

*Using Nonlinear Dynamics to
Improve Chaotic Synchronization*

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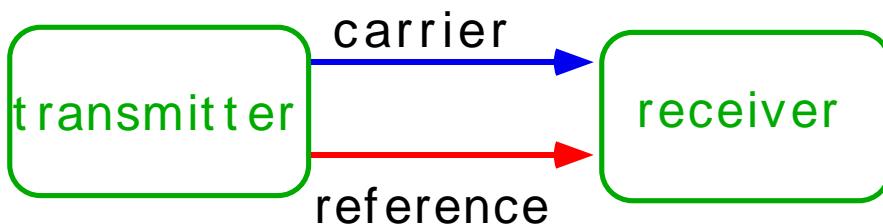
Includes work by:

Lou Pecora
Jim Heagy
Gregg Johnson
Doug Mar

Is chaos useful for communications?

Self-synchronizing systems:

- “Transmitted reference” systems developed in 1960’s.



Added noise contaminates reference. Easy to jam because 2 signals

- “Self-synchronizing” chaotic systems

Same noise problems.

Only 1 signal required.

- Non-synchronizing chaotic systems.

Similar to CDMA

If “transmitted reference” methods already known, why study chaotic self-synchronization?

**Chaotic systems are dynamical systems.
We may be able to manipulate them in
new ways.**

Look at physics of coupled dynamical systems

How to get receiver to synchronize most closely to drive in the presence of:

- **additive noise**
- **phase distortion**

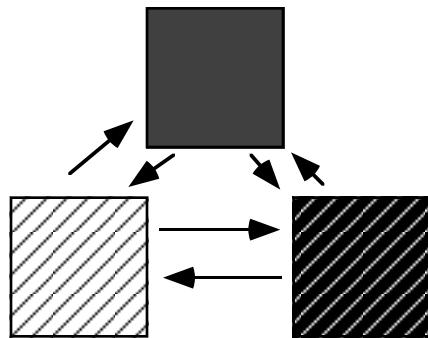
Main concern: get signal from A to B considering only these simplest problems. Worry about engineering measurements later.

Build up a set of tools for improving synchronization. Don't try to solve entire problem at once.

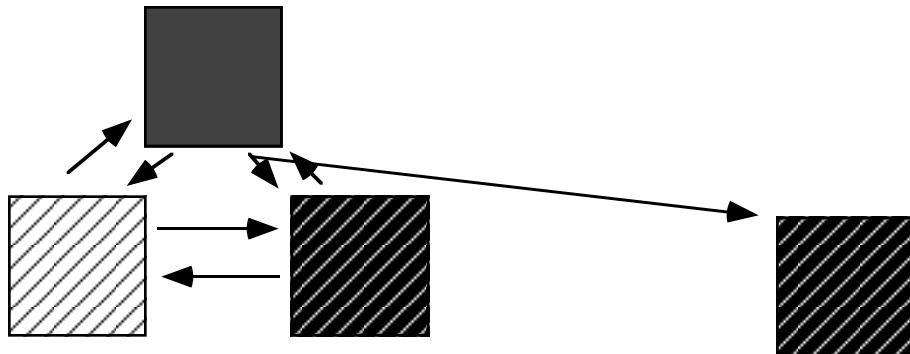
Methods used:

- choice of dynamical system (2-attractor systems)
- improve receiver stability through:
synchronous substitution
generalized coupling with minimization
- vary transmitted signal properties
synchronous substitution
coupling through functions:
 - linear filters
- “Stored reference” methods
similar to CDMA

Synchronizing Chaotic Systems:



find subsystems of chaotic system



drive a subsystem

if all Lyapunov exponents of driven subsystem < 0 , will synchronize

Synchronizing chaotic systems

$$\frac{dx}{dt} = f(x, y, z) -$$

$$\frac{dy}{dt} = g(x, y, z)$$

$$\frac{dz}{dt} = w(x, y, z)$$

drive system

$$\frac{dy}{dt} = g(x, y, z)$$

$$\frac{dz'}{dt} = w(x', y', z')$$

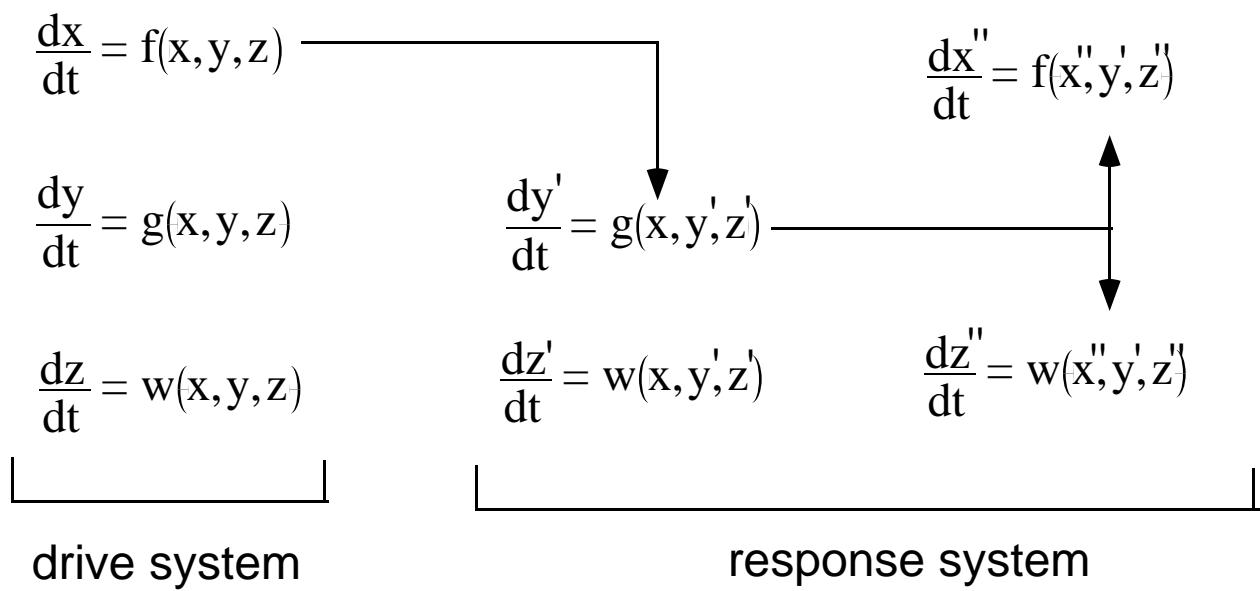
response system

$$\mathbf{y}'(t) \rightarrow \mathbf{y}(t)$$

$$z'(t) \rightarrow z(t)$$

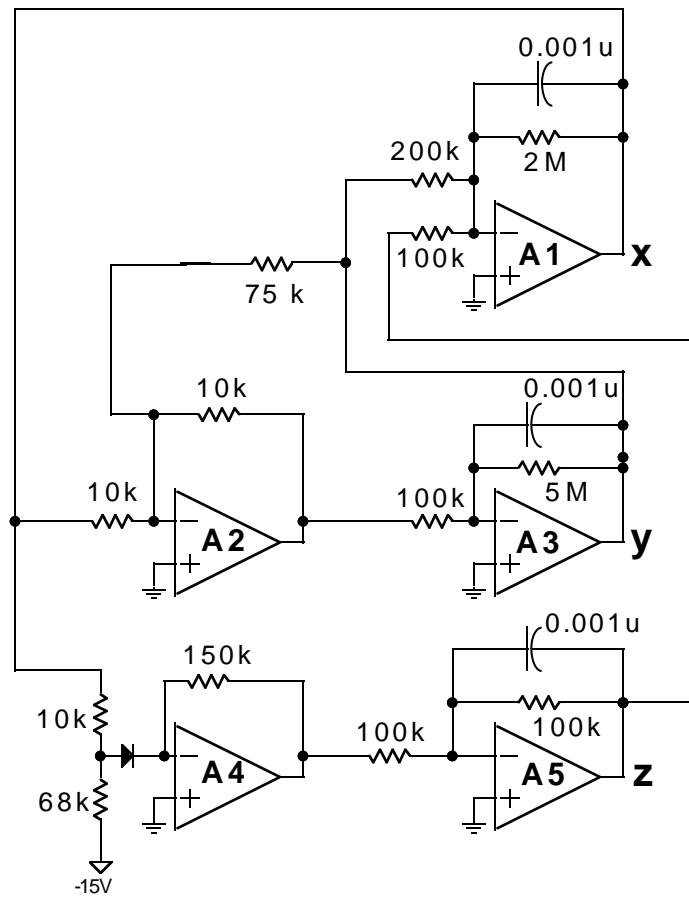
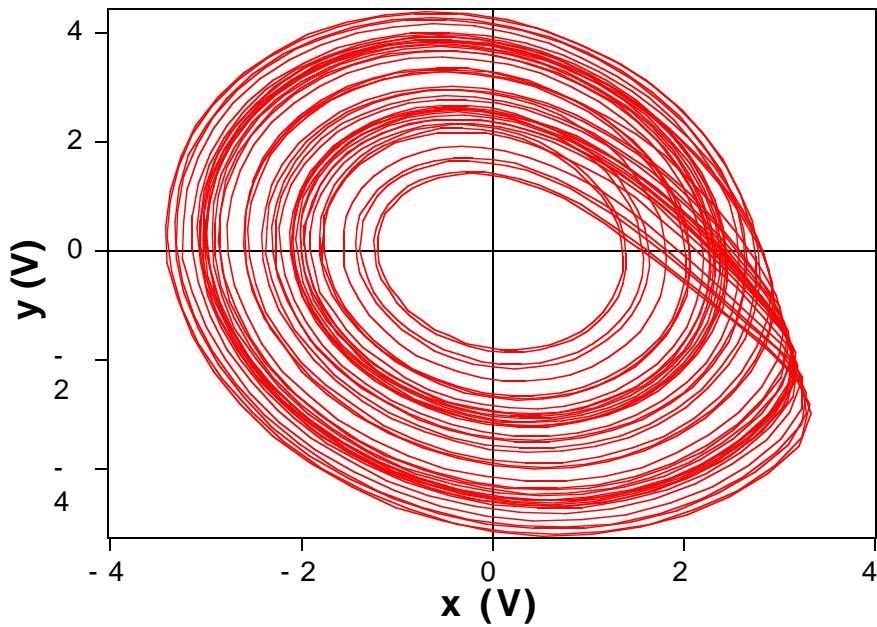
if: all Lyapunov exponents for response system
are < 0

Cascading synchronized systems

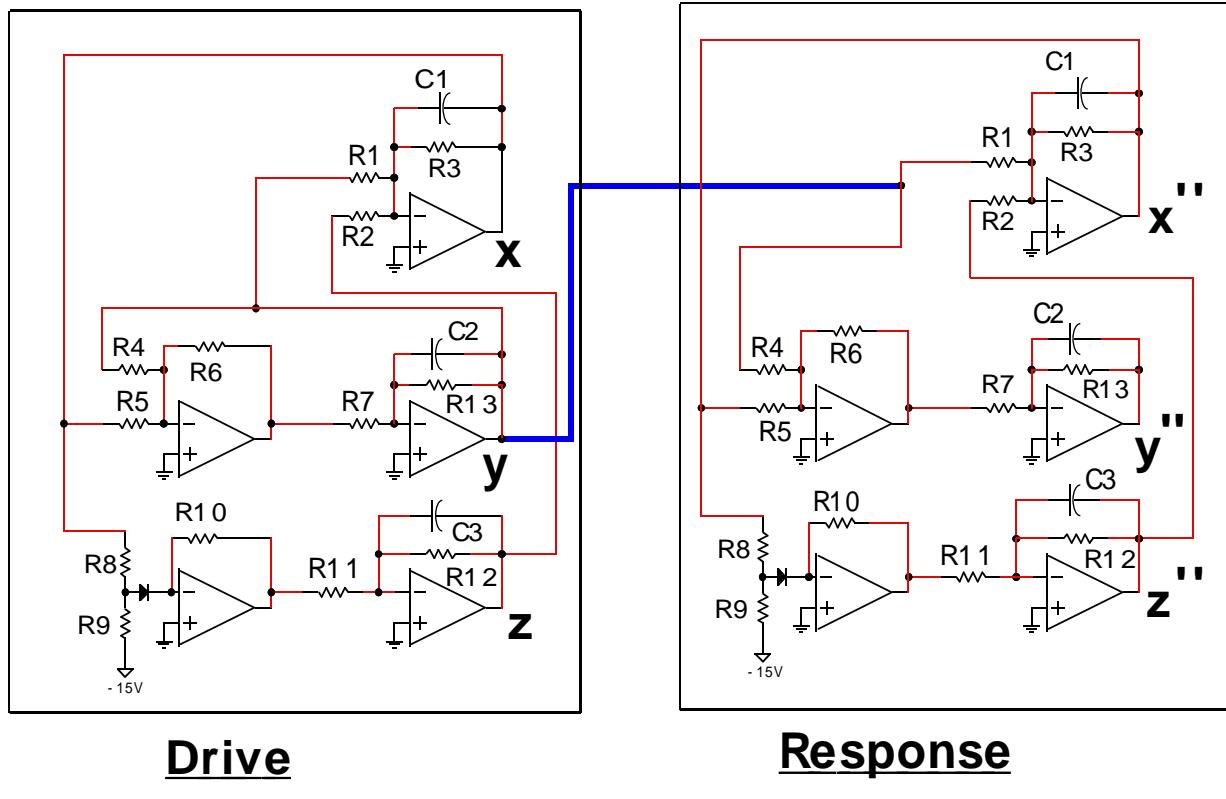


$$x''(t) \rightarrow x(t)$$

Rossler-like circuit



PL Rossler circuit synchronization



Example: Synchronizing PL Rossler:

Drive Jacobian

$$\begin{bmatrix} -0.05 & -0.5 & -1.0 \\ 1.0 & 0.131 & 0 \\ \frac{\partial g(x)}{\partial x} & 0 & -1 \end{bmatrix}$$

Response Jacobian

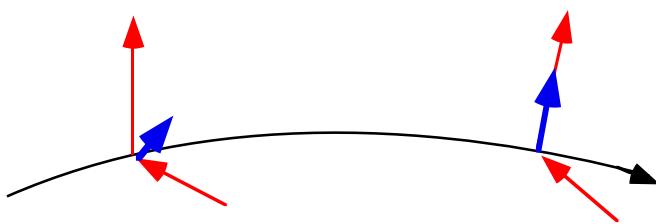
$$\begin{bmatrix} -0.05 & -0.5 & -1.0 \\ 1.0 & \textcolor{red}{0} & -0.02 \\ \frac{\partial g(x)}{\partial x} & 0 & -1 \end{bmatrix}$$

Simple Lyapunov Exponent Calculation (Largest exponent only)

choose random unit vector ξ

$$\begin{bmatrix} J_{11} & J_{12} & J_{13} \\ J_{21} & J_{22} & J_{23} \\ J_{31} & J_{32} & J_{33} \end{bmatrix} \begin{bmatrix} \xi_1 \\ \xi_2 \\ \xi_3 \end{bmatrix} = \begin{bmatrix} \frac{d\xi_1}{dt} \\ \frac{d\xi_2}{dt} \\ \frac{d\xi_3}{dt} \end{bmatrix}$$

ξ will line up with unstable direction



Simple Lyapunov Exponent Calculation

Occasionally renormalize $\xi(t)$

$$\ln\left(\frac{\xi(t)}{\xi(0)}\right) \rightarrow \lambda_{\max}$$

For piecewise linear systems: can just take eigenvalues of Jacobian.

Flow	(linear)map
> 0 : expansion	$\text{abs} > 1$: expansion
< 0 : contraction	$\text{abs} < 1$: contraction

Complications in Stability Calculations

Many different stability criteria for identical synchronization.

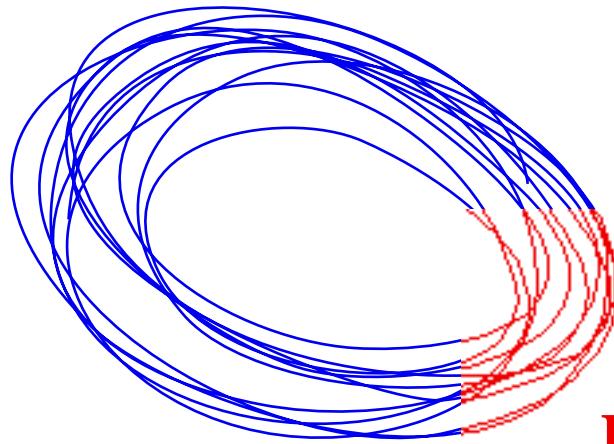
Typical problems:

- Local instabilities
- Non-normal eigenvalues

Local instabilities

Response system:

Stable



Unstable

Transverse Lyapunov Exponents (for coupled systems)

Example: 2 3-dimensional systems

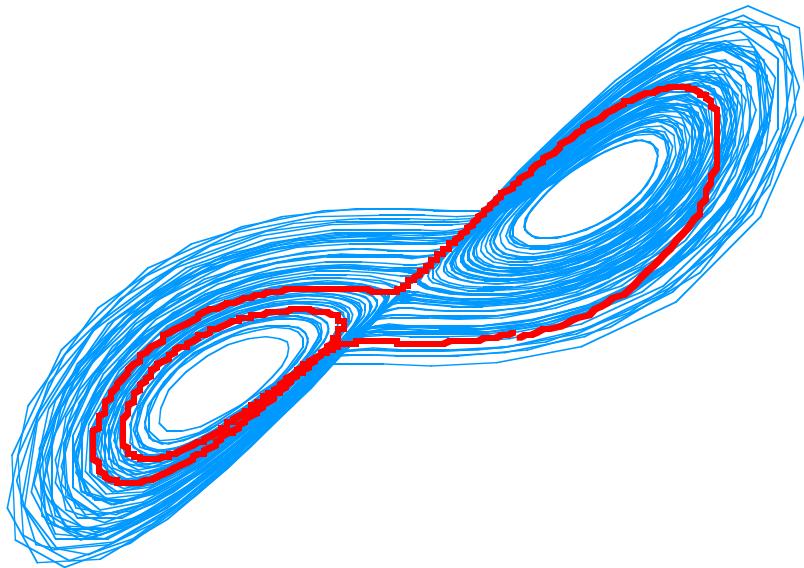
$$\dot{x} = F(x) \quad \dot{y} = F(y)$$

New coordinates:

$$\begin{array}{ll} \xi_1 = \mathbf{x}_1 + \mathbf{y}_1 & \xi_4 = \mathbf{x}_1 - \mathbf{y}_1 \\ \xi_2 = \mathbf{x}_2 + \mathbf{y}_2 & \xi_5 = \mathbf{x}_2 - \mathbf{y}_2 \\ \xi_3 = \mathbf{x}_3 + \mathbf{y}_3 & \xi_6 = \mathbf{x}_3 - \mathbf{y}_3 \end{array}$$

**ξ 1, 2 and 3 are motion on the synchronization manifold.
4,5 and 6 are motion transverse to the synchronization manifold**

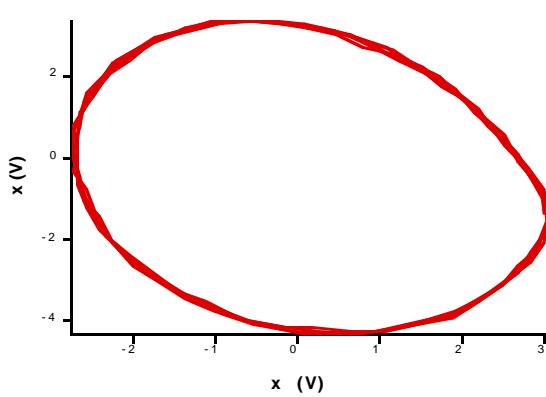
Unstable periodic orbits



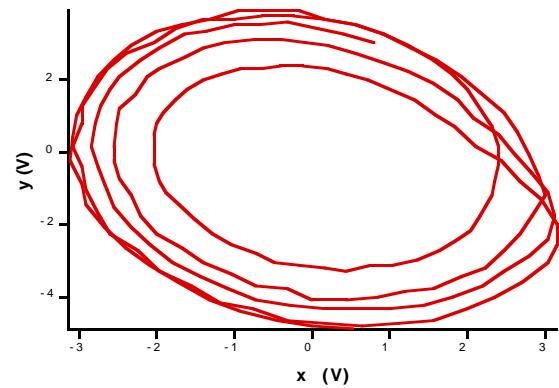
A chaotic attractor consists of an infinite number of unstable periodic orbits (UPO's)

PLR circuit

period 1

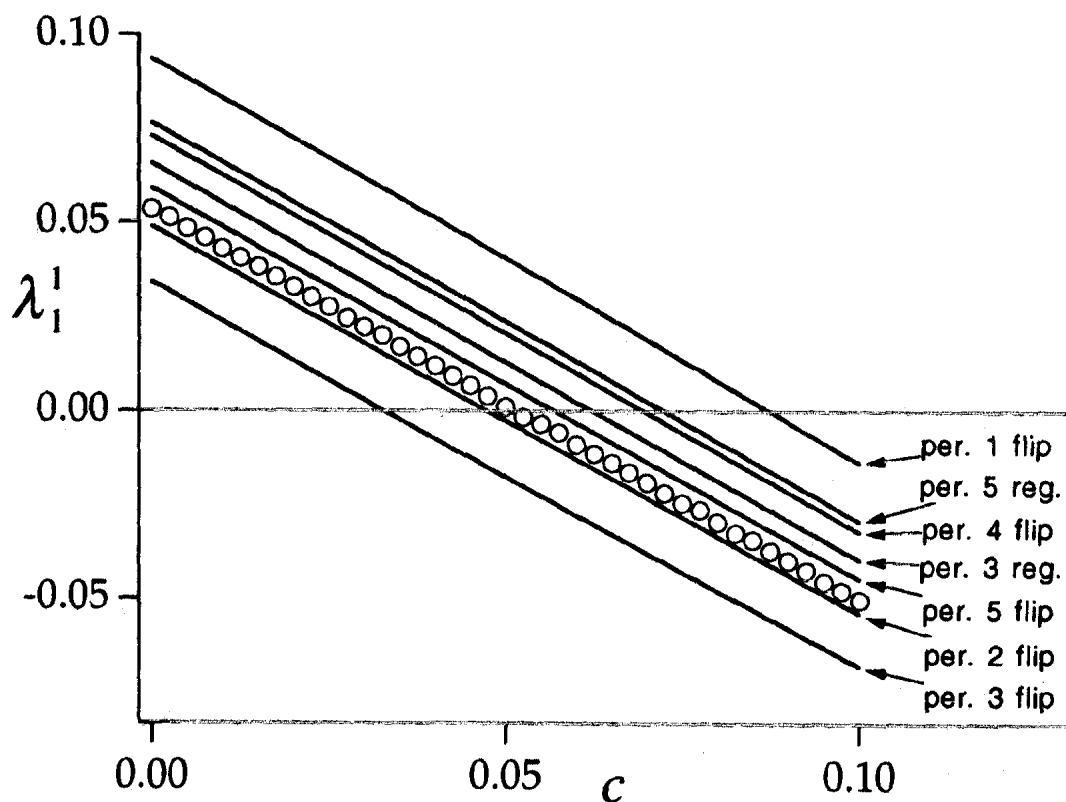


period 4

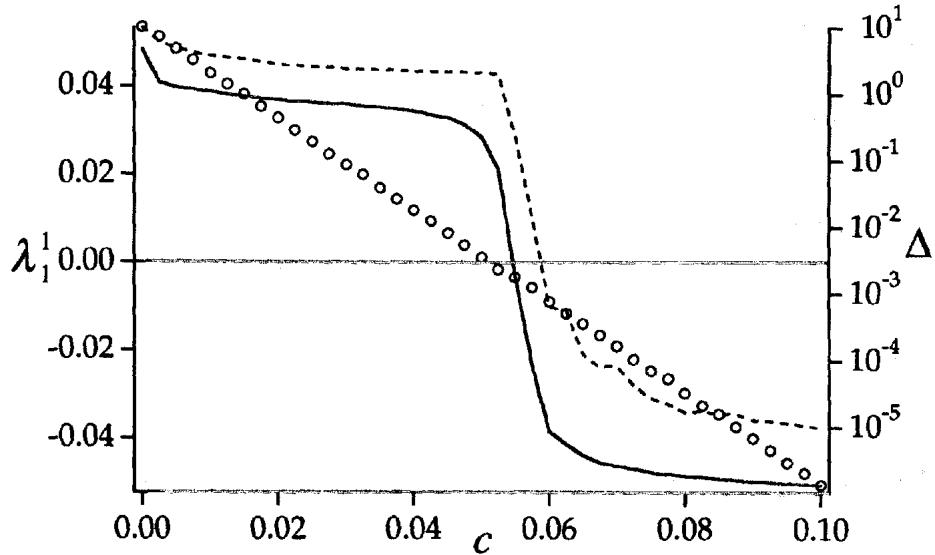


Coupled PL Rossler systems (diffusive coupling constant = c)

Transverse Lyapunov exponents for different UPO's

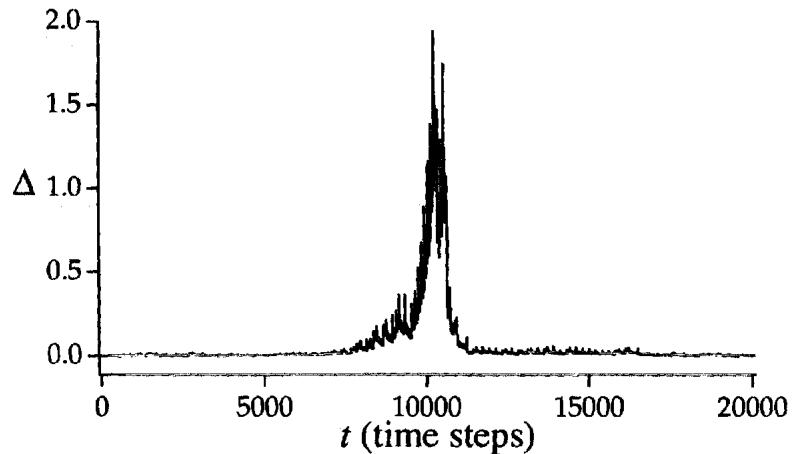


Rössler system synchronization (2 coupled Rösslers)



- Maximum transverse Lyapunov exponent
 - RMS difference
 - — — Peak difference

Single burst

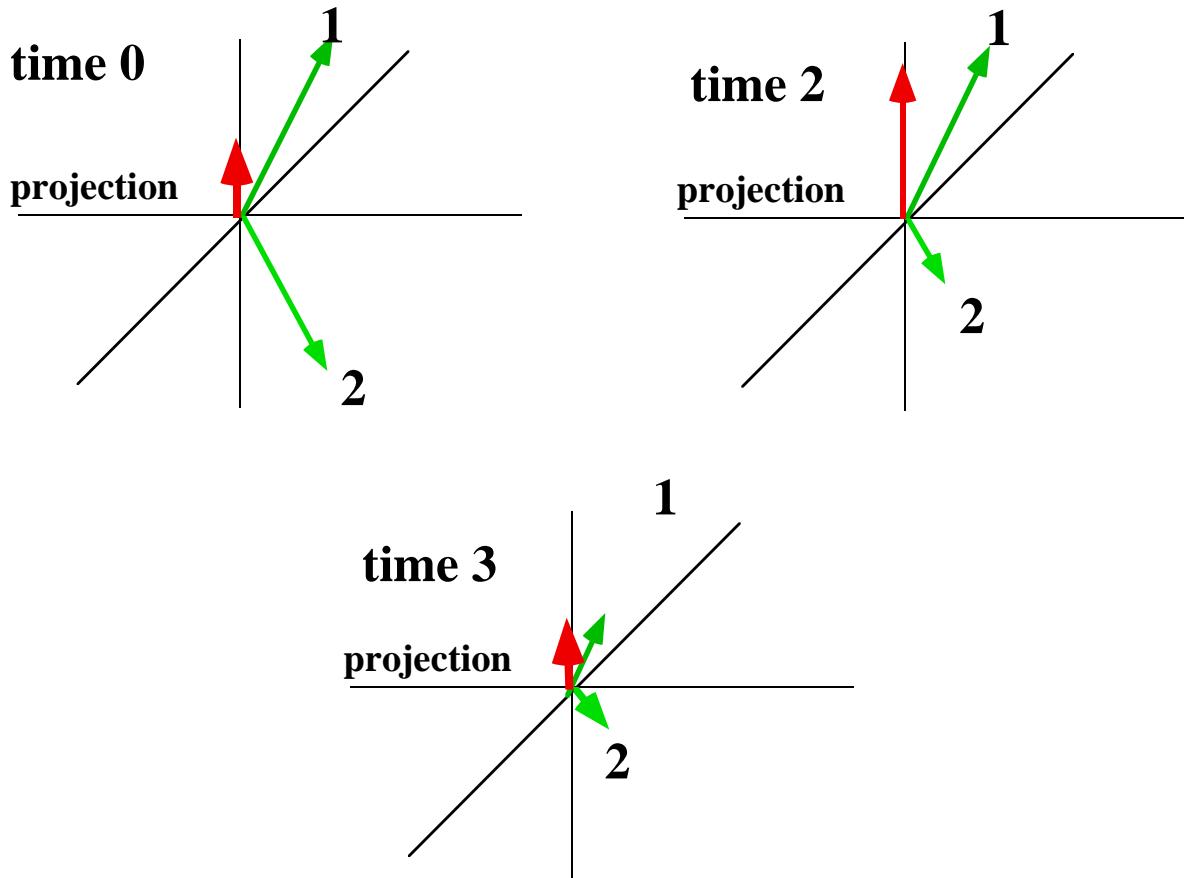


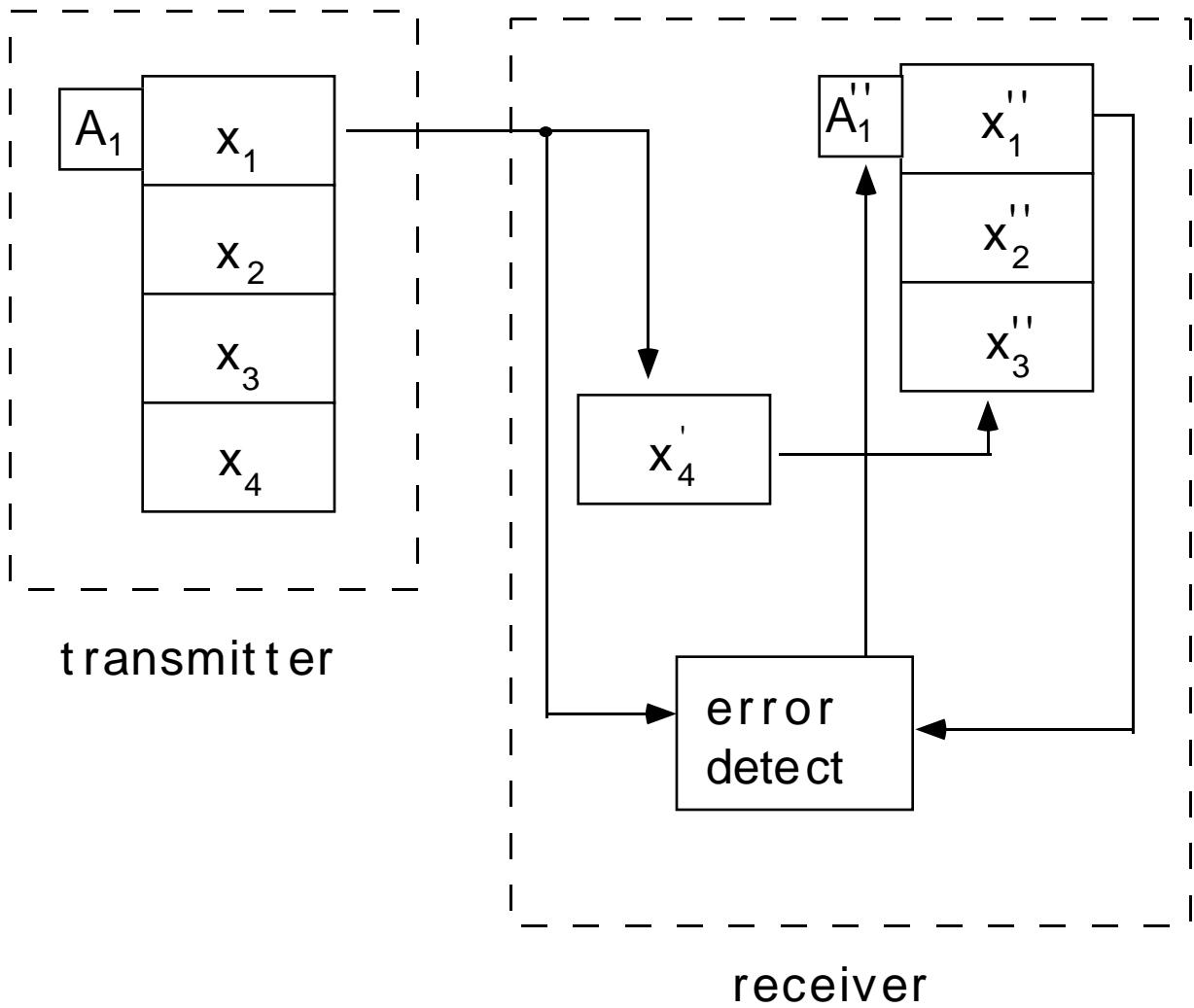
Other complications in synchronization:

