# SYSC 512 Quantitative Methods of Systems Science

Portland State University

Credits: 4

Instructor: Patrick Roberts

Time and Location

Mon. & Wed. 4:00-5:50 Harder House 104



Patrick Roberts: robertpa@ohsu.edu
Office: HH 03, Mon & Wed 1:00 PM -2:00 PM.

00\_SYSC512.psd

#### ScSy 512: Quantitative Methods of Systems Science

Class outline: (20 classes during 10 weeks.)

Class lectures will present examples of how quantitative methods are applied to systems. Homework excercises will focus on mathematical techniques.

Part I: Dynamics. (5 classes)

Key Ideas: Non-linear differential equations, continuous and discrete; Linearization, eigenvalues and eigenvectors; Stability and Lyapunov functions.

Part II: Optimization. (5 classes)

Key Ideas: First and second order conditions, Lagrange multipliers, variational calculus.

Part III: Uncertainty. (5 classes)

Key Ideas: Distributions for discrete and continuous random variables.

Bayes rule. Estimation and bias variance trade-off.

**Software**: The numerical exercises can be solved using your favorite software, but the *supported* package will be **Matlab**. PSU has a site license for on-campus use. **Octive** is a free software package that uses a syntax similar to Matlab.

#### Desired outcomes:

- 1. To help students understand how quantitative methods can be used to analyze, explain, predict, and control the behavior of systems.
- To provide students with hands-on experience using current research tools to investigate the concepts underlying these quantitative methods.
- 3. To help students to develop an intuition for the dynamics of simple and complex sytems.

02\_outcomes.psd

#### **Evaluation:**

- 1. Weekly homework: exercises using quantitative techniques (scored 0-1).
- 2. Exams, midterm and final (scored on a 0-4 scale). Final grade: 1/3 homework, 2/3 exams

**Text:** There will be 3 texts, one for each section of the course.

- Dynamical Systems with Applications using MATLAB (2004) Stephen Lynch
- Optimization Theory with Applications (1987) Donald A. Pierre
- Probability Theory: A Concise Course (1977) Y.A. Rozanov

I will also provide the sources I use for the lectures, and suggest further reading.

#### Class Website:

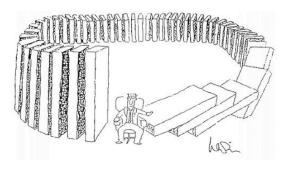
http://www.sysc.pdx.edu/classes/sysc512/

# Why quantify systems?

To understand To predict To control To manage

04\_why.png

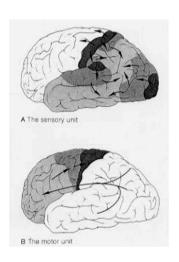
# Quantification: An important tool for research

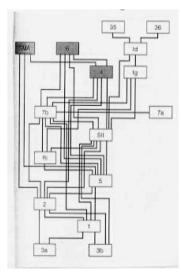


- Enhances our understanding
- Generates new hypotheses about interactions
- Allows us to test hypotheses
- Allows us to simulate models

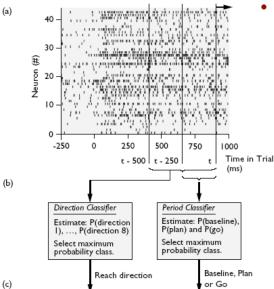
# A tool for understanding complex systems: Higher-order brain function

 Provides building blocks for biologically relevant neural network research



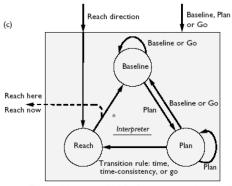


#### 06\_understand.png



Neural prosthetic control signals from plan activity, Shenoy et. al., NeuroReport, Vol 14(4), 2003.

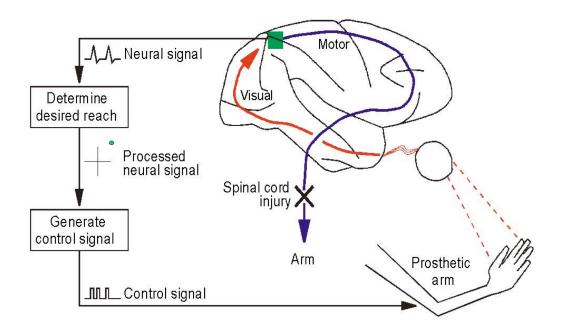
# Helps us to predict functional patterns of neuronal firing



\*This transition causes a high-level, cognitive control signal to be issued stating: reach here (from direction classifier), reach now.

