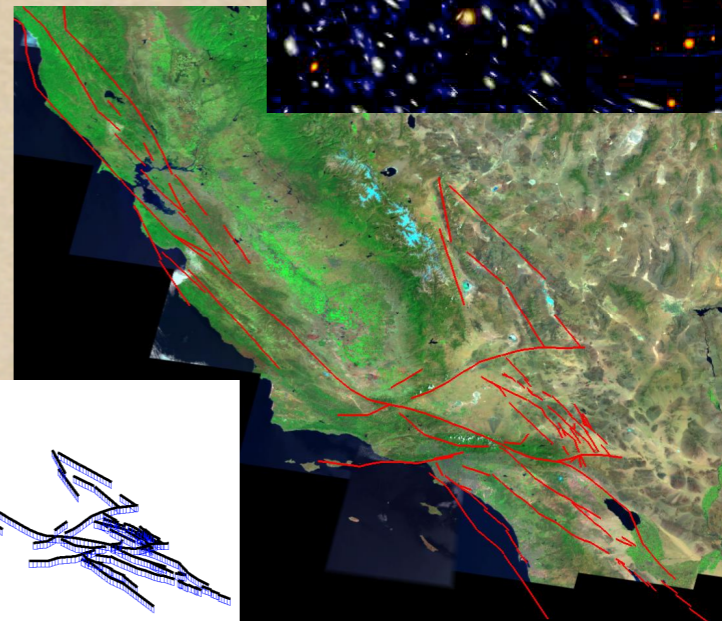
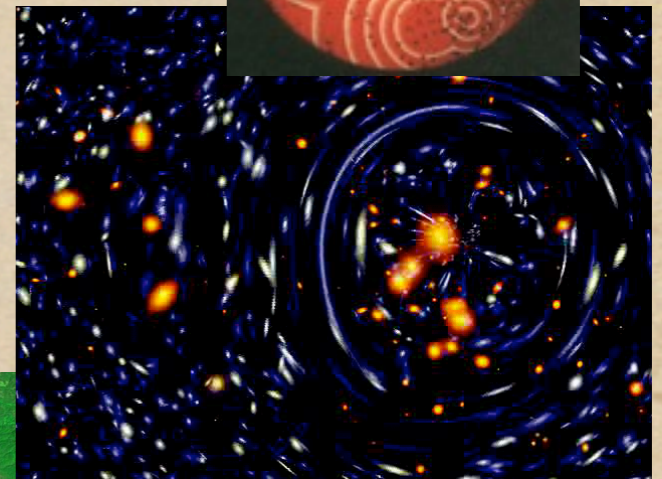
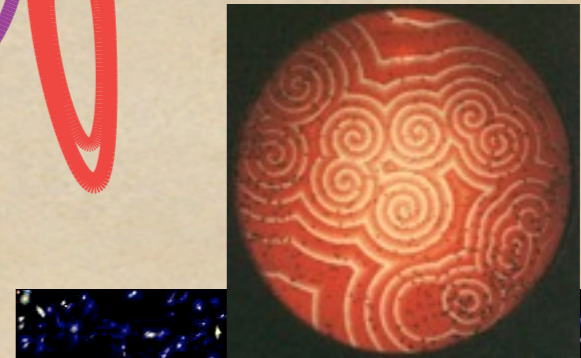
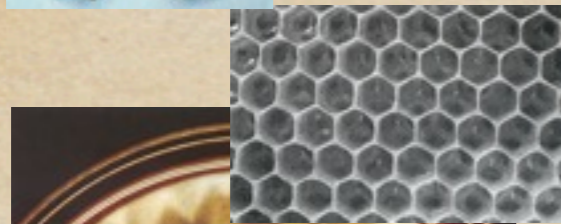
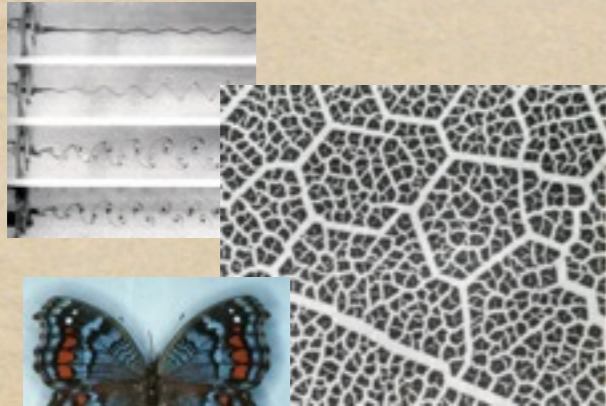