Diagonalize Jacobian:

$$\begin{bmatrix} \frac{d\zeta_1}{dt} \\ \frac{d\zeta_2}{dt} \\ \frac{d\zeta_3}{dt} \end{bmatrix} = \begin{bmatrix} \Lambda_1 & 0 & 0 \\ 0 & \Lambda_2 & 0 \\ 0 & 0 & \Lambda_3 \end{bmatrix} \begin{bmatrix} \zeta_1 \\ \zeta_2 \\ \zeta_3 \end{bmatrix}$$

Eigenvectors may not be orthogonal
(non-normal)





Synchronous Substitution

Send a function of the variables
(similar to Kocarev and Parlitz)

$$\frac{d\vec{x}}{dt} = F(x_1, x_2, x_3)$$

send $w = T(x_1, x_2, x_3)$

at response, invert T

For example: $\tilde{x}_2 = T^{-1}(w, x'_1, x'_2, x'_3)$

$$\frac{d\vec{x}'}{dt} = F(x'_1, \tilde{x}_2, x'_3)$$

Examples of Synchronous Substitution

PL Rossler circuit:

Transmit $w = y - x$

Then $\tilde{y} = w + x$

Response Jacobian:

$$\begin{bmatrix} -0.05 & -0.5 & -1.0 \\ 1.0+1.0 & 0-0.02 & 0 \\ \frac{\partial g(x)}{\partial x} & 0 & -1 \end{bmatrix}$$

$$\lambda_{max} = -196 \text{ s}^{-1}$$

Synchronous substitution examples

Send $w = \frac{-y}{(x+4.2)}$

Then $\tilde{y} = -w(x' + 4.2)$

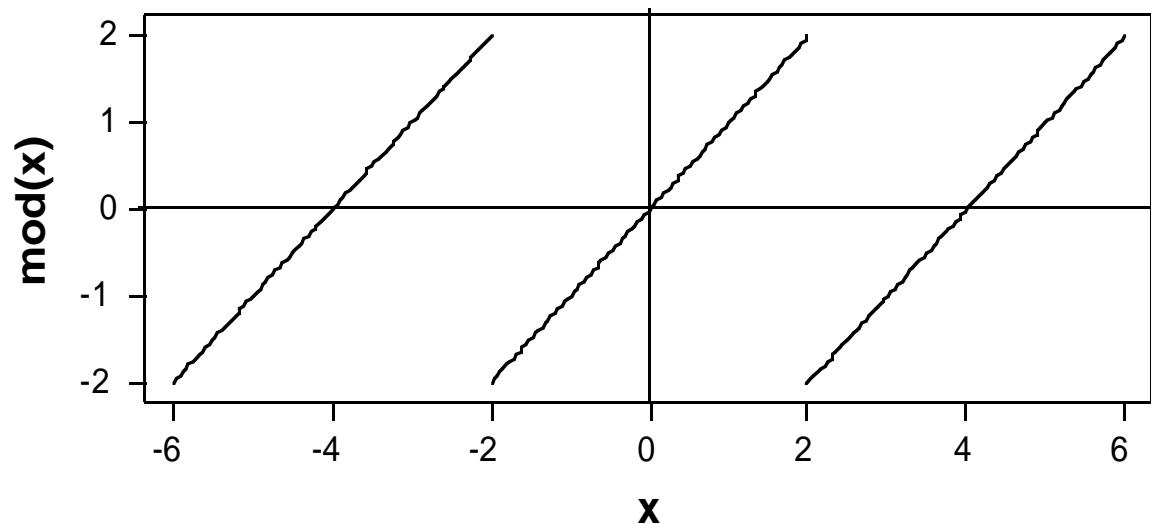
Response Jacobian:

$$\begin{bmatrix} -0.05 & -0.5 & -1.0 \\ 1.0-w & 0 & -0.02 & 0 \\ \frac{\partial g(x)}{\partial x} & 0 & -1 \end{bmatrix}$$

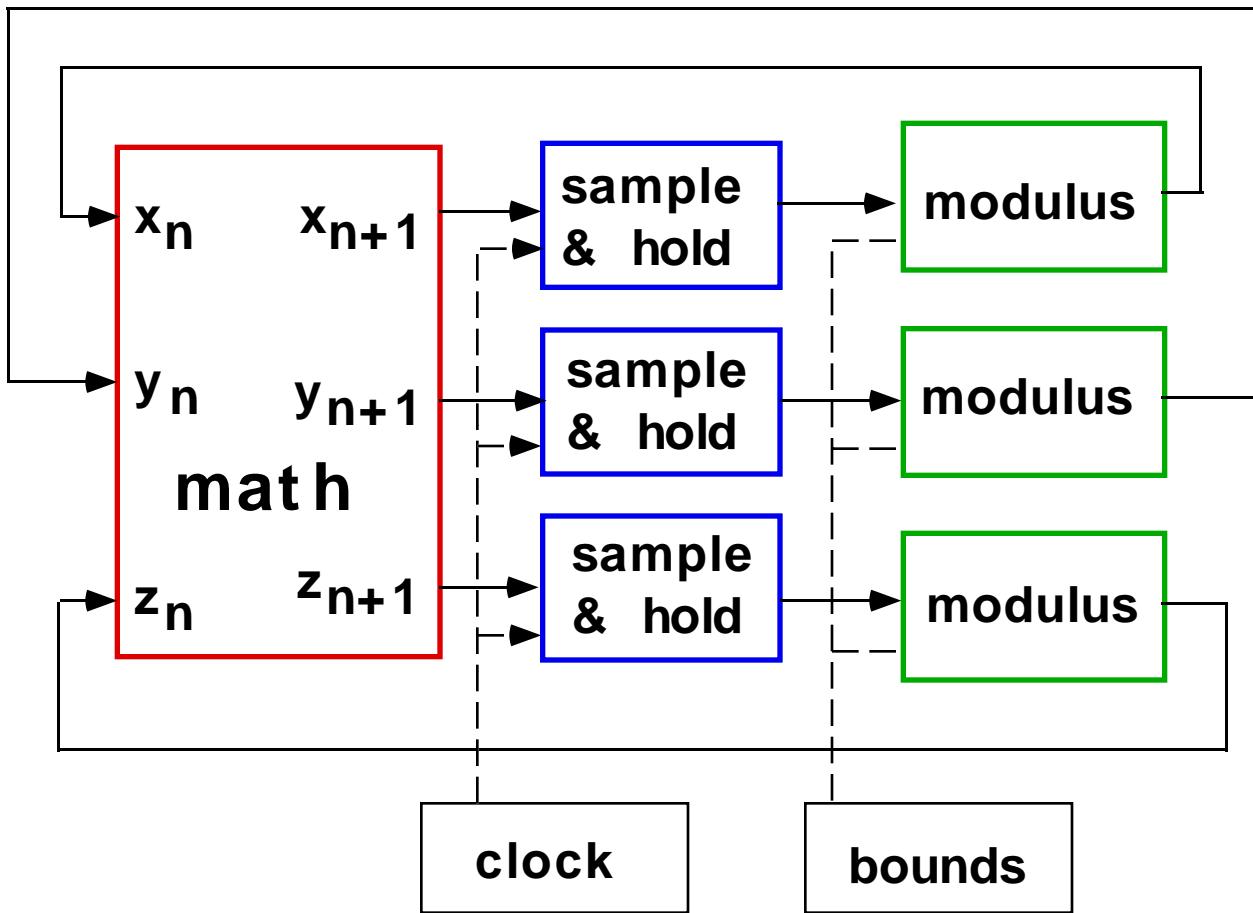
$$\lambda_{max} = -651 \text{ s}^{-1}$$

Synchronizing Volume-Preserving Maps

$$\begin{cases} x_{n+1} = -\frac{4}{3}x_n + z_n \\ y_{n+1} = \frac{1}{3}y_n + z_n \\ z_{n+1} = x_n + y_n \end{cases} \text{mod} \pm 2$$

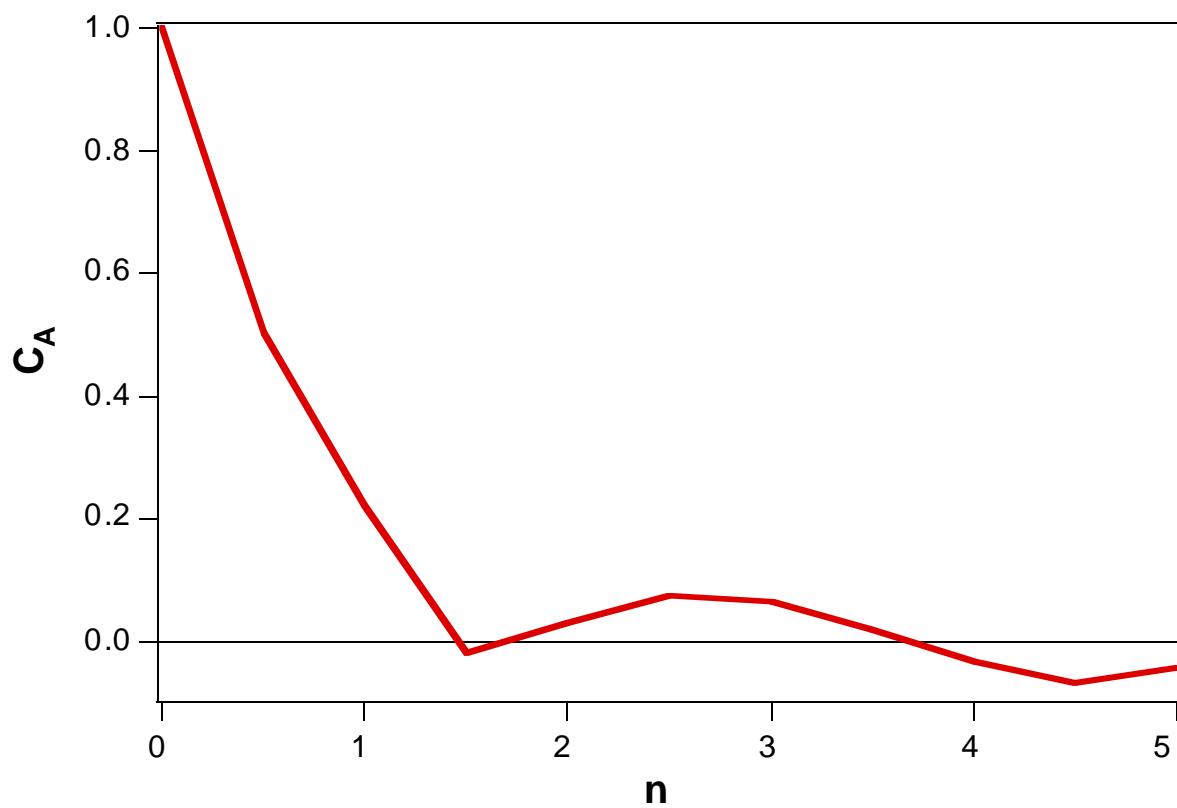


Circuit block diagram

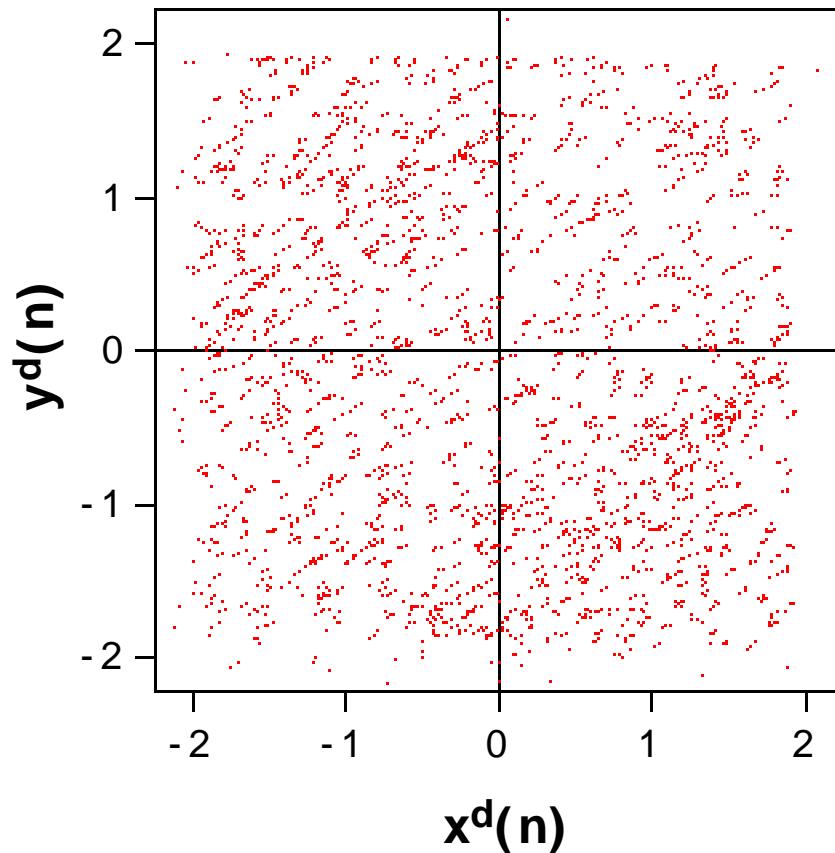


Lyapunov exponents:
 $0.6829 + 0.3023 + (-0.9852) = 0$

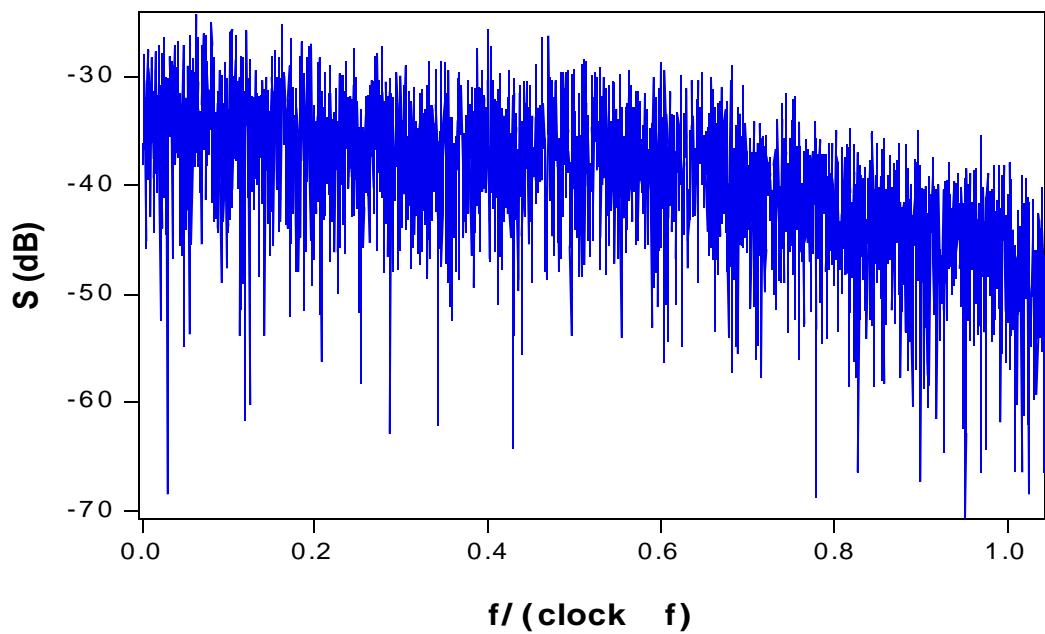
Autocorrelation (from circuit)



Circuit attractor



Circuit power spectrum



How to couple circuits?

Drive Jacobian:

$$\begin{bmatrix} -\frac{4}{3} & 0 & 1 \\ 0 & \frac{1}{3} & 1 \\ 1 & 1 & 0 \end{bmatrix}$$

transmit

$$w_n = z_n + \Gamma x_n$$

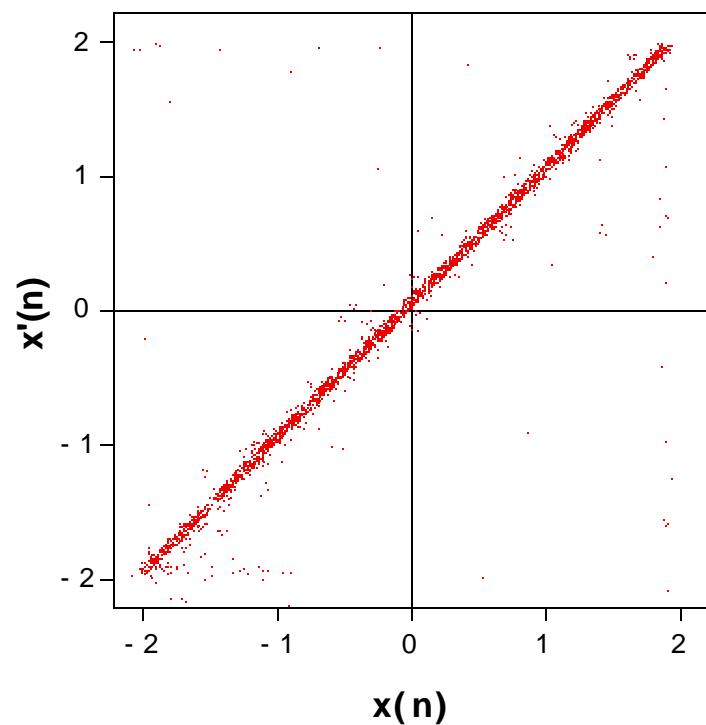
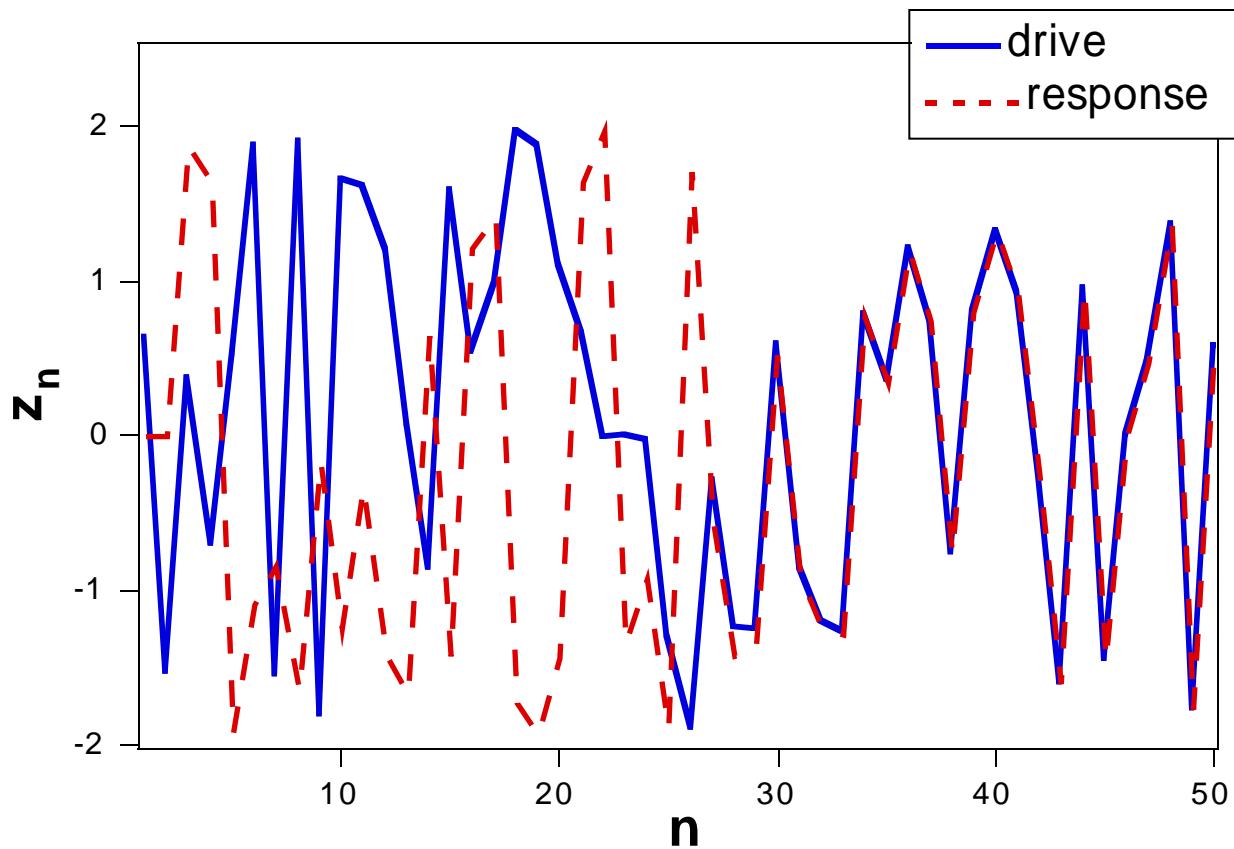
drive x-y subsystem with:

$$\hat{z}_n = w_n - \Gamma x'_n$$

$$\begin{bmatrix} -\frac{4}{3} - \Gamma & 0 \\ -\Gamma & -\frac{1}{3} \end{bmatrix}$$

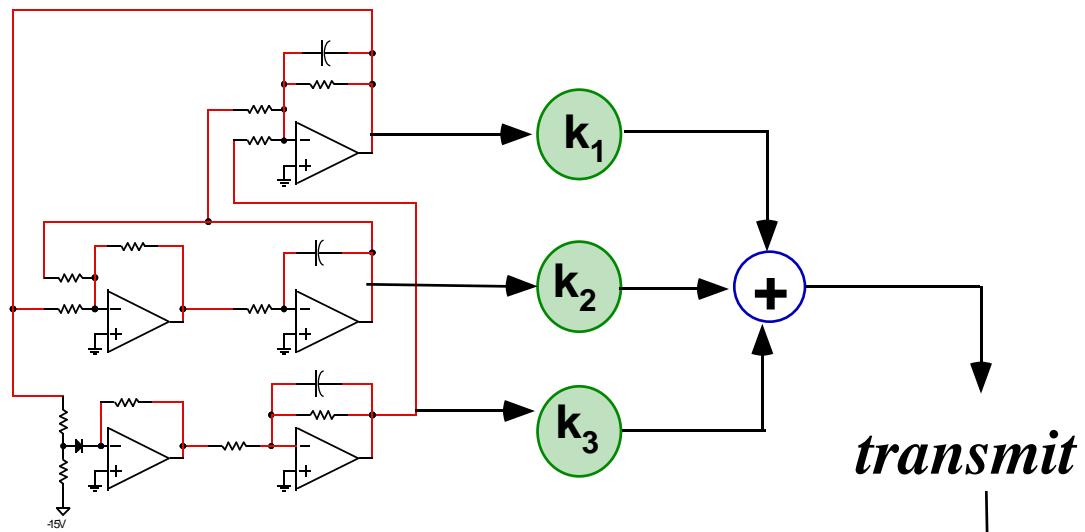
Use $\Gamma = -4/3$

Map synchronization

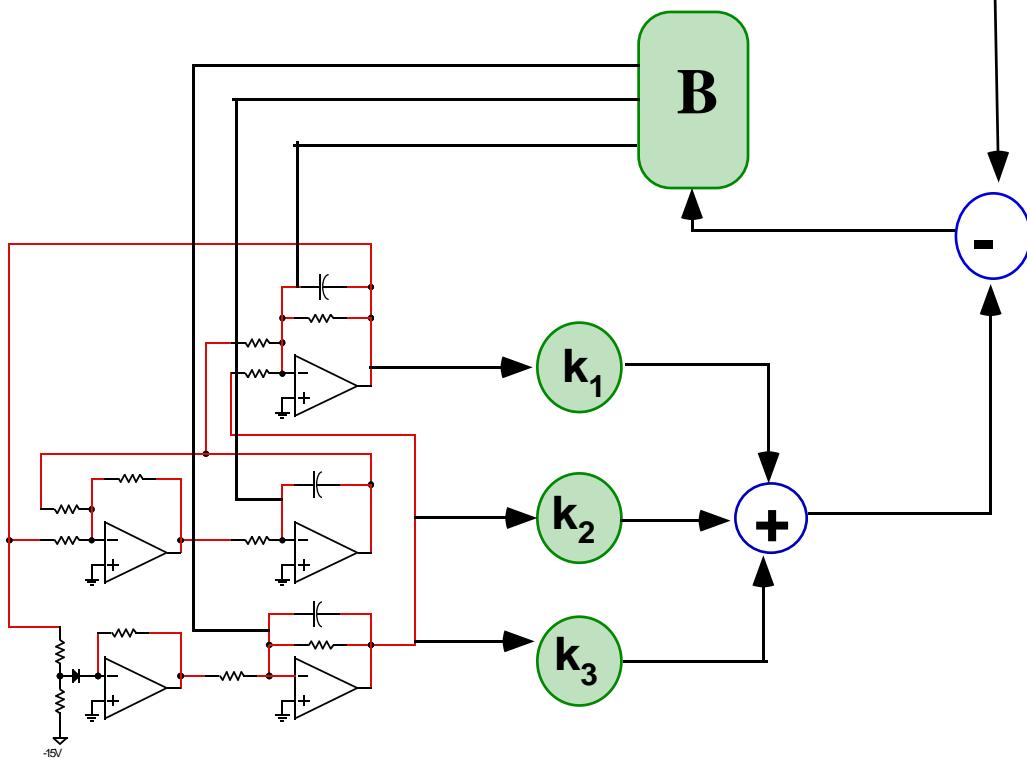


General coupling scheme (Peng et al. PRL 1996)

drive circuit



transmit



response circuit

General coupling:

$$\frac{d\mathbf{x}(t)}{dt} = \mathbf{F}[\mathbf{x}(t)]$$

$$\frac{d\mathbf{y}(t)}{dt} = \mathbf{F}[\mathbf{y}(t)] - \mathbf{B}\mathbf{K}^T[\mathbf{y}(t) - \mathbf{x}(t)]$$

Jacobian for PL Rossler

$$\begin{bmatrix} -0.05 - k_1 b_1 & -0.5 - k_2 b_1 & -1.0 - k_2 b_1 \\ 1.0 - k_1 b_2 & 0.131 - k_2 b_2 & 0 - k_3 b_2 \\ \frac{\partial g(x)}{\partial x} - k_1 b_3 & 0 - k_2 b_3 & -1 - k_3 b_3 \end{bmatrix}$$

General coupling

For n dimensions, have 2n parameters

$$k_1, \dots, k_n; b_1, \dots, b_n$$

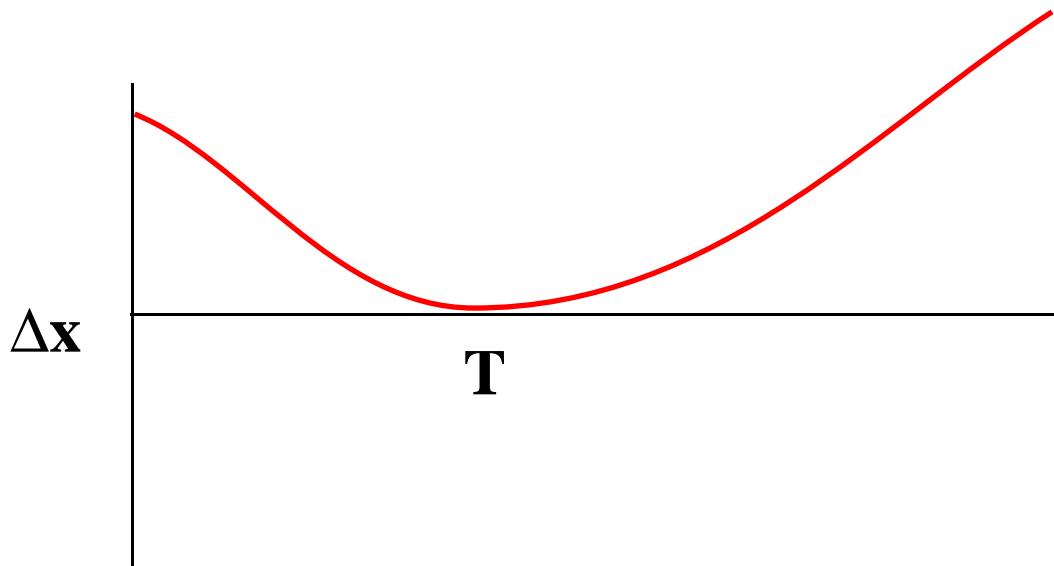
Use minimization algorithm to minimize largest response Lyapunov exponent by varying k's and b's.

