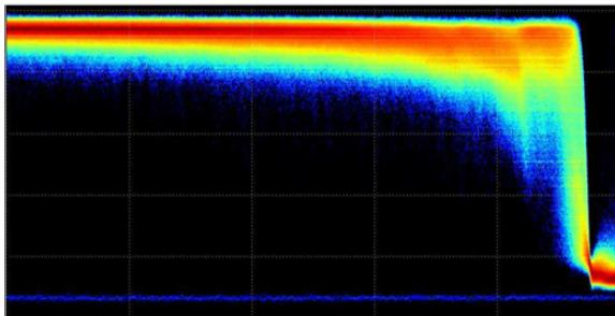
Time

- Extreme pulses (diode laser with injection)



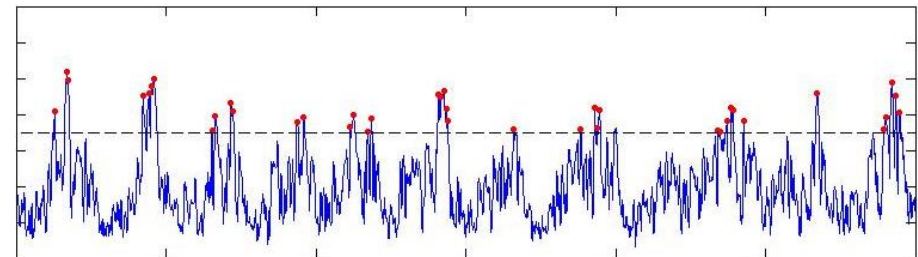
Time

- Polarization switching VCSEL



Time

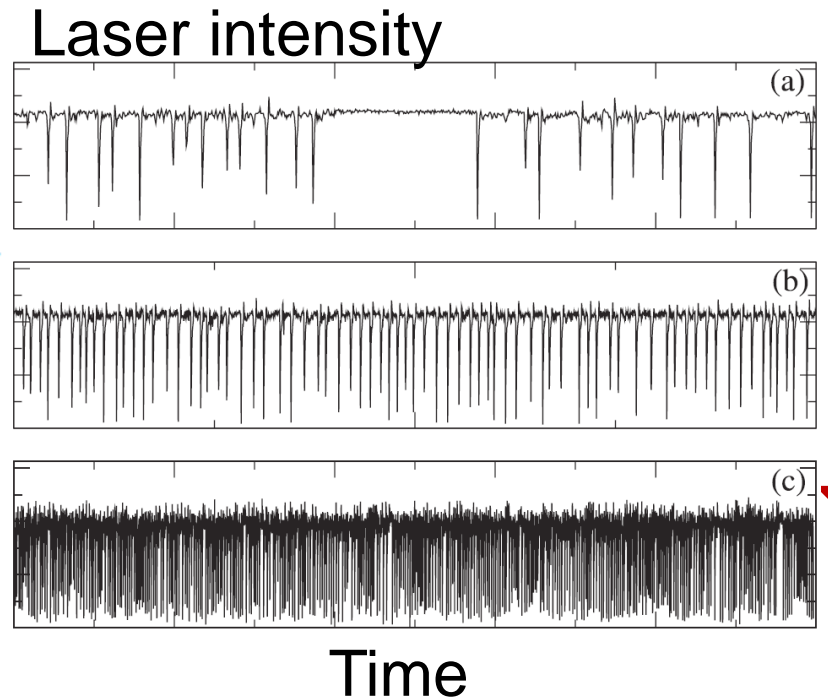
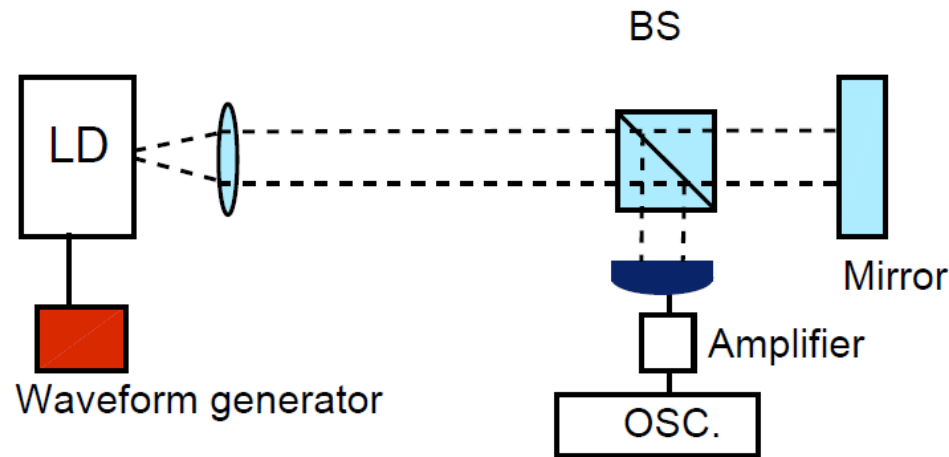
- Transition to optical turbulence Fiber laser



Time

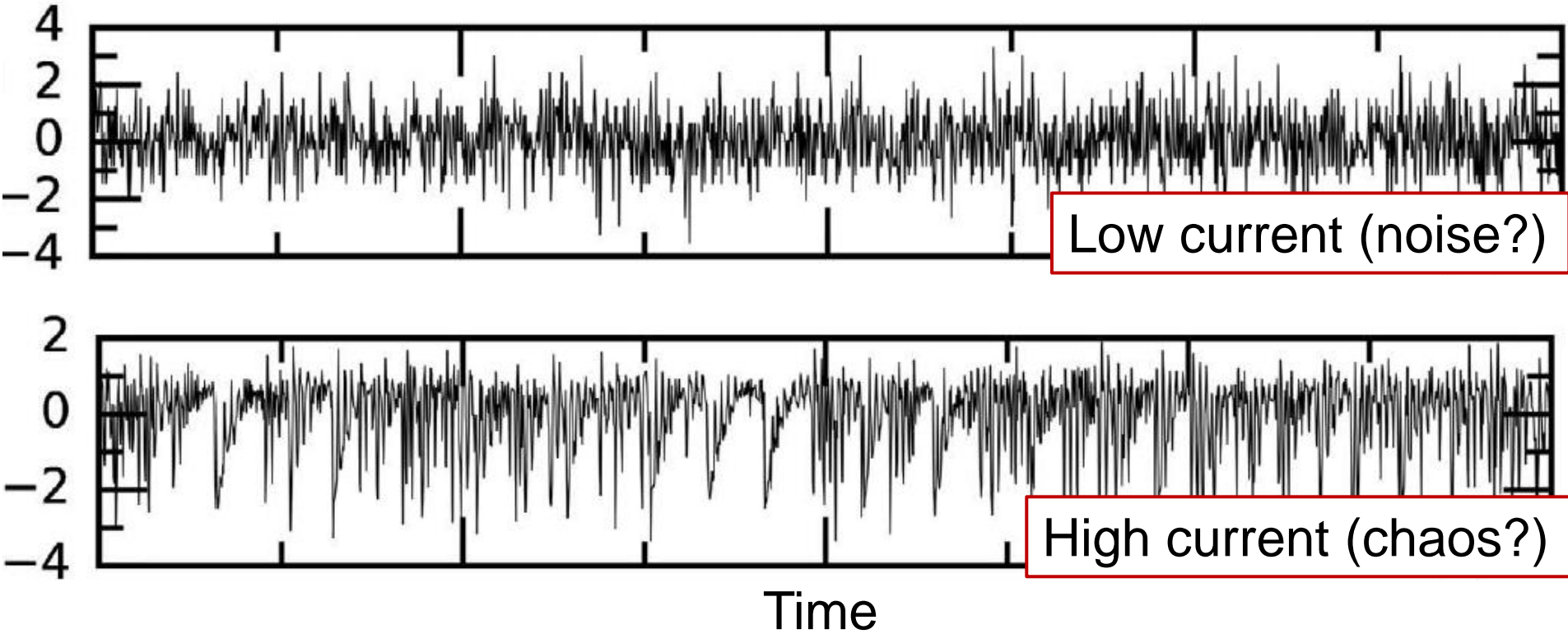
Dynamical transitions are often difficult to identify and to characterize.

Example: diode laser with time delayed optical feedback



Video: [how complex signals emerge from optical noise](#)

Laser output intensity



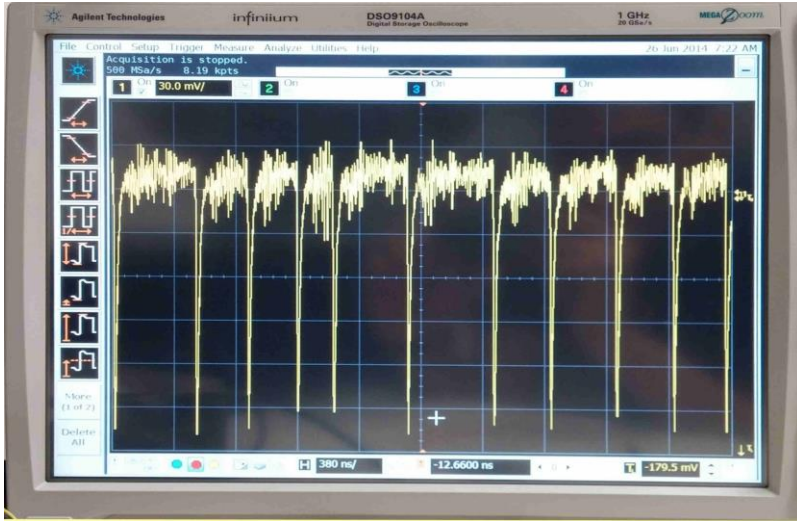
Can differences be quantified? With what reliability?

# Different methods provide complementary information

- Many methods
  - Correlation analysis
  - Fourier analysis
  - Lyapunov & fractal analysis
  - Symbolic analysis
  - Wavelet analysis
  - Etc. etc.
- The method to be used depends on the data
  - Length
  - Noise
  - Resolution
  - Etc.

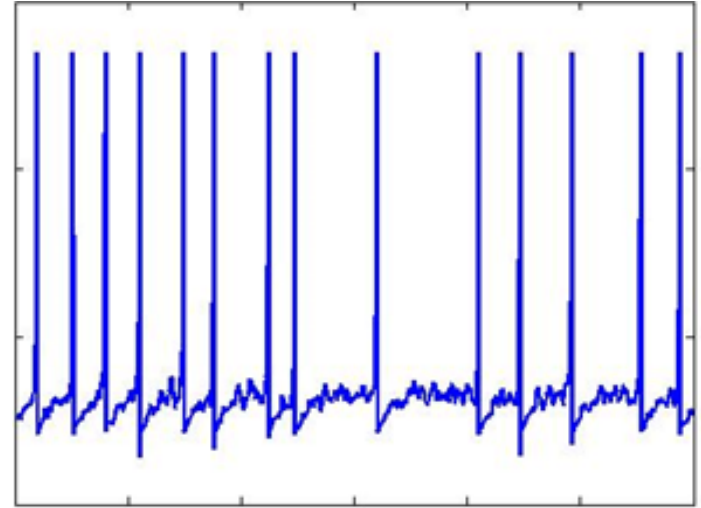
# How similar these time series are?