# Nonlinear Physics— Modeling Chaos & Complexity



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# Mechanism Revived

- ◆ Deterministic chaos
  - ◆ Nature actively produces unpredictability
- ◆ What is randomness?
- ◆ Where does it come from?
- ◆ Specific mechanisms:
  - ◆ Exponential divergence of states
  - ◆ Sensitive dependence on parameters
  - ◆ Sensitive dependence on initial state
  - ◆ ...

# Brief History of Chaos

- ◆ *Discovery of Chaos:*
  - ◆ 1890s, Henri Poincaré
  - ◆ Invents Qualitative Dynamics
- ◆ *Dynamics in 20th Century*
  - ◆ Develops in Mathematics (Russian & Europe)
  - ◆ Exiled from Physics
- ◆ *Re-enters Science in 1970s*
  - ◆ Experimental tests
  - ◆ Simulation
- ◆ *Flourishes in Mathematics:*
  - ◆ Ergodic theory & foundations of Statistical Mechanics
  - ◆ Topological dynamics
  - ◆ Catastrophe/Singularity theory
  - ◆ Pattern formation/center manifold theory
  - ◆ ...

# Discovering Order in Chaos

- ◆ Problem:
  - ◆ No “closed-form” analytical solution for predicting future of nonlinear, chaotic systems
  - ◆ One can prove this!
- ◆ Consequence:
  - ◆ Each nonlinear system requires its own representation
- ◆ Pattern recognition: Detecting what we know
- ◆ Ultimate goal: Causal explanation
  - ◆ What are the hidden mechanisms?
- ◆ Pattern discovery: Finding what's truly new

# Major Roadblock to the Scientific Algorithm

- ◆ No “closed-form” analytical solutions
- ◆ Baconian cycle of successively refining models broken
- ◆ Solution:
  - ◆ Qualitative dynamics: “Shape” of chaos
  - ◆ Computing

# Logic of the Course

- ◆ Two parallel themes
- ◆ Conceptual:
  - ◆ Deterministic Chaos: Emergence of randomness
  - ◆ Self-organization: Emergence of order
  - ◆ Complex systems: Balance of order & chaos
- ◆ Tools:
  - ◆ Building: Programming
  - ◆ Uses: Exploration & analysis

# How to do this?

- ◆ Mathematics of dynamical systems
- ◆ Computing methods:
  - ◆ Numerical simulation
  - ◆ Interactive visualization

# Goals

- ◆ Comfortable with state space
- ◆ Understand geometric mechanisms of unpredictability
- ◆ Measure the degree of chaos and order
- ◆ Build your own exploration tools



# Demos?

- ◆ Lorenz chaotic attractor
- ◆ Map lattice
- ◆ Spin system

# The Holodeck is Here!

## KeckCAVES

- ◆ Sensory Immersive Environment

- ◆ 10' x 10' x 8' Room

- ◆ Three Walls + Floor:

Each a stereoscopic  
projection screen



# KeckCAVES ...

## ◆ User View:

- ◆ LCD Shutter Glasses
- ◆ One user's head is tracked



## ◆ Users Interaction:

- ◆ Wand
- ◆ Position & Orientation
- ◆ Buttons



## KeckCAVES ...

- ◆ Movie: User Manipulates Protein
- ◆ <http://keckcaves.org/>

# Applications (a few) (Projects?)

- ◆ Physics:
  - ◆ Solid state: Bose-Einstein condensates, Charge-density waves, ...
  - ◆ Astronomy
  - ◆ Cosmology
- ◆ Chemistry:
  - ◆ Molecular dynamics
  - ◆ Reaction kinetics
  - ◆ Chemical oscillators
- ◆ Biology:
  - ◆ Population dynamics
  - ◆ Ecology
  - ◆ Evolution
  - ◆ Neurodynamics
- ◆ Social sciences:
  - ◆ Market dynamics
  - ◆ Game interactions
- ◆ Engineering:
  - ◆ Mechanical systems
  - ◆ Electrical circuits
  - ◆ Fluid turbulence
  - ◆ Oscillations in Internet traffic through-put
- ◆ Health:
  - ◆ Epidemics
- ◆ ...

# Prerequisites

- ◆ Interest in modeling some dynamical phenomenon
- ◆ Mathematics:
  - ◆ Vector calculus
  - ◆ Linear algebra
  - ◆ Lower division Math, Physics, or CS courses
- ◆ Programming:
  - ◆ Experience with C/C++, Java, or ...
  - ◆ We will use Python
- ◆ Preferred environment:
  - ◆ Laptop with Python v. 2.6 running

# Why Python?

- ◆ Open source & free!
- ◆ Hierarchy of programming structures:
  - ◆ Procedural (like C/Fortran)
  - ◆ Object oriented (like C++/Java)
  - ◆ Functional programming (like Haskell/Lisp)
- ◆ Interpreted, not compiled:
  - ◆ Easy to test code, interactive
  - ◆ Scriptable (like Perl)
  - ◆ Can be slow!
- ◆ Excellent libraries: OS, numerical, WWW, parallel, ...
- ◆ Wide range of tools available:
  - ◆ Development: e.g., Eclipse IDE
  - ◆ WWW

# Organization: Two tracks

- ◆ Parallel Theme I:  
Forms of Randomness, Order, & Intrinsic Instability
  - ◆ Qualitative Dynamics
  - ◆ Continuous-time ODEs and discrete-time maps
  - ◆ Bifurcations
  - ◆ Stability, Instability, and Chaos
  - ◆ Quantifying (In)Stability



# Organization: Two tracks ...

- ◆ Parallel Theme II:  
Tools for Exploring Chaos and Complexity
  - ◆ Modeling methods
  - ◆ Programming
  - ◆ Simulation
  - ◆ Graphics
  - ◆ Interaction

# Organization: Two tracks ...

- ◆ Each week:
  - ◆ Theory first (Tuesday)
  - ◆ Then Lab: Code up ideas (Thursday)
- ◆ Field trip (May/June)
  - ◆ Sensory Immersive Environments
  - ◆ KeckCAVES tour

# Who are we?

- ◆ Me: JPC
- ◆ Assistant: Benny Brown
- ◆ You: (Please fill out questionnaire.)
  - ◆ Interests
  - ◆ Background
  - ◆ Abilities

# Course logistics

- ◆ Course Website:

[cse.ucdavis.edu/~chaos/courses/nlp/](http://cse.ucdavis.edu/~chaos/courses/nlp/)

- ◆ Readings: Assignments on website

- ◆ Homework: Assignments on website

Assigned first 2/3s of quarter

- ◆ Project:

Remaining 1/3, presentation, written report, working code

- ◆ Grading:

- ◆ 30% homework + 30% lab + 40% project

# Staying in touch

- ◆ Course Website:

[cse.ucdavis.edu/~chaos/courses/nlp/](http://cse.ucdavis.edu/~chaos/courses/nlp/)

- ◆ Email

[chaos@cse.ucdavis.edu](mailto:chaos@cse.ucdavis.edu) & [brown@cse.ucdavis.edu](mailto:brown@cse.ucdavis.edu)

- ◆ Office hours

JPC: Wednesday 3-4 PM

BB: TBD

# Materials

## ◆ Books

[NDAC] Nonlinear Dynamics and Chaos: with applications to physics, biology, chemistry, and engineering, S. H. Strogatz, Addison-Wesley, Reading, Massachusetts (2001). **2001 Printing is Important!**

[Python] Learning Python, M. Lutz, Fourth Edition, O'Reilly & Associates (2009).