Many minima.

Pitfalls of minimization

**Calculate λ for interval of length T:
Algorithm will minimize expansion
*over this interval***

Possible result



**Actual system is unstable, but
calculated λ is negative**

Hyperchaotic Rossler circuit equations

(design by Gregg Johnson)

$$dx_1 / dt = -0.05x_1 - 0.5x_2 - 0.62x_3$$

$$dx_2 / dt = x_1 + \rho x_2 + 0.40x_4$$

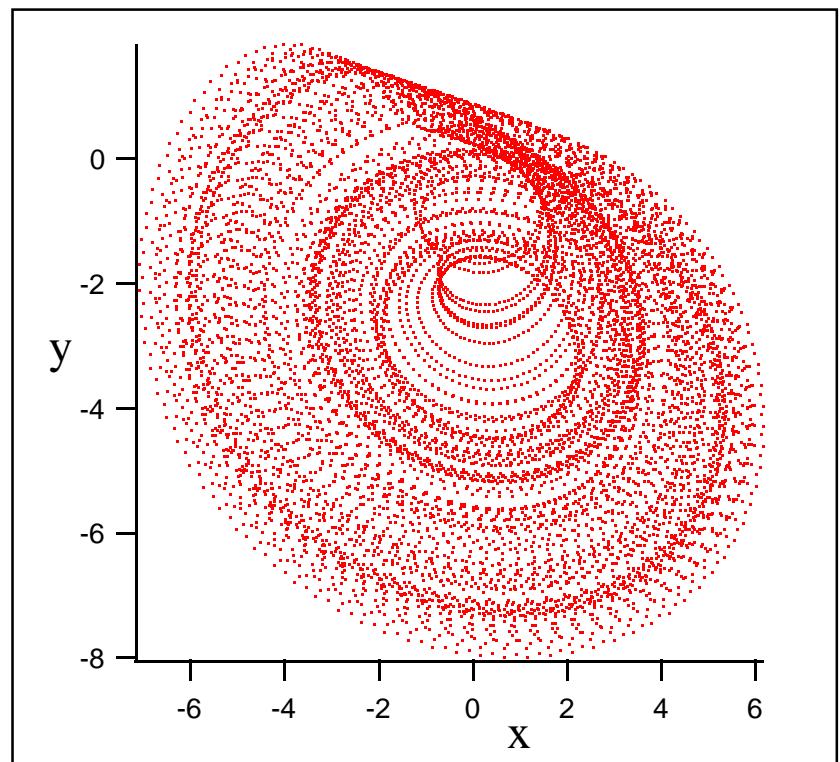
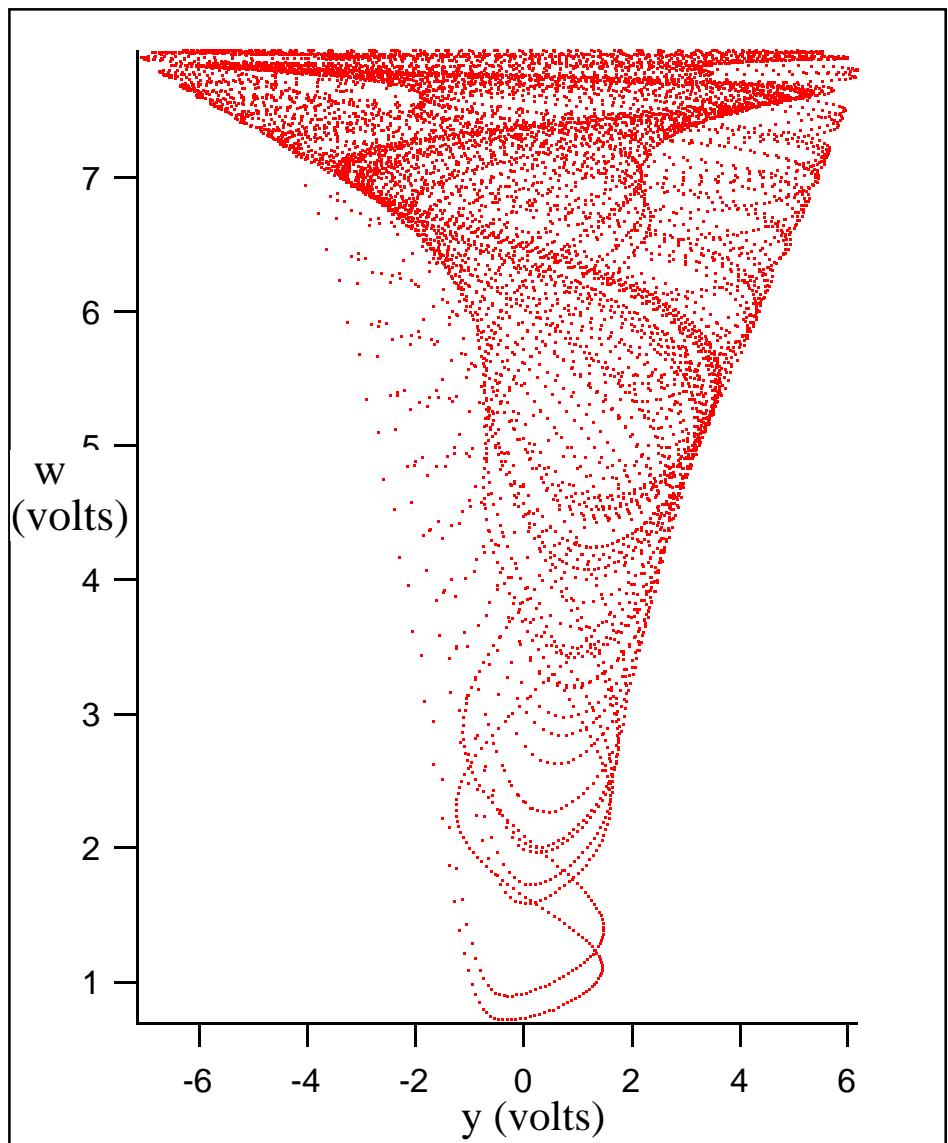
$$dx_3 / dt = -2x_3 + g(x_1)$$

$$dx_4 / dt = -1.5x_3 + 0.18x_4 + h(x_4)$$

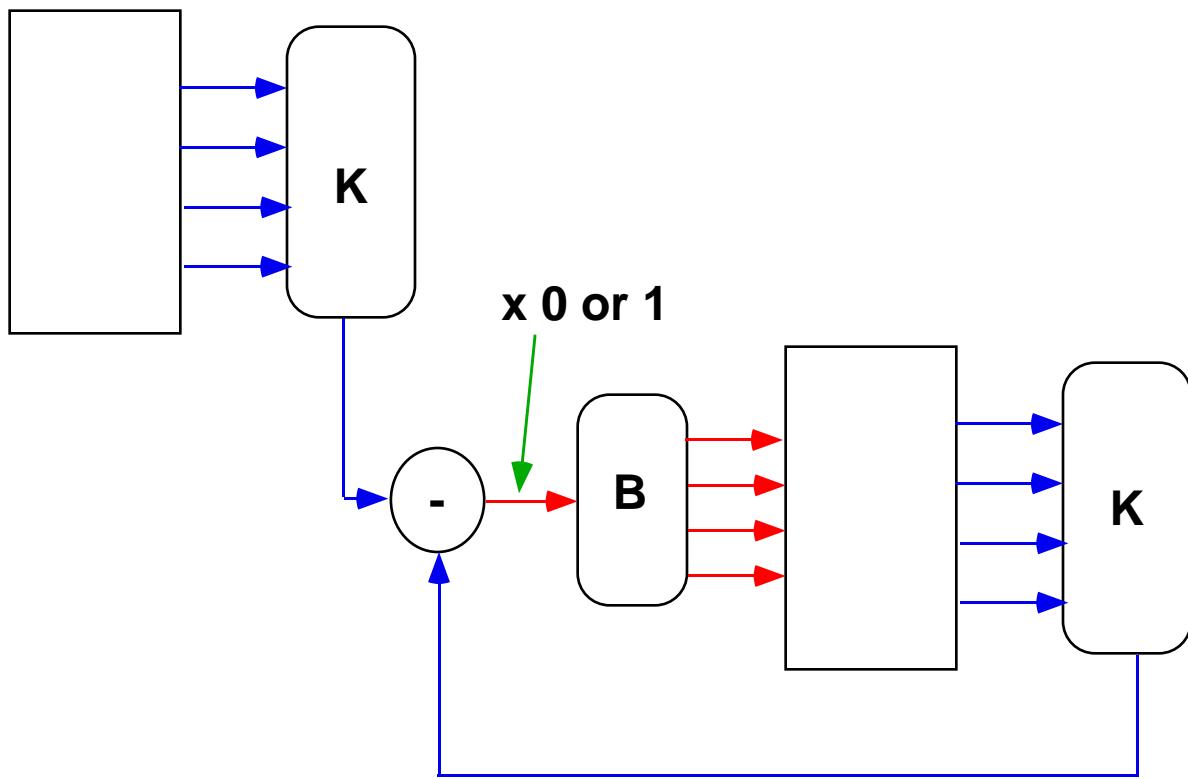
Piecewise linear functions:

$$g(x_1) = 10(x_1 - 0.68) \Theta(x_1 - 0.68)$$

$$h(x_4) = -0.41(x_4 - 3.8) \Theta(x_4 - 3.8)$$



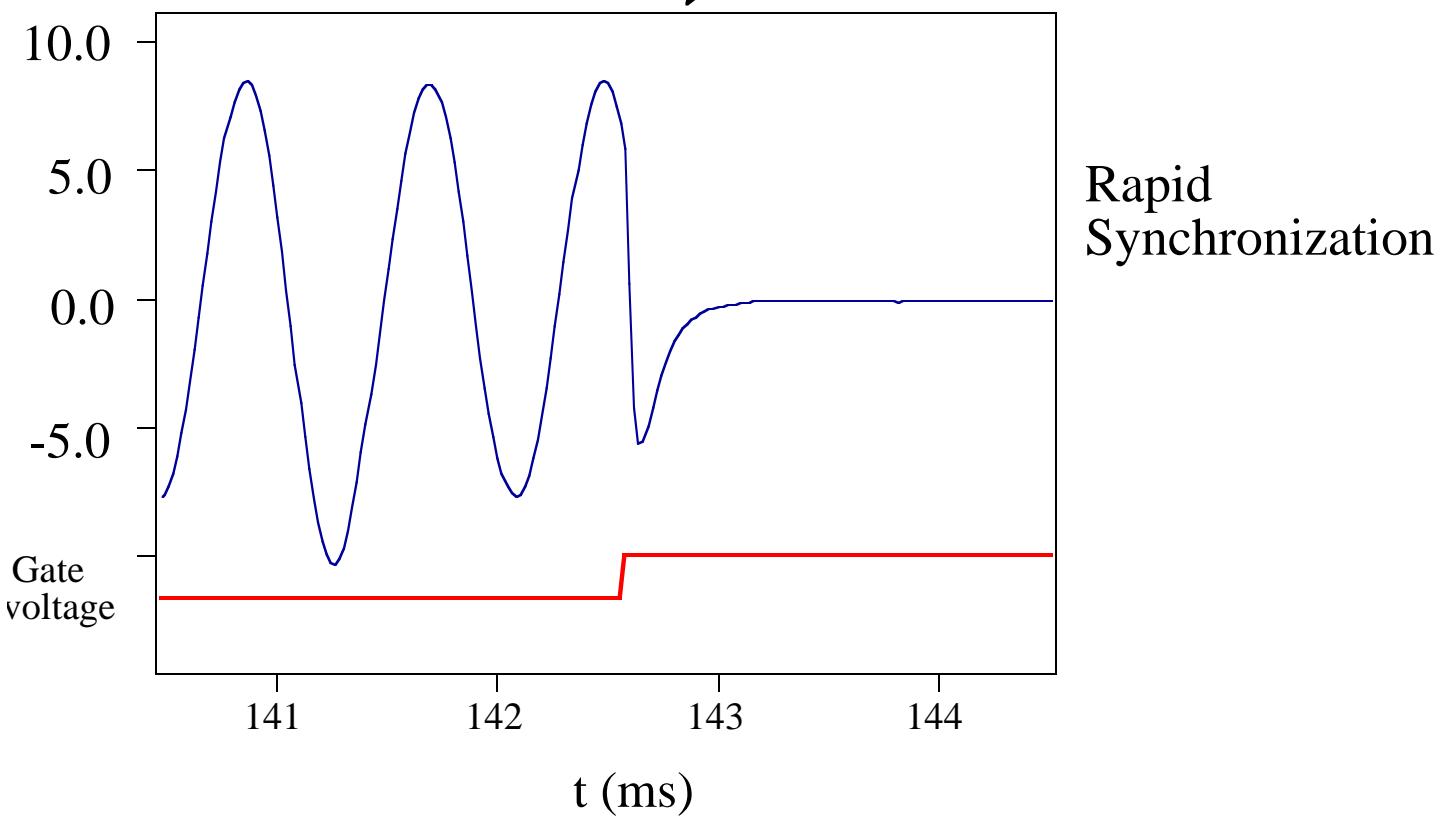
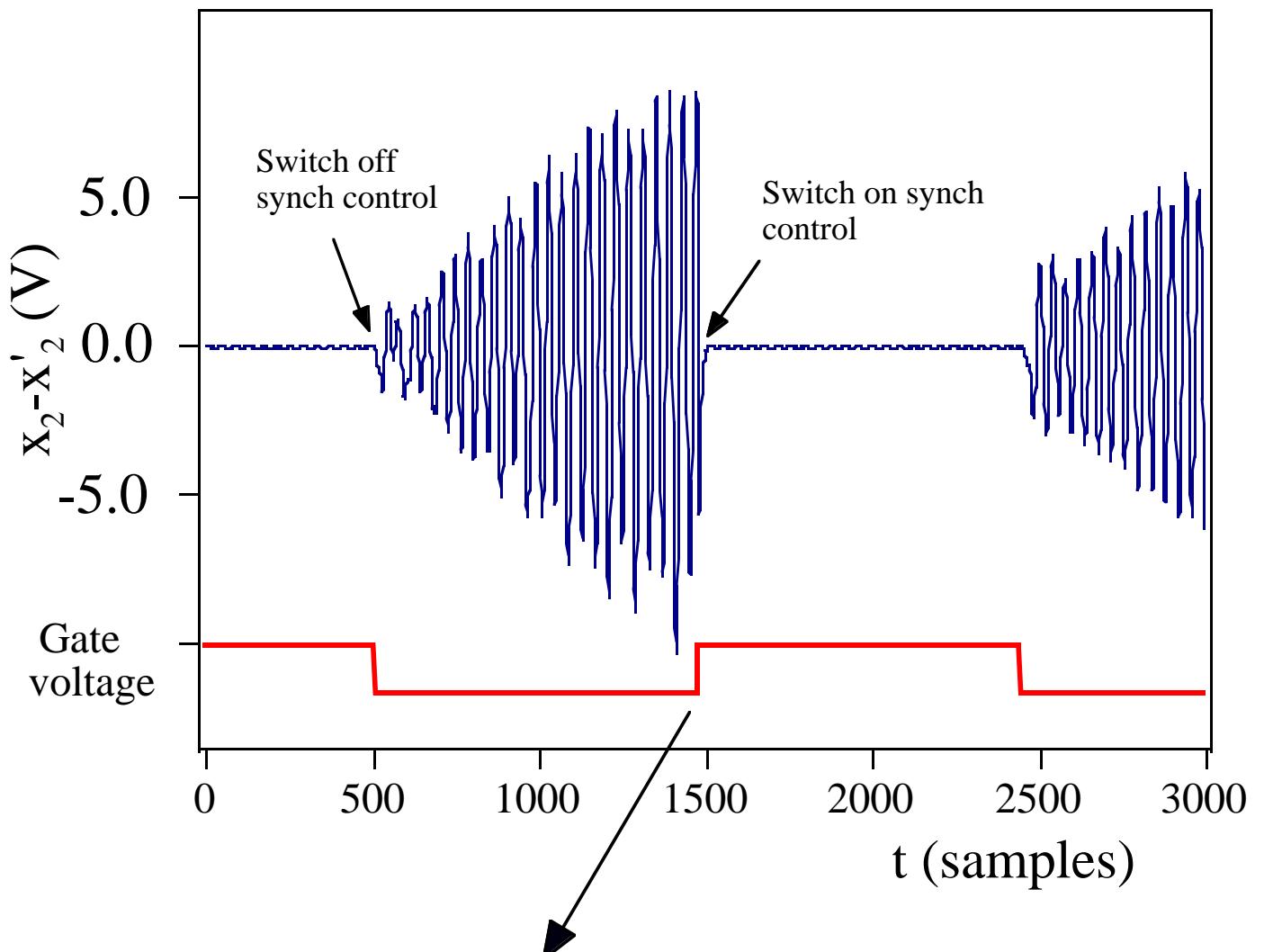
Coupling coefficients for 4-D Rossler



$$\mathbf{K} = (-1.97, 2.28, 0, 1.43)$$

$$\mathbf{B} = (0.365, 2.04, -1.96, 0)$$

$$\lambda = -0.34$$

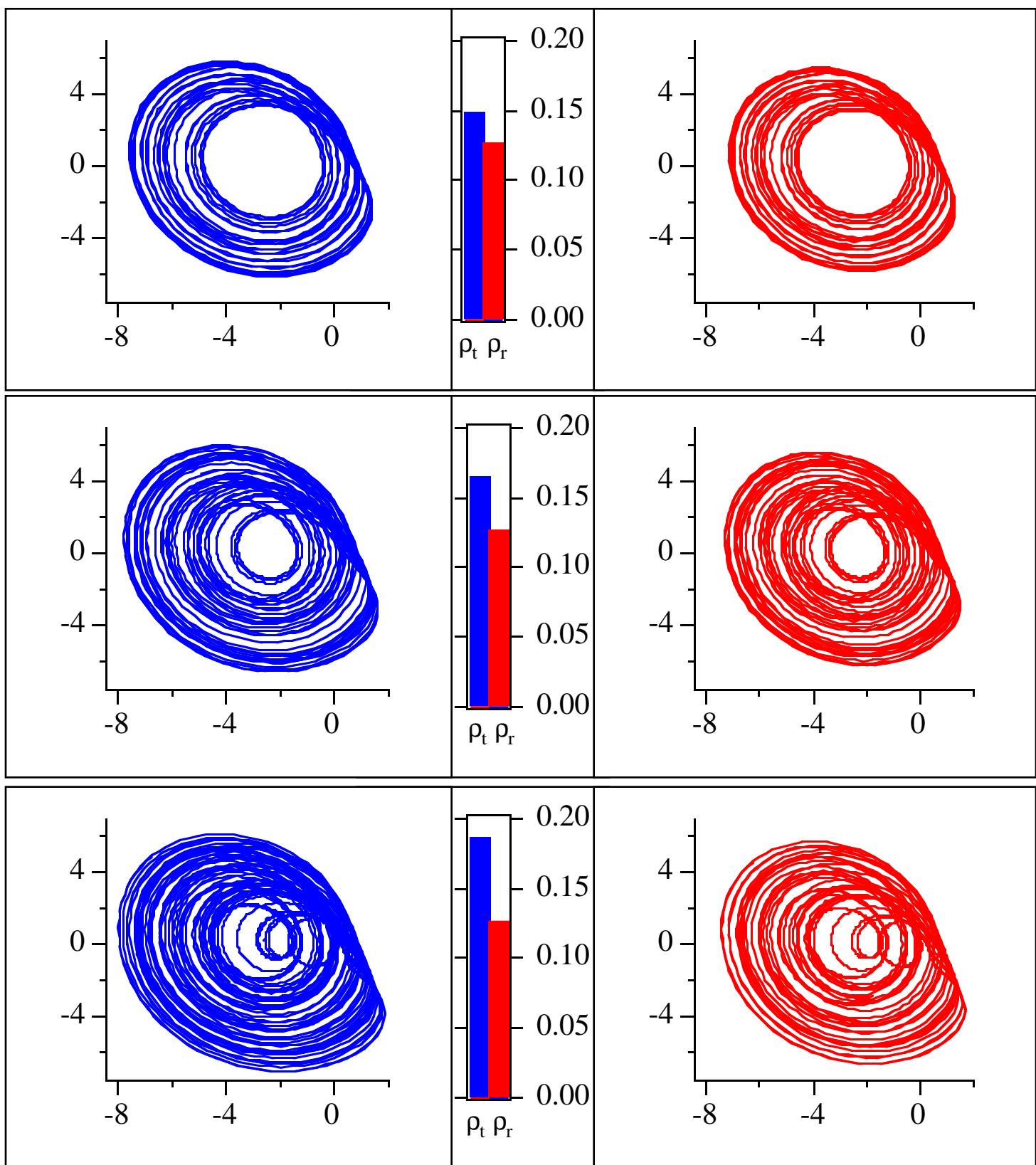


y vs. x (transmitter)

y' vs. x' (receiver)

chaotic --> hyperchaotic

parameter fixed



Experiment: 4D Rossler circuit, ρ_r fixed

Lorenz equations

$$dx_1 / dt = 16(x_2 - x_1)$$

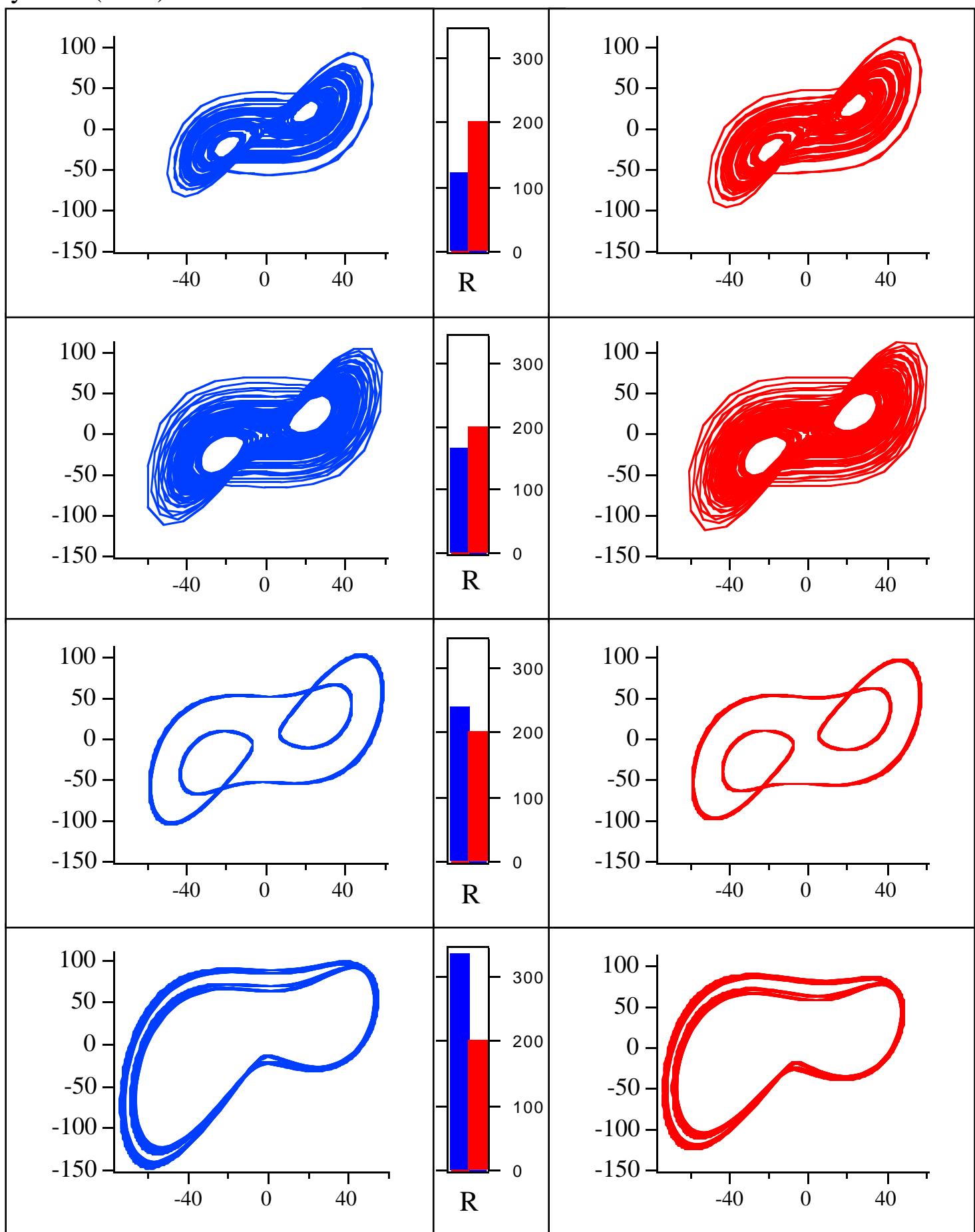
$$dx_2 / dt = x_1(R - x_3) - x_2$$

$$dx_3 / dt = x_1x_2 - 4x_3$$

y vs. x (trans)

Lorenz parameter mismatch

y' vs. x' (rec.)

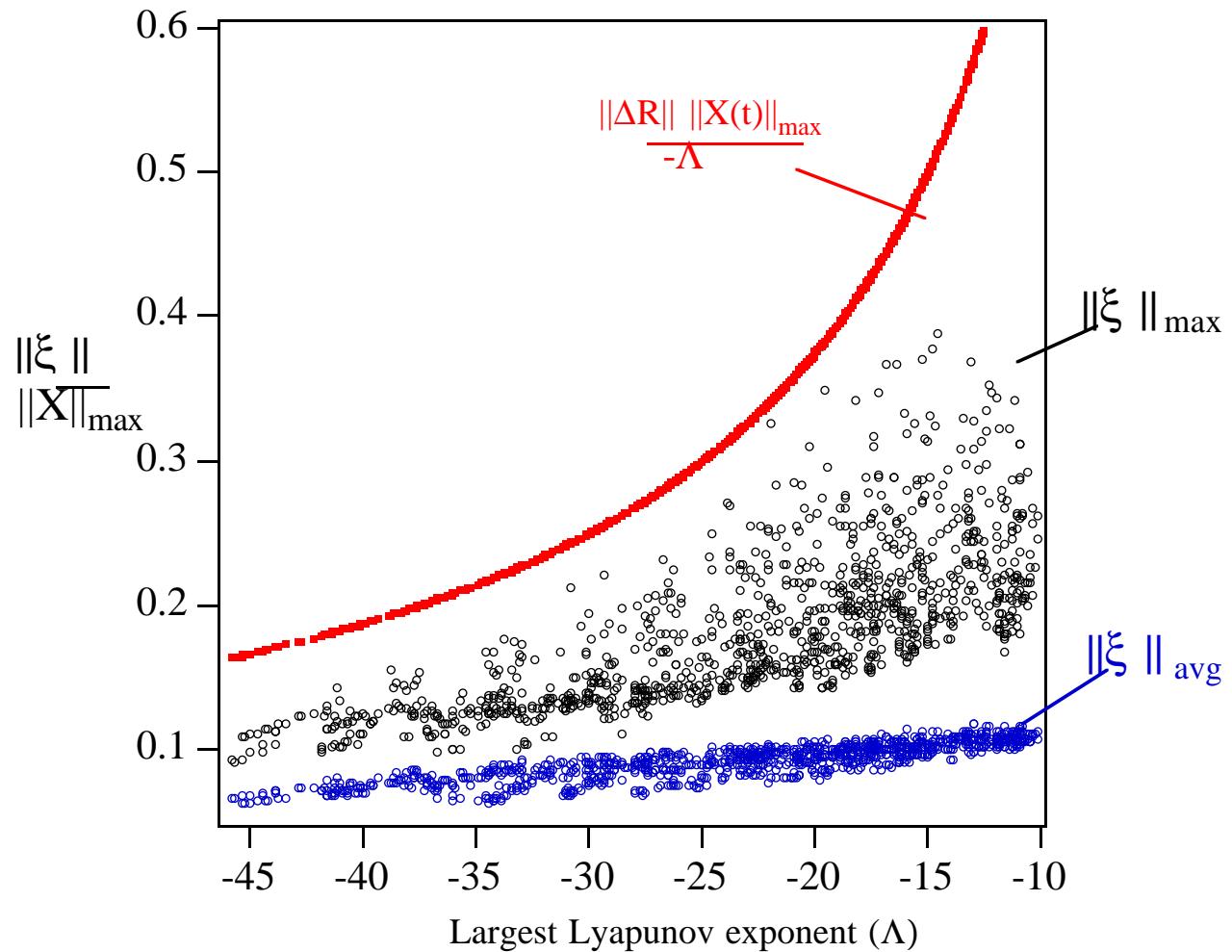


Lorenz system

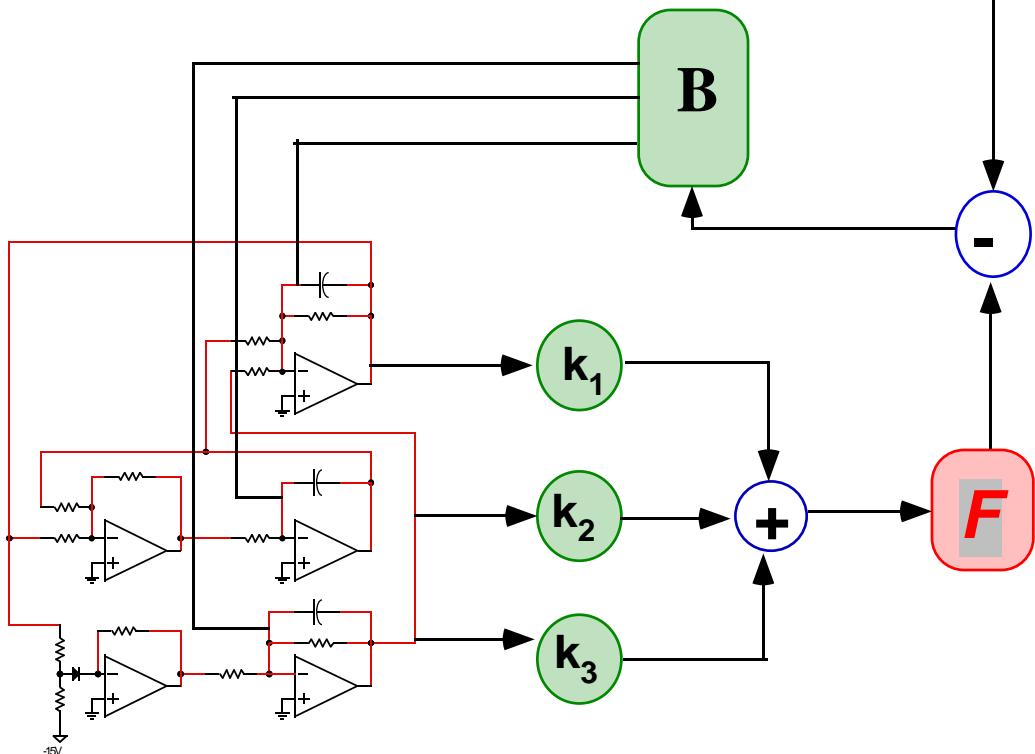
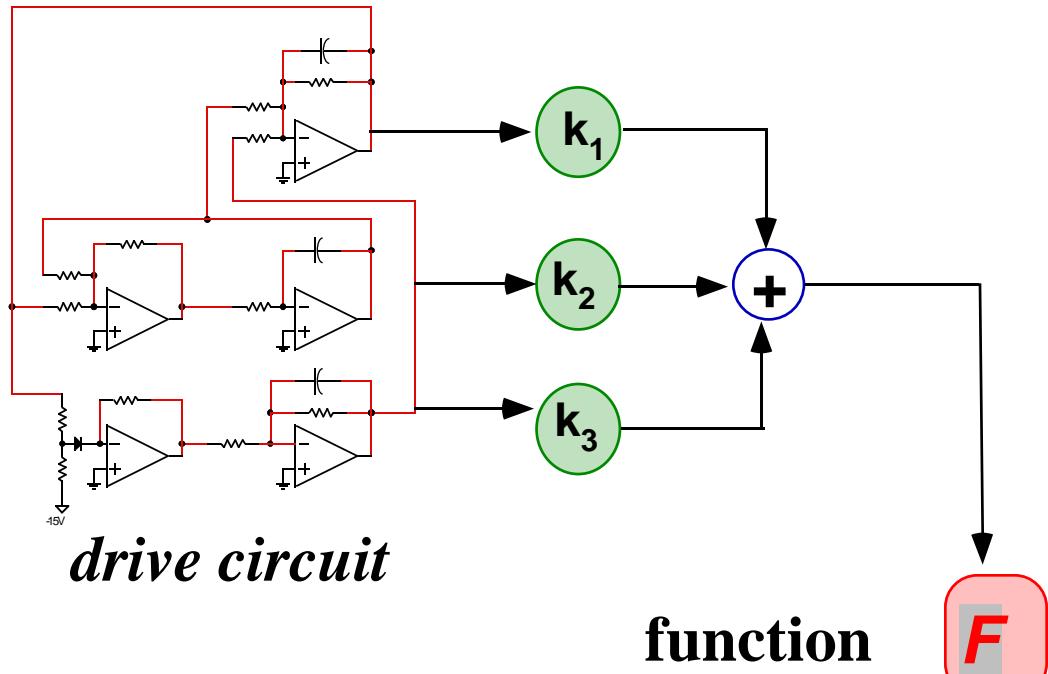
$$\Delta R = 17.5 \%$$