## Optical spikes



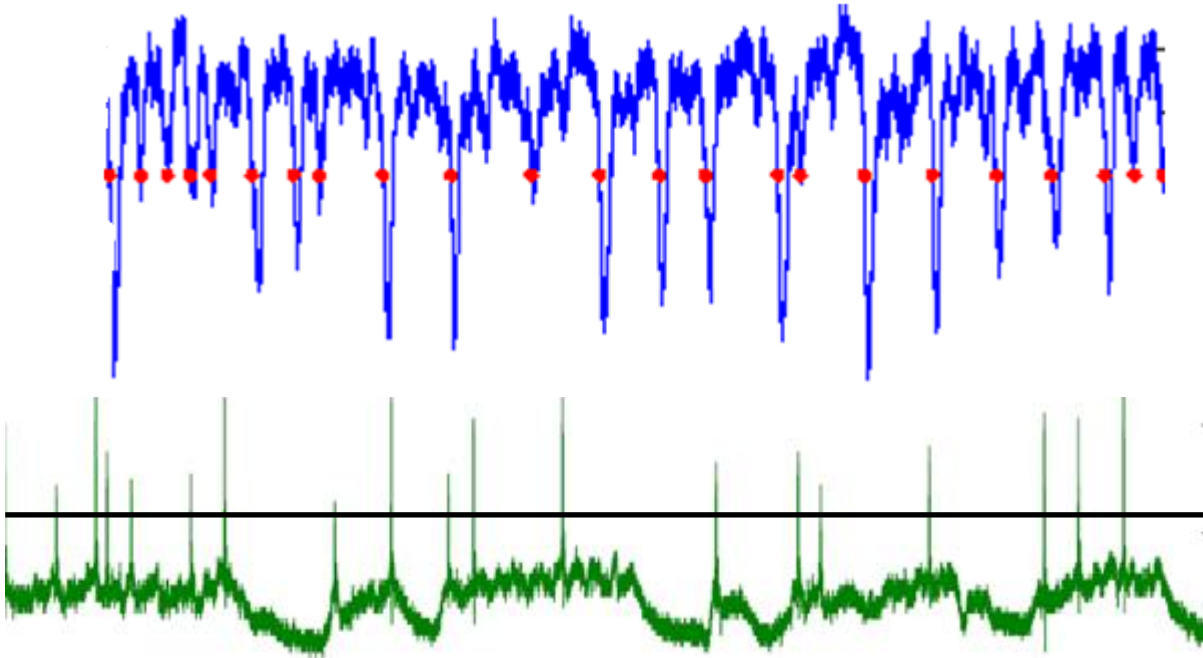
Time

## Neuronal spikes



Time

# Threshold crossings define ``events'' in a time series



- Problems:
  - How to select the threshold?
  - Threshold dependent results?

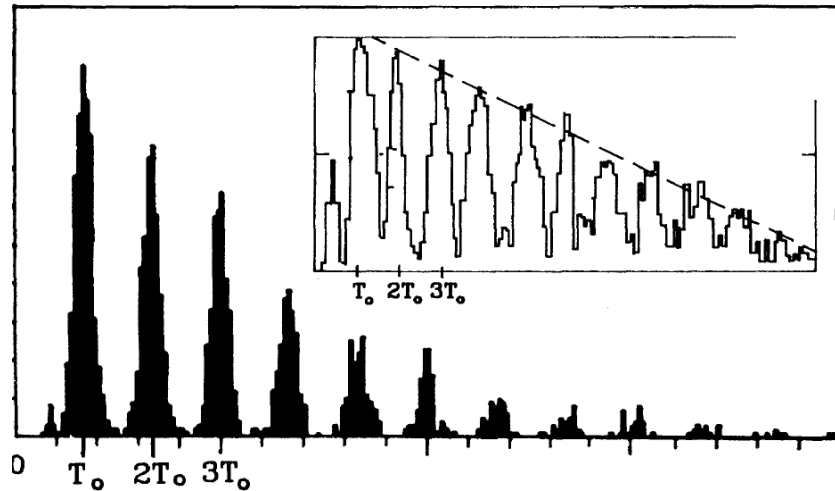
inter-spike-intervals (ISIs):

$$\Delta T_i = t_{i+1} - t_i$$



# ISI distribution indicates that neurons and lasers have a similar response to external periodic forcing

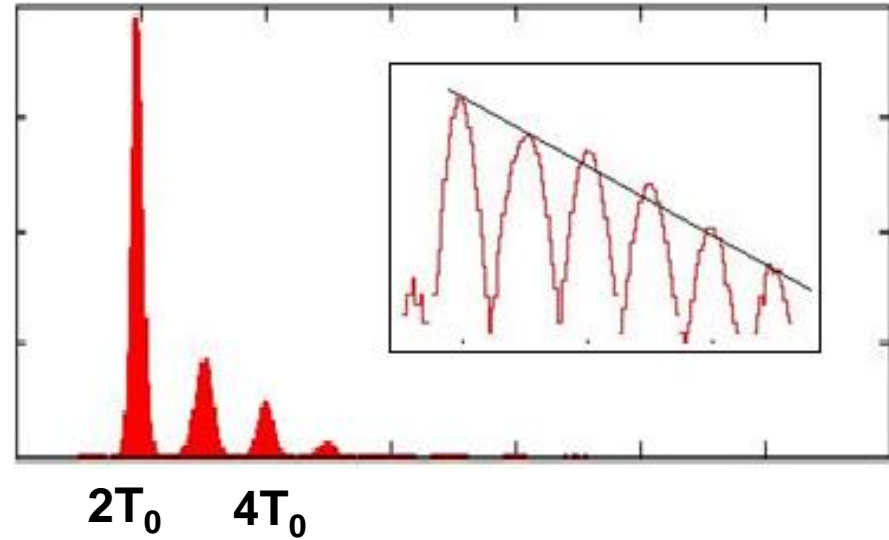
## Neuron data



Single auditory nerve fiber of a squirrel monkey with a sinusoidal sound stimulus applied at the ear.

*A. Longtin et al PRL (1991)*

## Laser data



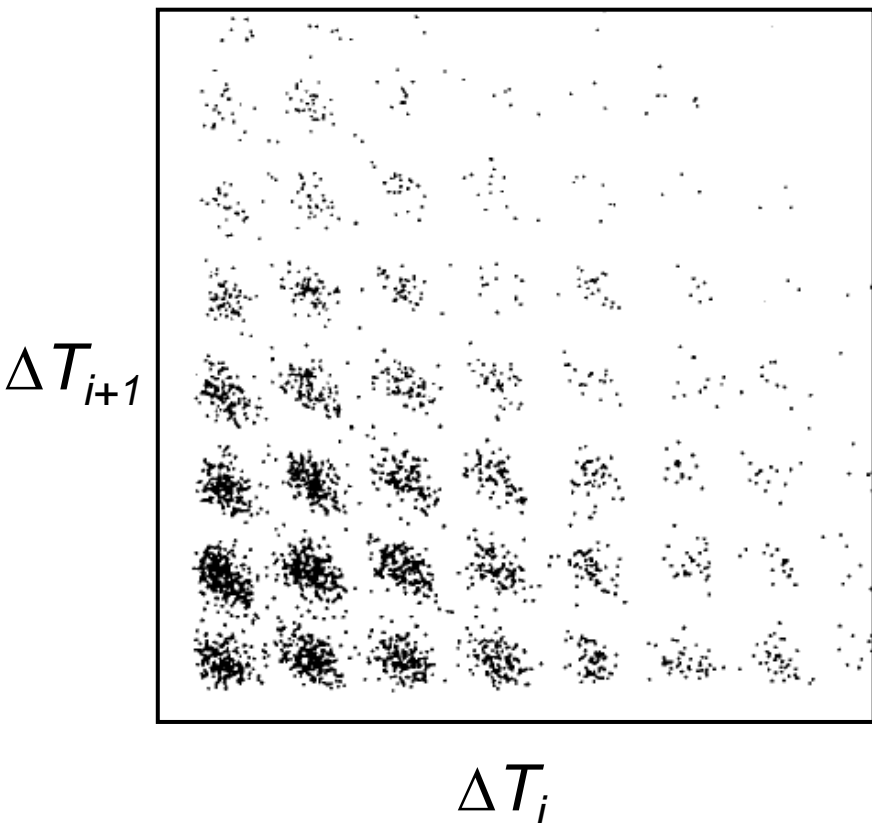
Data recorded in our lab when a sinusoidal signal is applied to the laser current.

*A. Aragoneses et al  
Optics Express (2014)*

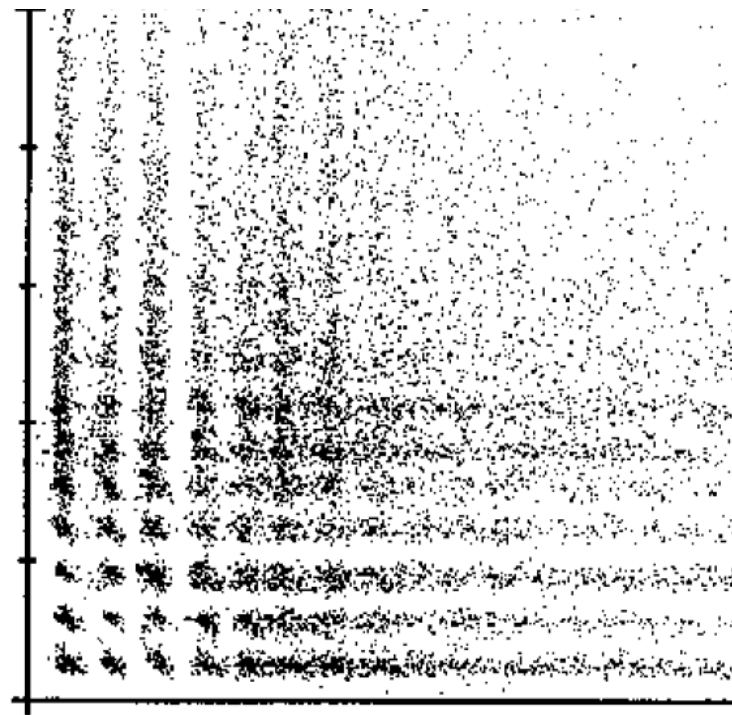


**Return maps** also suggest that neurons and lasers have similar response to external periodic forcing

Neuronal ISIs



Laser ISIs



*A. Longtin  
Int. J. Bif. Chaos (1993)*

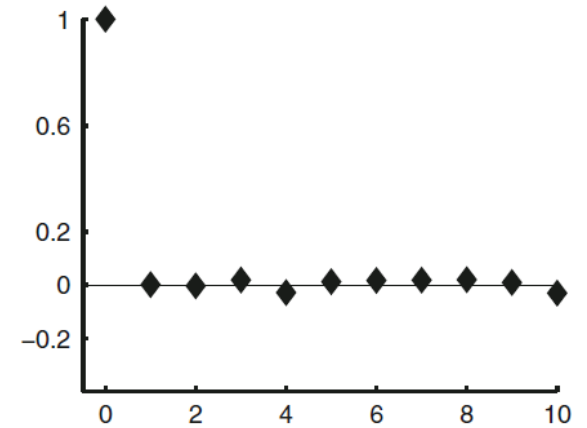
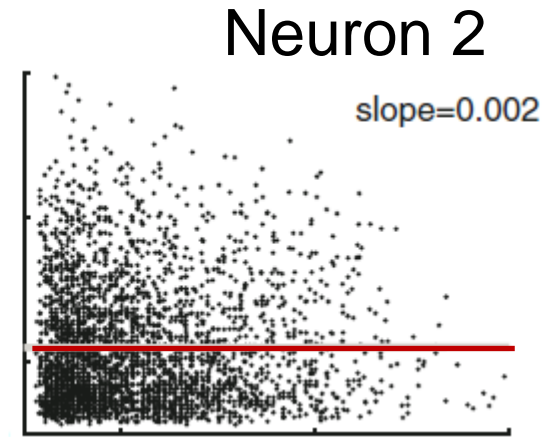
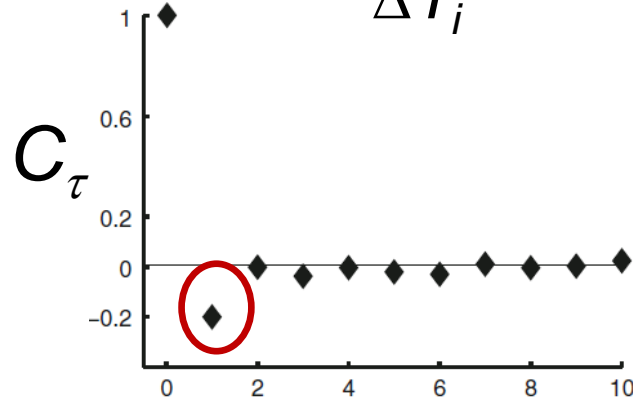
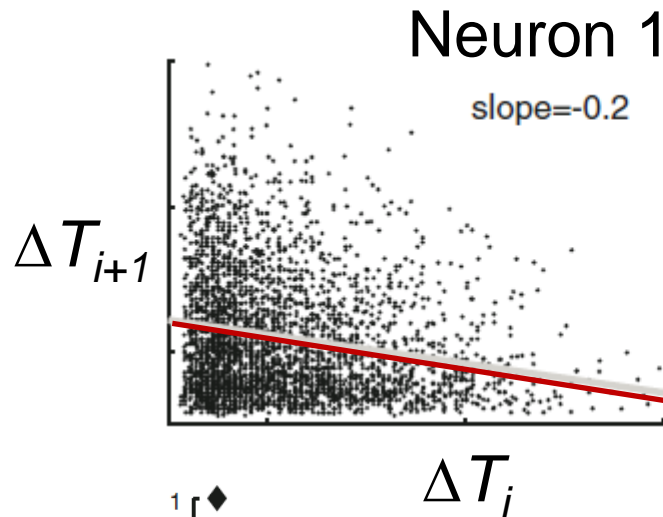
*M. Giudici et al PRE (1997)  
A. Aragonese et al  
Optics Express (2014)*