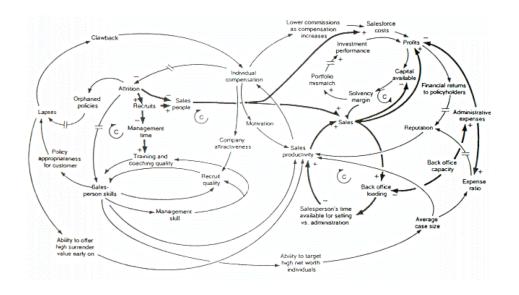
Fig. 2. Computational architecture for generating control signals from PRR plan activity. (a) Spike rasters from one trial for each of 41 PRR neurons. The goal visual target occurs at 0 ms. The onset of arm movement occurs after 1100 ms (not shown). (b) Classifiers use neural activity from fixed-width sliding analysis windows to estimate the direction of arm movement (direction classifier) and the current neural/behavioral period (period classifier). (c) The interpreter receives the stream of period classifications (i.e., baseline, plan or go) from the period classifier and the stream of movement direction classifications (e.g. downward reach) from the direction classifier. The interpreter consists of a finite state machine that transitions among three states (baseline, plan and reach) according to the period classification at each time step.

# A tool for neuroprosthetic device research

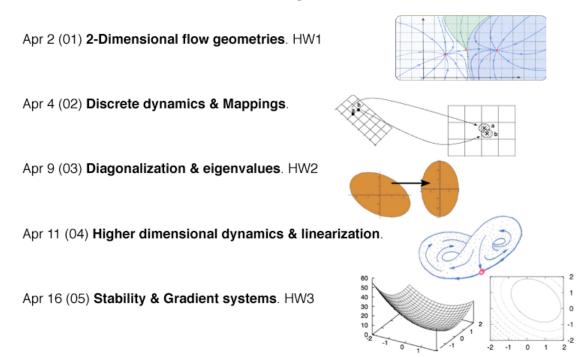


08\_control.png

# Manage and Improve Complex Systems Without Breaking Them



Part 1: Dynamics

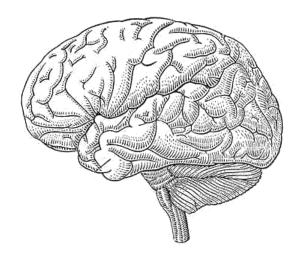


Dynamical Systems with Applications using MATLAB (2004) Stephen Lynch

10\_Dynamics.psd

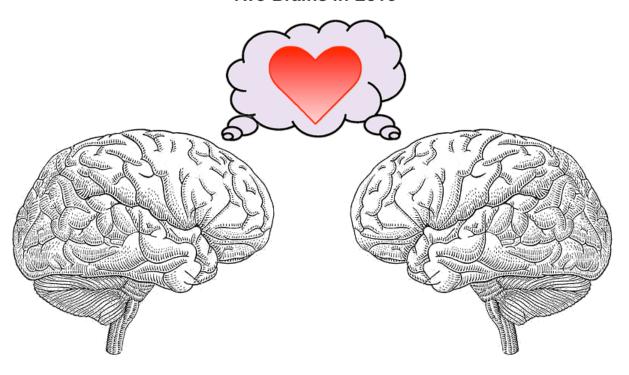
Example 1: The Human Brain

"The most complex system in the known universe."



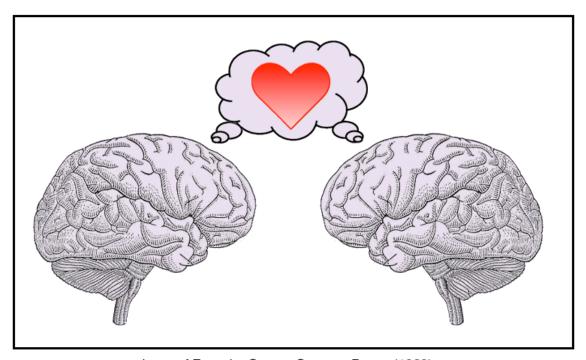
Being and Value: Toward a Constructive Postmodern Metaphysics, by Frederick Ferre (1996)