$$R_T = 165$$

$$R_R = 200$$

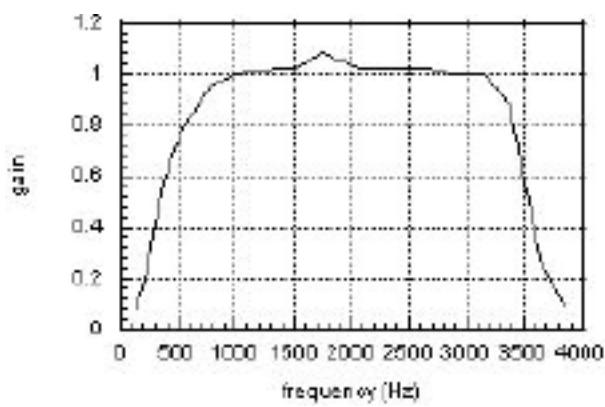
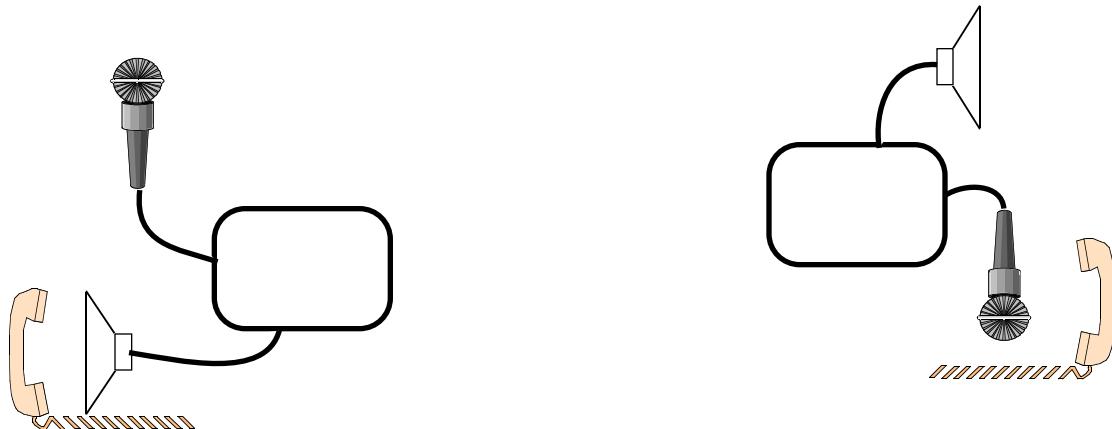


Add function to circuits

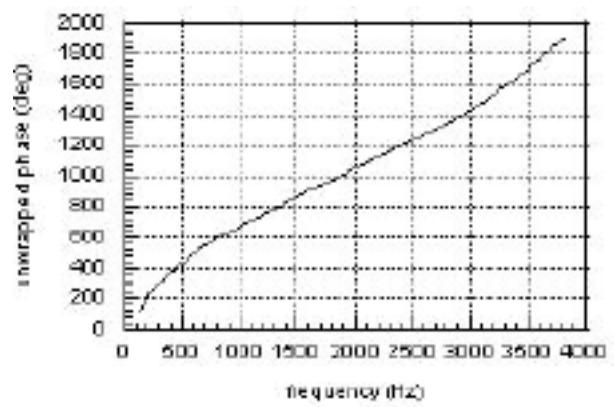


response circuit

Telephone Scrambler



amplitude

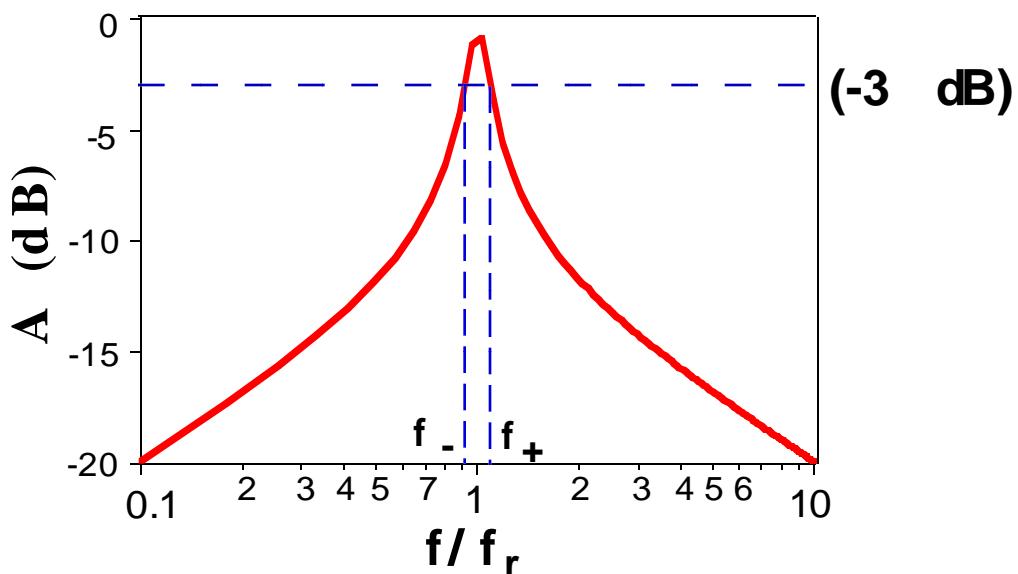


phase

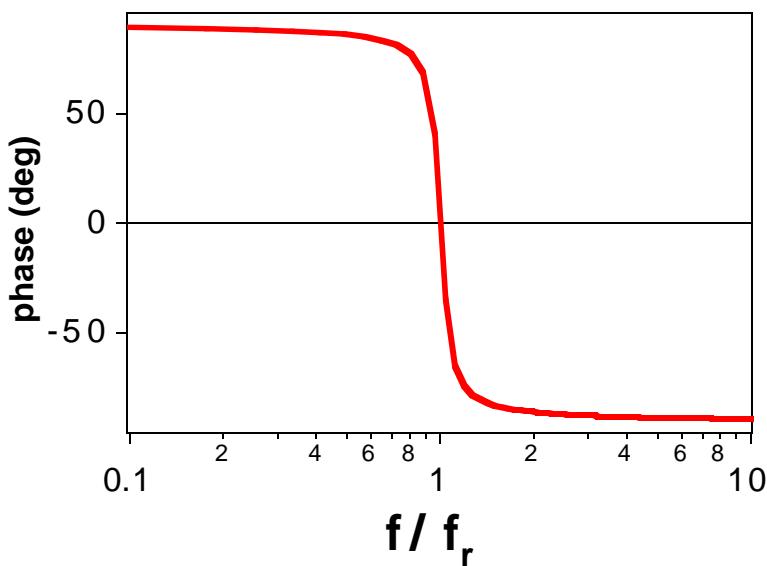
Use a bandpass filter for F

A bandpass filter is a second order (or higher) dynamical system.

Second order bandpass filter characteristics:



$$Q = f_r / (f_+ - f_-)$$

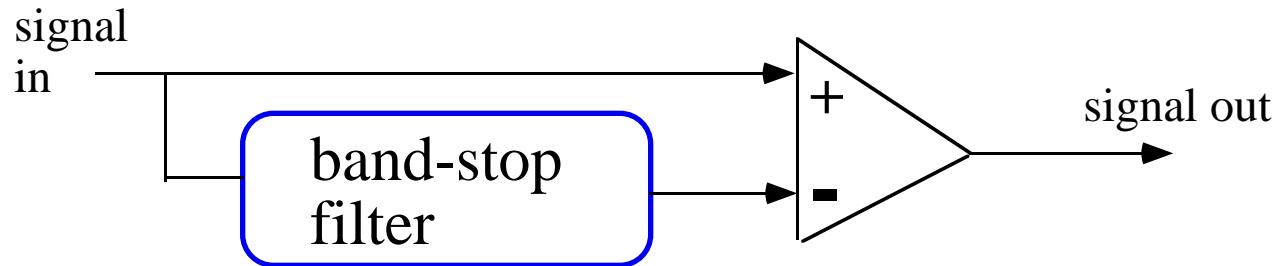


Form of the filter F is important

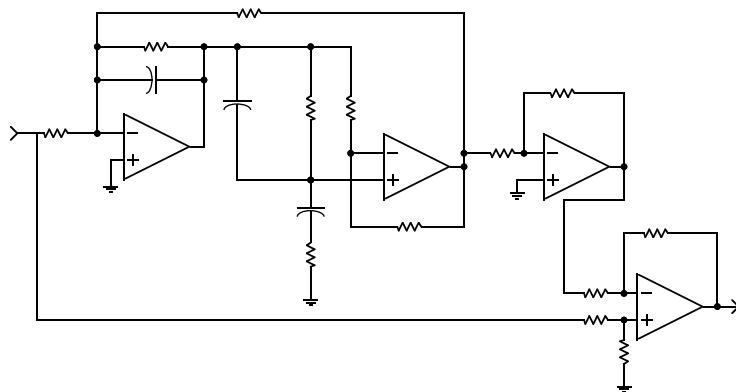
If output of F does not explicitly contain x, y, or z, then Jacobian looks like:

$$\begin{bmatrix} J_{11} & J_{12} & J_{13} & \frac{\partial F(x, y, z, K, B)}{\partial x} \\ J_{21} & \cdots & & \\ \vdots & \ddots & & \end{bmatrix}$$

Filtering process for Rossler signal



Wien-Robinson bandstop filter

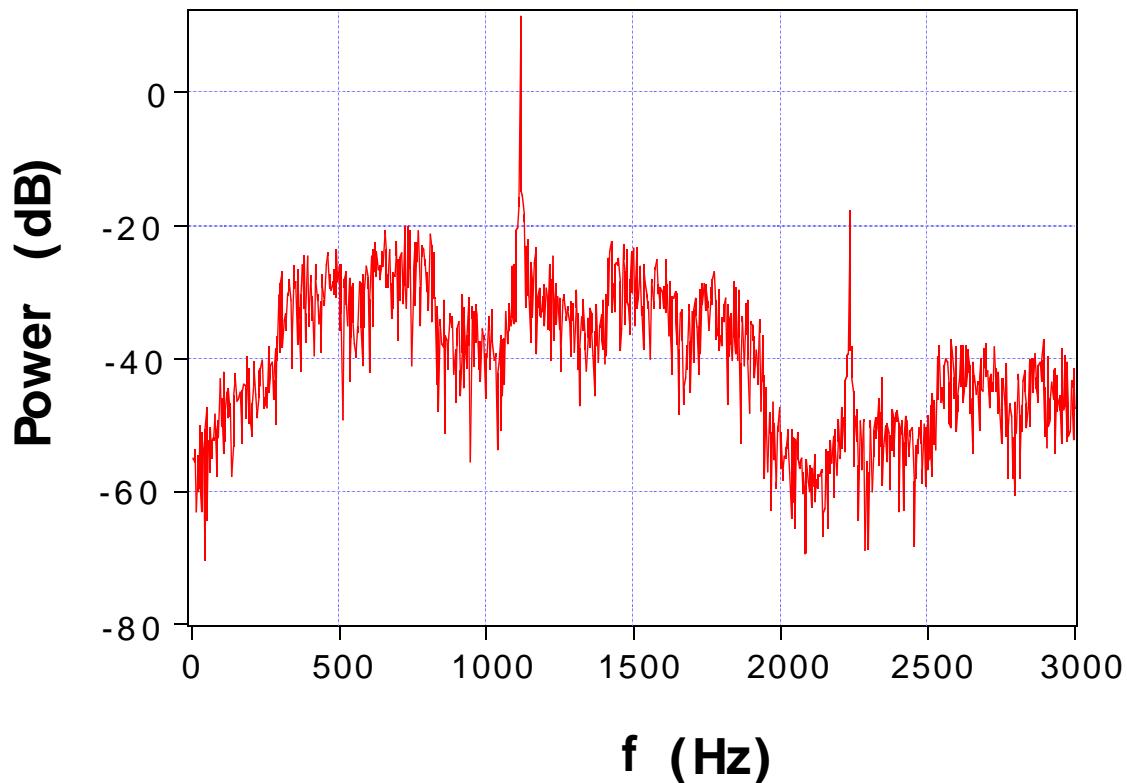


g_2 = output, u = input

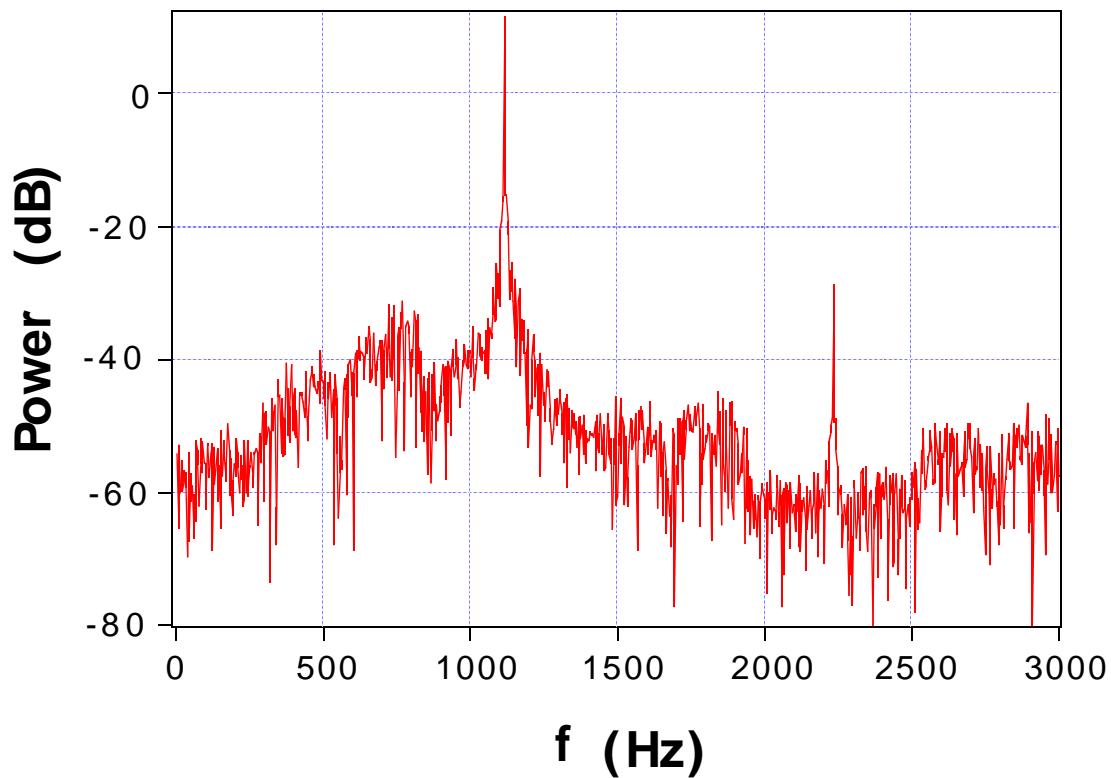
$$\frac{dg_1}{dt} = \frac{1}{RC} \left(A_0 u - g_2 - \frac{1}{Q} g_1 \right) + A_0 RC \frac{d^2 u}{dt^2}$$

$$\frac{dg_2}{dt} = \frac{1}{RC} g_1$$

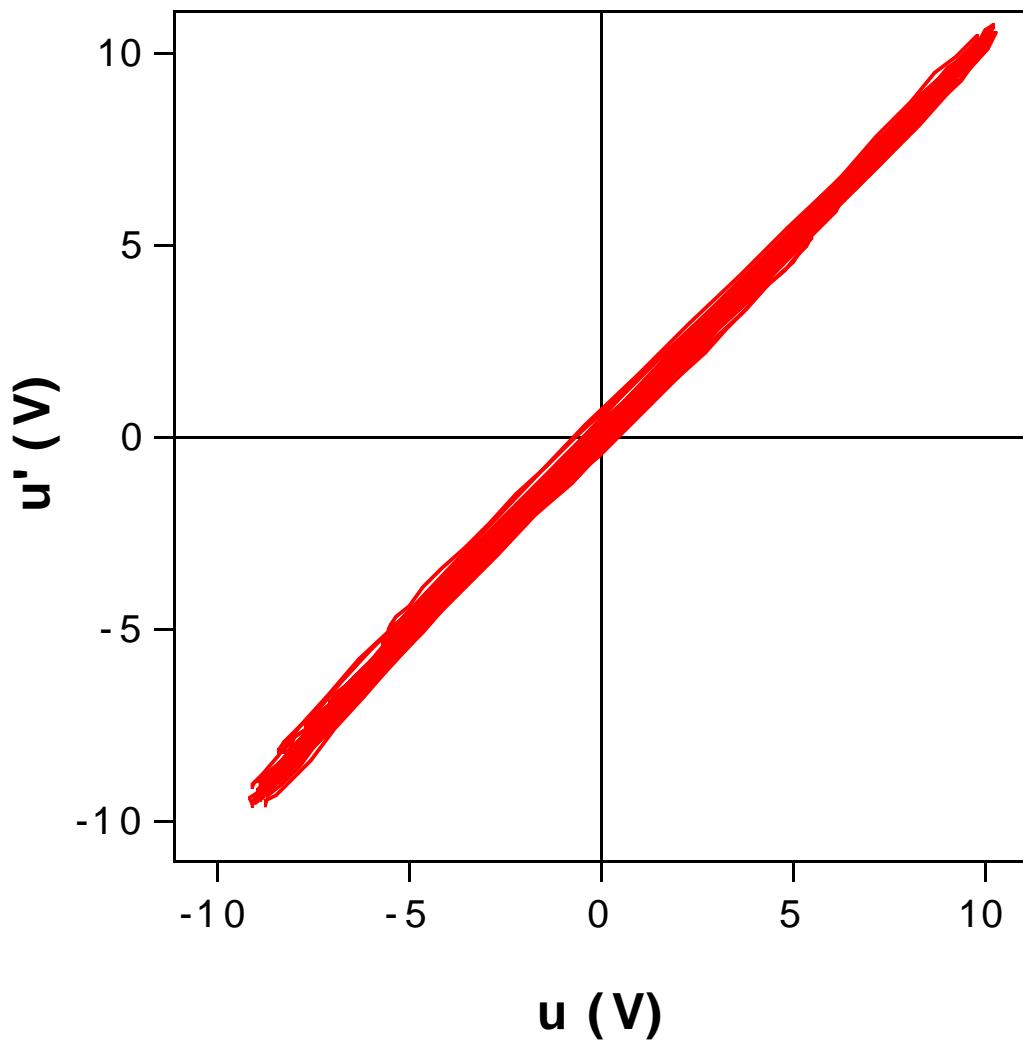
Rossler spectrum before filtering



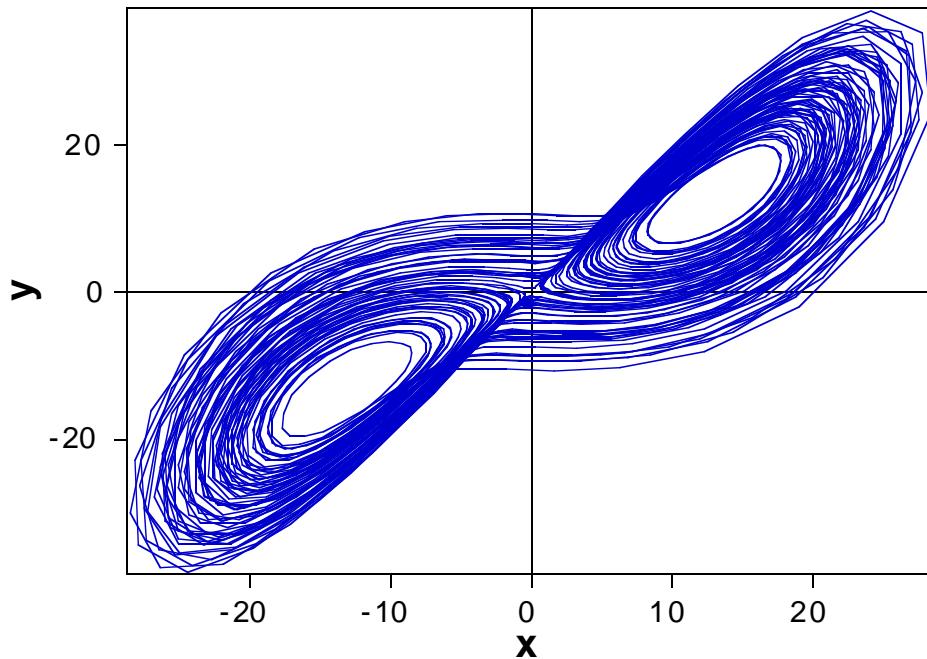
Rossler spectrum after filtering (Q = 7)



Rössler synchronization: u' vs u



Lorenz system



$$\frac{dx}{dt} = 16(y - x)$$

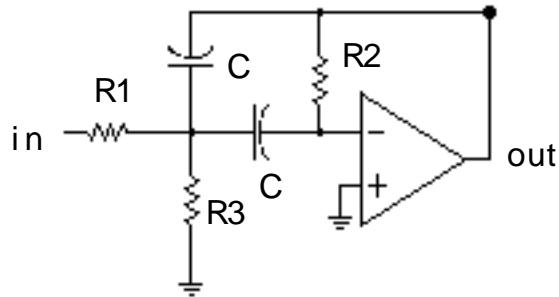
$$\frac{dy}{dt} = -xz + 45.92x - y$$

$$\frac{dz}{dt} = xy - 4z$$

Filtering process for Lorenz system



bandpass filter

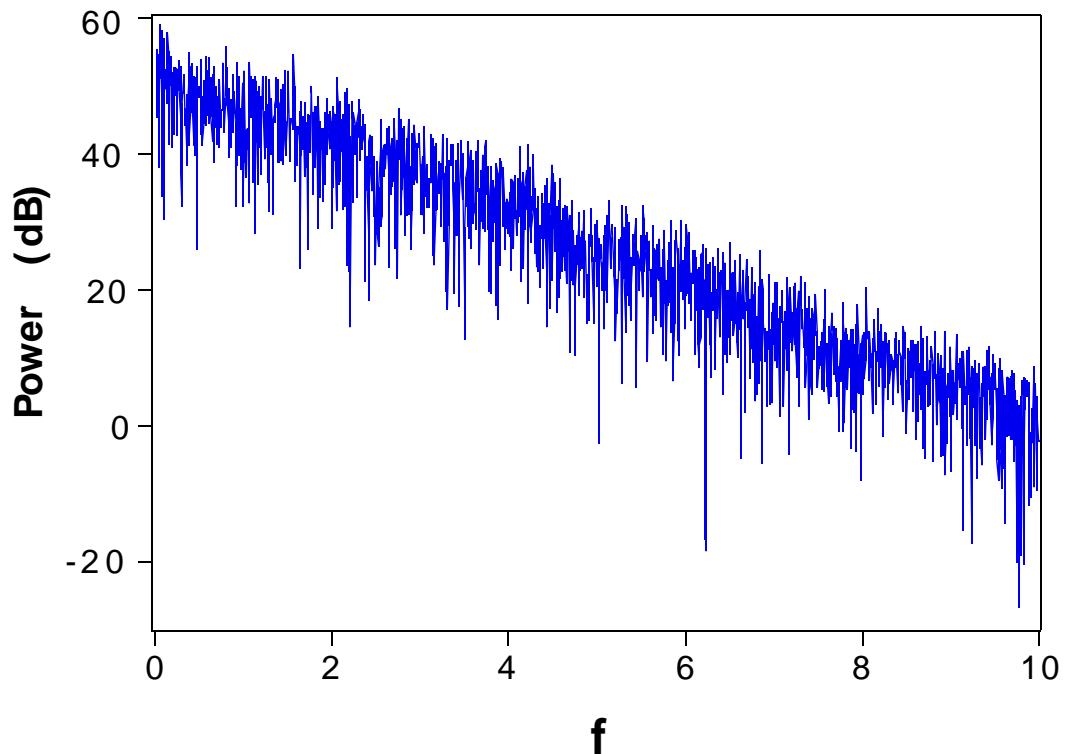


u = input, g_2 = output

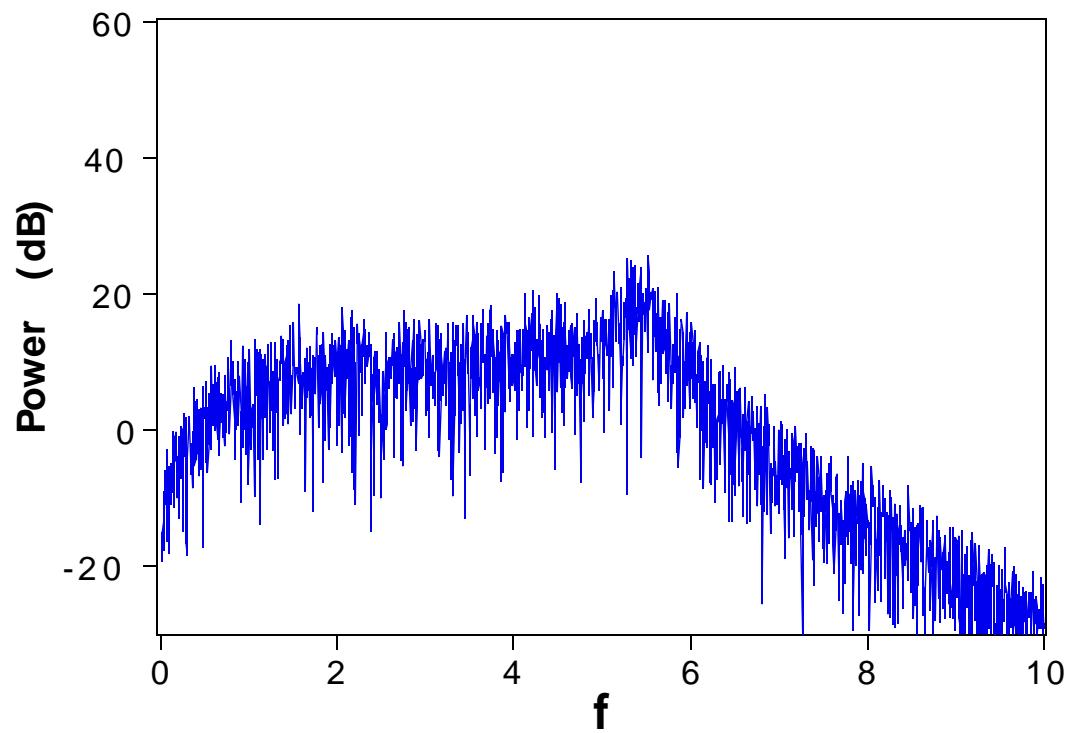
$$\frac{dg_1}{dt} = \frac{-2}{R_1 C} g_1 - \left(\frac{1}{2R_2 C} \left(\frac{1}{R_3 C} - \frac{1}{R_1 C} \right) g_2 - \left(\frac{1}{R_1 C} \right) \frac{du}{dt} \right)$$