# ISI correlations uncover memory in neuron's firing activity

$$\{\dots \Delta T_{i-\tau} \dots \Delta T_i \dots\}$$

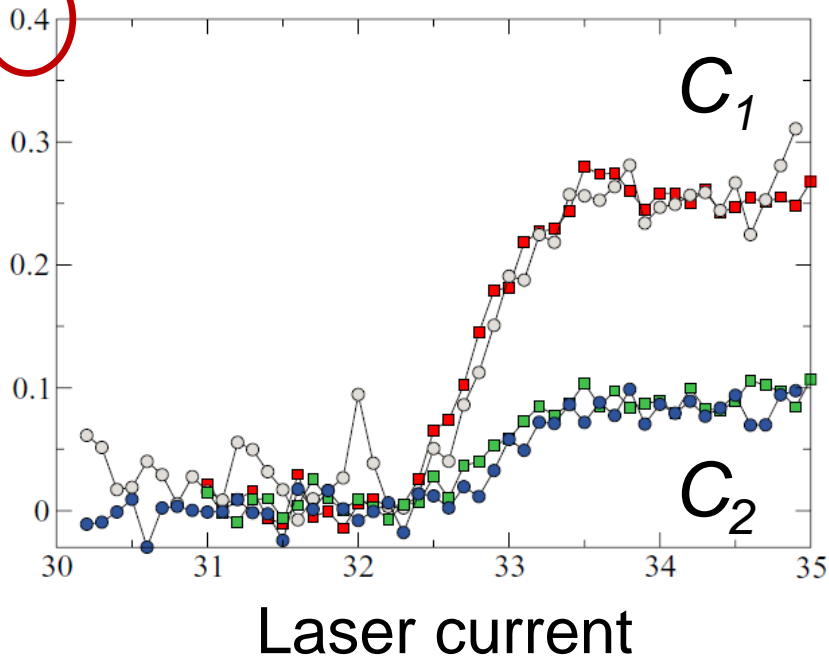
$$C_\tau = \frac{\langle (\Delta T_i - \langle \Delta T \rangle) (\Delta T_{i-\tau} - \langle \Delta T \rangle) \rangle}{\sigma^2}$$

Also positive and alternating ISI correlations have been reported.

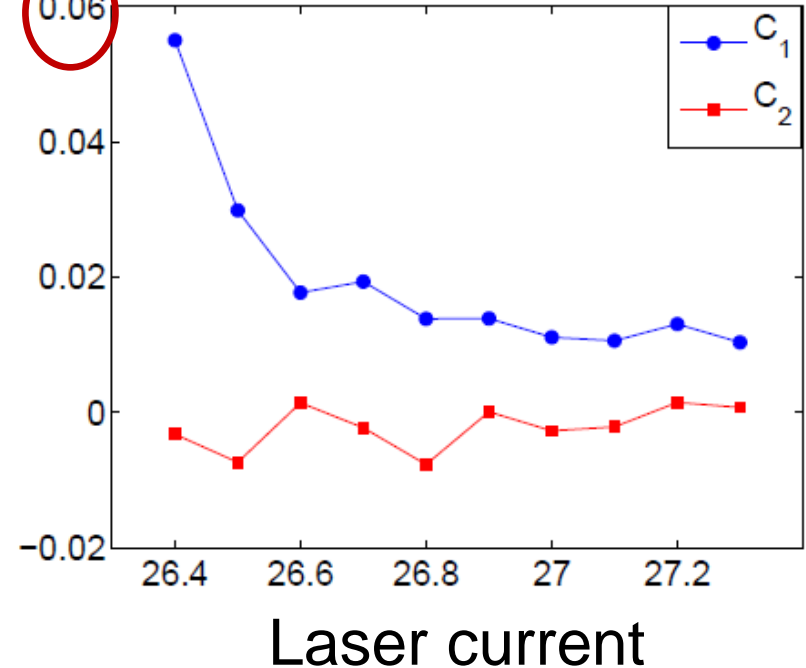


# In the laser data, ISI correlations uncover transitions

Experiment 1 (two datasets)



Experiment 2: no significant correlations



- How to identify temporal order in the laser spikes?
- Are there more or less expressed spike patterns?

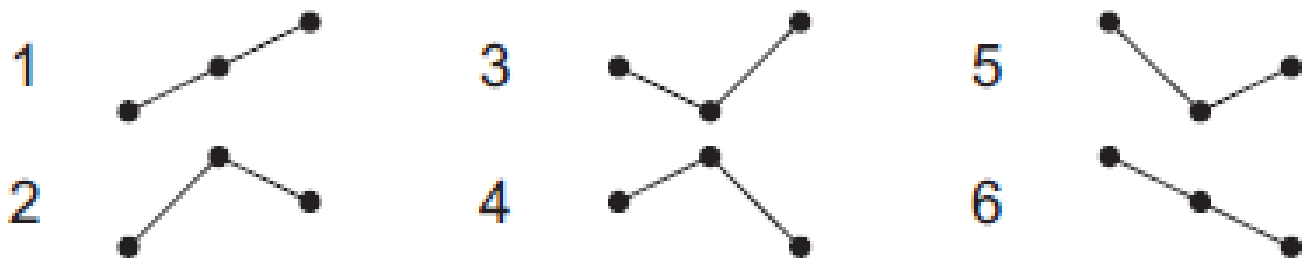
*J. Tiana et al PRA (2010)*

*A. Aragonese et al Sci. Rep. (2014)*

# **Symbolic ordinal analysis**

# Ordinal analysis: a tool to look for patterns in data

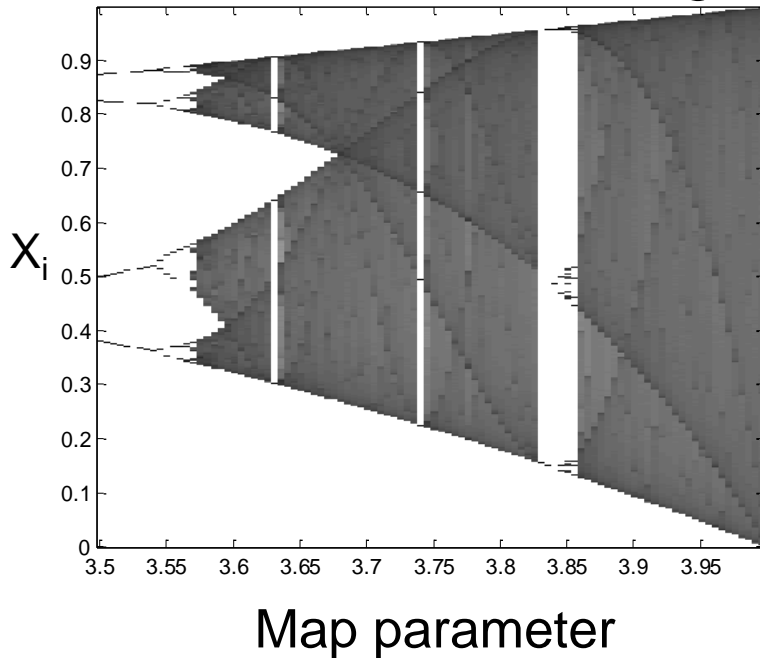
- Consider a time series  $X(t) = \{\dots, X_i, X_{i+1}, X_{i+2}, \dots\}$
- Which are the possible order relations among three data points?



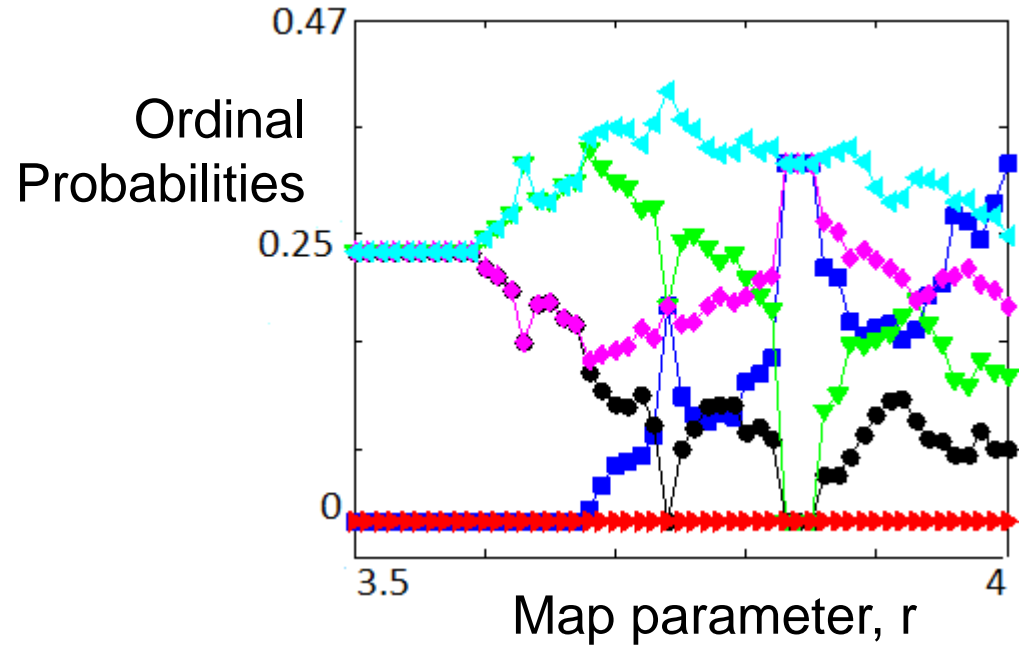
- Count how many times each “ordinal pattern” appears.
- Advantages: allows to identify temporal structures & is robust to noise.
- Drawback: information about actual data values is lost.

# Ordinal analysis yields complementary information

## Normal bifurcation diagram

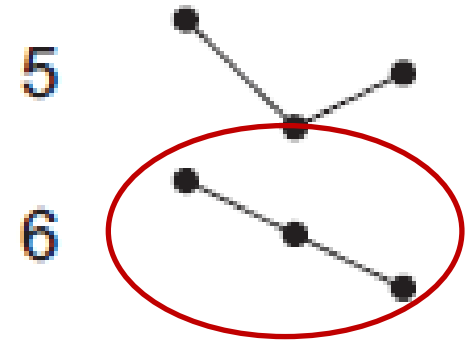
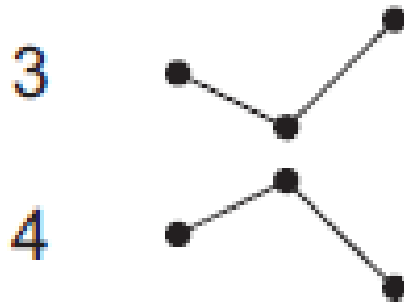
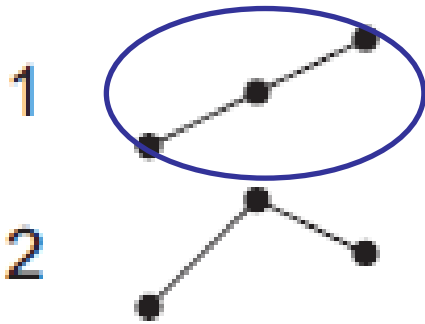
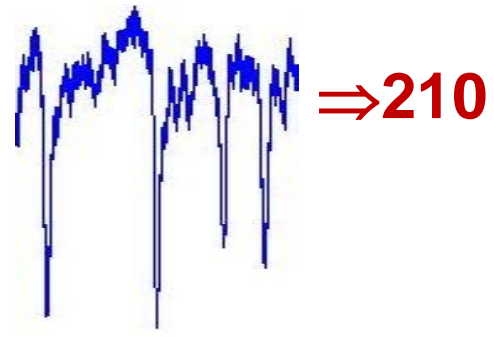
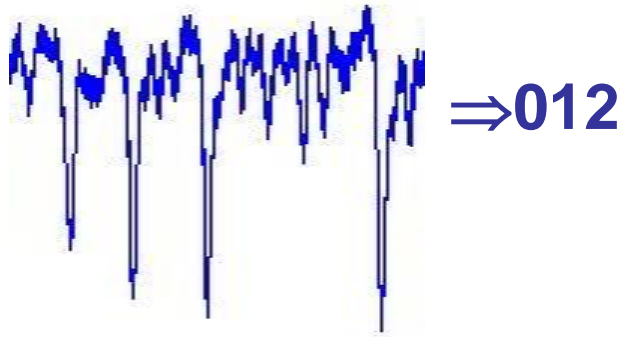