# Infinitely More Complex than the Human Brain: Two Brains in Love



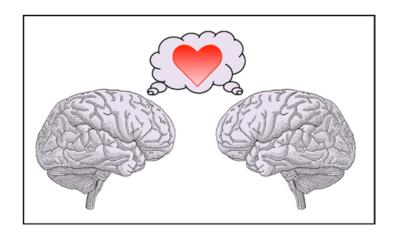
12\_2brains.psd

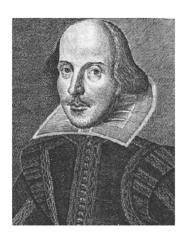
# Quantify a System's Dynamics: Step #1:"Draw a distinction"



Laws of Form, by George Spencer-Brown (1969)

# Quantify a System's Dynamics: Step #2: Specify an example





Romeo and Juliet, by William Shakespeare (1594)

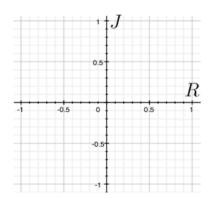
Strogatz, S. H. 1988. Love affairs and differential equations. *Mathematics Magazine* 61:35 14\_specify.psd

# Quantify a System's Dynamics: Step #3: Quantify the salient features

# The Dynamics of Romeo and Juliet



Romeo's feelings for Juliet:  $\,R(t)\,$  Juliet's feelings for Romeo:  $\,J(t)\,$ 

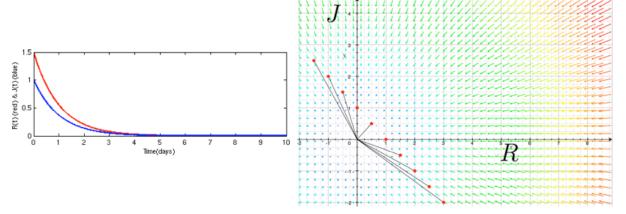


Strogatz, S. H. 1988. Love affairs and differential equations. *Mathematics Magazine* 61:35 15\_quantify.psd

#### The Dynamics of Romeo and Juliet

Case #1: Independent dreamers
Drift towards indifference

$$\frac{d\mathbf{R}(t)}{dt} = -\mathbf{R}(t) \qquad \frac{d\mathbf{J}(t)}{dt} = -\mathbf{J}(t)$$

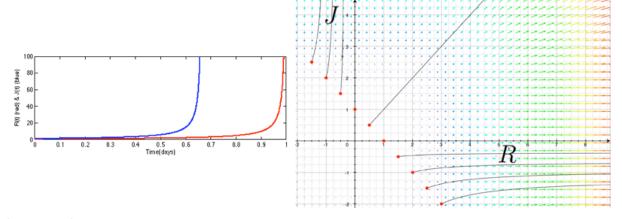


16\_RJ1\_indifference.psd

## The Dynamics of Romeo and Juliet

Case #1: Independent dreamers "Absence makes the heart grow fonder"

$$\frac{d\mathbf{R}(t)}{dt} = \mathbf{R}(t)^2 \qquad \frac{d\mathbf{J}(t)}{dt} = \mathbf{J}(t)^2$$