$$\frac{dg_2}{dt} = g_1$$

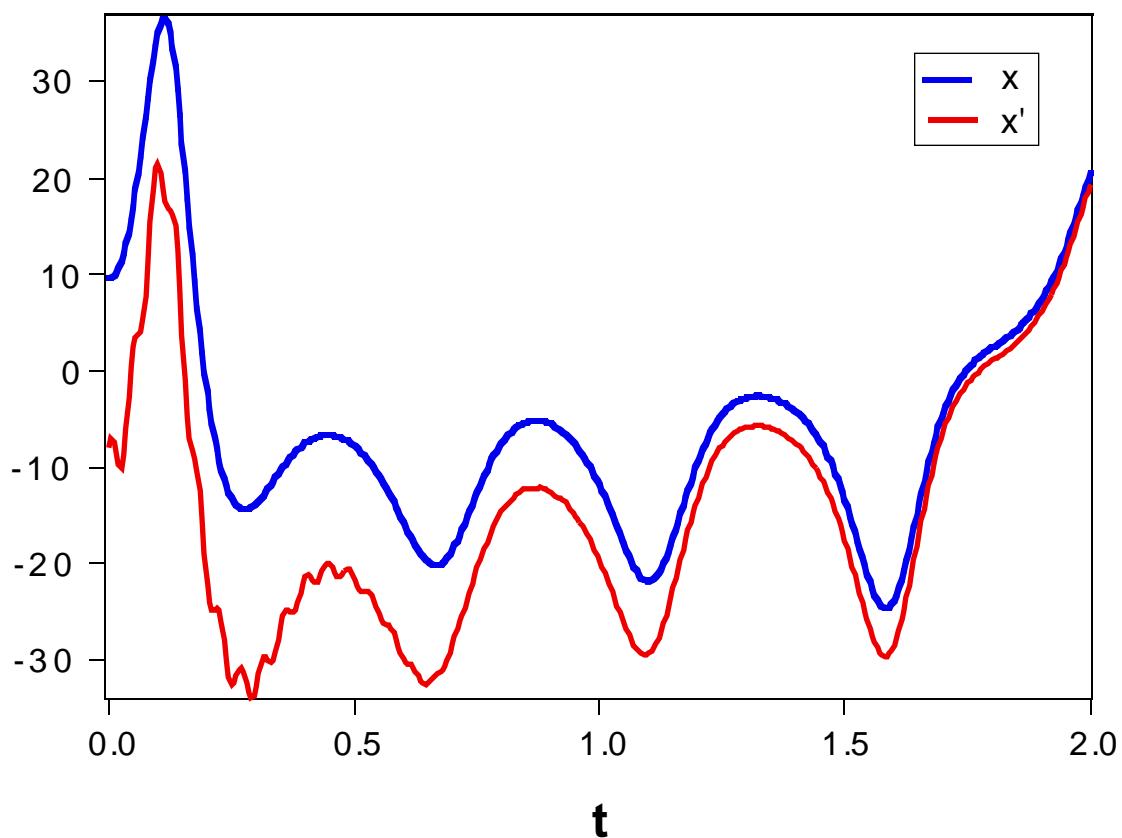
Lorenz signal before filtering



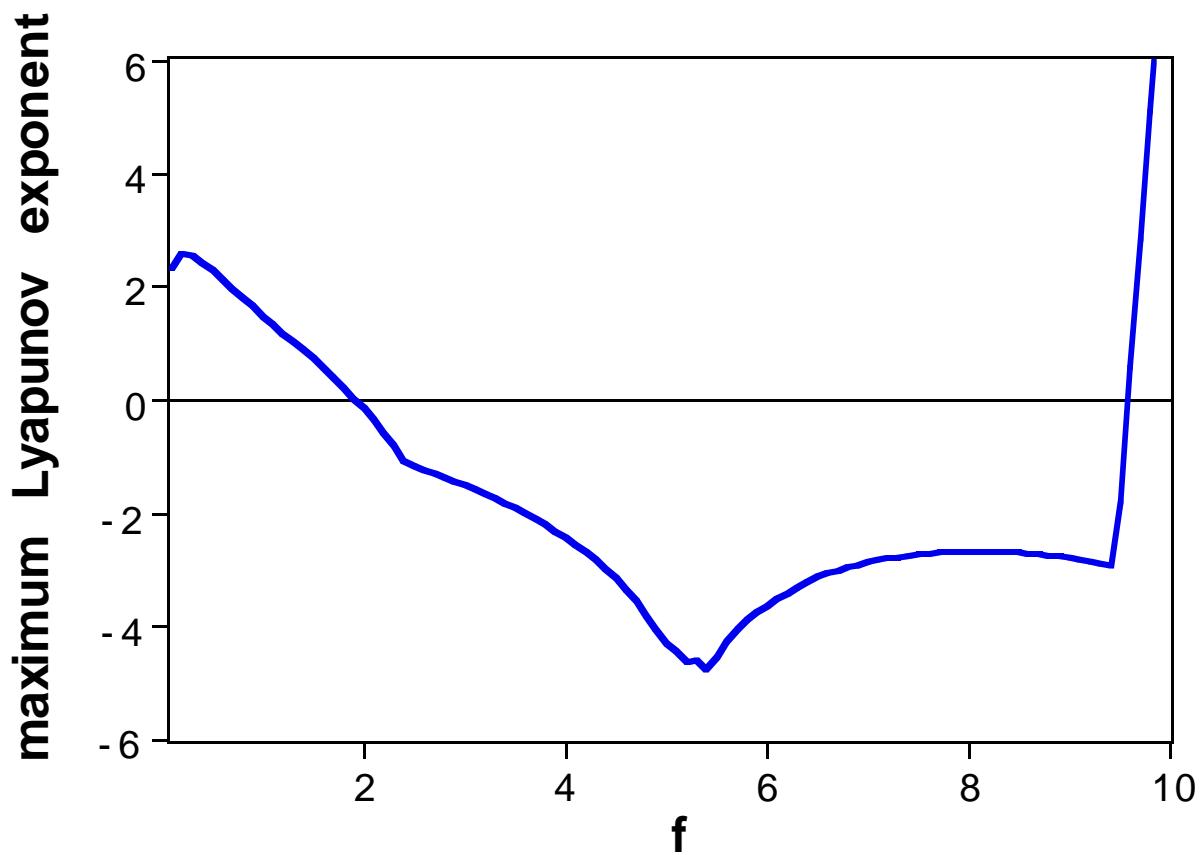
Lorenz signal after filtering



Lorenz synchronization

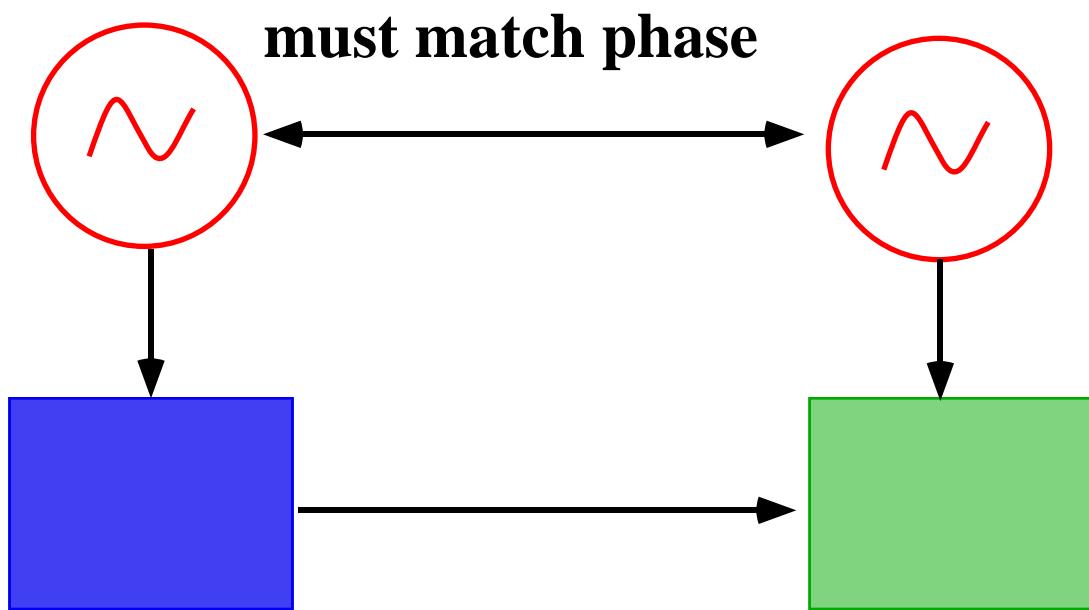


Lorenz stability vs filter center frequency



Other Applications for Filters:

Synchronizing Nonautonomous Circuits



Consider 2 periodically driven systems such as the Duffing system: (Heagy)

$$\frac{dx_1}{dt} = v_1$$

$$\frac{dv_1}{dt} = -\gamma v_1 + g(x_1) + A \cos(\phi_1)$$

$$\frac{d\phi_1}{dt} = \omega$$

$$\frac{dx_2}{dt} = v_2$$

$$\frac{dv_2}{dt} = -\gamma v_2 + g(x_2) + A \cos(\phi_2)$$

$$\frac{d\phi_2}{dt} = \omega$$

Suppose we drive system 2 with the x component of system 1:

$$v_2 = -\gamma v_2 + g(x_1) + A \cos\phi_2$$

We will want $\phi_2 - \phi_1$ to go to 0, but we only know x_2 and x_1 .

Heagy's control scheme

$$\delta x = x_2 - x_1$$

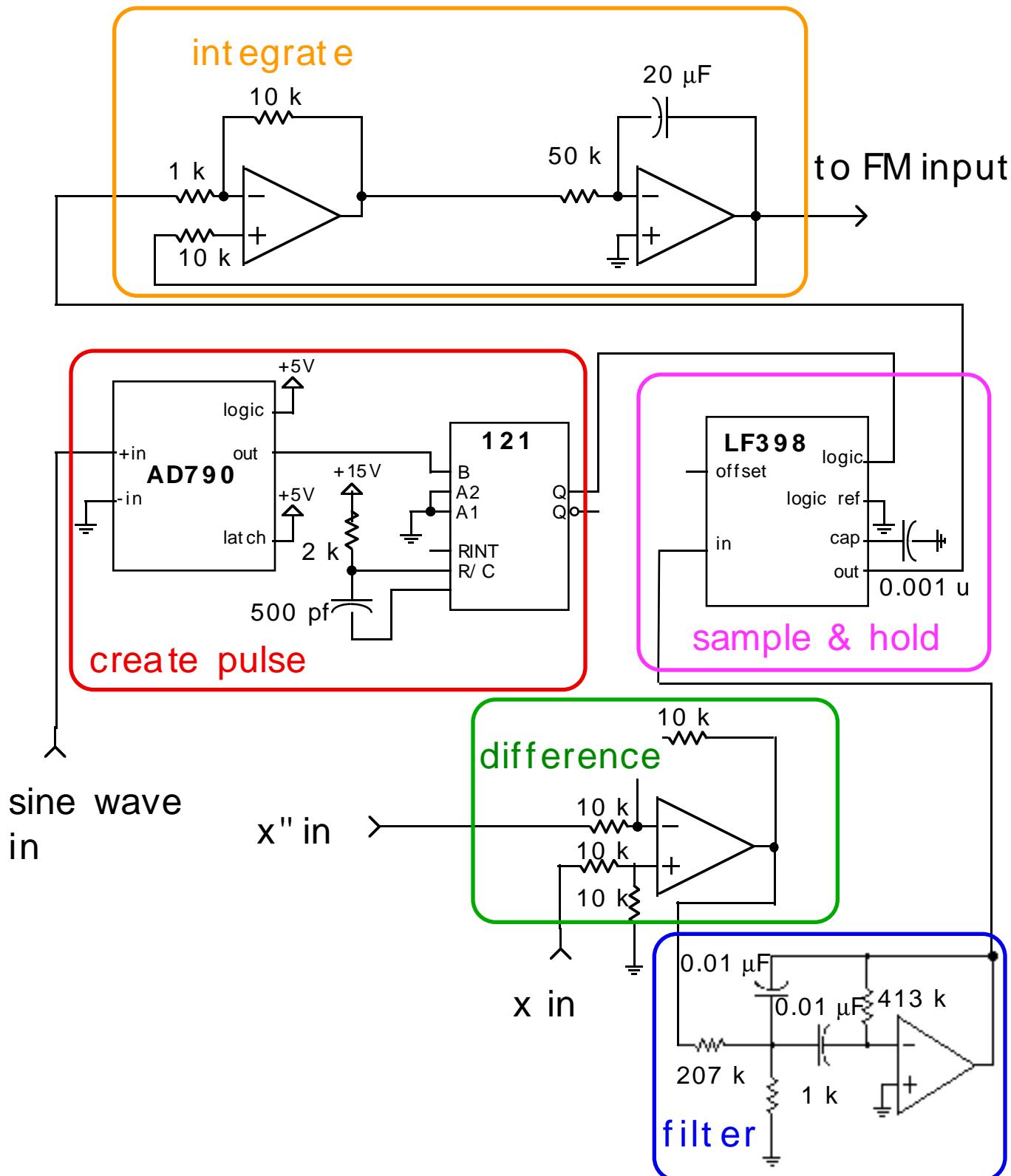
$$\delta\phi(0) = \phi_2(0) - \phi_1(0),$$

It can be shown for small δx after an initial transient time that:

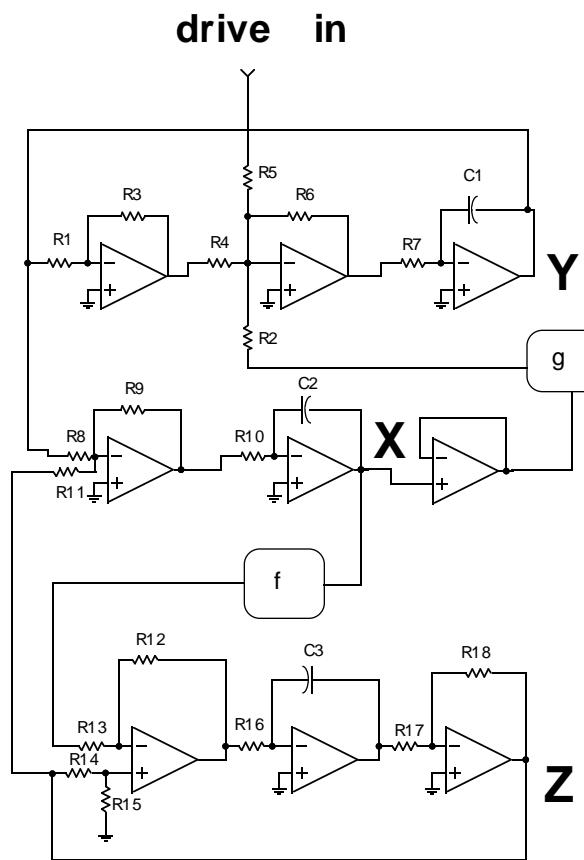
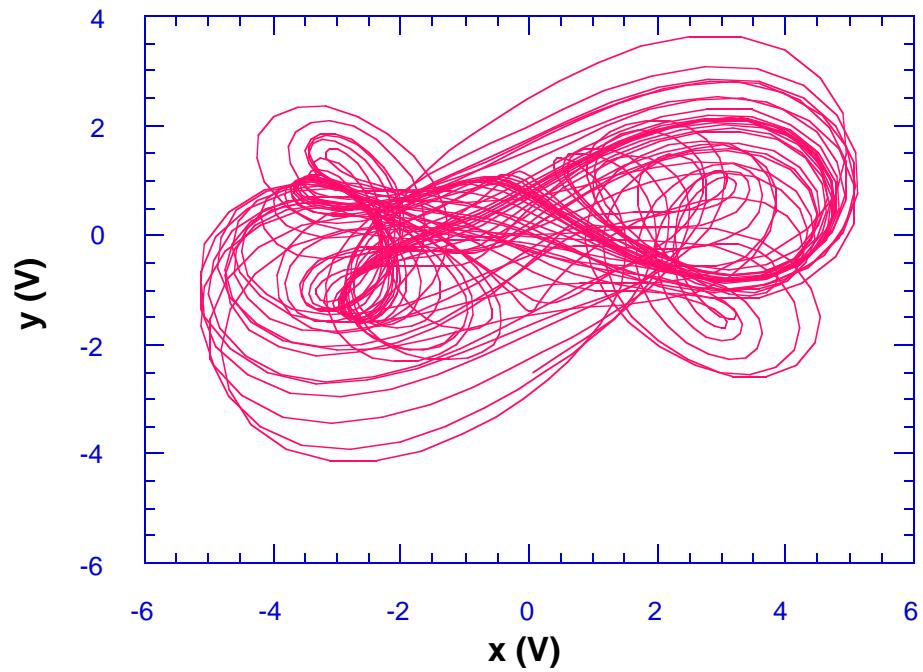
$$\delta x = \frac{A\delta\phi(0)}{\omega(\gamma^2 + \omega^2)} [\gamma \cos(\omega t + \phi_2(0)) + \omega \sin(\omega t + \phi_2(0))]$$

Therefore, the amplitude of δx is proportional to the phase difference between the two systems and is modulated at the forcing frequency ω .

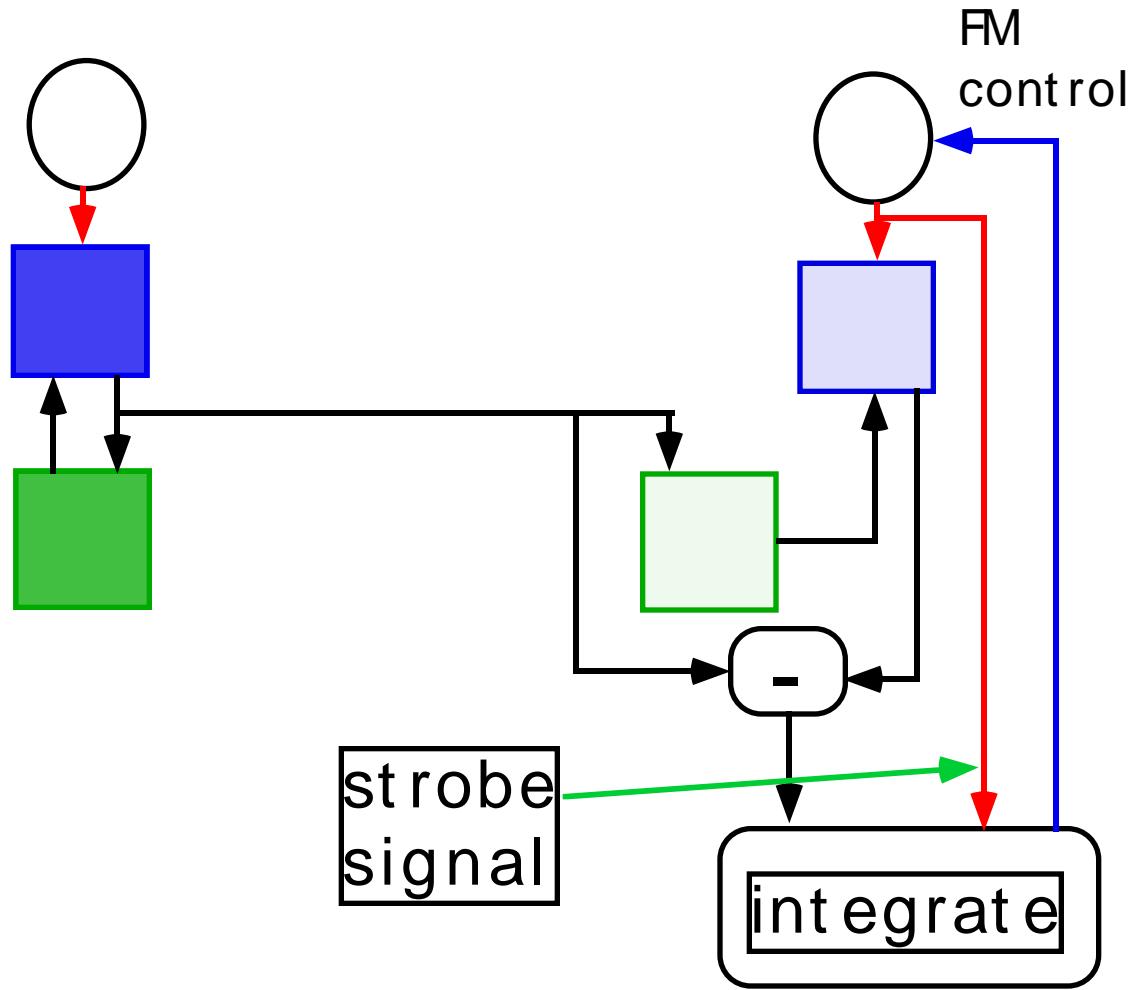
Phase correction circuit



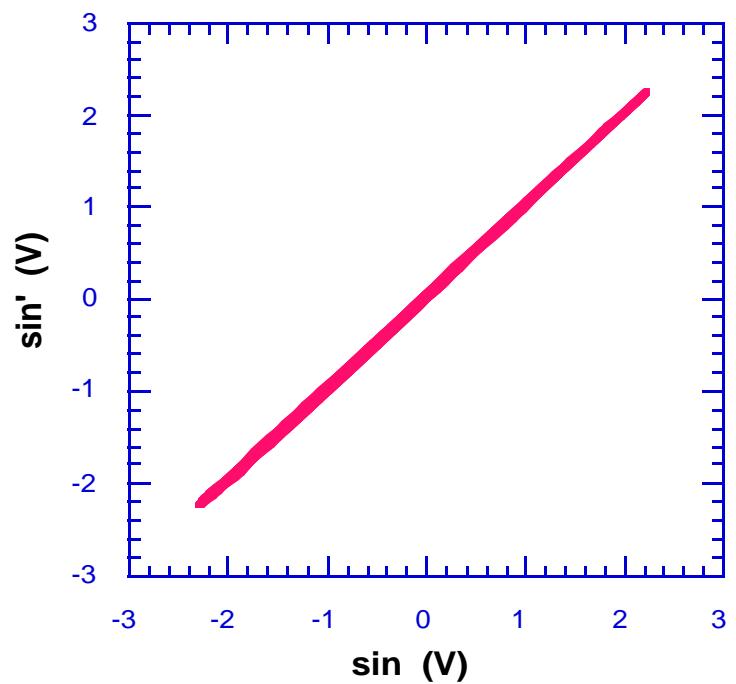
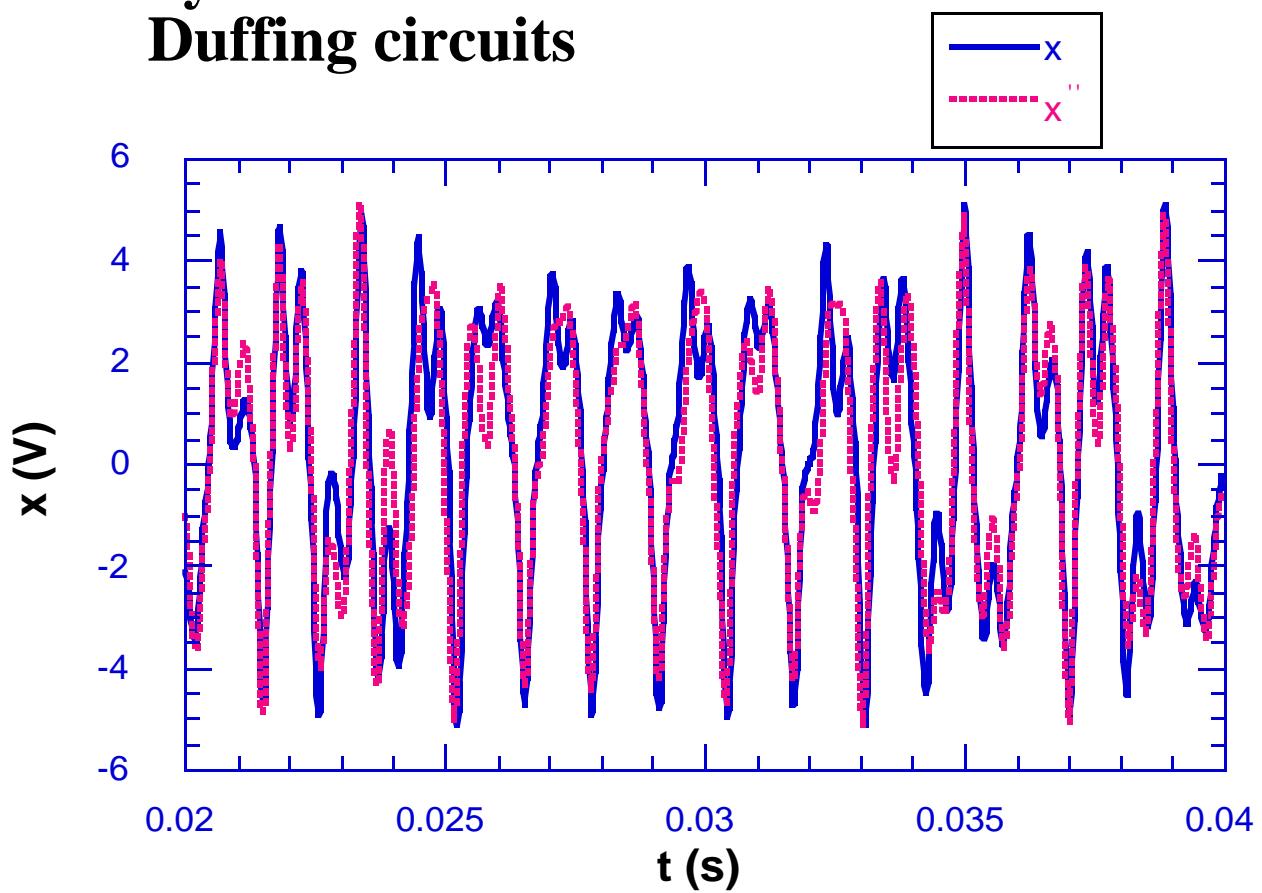
4-D Duffing Circuit