## Ordinal bifurcation diagram



Pattern **6 (210)** is always forbidden;  
pattern **1 (012)** is more frequently  
expressed as  $r$  increases

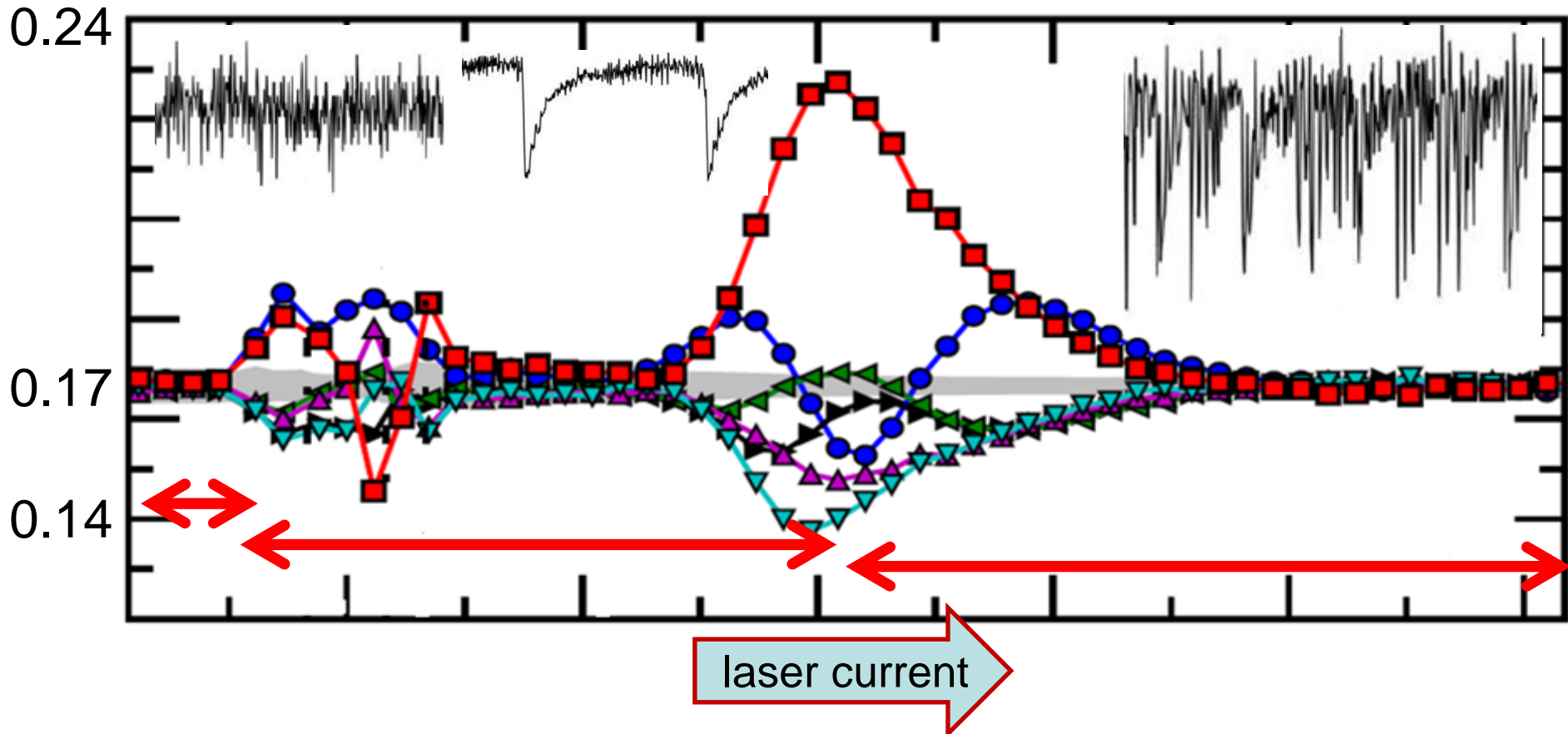
# Ordinal analysis of inter-spike intervals





**Example of application:  
How optical chaos emerges from noise?**

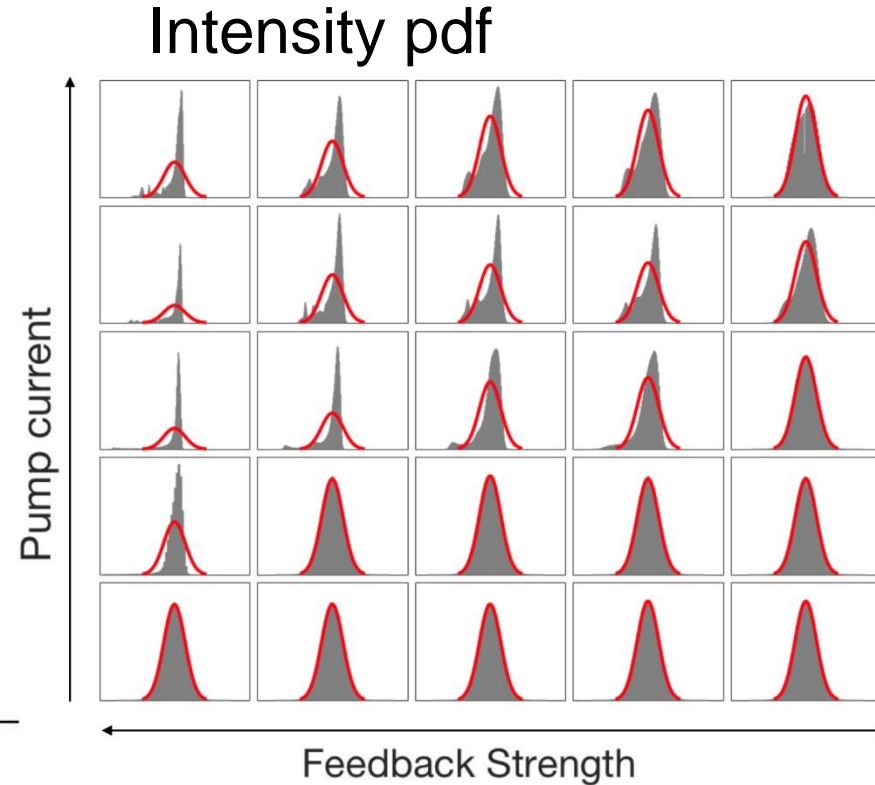
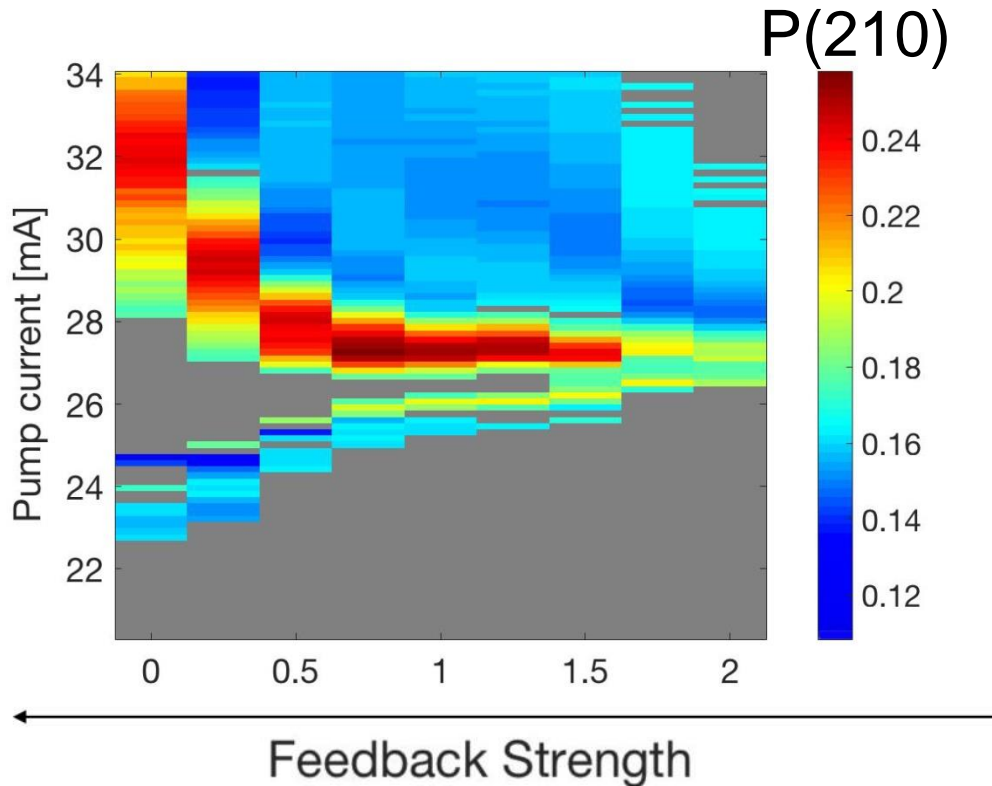
**Ordinal analysis identifies the onset of different dynamical regimes, but does not distinguish “noise” and “chaos”**



Grey region: probabilities are consistent with the uniform distribution ( $P_i = 1/6 \cong 0.17 \forall i$ ) with 99.7% confidence level