#### Digression: Solving differential equations

$$\frac{dx}{dt} \equiv \dot{x} = f(x)g(t)$$

Linear equations

Quadratic equations

$$\dot{x} = ax \qquad \dot{x} = x^{2}$$

$$\frac{dx}{x} = a dt \qquad \frac{dx}{x^{2}} = dt$$

$$\ln(x) = at + c$$

$$x(t) = e^{at+c} = x(0)e^{at} \qquad \frac{1}{x} = t + c$$

$$x(t) = \frac{1}{c-t}$$

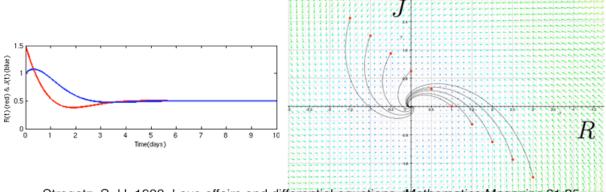
18\_solve.psd

## The Dynamics of Romeo and Juliet

Case #2: Two to Tango Fickle Romeo and Juliet

$$\frac{d\mathbf{R}(t)}{dt} = -\mathbf{R}(t) - \mathbf{J}(t)$$

$$\frac{d\mathbf{J}(t)}{dt} = -\mathbf{J}(t) + \mathbf{R}(t)$$



#### **General Form of Linear Dynamical Equations**

2-Dimensional dynamics

$$\frac{d\mathbf{R}(t)}{dt} = a(R_0 - \mathbf{R}(t)) - b\mathbf{J}(t)$$

$$\frac{d\mathbf{J}(t)}{dt} = d(J_0 - \mathbf{J}(t)) + c\mathbf{R}(t)$$

$$\frac{d}{dt} \begin{bmatrix} \mathbf{R}(t) \\ \mathbf{J}(t) \end{bmatrix} = \begin{bmatrix} a & b \\ c & d \end{bmatrix} \begin{bmatrix} R_0 - \mathbf{R}(t) \\ J_0 - \mathbf{J}(t) \end{bmatrix}$$

Ordinary, homogenous, linear, first-order differential equation:

$$\dot{x} = Ax$$

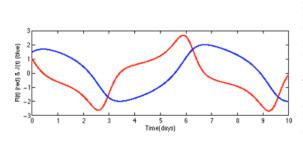
20\_RJ2\_matrix.psd

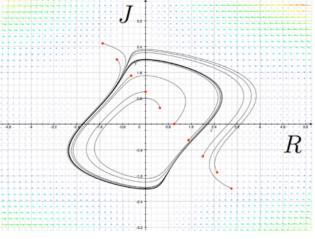
#### The Dynamics of Romeo and Juliet

Case #2b: Two to Tango Fickle Romeo, modulated by the intensity of Juliet's feelings

$$\frac{d\mathbf{R}(t)}{dt} = \mathbf{R}(t)(1 - \mathbf{J}(t)^2) - \mathbf{J}(t)$$

$$\frac{d\mathbf{J}(t)}{dt} = \mathbf{R}(t)$$





#### The Dynamics of Romeo and Juliet

Case #2b: Two to Tango Fickle Romeo, modulated by the intensity of Juliet's feelings

$$\frac{d\mathbf{R}(t)}{dt} = \mathbf{R}(t)(1 - \mathbf{J}(t)^2) - \mathbf{J}(t)$$

$$\frac{d\mathbf{J}(t)}{dt} = \mathbf{R}(t)$$

Eliminate Romeo to obtain second-order differential equation in Juliet:

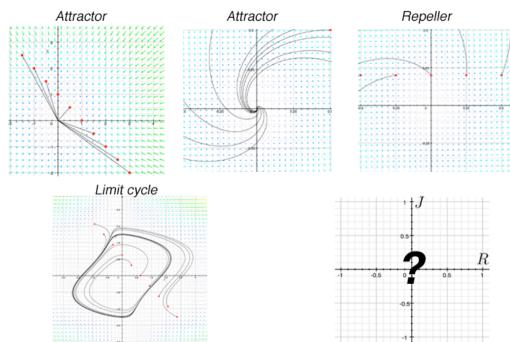
$$\frac{d^2 \mathbf{J}(t)}{dt^2} = a \frac{d \mathbf{J}(t)}{dt} (1 - \mathbf{J}(t)^2) - \mathbf{J}(t)$$

Van der Pol oscillator yields a stable limit cycle.

22\_RJ2\_2ndOrder.psd

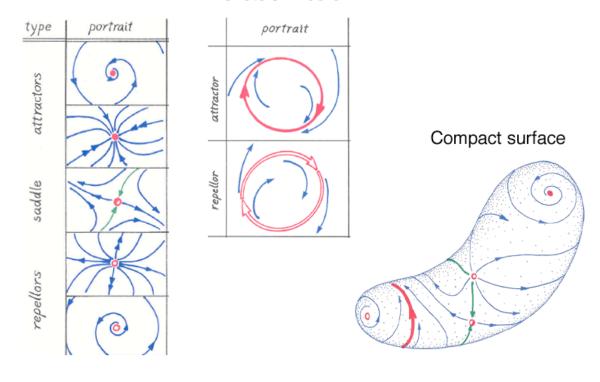
# Quantify a System's Dynamics: Step #4: Classify the Dynamics

## The Dynamics of Romeo and Juliet



## The Classification of 2-Dimensional Dynamics

#### Piexoto's Theorem



24\_classif.psd

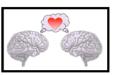
I. Dynamics: 2-Dimensional flow geometries

# Steps to quantify a System's Dynamics:

Step #1:"Draw a distinction"

Step #2: Specify an example

Step #3: Quantify the salient features







Step #4: Classify the Dynamics