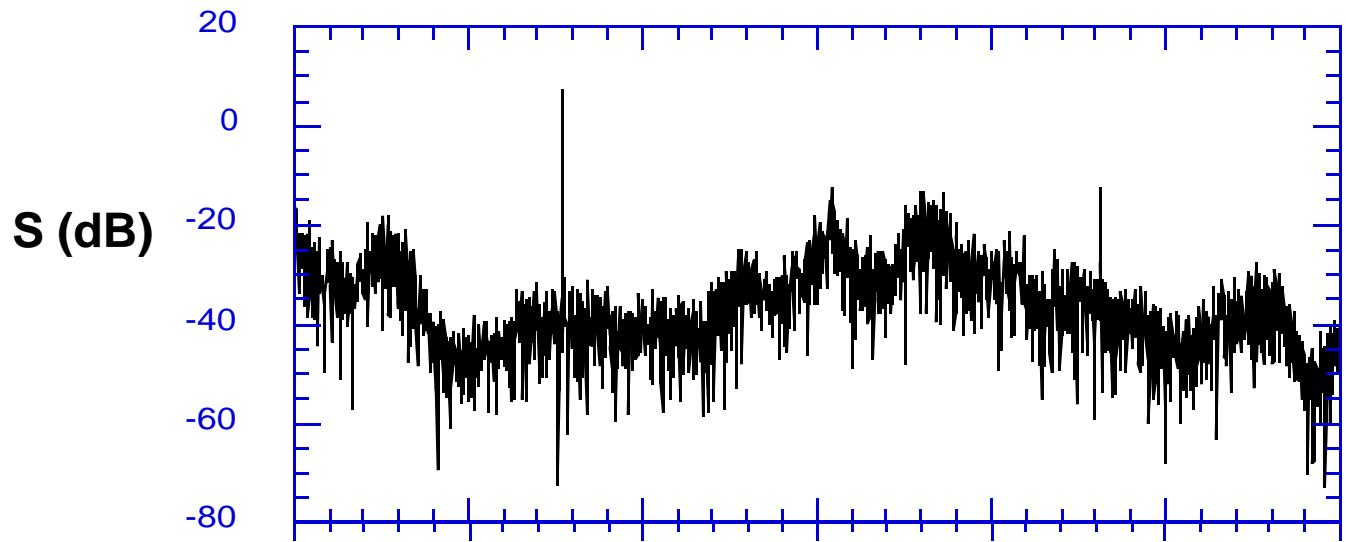
Synchronizing nonauto circuits



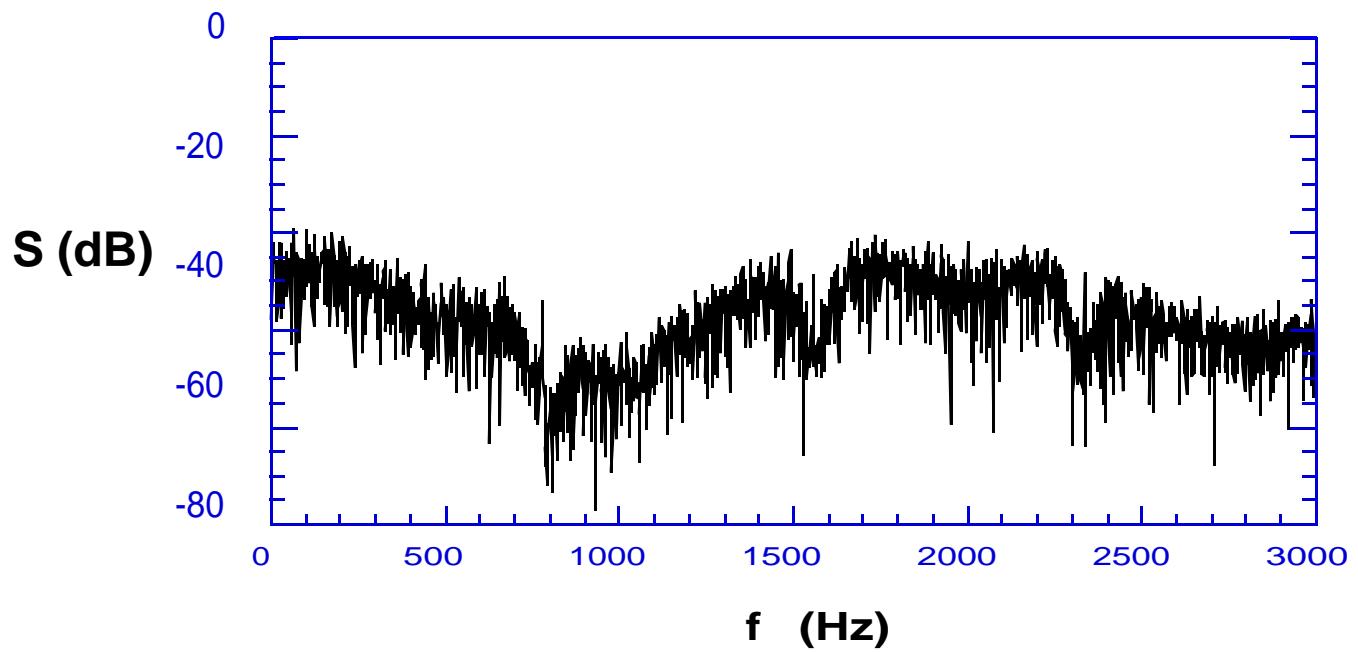
Synchronization of 4-D Duffing circuits



Duffing spectrum unfiltered



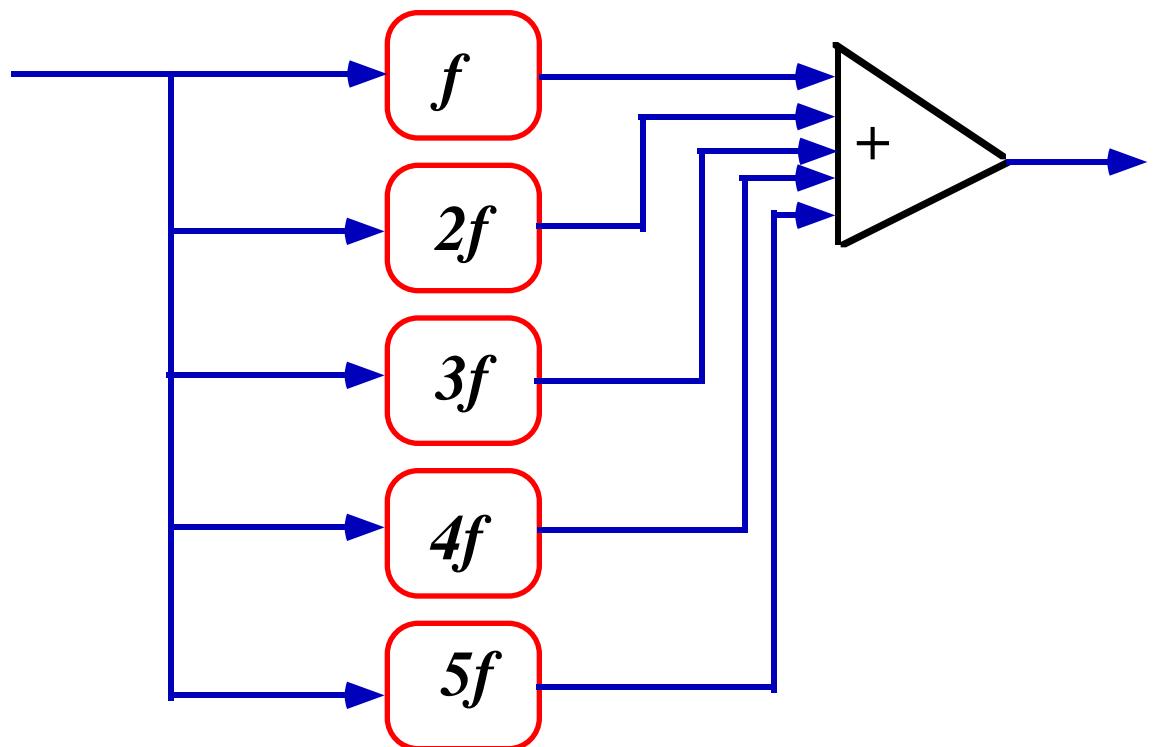
Duffing spectrum filtered



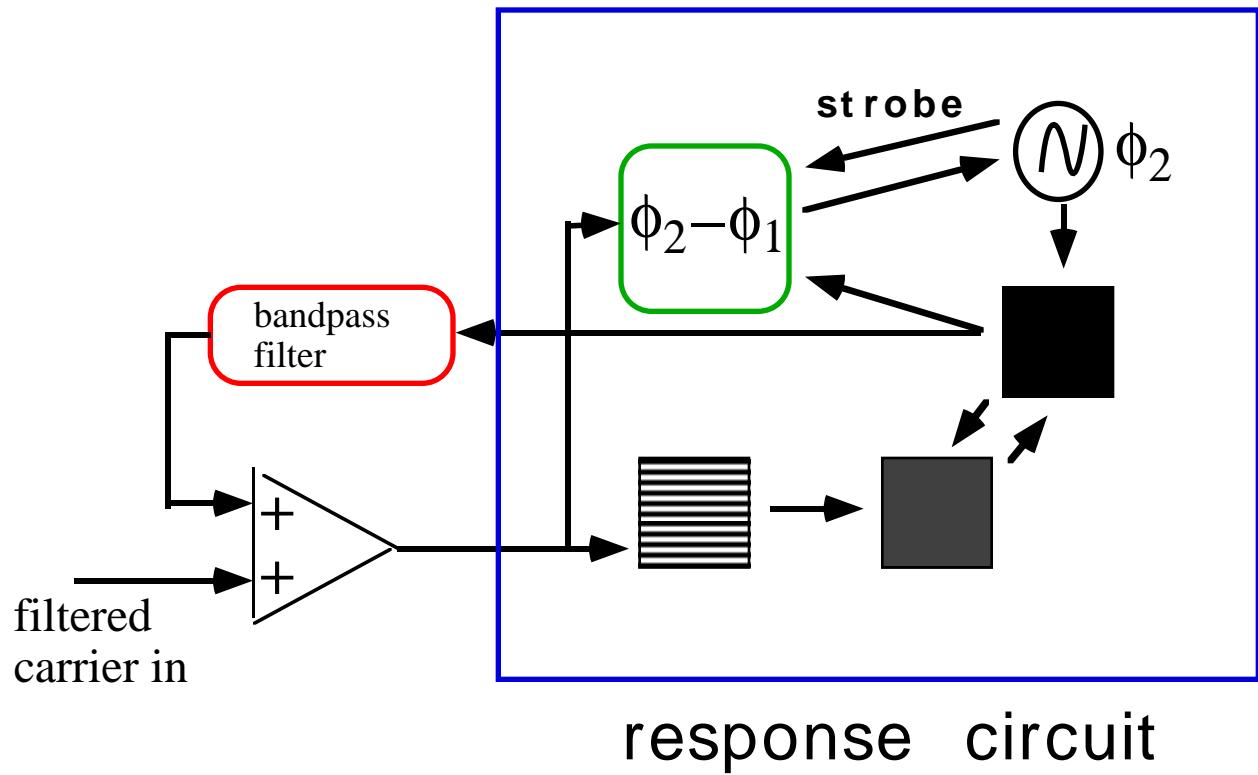
Filtering Duffing Signal



inside bandpass filter:



Reconstructing Chaotic Signal



Full circuit equations

$$\frac{dx}{dt} = \beta(y - z)$$

$$\frac{dy}{dt} = \beta(-\Gamma_y y - g(x) + \alpha \cos(\omega t) + A) \quad \text{drive}$$

$$\frac{dz}{dt} = \beta(f(x) - \Gamma_z z)$$

$$\frac{du_i}{dt} = \frac{-2.0}{R_{i2}C} u_i - \frac{1}{R_{i2}C} \left(\frac{1}{R_{i3}C} + \frac{1}{R_{i1}C} \right) v_i - \frac{1}{R_{i1}C} \frac{dx}{dt}$$

$$\frac{dv_i}{dt} = u_i$$

$$x_t = x + \sum_{i=1}^5 v_i \quad \underline{x_t \text{ is transmitted carrier signal}}$$

$$x_d = x_t - \sum_{i=1}^5 r_i$$

$$\frac{dq_i}{dt} = \frac{-2.0}{R_{i2}C} q_i - \frac{1}{R_{i2}C} \left(\frac{1}{R_{i3}C} + \frac{1}{R_{i1}C} \right) r_i - \frac{1}{R_{i1}C} \frac{dx''}{dt}$$

$$\frac{dr_i}{dt} = q_i$$

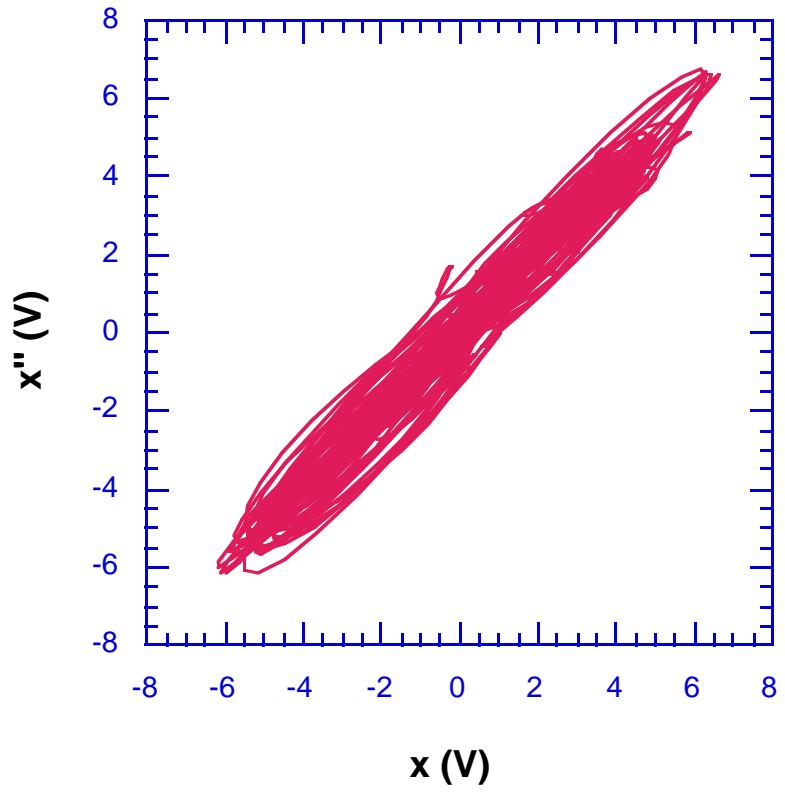
$$\frac{dz'}{dt} = \beta(f(x_d) - \Gamma_z z')$$

$$\frac{dx''}{dt} = \beta(y'' - z')$$

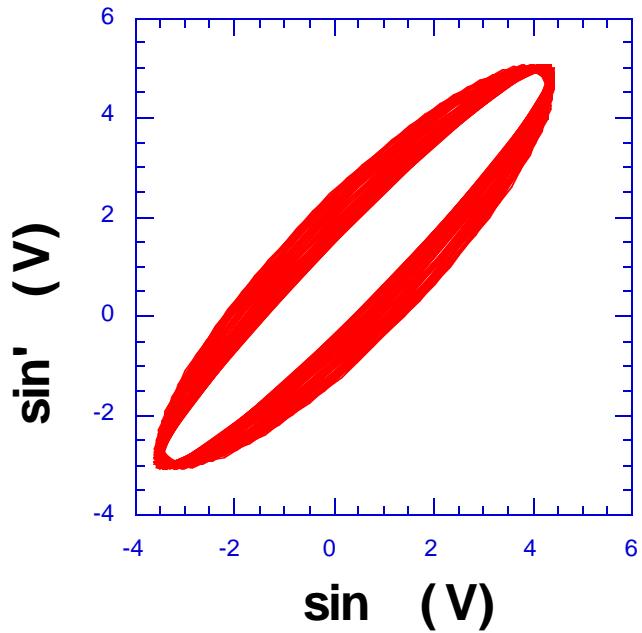
response

$$\frac{dy''}{dt} = \beta(-\Gamma_y y'' - g(x'') + \alpha \cos(\omega_r t + \phi_r) + A)$$

synchronization



Phase synchronization



Signal Separation

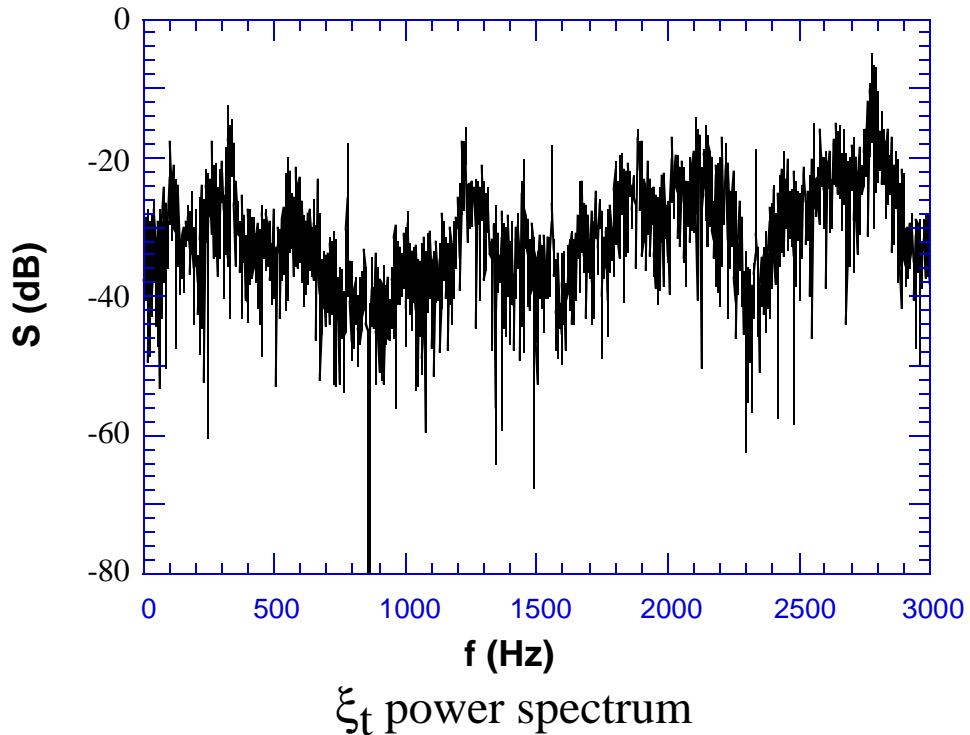
add signal from a different Duffing circuit

Same drive frequency: independent phase

$$\frac{d\xi}{dt} = 10^4 \psi$$

$$\frac{d\psi}{dt} = 10^4(\beta \cos(\omega t + \phi_2) + A_2 - 0.256\psi - \xi^3)$$

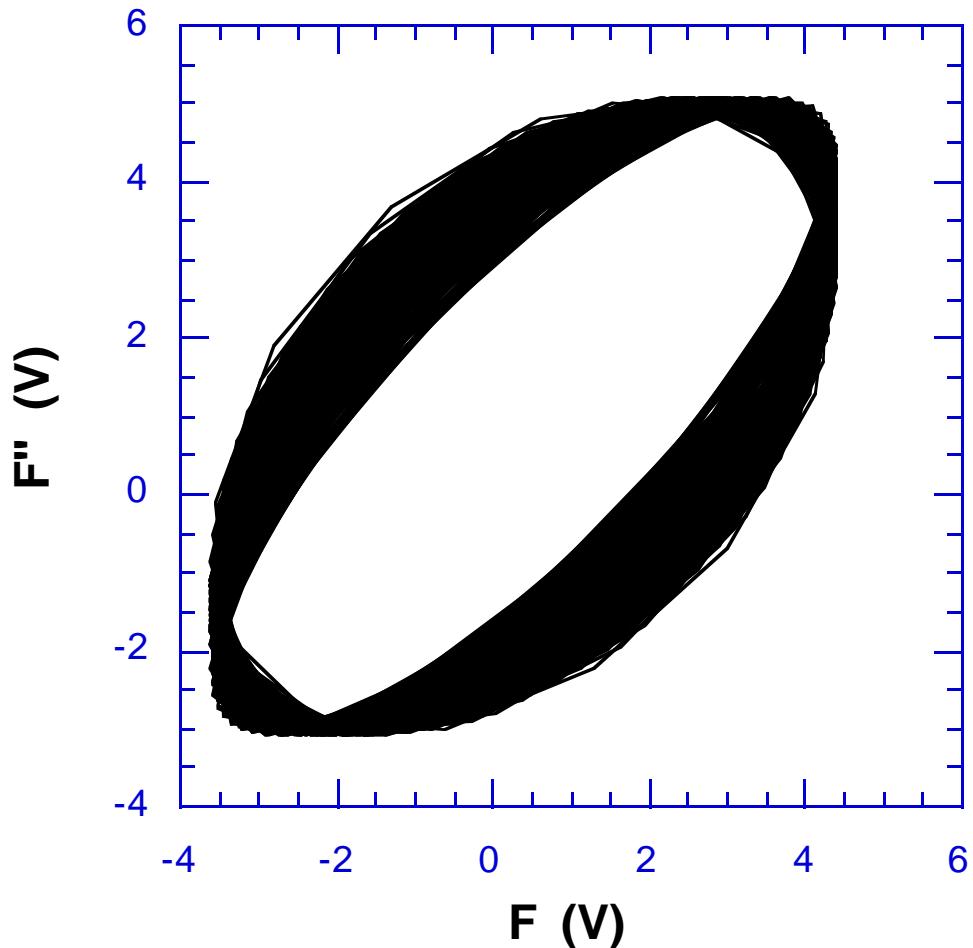
filter ξ to produce ξ_t and add to x_t



ξ_t acts as deterministic in band noise: hard to separate

Signal to noise 1:1

Constant phase offset, but little drift



**If only wrong signal present,
no synchronization**

Review

Drive-Response synchronization:

$$\frac{dx}{dt} = F(x, y, z), \quad \frac{dy}{dt} = G(x, y, z), \quad \frac{dz}{dt} = H(x, y, z)$$

response:

$$\frac{dy'}{dt} = G(x, y', z'), \quad \frac{dz'}{dt} = H(x, y', z')$$

if all Lyapunov exponents <0, $y' \rightarrow y, z' \rightarrow z$

Cascading:

$$\frac{dx''}{dt} = F(x'', y', z'), \quad \frac{dz''}{dt} = H(x'', y', z')$$

If all Lyapunov exponents < 0, then $x'' \rightarrow x$

**Can communicate by varying a parameter,
so $x'' = x$ or $x'' \neq x$**

Review

Synchronous substitution:

$$\frac{dx}{dt} = F(x, y, z), \quad \frac{dy}{dt} = G(x, y, z), \quad \frac{dz}{dt} = H(x, y, z)$$

transmit $w = T(x, y, z)$

at response: use response variables to invert T:

$$\tilde{x} = T^{-1}(w, y', z')$$

$$\frac{d\tilde{x}}{dt} = F(\tilde{x}, y', z'), \quad \frac{dy'}{dt} = G(\tilde{x}, y', z'), \quad \frac{dz'}{dt} = H(\tilde{x}, y', z')$$

Choice of T affects stability of response

Review

General coupling scheme:

$$\frac{dx}{dt} = F(x, y, z), \quad \frac{dy}{dt} = G(x, y, z), \quad \frac{dz}{dt} = H(x, y, z)$$

Transmit $w = k_1x + k_2y + k_3z$

Response: $w' = k_1x' + k_2y' + k_3z'$

$$\frac{dx'}{dt} = F(x', y', z') + b_1(w - w')$$

$$\frac{dy'}{dt} = G(x', y', z') + b_2(w - w')$$

$$\frac{dz'}{dt} = H(x', y', z') + b_3(w - w')$$

**Vary k 's, b 's to minimize response
Lyapunov exponents.**

**First 2 schemes are special cases of this
general coupling.**

Review

Filtering autonomous chaotic systems:

$$w = k_1x + k_2y + k_3z$$

Transmit $w_f = \Phi(w)$, where Φ is a dynamical system (filter).

At response, $w' = k_1x' + k_2y' + k_3z'$

$$w'_f = \Phi(w')$$

Feedback $(w_f - w'_f)$ to synchronize response system.

Review

Synchronizing non-autonomous systems.

$$\frac{d\vec{x}}{dt} = F(x, y, z, \sin(\omega t + \phi_1))$$

response:

$$\frac{d\vec{x}'}{dt} = F(x, y', z', \sin(\omega t + \phi_2))$$

then $x - x'$ is proportional to

$$(\phi_1 - \phi_2) \sin(\omega t + \theta)$$

Filter at ω , sample, integrate, and correct response phase using frequency modulation.

Review

Filtering nonautonomous signals:

$$\frac{d\vec{x}}{dt} = F(x, y, z, \sin(\omega t + \phi_1))$$

Filter out periodic components of transmitted signal:

$x_f = x - \Phi(x)$, where Φ is a bandpass filter

At response, $x'_{\phi} = \Phi(x')$

Drive response with

$$\tilde{x} = x_f + x'_{\phi} = x - \Phi(x) + \Phi(x')$$

Result is phase sync of sine oscillators by broad-band signal. Very noise resistant.

Non-self-synchronous systems

- **Problems with self-synchronous systems:**

noise added to reference signal- is it possible to use when $S/N < 1$? (no processing gain)

Distortion: filtering may be irreversible, information lost.

Stable response system necessary: difficult when filters added.

Circuits must be well matched.

Extracting signals from noise

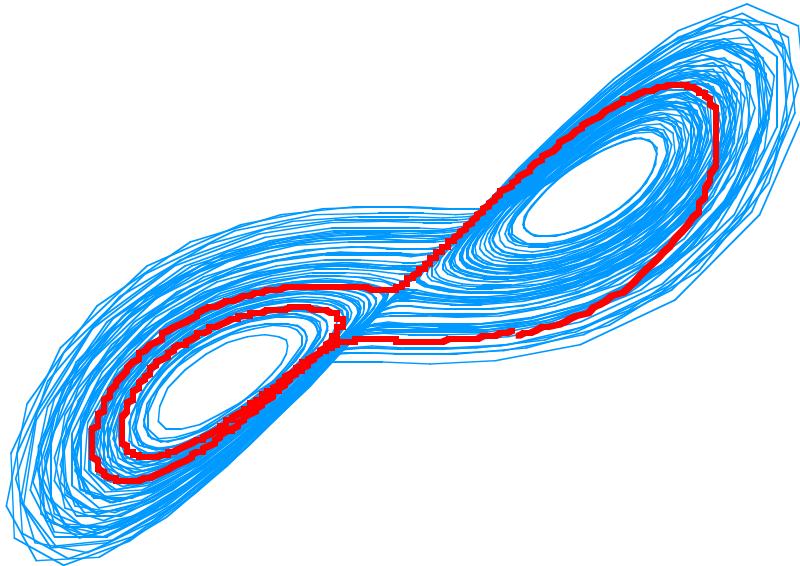
Must know something about signal.

Examples:

- **Periodic carrier-** know frequency
- **Direct sequence spread spectrum-** know pseudo-random sequence.
- **Deterministic signals:** presence of determinism used in some chaotic noise reduction methods.

For a known chaotic attractor, we do know the unstable periodic orbits (UPO's)

Unstable periodic orbits



A chaotic attractor consists of an infinite number of UPO's.

If we know which UPO attractor is on at all times, we know attractor.

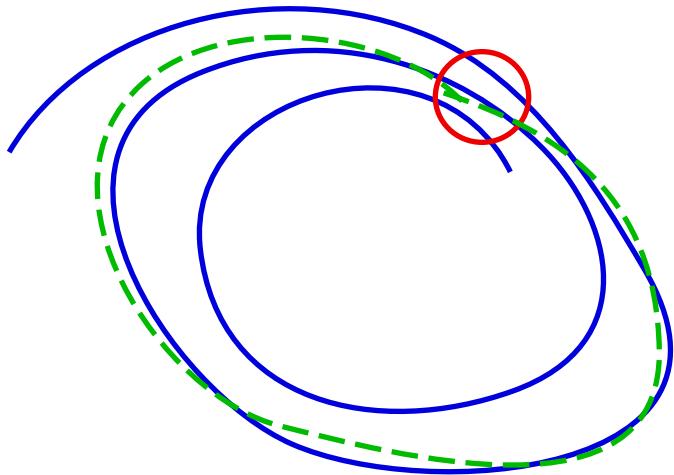
Finding UPO's

From equations of motion:

- Use Newton's method to find periodic solutions.

From data:

- Method of close approaches



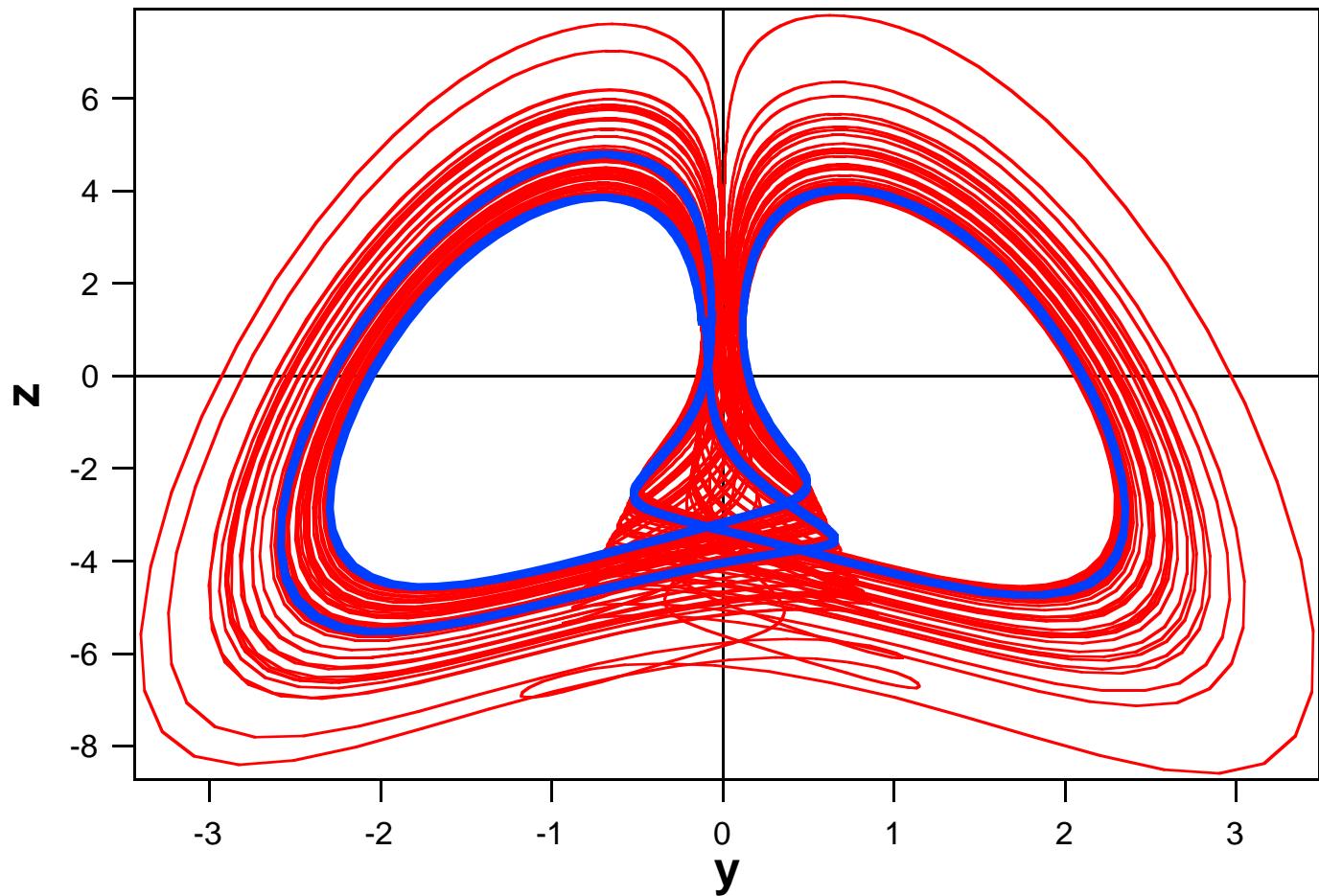
Look for multiple returns within some small radius.