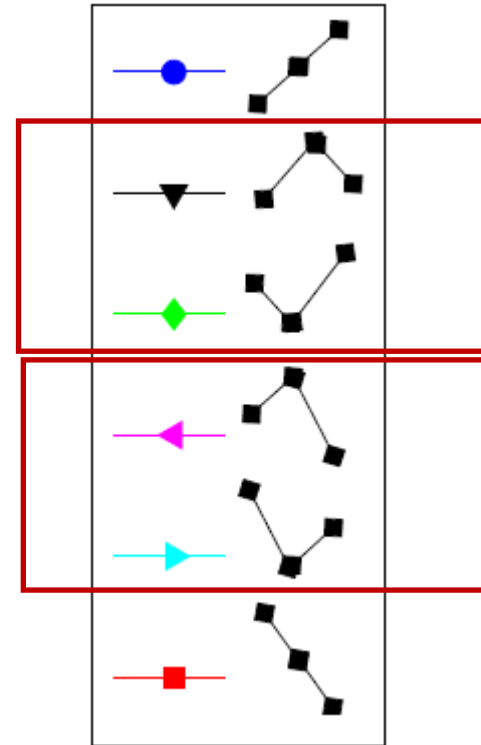
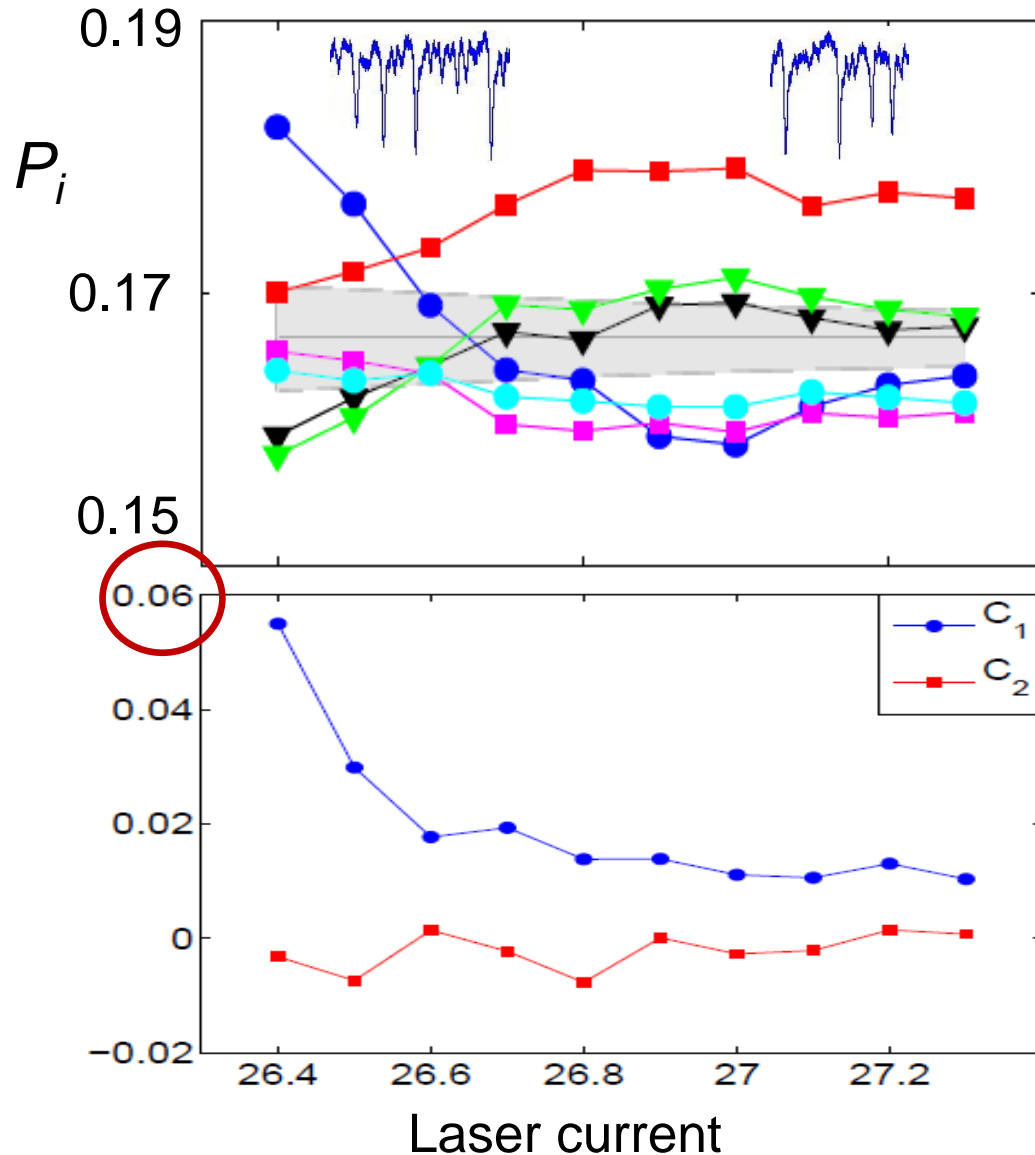
*C. Quintero-Quiroz et al, Scientific Reports (2016)*

# P(210) identifies dynamical regimes in parameter space (pump current, feedback strength)



*M. Panozzo et al, Chaos (2017)*

**Zooming into the region where spikes are well-defined, a transition is detected (not captured by correlation analysis)**



*A. Aragonese et al  
Scientific Reports (2014)*

# A modified circle map: simple minimal model

$$\varphi_{i+1} = \varphi_i + \rho + \frac{K}{2\pi} [\sin(2\pi\varphi_i) + \alpha_c \sin(4\pi\varphi_i)] + D\zeta$$

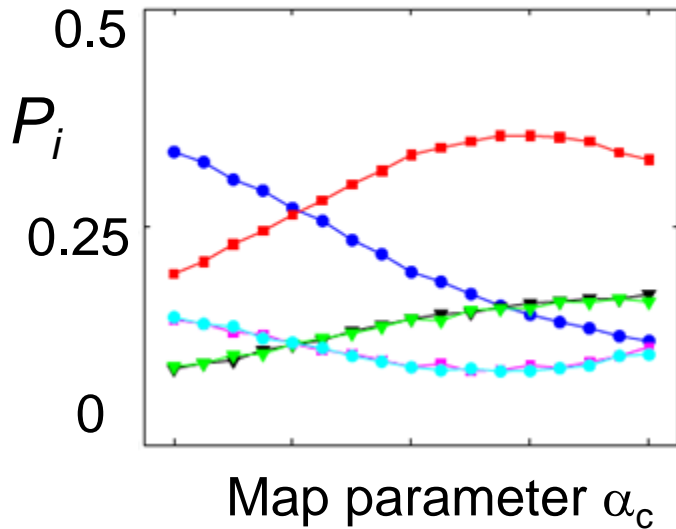
$$X_i = \varphi_{i+1} - \varphi_i$$

$\rho$  =  $\frac{\text{natural frequency}}{\text{forcing frequency}}$

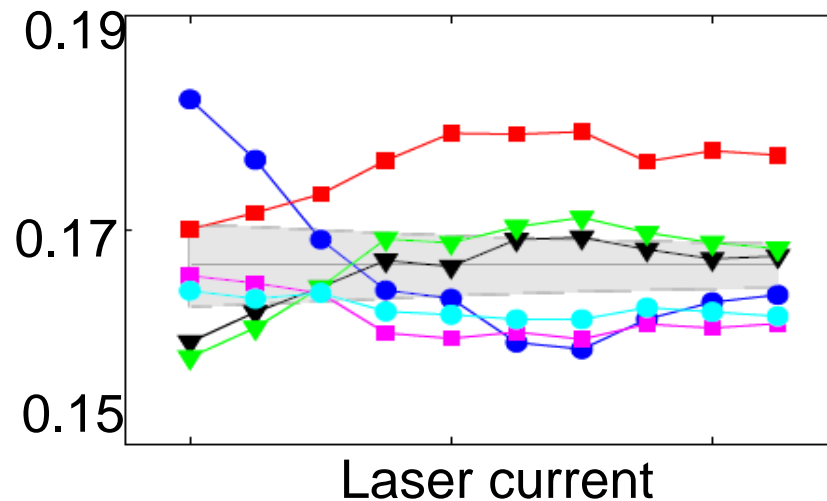
K = forcing amplitude

D = noise strength

Circle map data



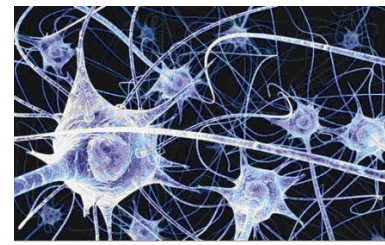
Empirical laser data



Same “clusters” & same hierarchical structure

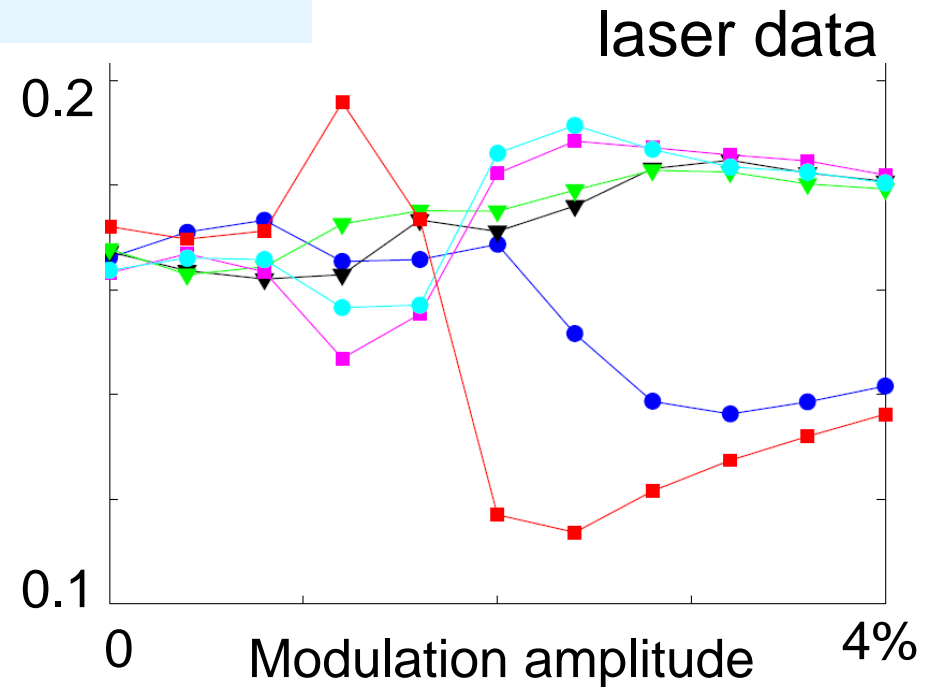
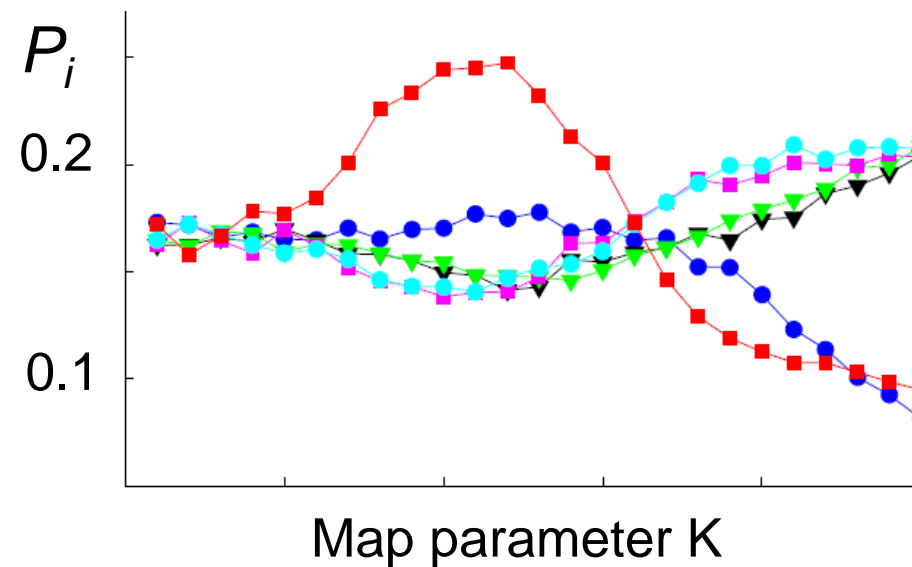
*A. Aragonese et al Scientific Reports (2014)*

# Connection with neurons: the circle map describes many excitable systems



- The modified map describes spike correlations in sensory neurons (Neiman and Russell, PRE 2005)
- Can we test its validity as a minimal model for the laser spikes?