Sprott system B

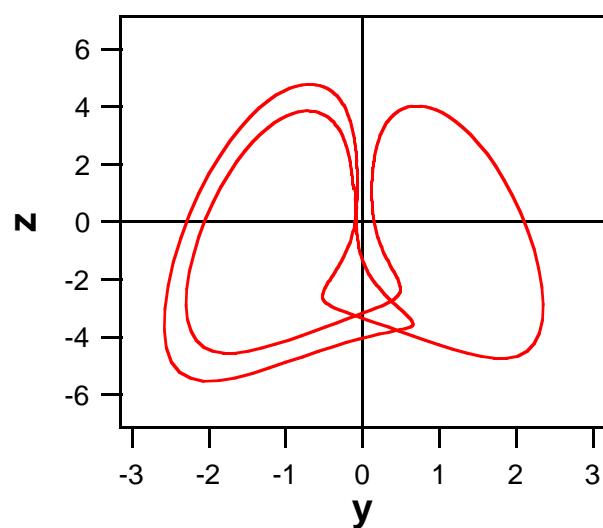
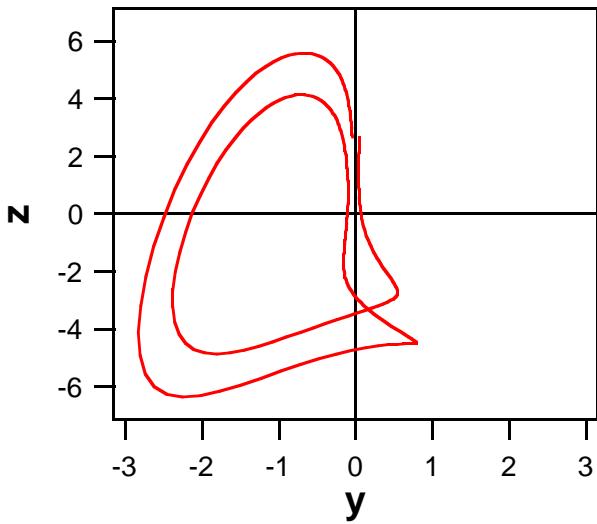
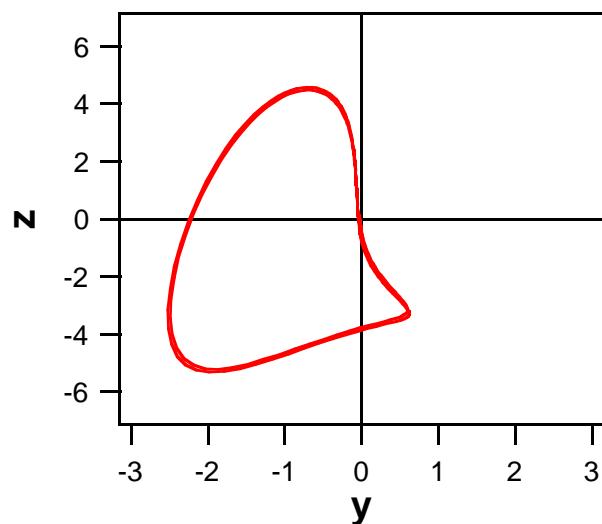
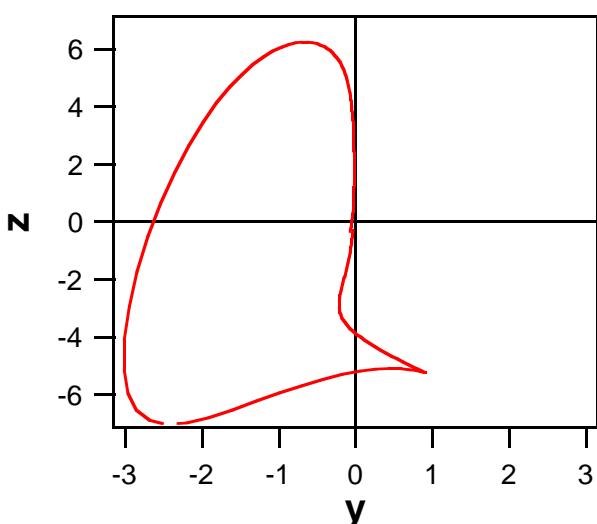
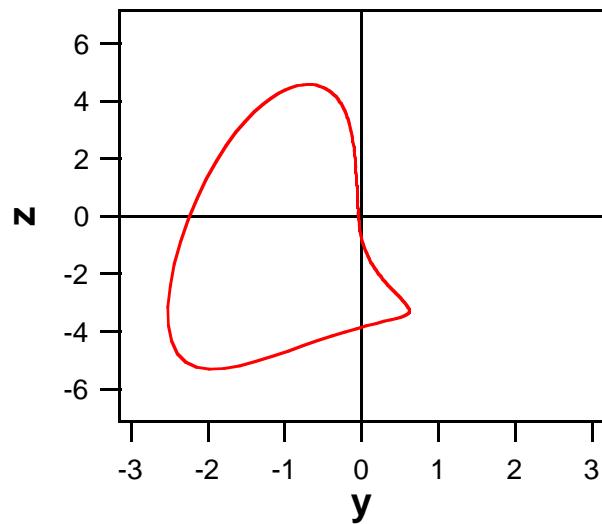
$$\frac{dx}{dt} = 0.4yz$$

$$\frac{dy}{dt} = x - 1.2y$$

$$\frac{dz}{dt} = 1 - xy$$



Typical UPO's from Sprott system B



Unstable periodic orbits

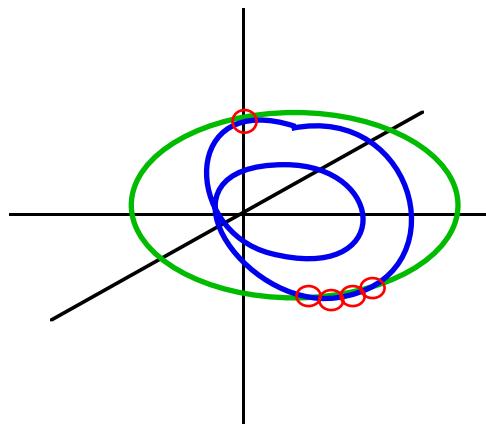
Infinite number of orbits, but dynamics dominated by low period orbits.

Can create an approximation to the attractor by using only a finite set of low period orbits.

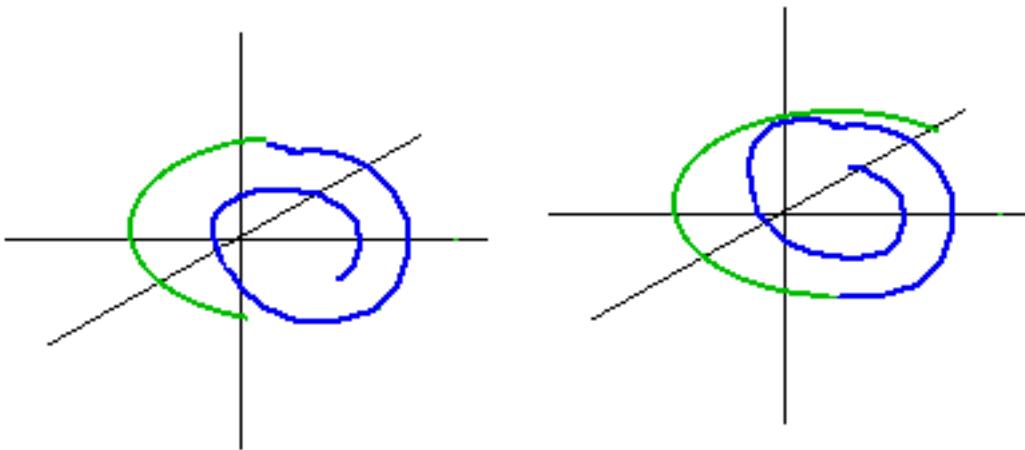
UPO Approximation technique

- 1. Extract UPO's up to a given length from a chaotic attractor.**
- 2. Construct all possible sequences of motion based on this set of UPO's. Truncate sequences to a fixed length L**
- 3. Take segment of length L from time series. Compare to each UPO sequence. Choose best fit to approximate time series.**
- 4. Repeat 3**
- 5. Build histogram, truncate set of UPO's**
- 6. Combine UPO sequences for length of 2L, 3L, etc, if necessary**

Creating UPO sequences

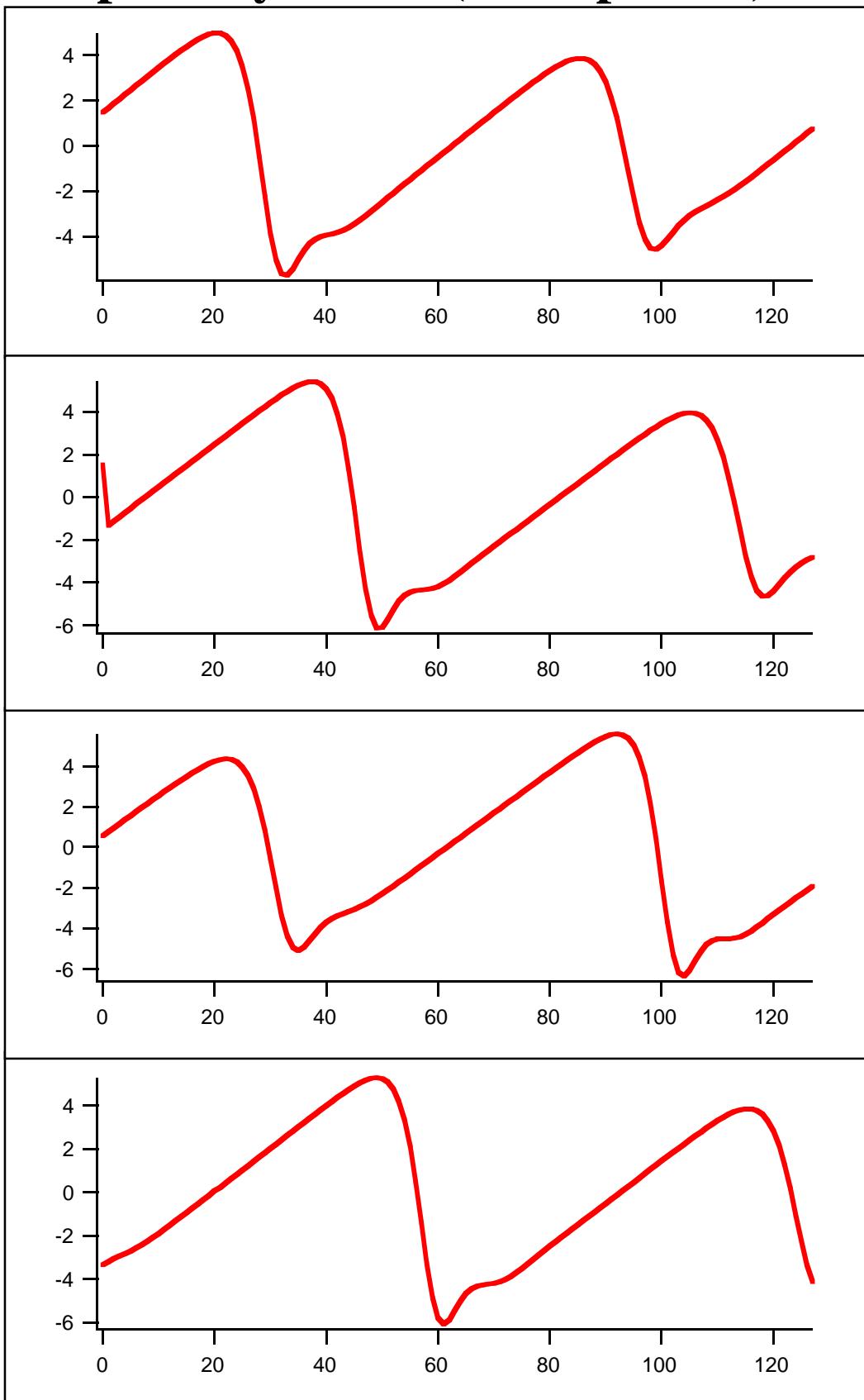


Decide which UPO's can follow each other: x, y , and z must come within some tolerance ε of each other.

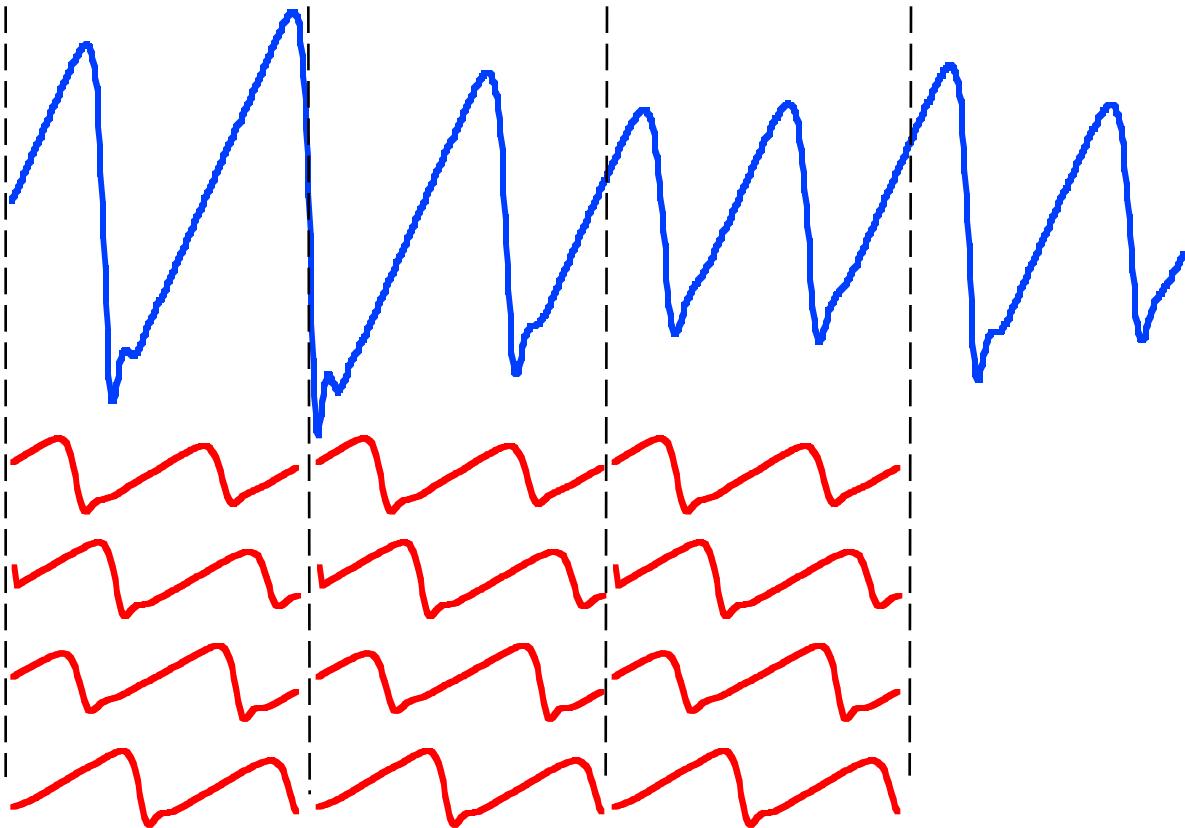


Construct all possible sequences for a fixed length L

Typical UPO sequences of length 128 for Sprott System B (z component)

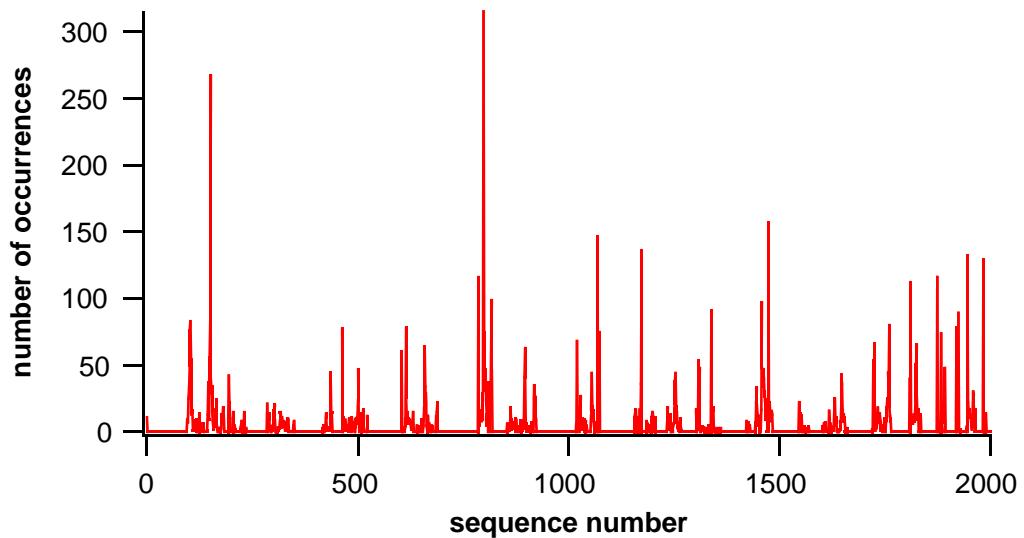


Correlate with incoming signal:

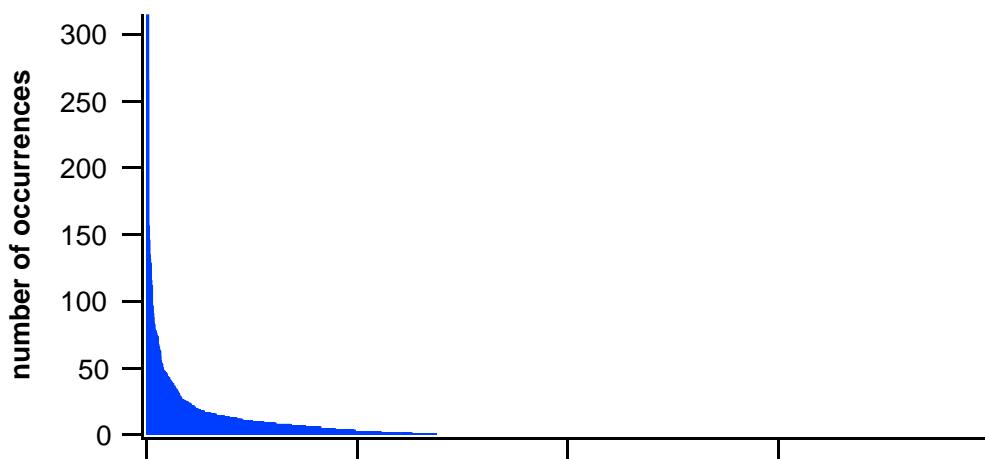


Compare each 128 point sequence. At each interval, choose sequence with largest cross correlation.

Histogram of 128 point sequences (1992 sequences)



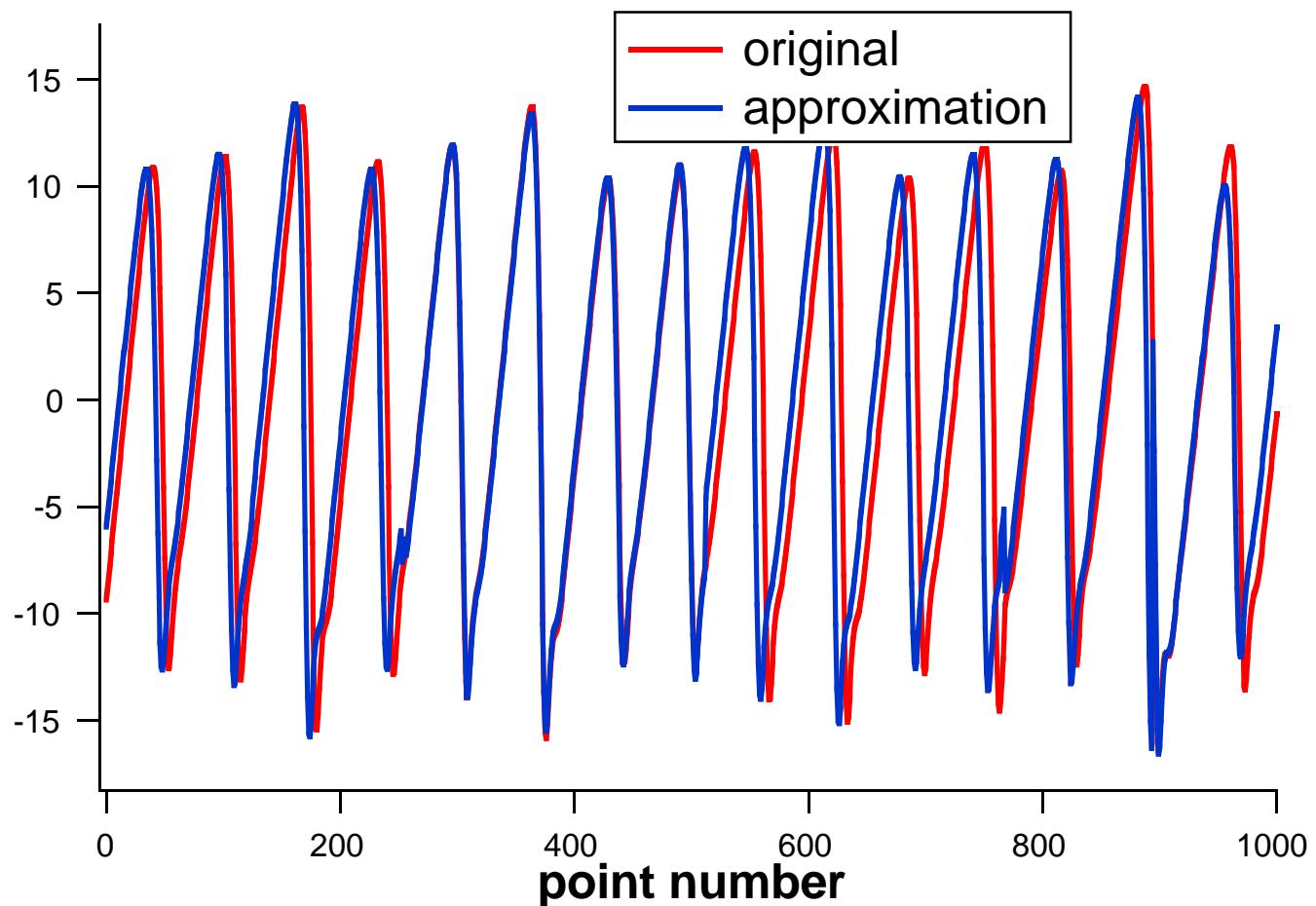
Sorted by number of occurrences



274 sequences occur more than 10 times

combine 128 point sequences for 256 point sequences

keep 1162 sequences

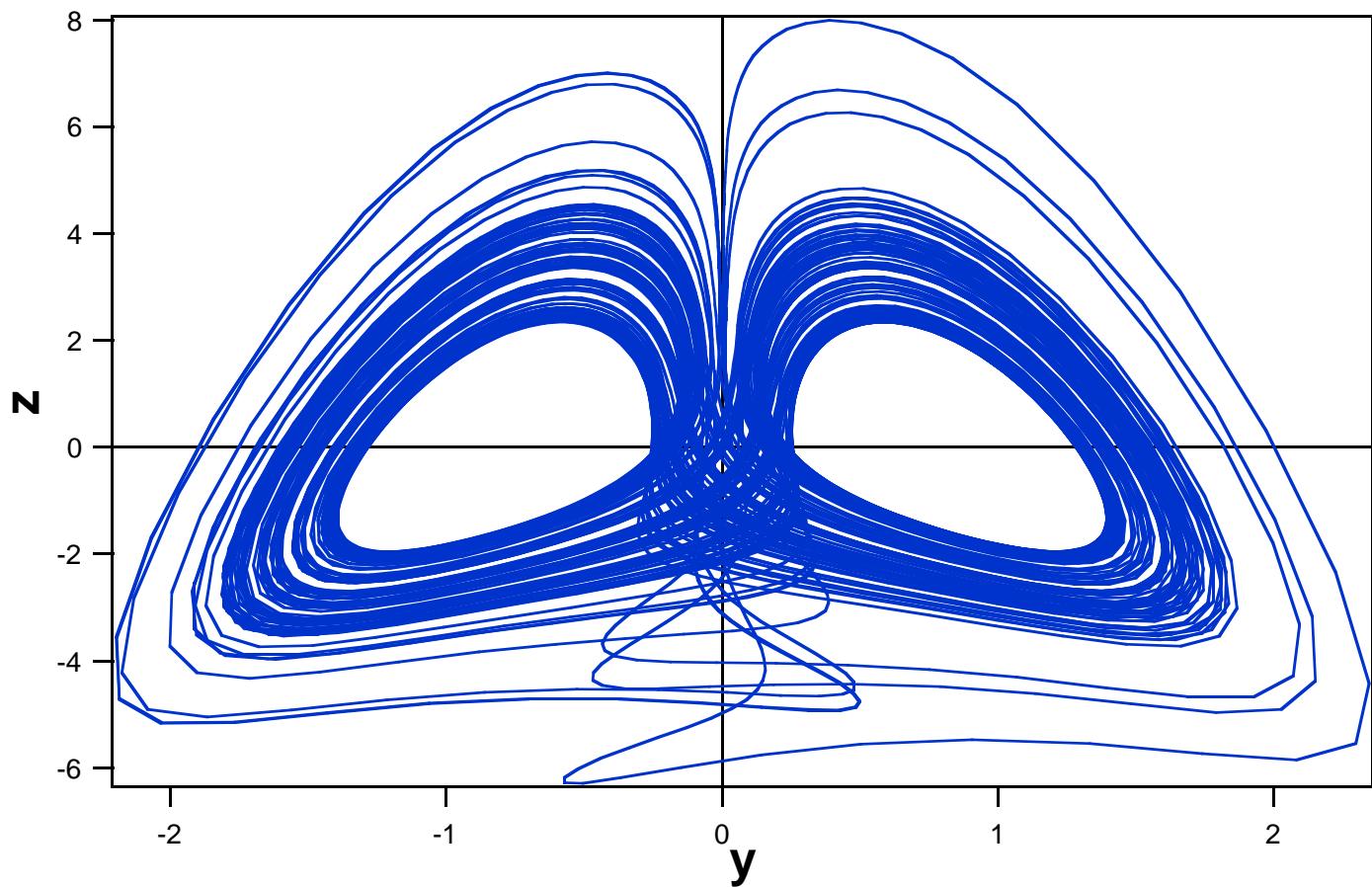


Sprott system C

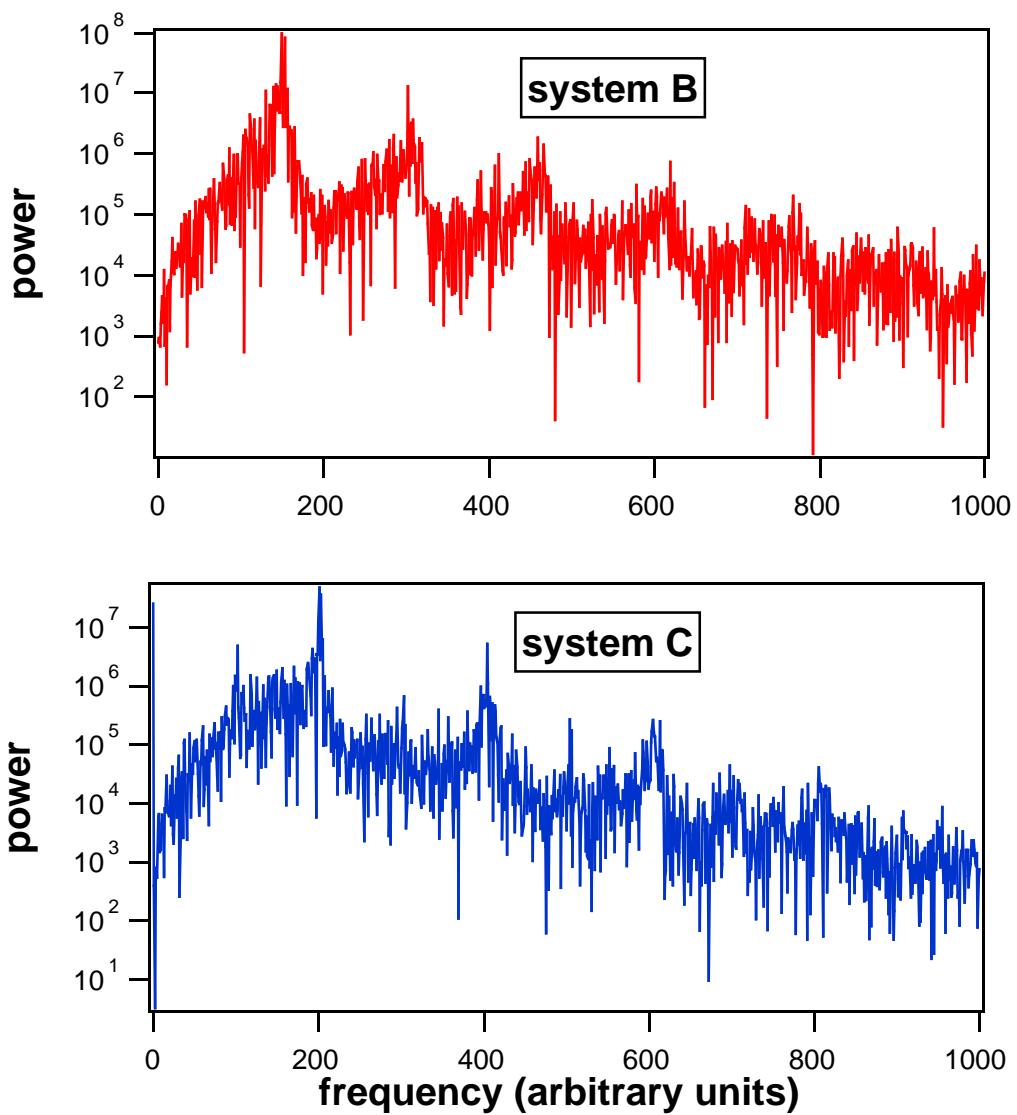
$$\frac{dx}{dt} = 0.4yz$$

$$\frac{dy}{dt} = x - 1.2y$$

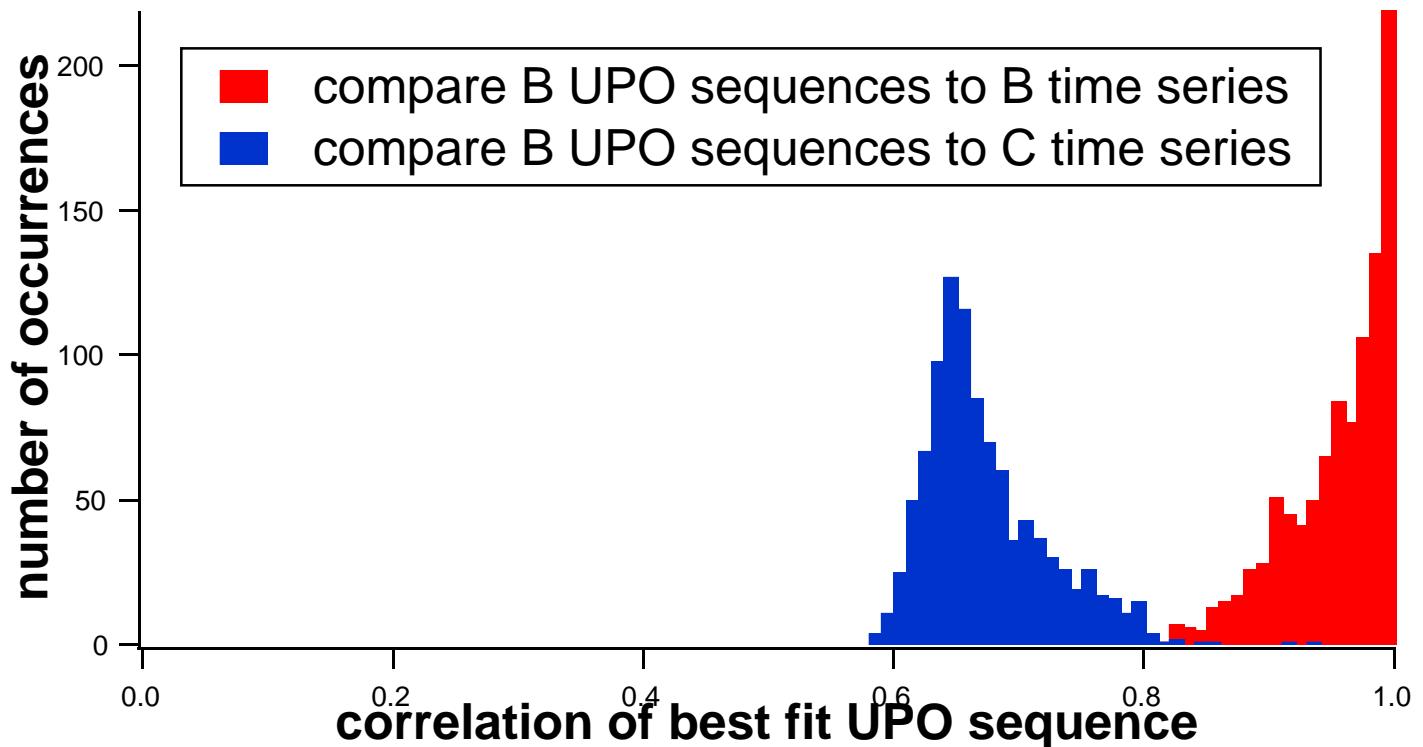
$$\frac{dz}{dt} = 1 - x^2$$



Power spectra for systems B,C (adjust time constants so spectra match)