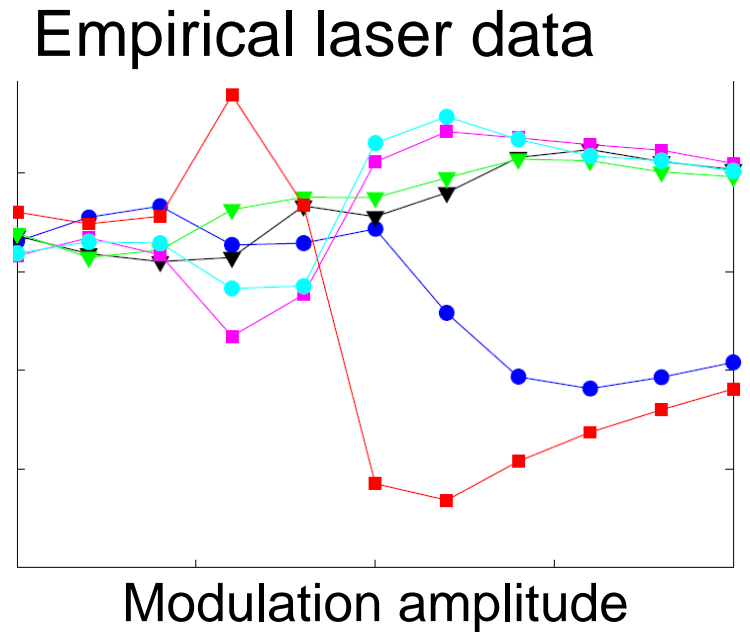
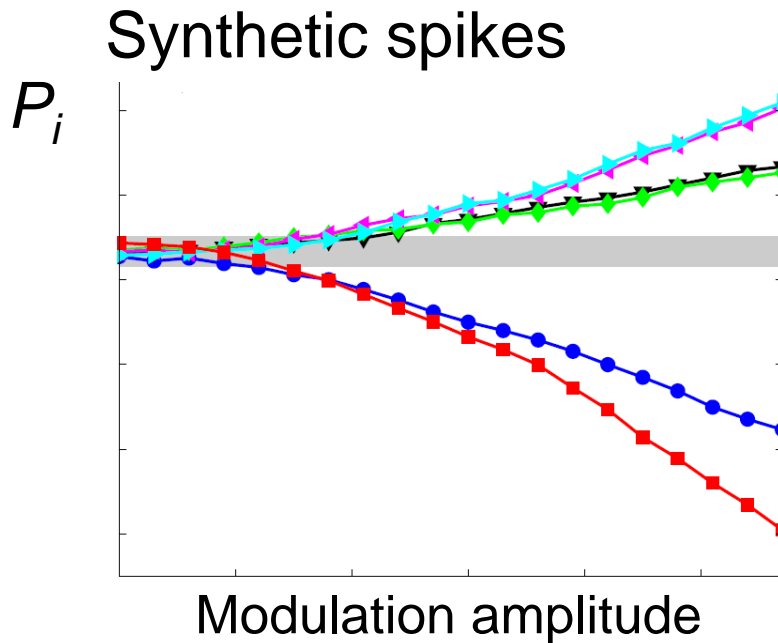
$$\varphi_{i+1} = \varphi_i + \rho + \frac{K}{2\pi} [\sin(2\pi\varphi_i) + \alpha_c \sin(4\pi\varphi_i)] + D\zeta$$



# Comparing with synthetic neuronal spikes: good agreement

FHN model with Gaussian white noise and **weak** sinusoidal input: spikes are noise-induced

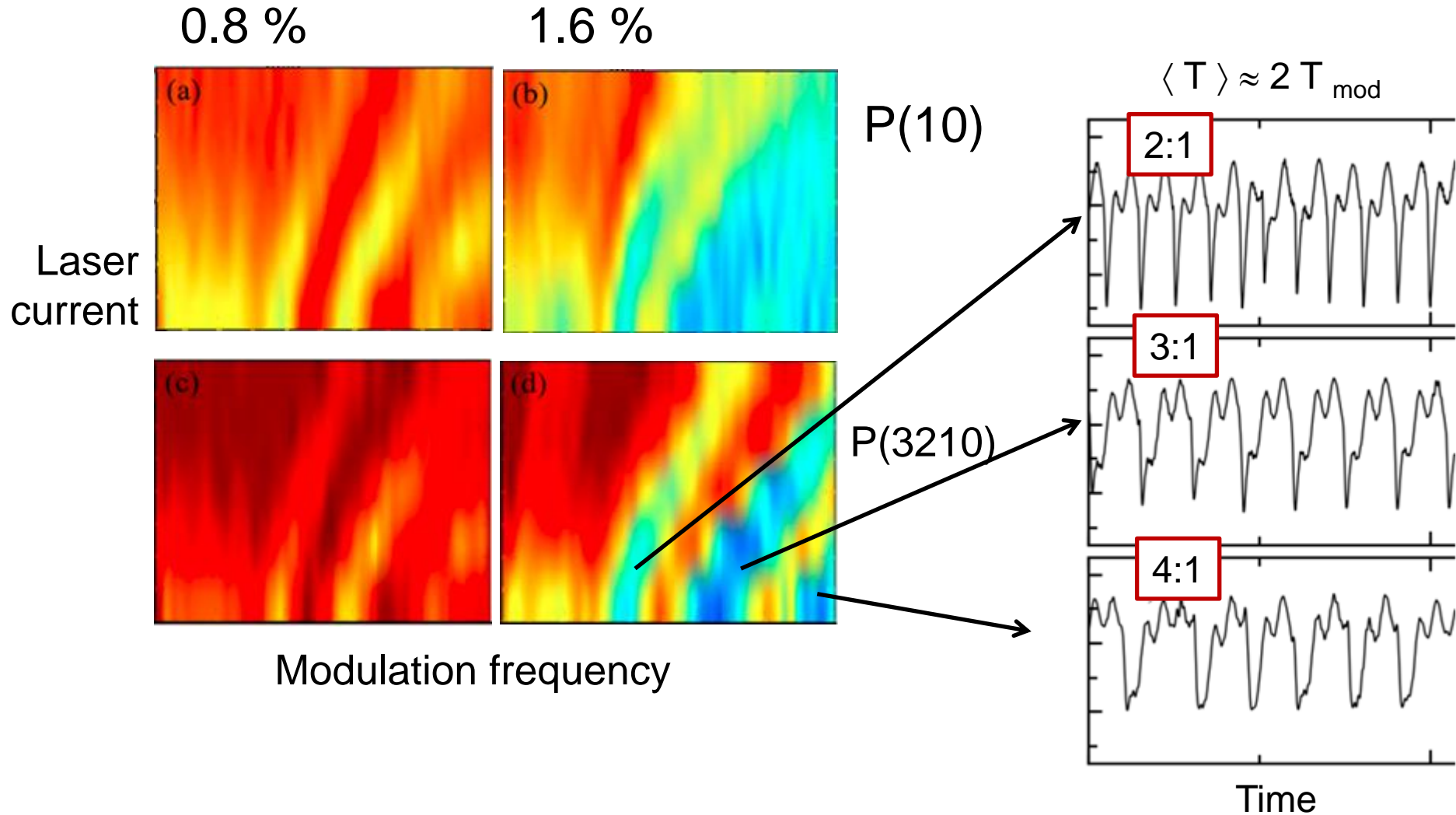
$$\epsilon \frac{dx}{dt} = x - \frac{x^3}{3} - y,$$
$$\frac{dy}{dt} = x + a + \boxed{a_o \cos(2\pi t/T)} + D\xi(t),$$



*Aparicio-Reinoso et al, PRE (2016)*



# Ordinal probabilities uncover the regions of noisy locking



# How to *control* the laser spikes? How to *quantify* the degree of entrainment?

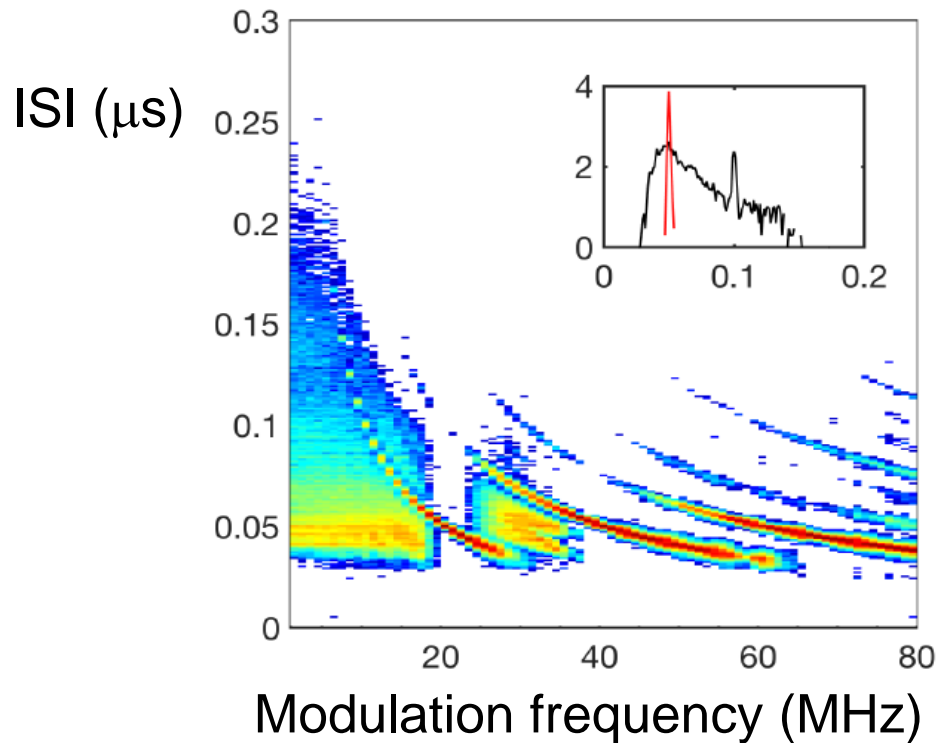


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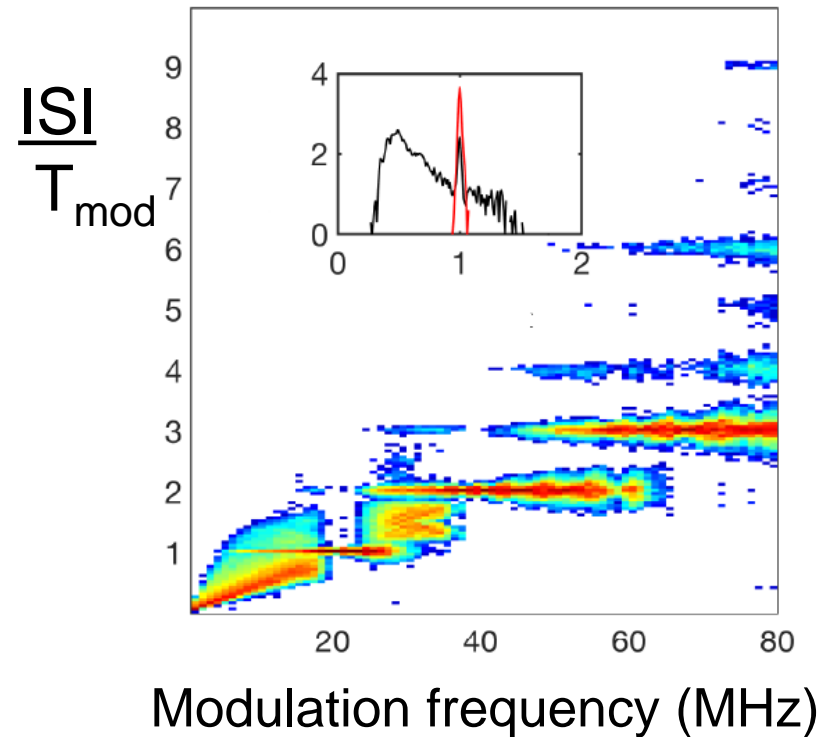
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# Gaining insight into the locking regions: the inter-spike time interval (ISI) distribution as a function of the frequency of the external forcing

$$A_{\text{mod}} = 2.3\% \text{ of } I_{\text{dc}}$$

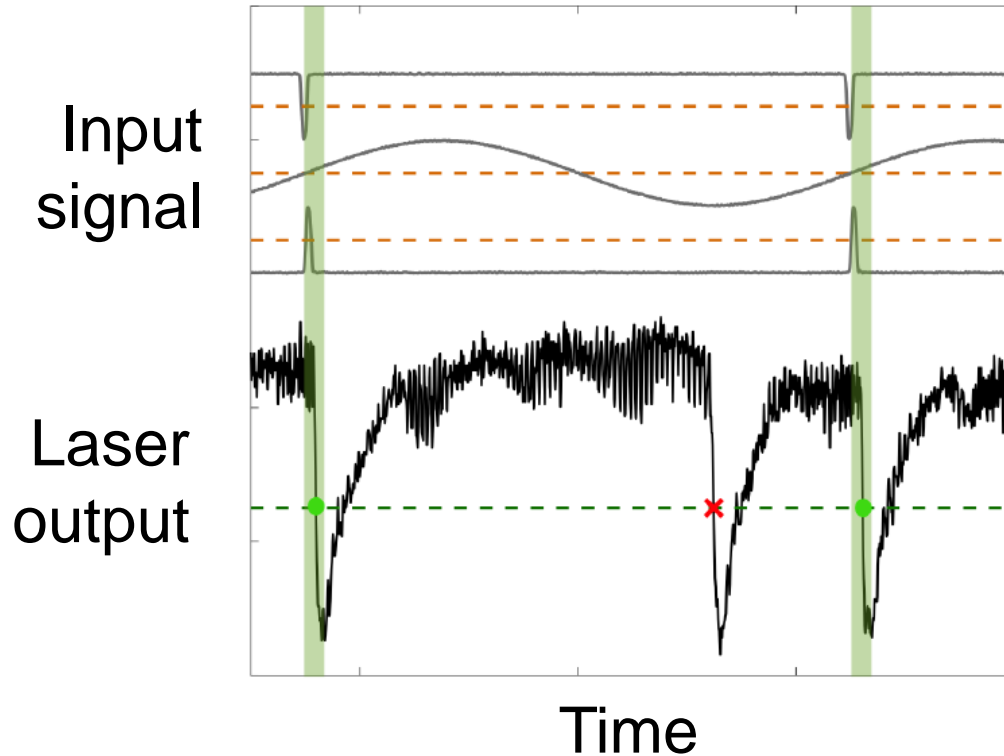


$\Rightarrow$  “refractory time” clear



$\Rightarrow$  “locking” horizontal

We test three modulation waveforms and quantify locking with the success rate and the false positive rate

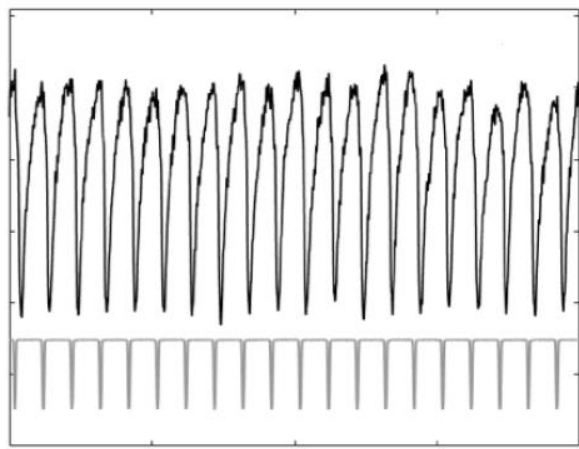
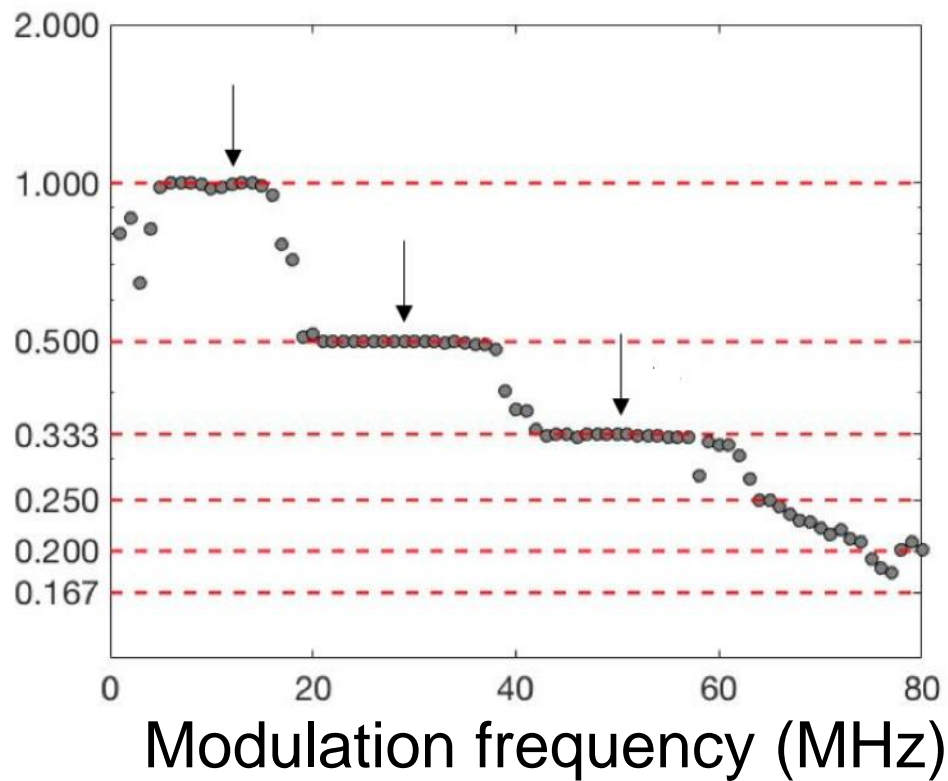


$$SR(\tau) = \frac{\# \text{ of spikes emitted in the interval } \tau}{\# \text{ of modulation cycles}}$$

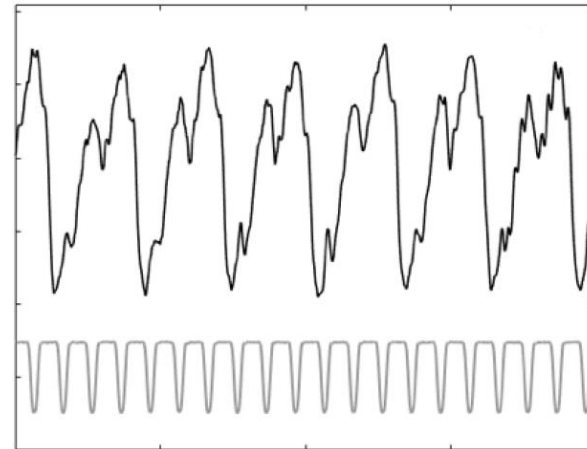
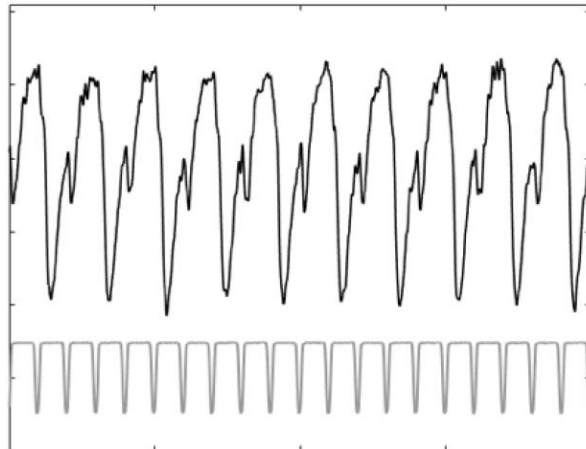
$$FPR(\tau) = \frac{\# \text{ spikes that are not emitted in the time interval } \tau}{\text{Total } \# \text{ of spikes}}$$

# Quantification

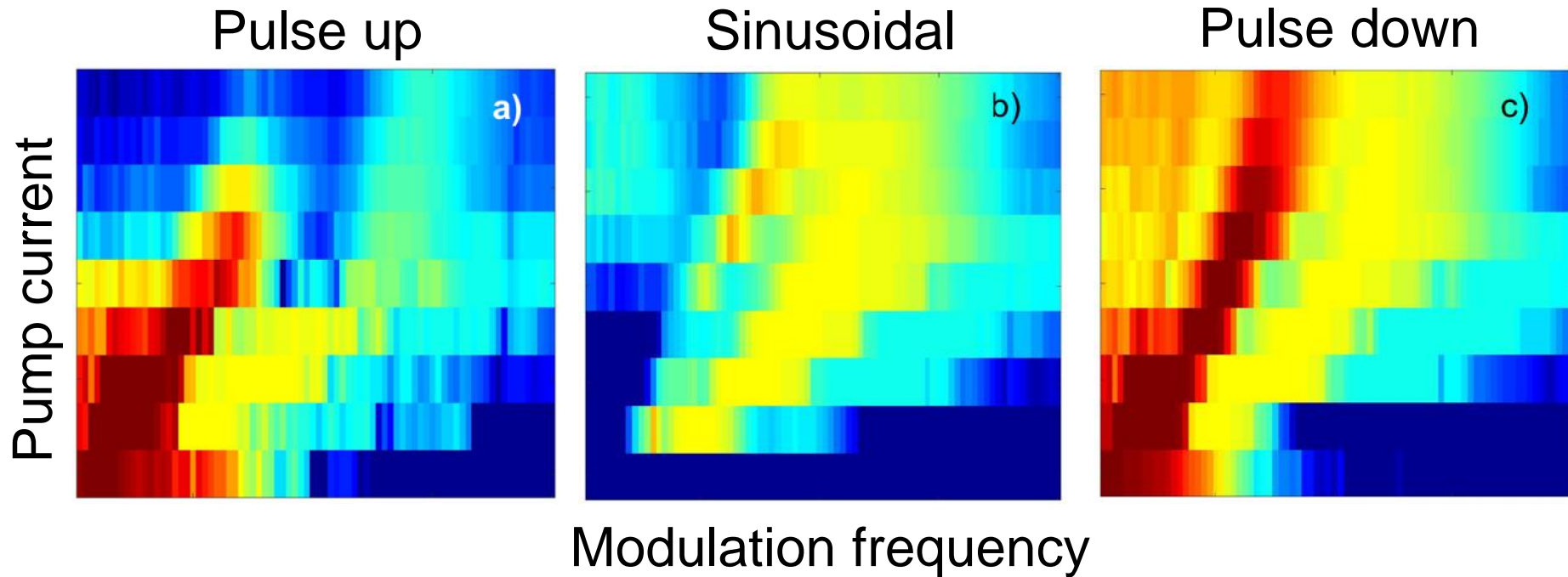
Success  
rate



Time/ $T_{\text{mod}}$



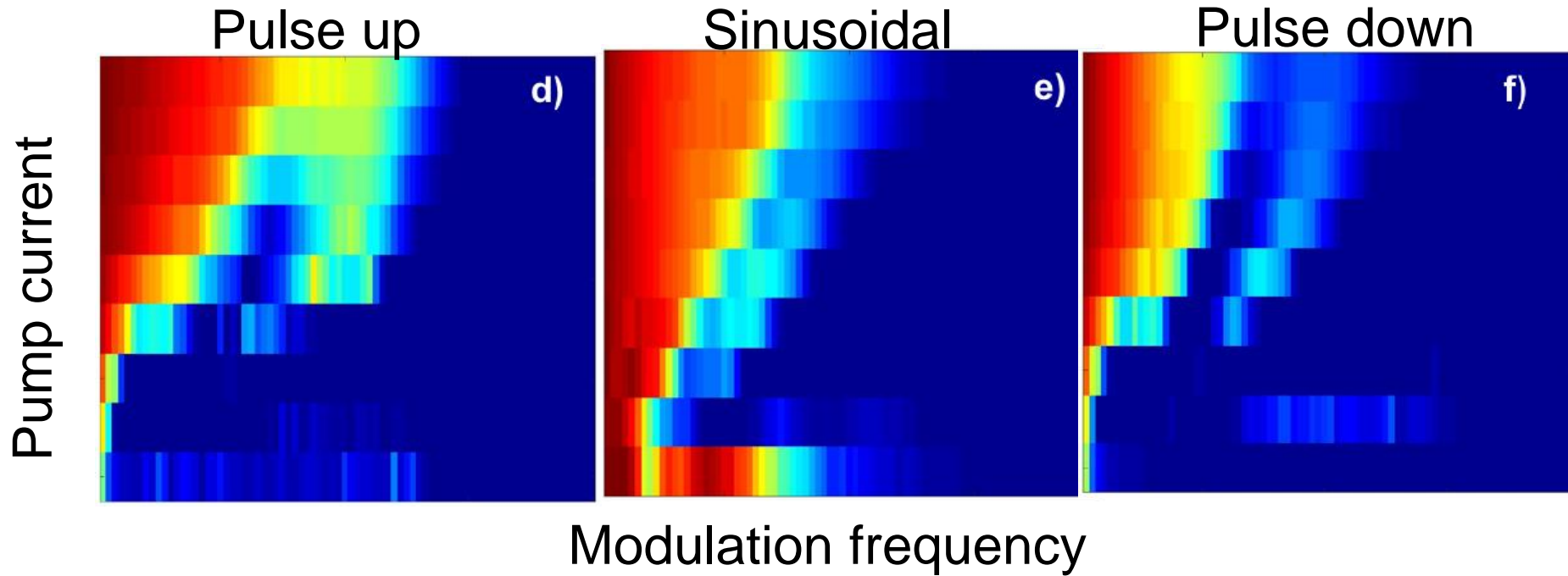
# Waveform comparison: in color code the success rate (red SR=1)