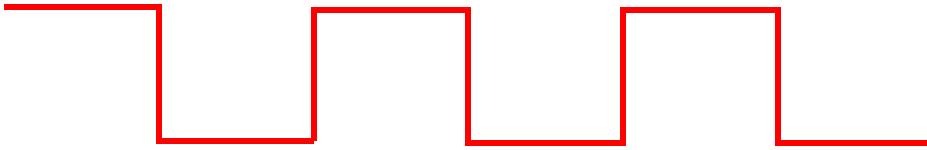


**Try to fit system C time series
with system B UPO sequences:
histogram of correlations.**



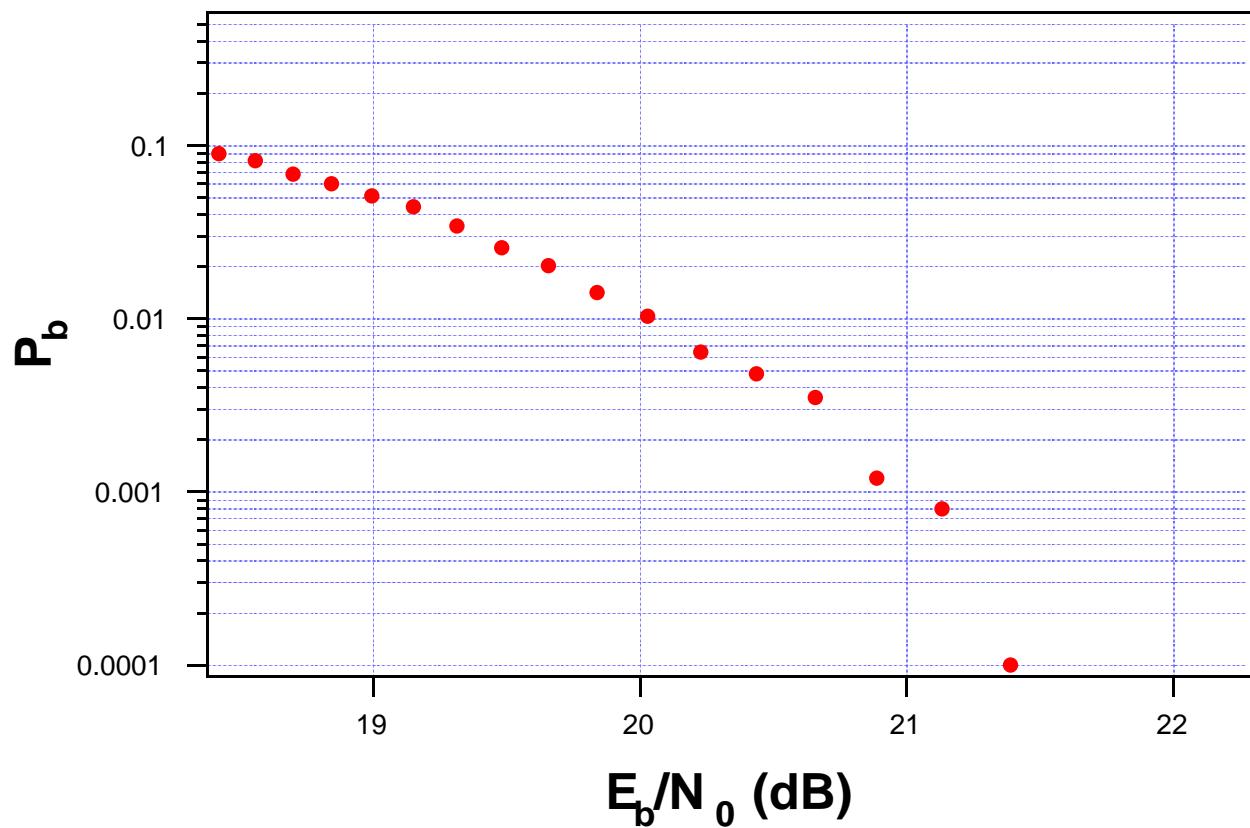
Communication

- Multiply time series by ± 1

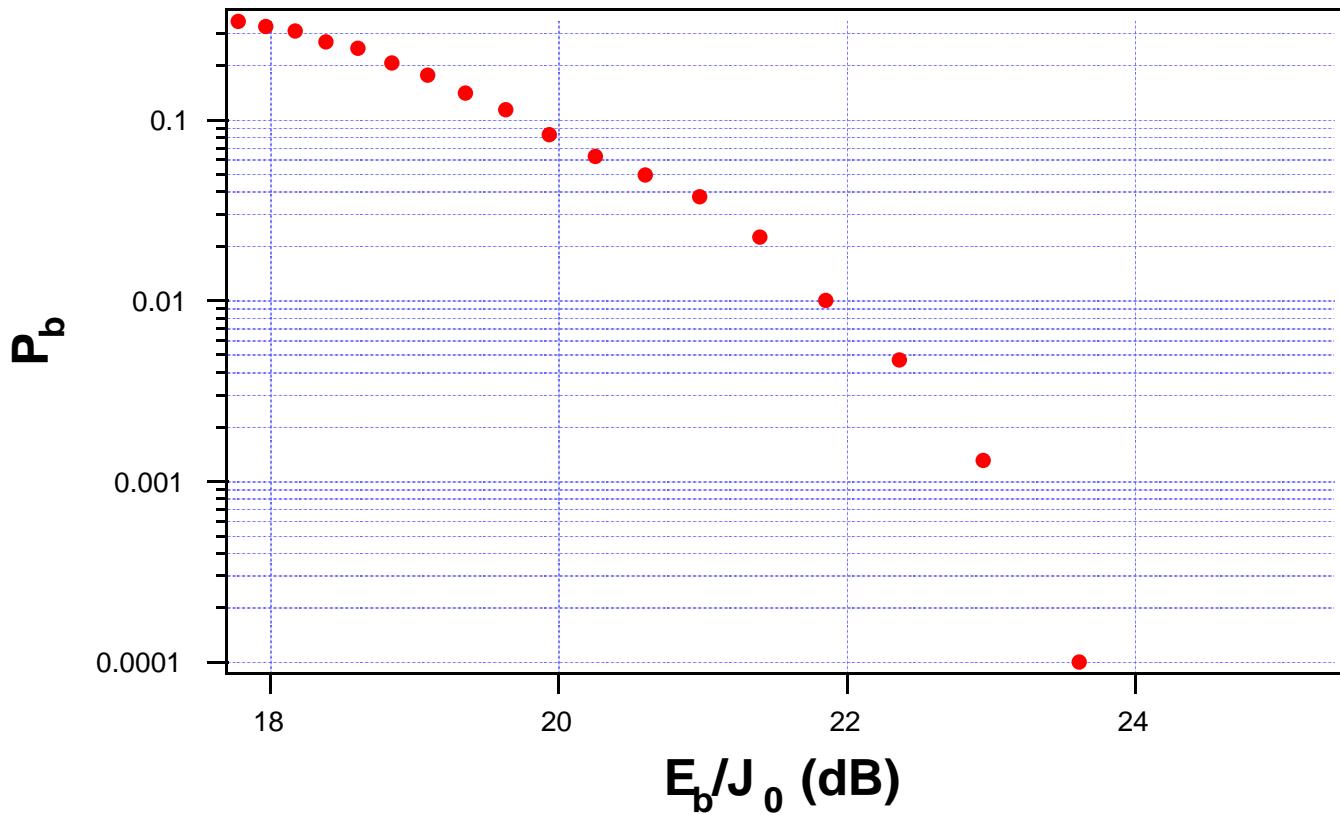


- Add noise or other chaotic signal.
- Use cross-correlation to find best fit UPO sequence: reveals if + or - 1 was sent.
- Estimate bit error probability: what is the probability of detecting +1 when -1 was sent, and vice versa.
- Bit error probability of 0.5 means no knowledge

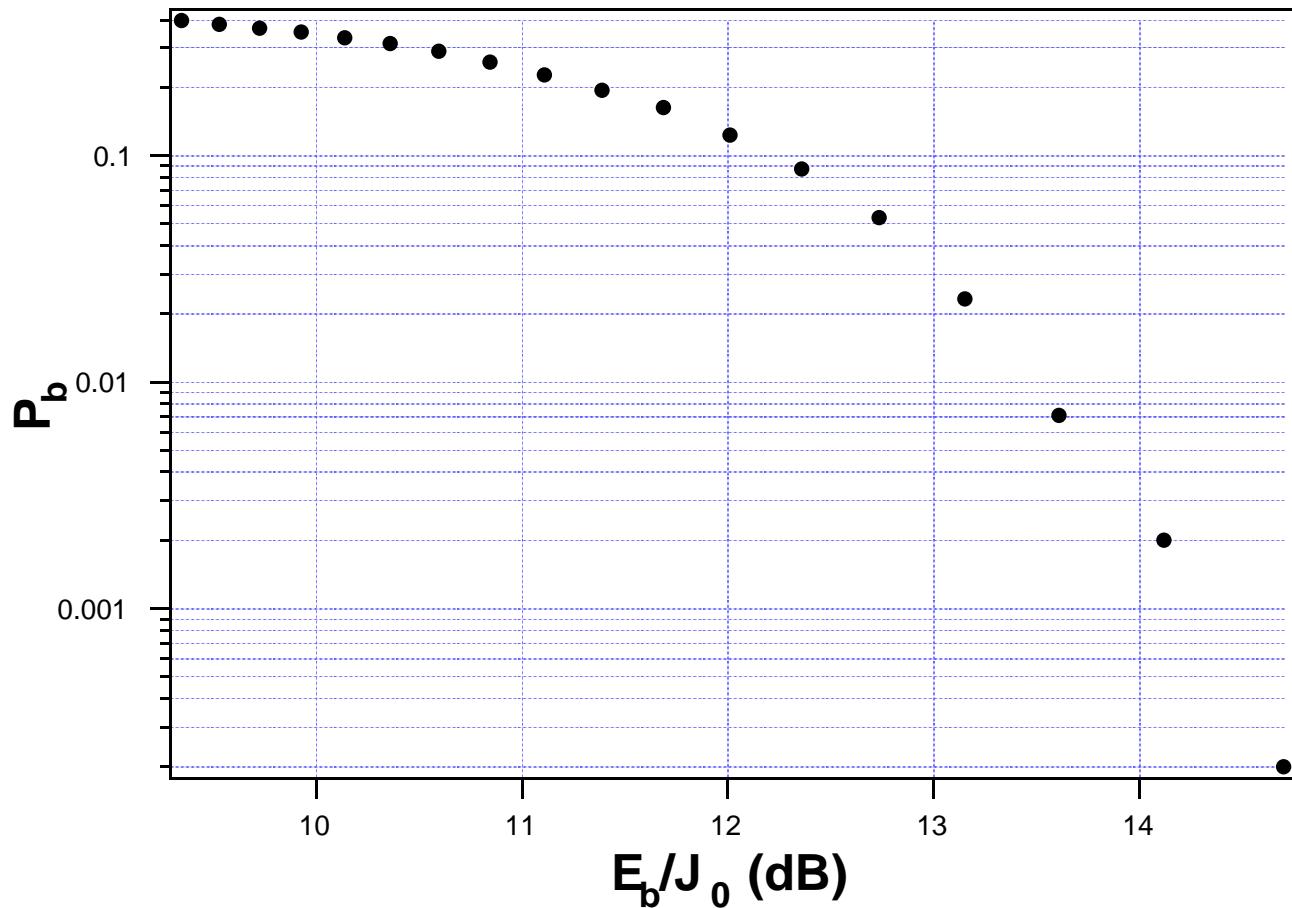
Performance for Sprott system B with white noise



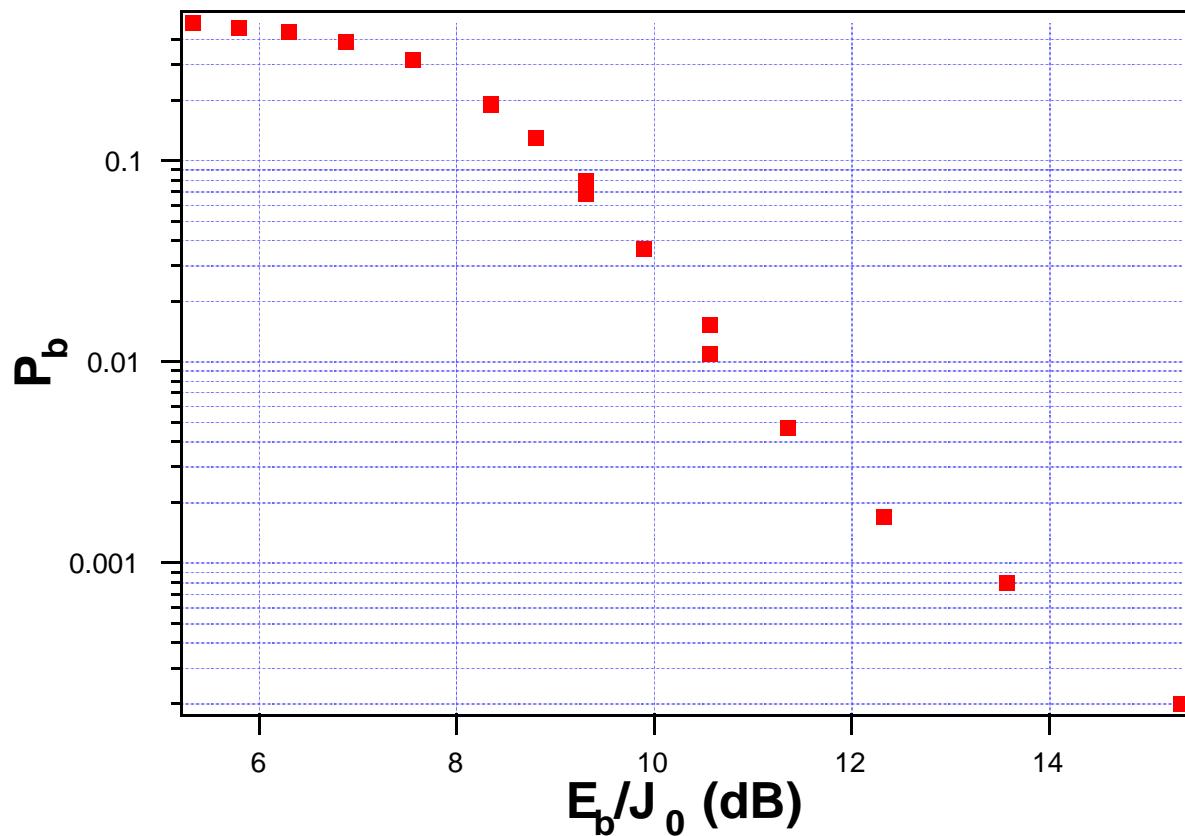
Performance of Sprott system B with Sprott system C



Performance with noise from Lorenz equations



Performance of Logistic map with noise from a 3-D linear map



Using UPO's to overcome distortion

Simulate distortion with a 2nd order band pass filter:

$$A(\omega) = \frac{j\Omega}{Q(1 + j\Omega/Q - \Omega^2)} \quad \Omega = \omega/\omega_c$$

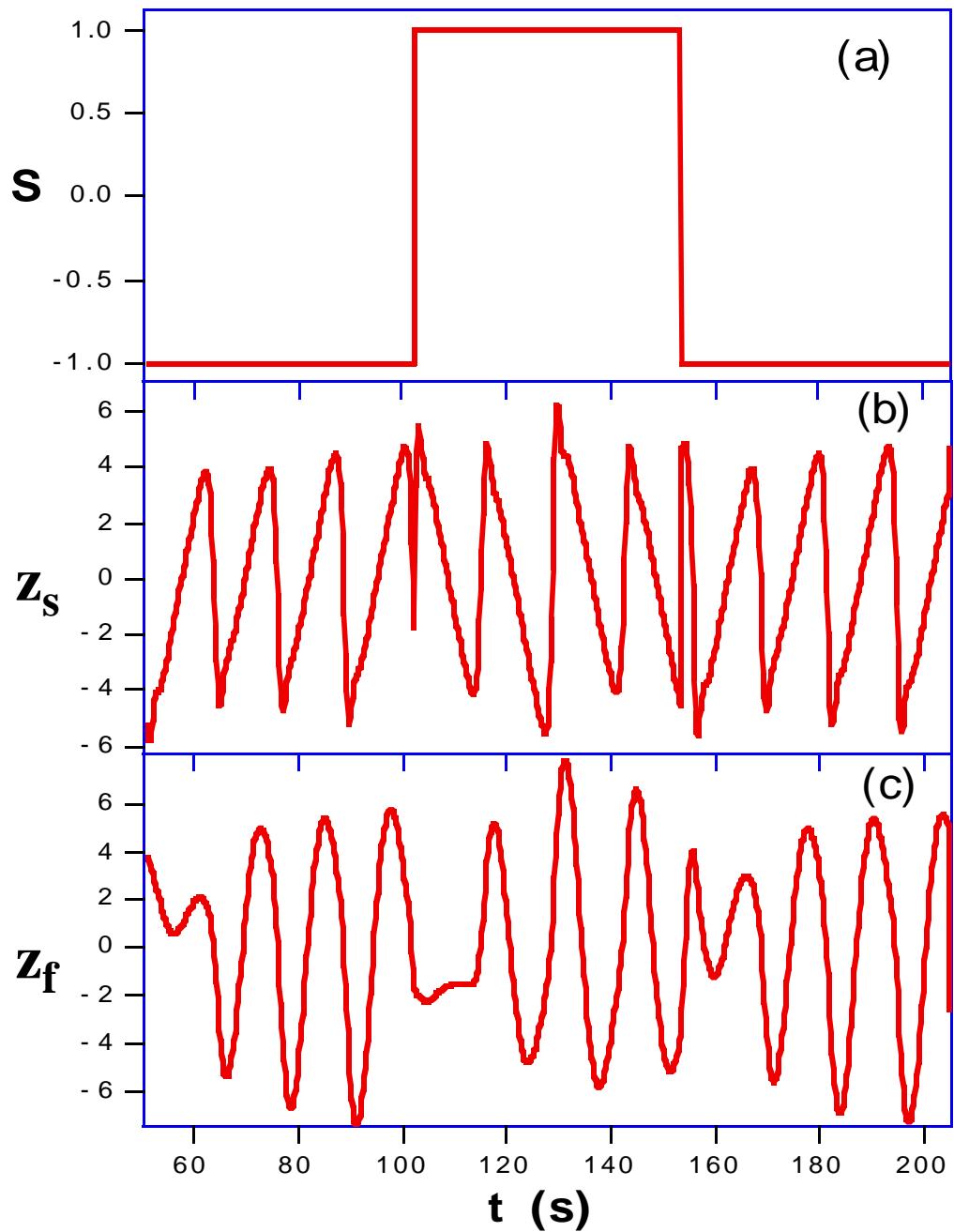
Modulate signal from Sprott system B as before.

Filter with bandpass filter.

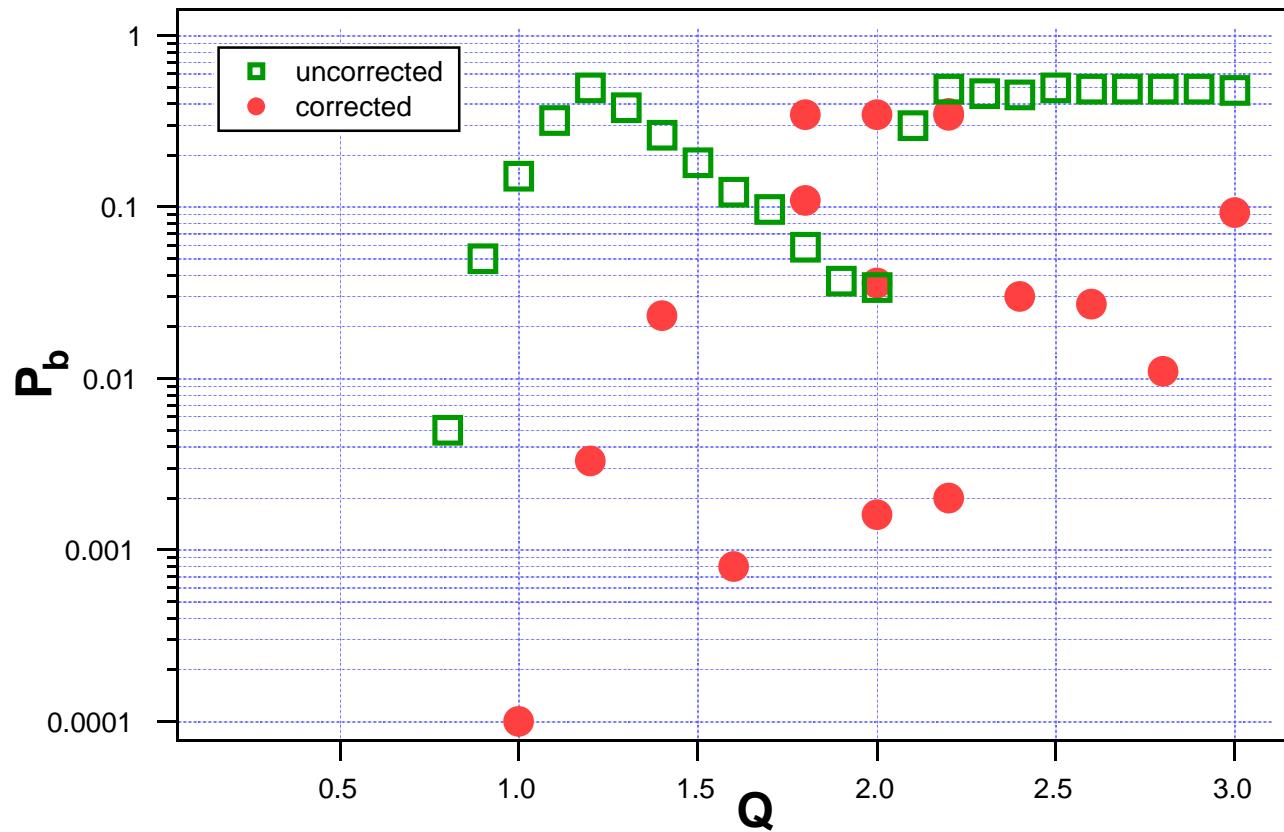
Compare to UPO sequences as before, but first filter with bandpass filter, where ω_c and Q are adjustable parameters.

Vary ω_c and Q during each comparison to get best cross correlation

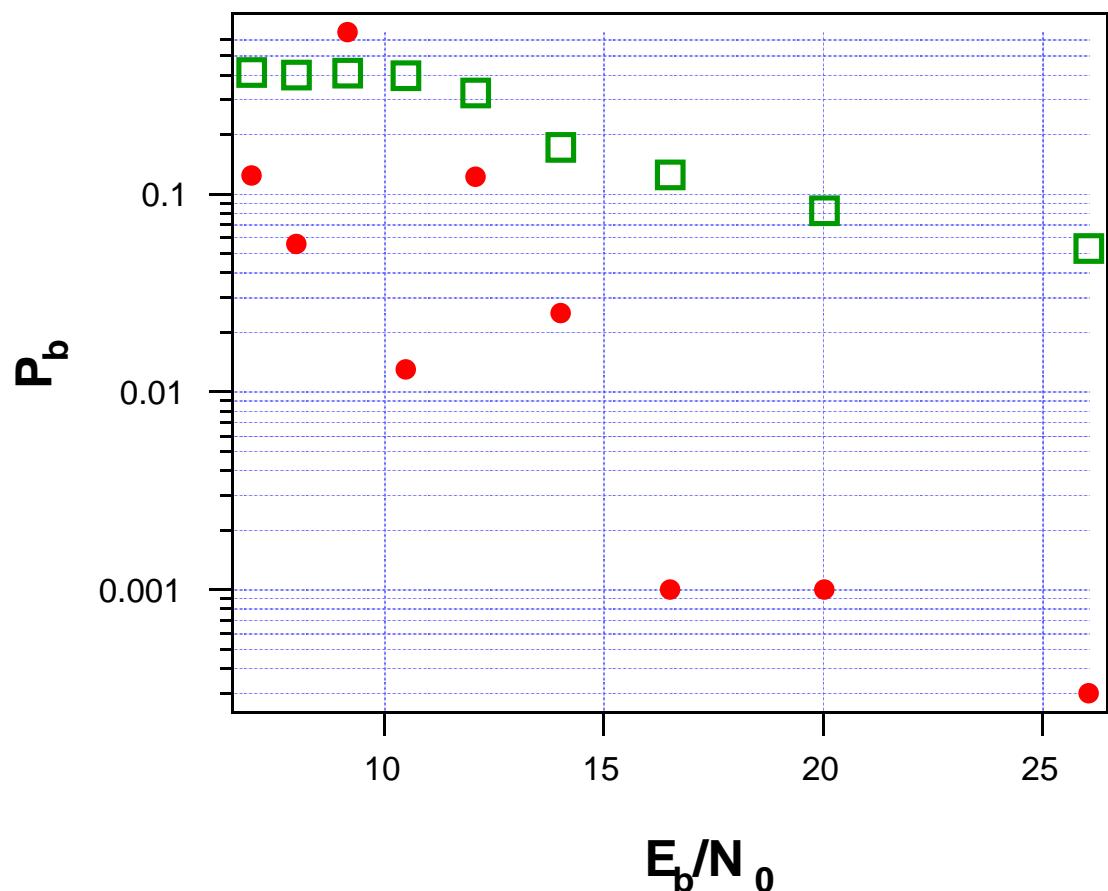
$$Q=2, \omega_c = 0.5$$



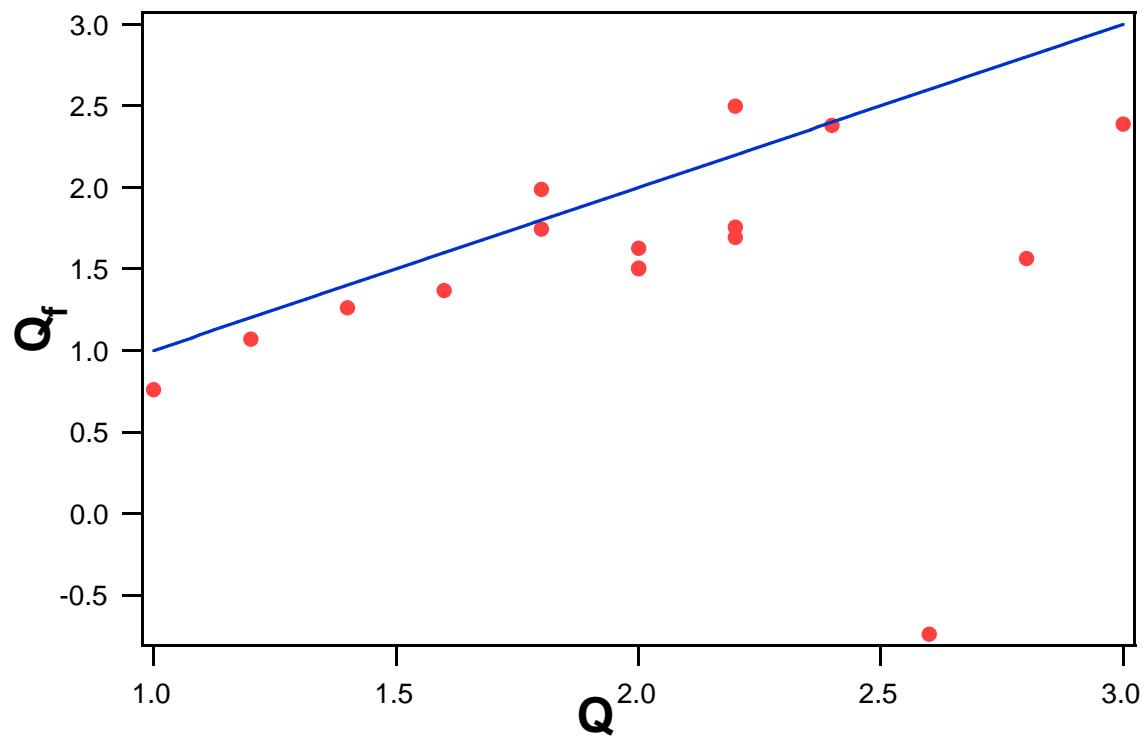
Performance vs filter Q uncorrected and corrected



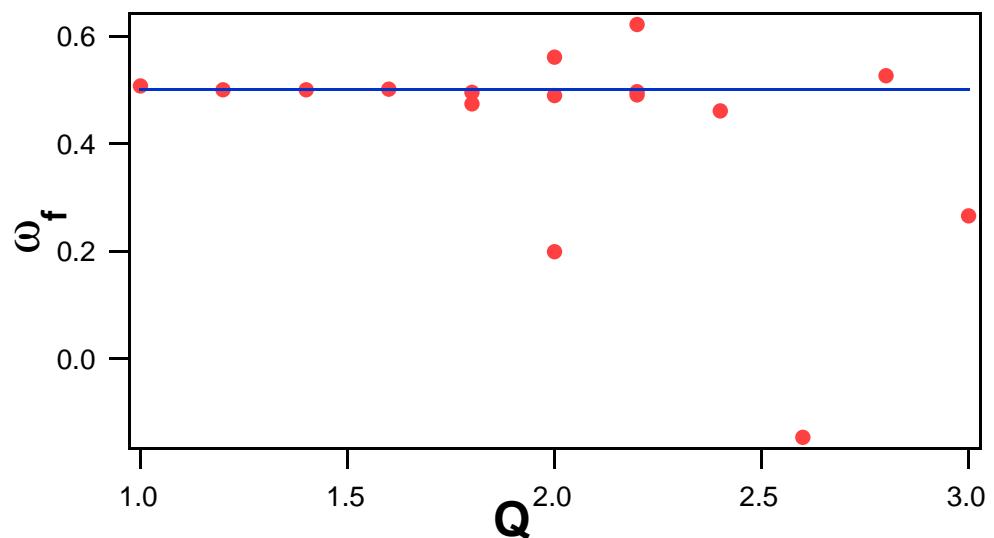
Performance in white noise uncorrected and corrected



Fitted Q vs actual Q (no noise)



Fitted frequency vs actual Q (no noise)



Review

Possible to approximate chaotic signal with UPO's.

Degree of approximation depends on amount of computation.

Works best with dissimilar chaotic signals.

Big Problem:
Searching through UPO sequences is slow

Future questions

- What is minimum SNR for self sync?
- Are there properties of chaotic signals that are preserved under heavy filtering?
- How can properties of Dynamical Systems be used to improve communications?
- Can chaos do anything better? Are we trying to force chaos into the wrong application?