⇒ wider locking with pulse-down waveform

*J. Tiana et al, Opt. Express 26 9298 (2018)*

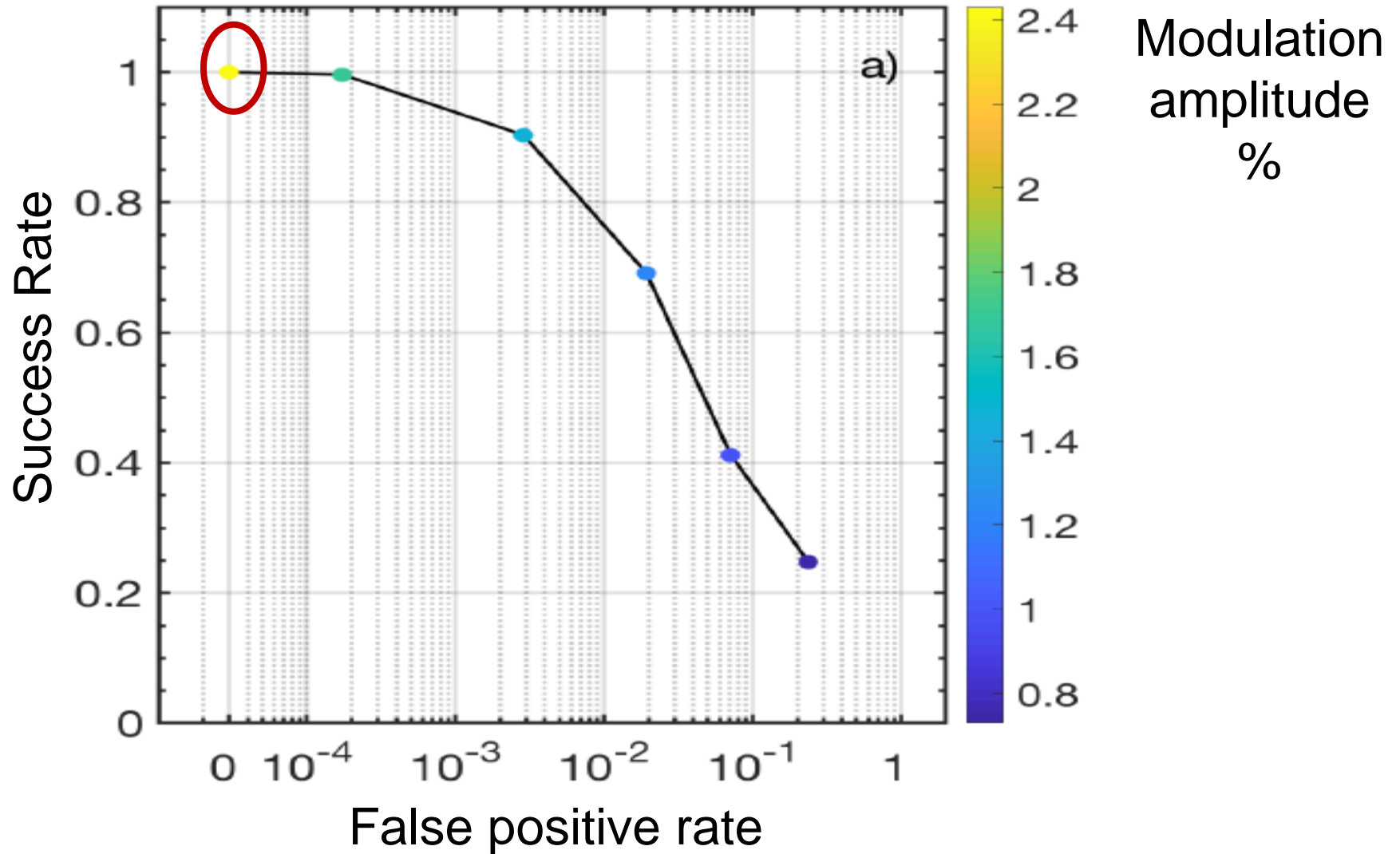
# And the false positives? (the natural, uncontrolled spikes)



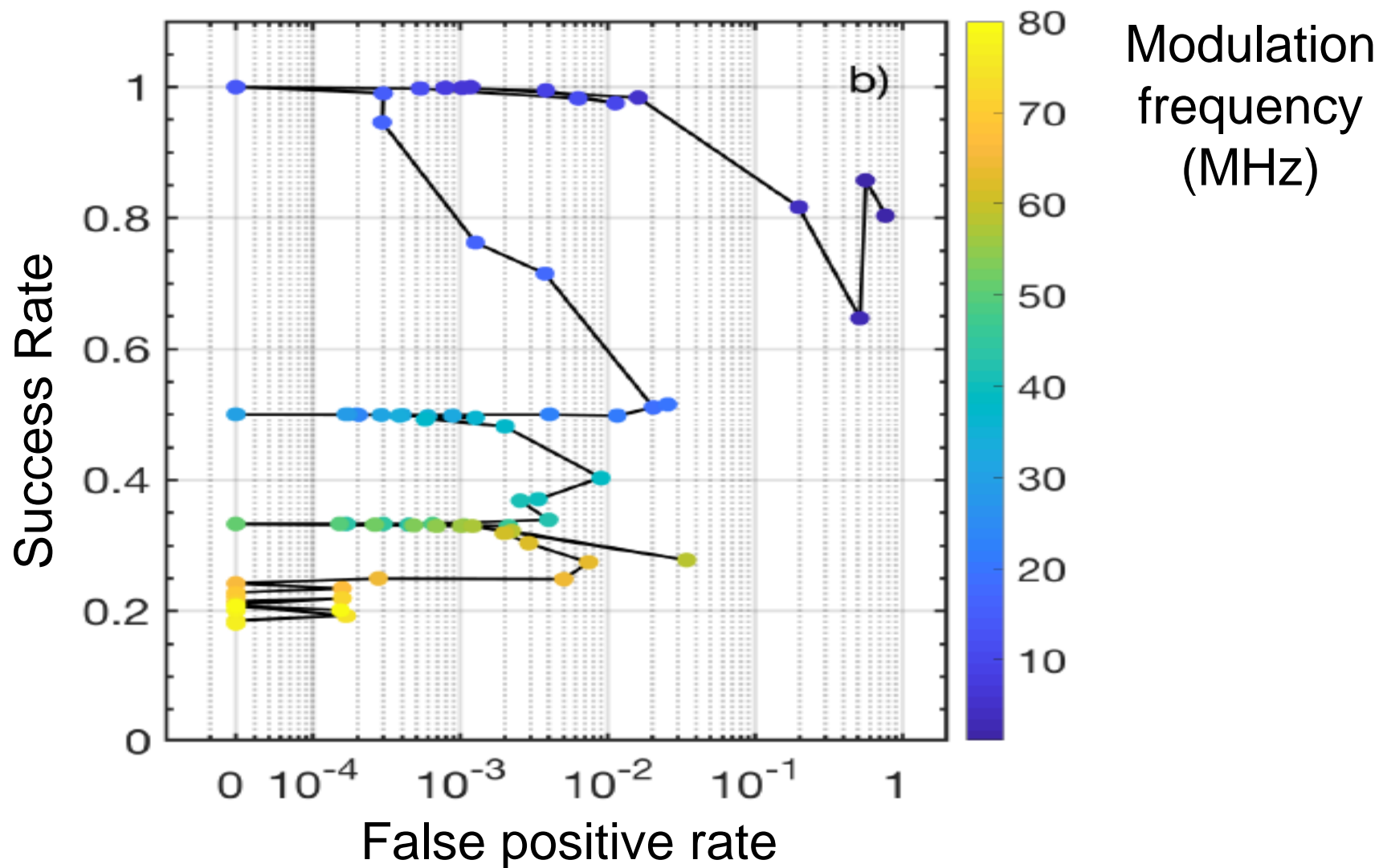
*J. Tiana et al, Opt. Express 26, 9298 (2018)*



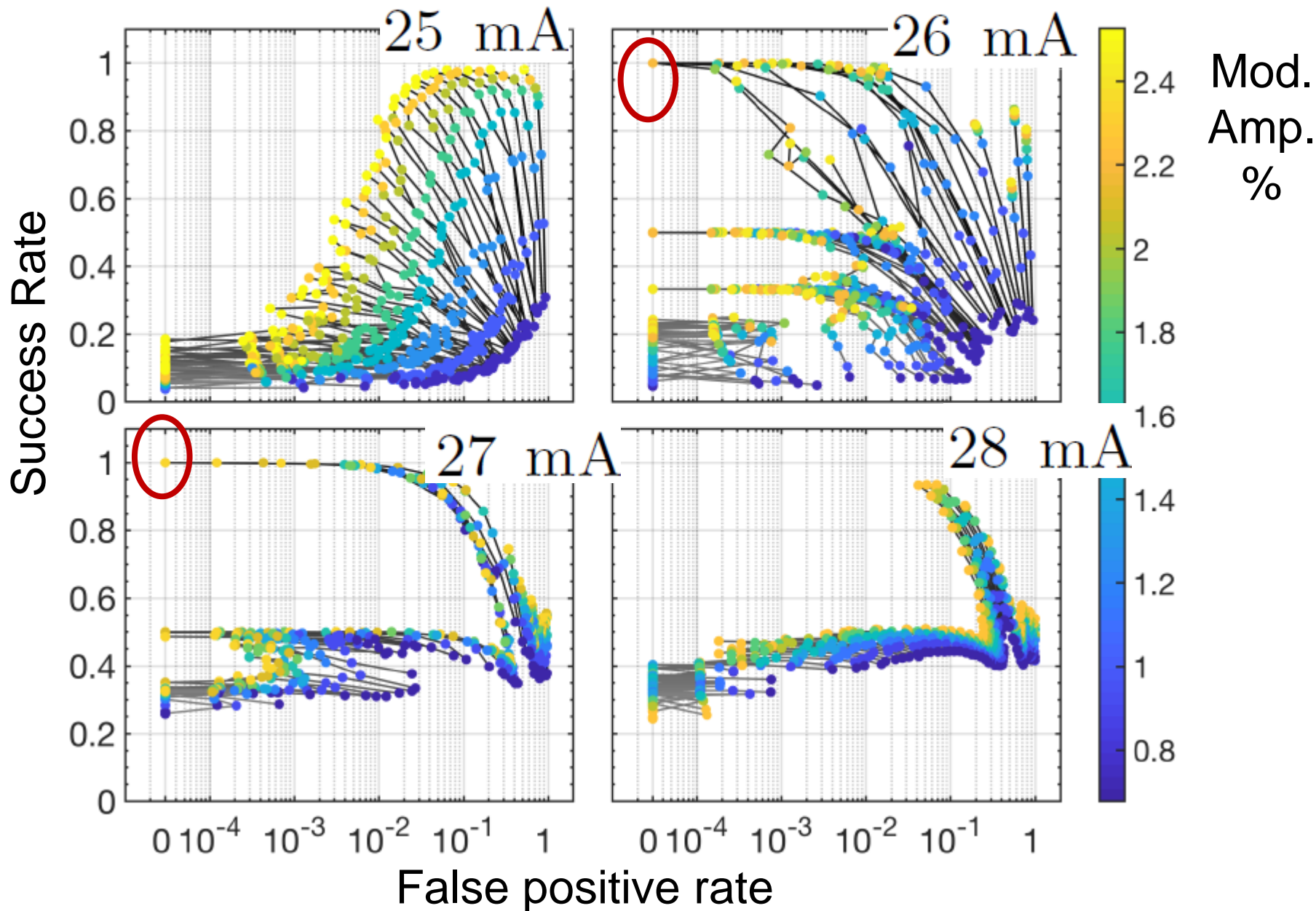
# Receiver operating characteristic (ROC) curves



# Locked-unlocked transitions when the modulation frequency increases



# Role of the laser current (controls the natural spike rate)



## What did we learn?

- Transition to optical chaos: ordinal analysis distinguishes different regimes.
- Spike patterns that are more/less expressed are not always detected by correlation analysis.
- Minimal model identified (a modified circle map).
- Good agreement between optical & neuron (synthetic) spikes.
- ROC curves allow to quantify the entrainment quality.
- Regions of perfect 1:1 locking identified.

**Ongoing work:** potential for sensing applications?

**To do in the future:** The connection with the circle map needs to be explored.

# Advertisement



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Punta del Este, Uruguay, 26--30 November 2018

<https://ddayslac2018.org/>





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J. Tiana

M. C. Torrent

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M. Panozzo et al., Chaos 27, 114315 (2017)

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