## ◆ [NLP] Nonlinear Dynamics Reader

[cse.ucdavis.edu/~chaos/courses/nlp/Reader.html](http://cse.ucdavis.edu/~chaos/courses/nlp/Reader.html)

## ◆ Lecture Notes online

# Software

- ◆ Goal: Learn via Analytical, Numerical, Coding
- ◆ Previous programming?
- ◆ Python Tools & Development:
  - ◆ Python v. 2.6
  - ◆ Suggested packages:
    - ◆ Numerical: NumPy, SciPy, & ScientificPython
    - ◆ Graphics: matplotlib & MayaVi & PyGlet
    - ◆ Images: PIL & ImageMagick
    - ◆ Development: iPython and others
  - ◆ See course web pages for configuration help:  
[cse.ucdavis.edu/~chaos/courses/nlp/Software/](http://cse.ucdavis.edu/~chaos/courses/nlp/Software/)  
Enthought Python Distribution 6.1: Windows, Linuses, & Mac

# Who has what?

- ◆ Fill out questionnaire
- ◆ Laptop?
- ◆ OS:
  - ◆ Windows?
  - ◆ OS X?
  - ◆ Linux?



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Modeling Chaos and Complexity

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Spring 2008  
WWW: <http://cse.ucdavis.edu/~chaos/courses/nlp/>

Questionnaire

1. Name: \_\_\_\_\_
2. Graduate or Undergraduate (circle one)  
**17**                      **6**
3. Email address: \_\_\_\_\_
4. Major/Field: \_\_\_\_\_
5. What programming language(s) have you used?  
(circle all appropriate)  
C or C++ or Java or Fortran or Python or Perl or Other \_\_\_\_\_  
**17** **21** **7** **4** **10** **5**
6. What level of programming experience do you have?  
(circle one)  
Little or Moderate or Extensive  
**5**                      **11**                      **10**
7. Are you familiar with Unix? Yes or No (circle one)  
**19**                      **6**
8. Do you have a laptop? Yes or No (circle one)  
**21**                      **3**
9. Which OS(es) does it run?  
(circle all appropriate)  
Windows or OS X or Linux  
**15**                      **7**                      **5**
10. Do you have a desktop machine? Yes or No (circle one)  
**16**                      **9**
11. Which OS(es) does it run?  
(circle all appropriate)  
Windows or OS X or Linux  
**12**                      **2**                      **6**

PHY	10
APM	7
CS	2
MAT	1
ApSci	1
MAE	1
Civil	1
Econ	1
?	1
Matlab	5
Lisp	3
LabView	2
Haskell	2
C#	2
ASM	2
Basic	2
SQL	1
Lua	1
Ruby	1
Pascal	1
IDL	1

# Tasks: Done by Thursday

- ◆ Get your machine(s) running Python 2.6
- ◆ Computer lab:
  - ◆ 2118 Math Sciences Bldg
  - ◆ Currently testing installation
- ◆ Get your computing lab account:  
Instructions on course website.
- ◆ Familiarize yourself with Linux/Unix:  
See tutorials on course website.

# Reading To Do

- ◆ NLP articles:
  - ◆ Lem “Odds”
  - ◆ “Chaos”, Scientific American
- ◆ NDAC:
  - ◆ Chapters 1 & 2

# Homework 0

- ◆ Find three (3) examples of unpredictability that you encounter directly over the weekend.
- ◆ For each, be prepared to discuss:
  - Where did you encounter it?
  - What was your interaction?
  - Why do you consider it unpredictable?
  - What effect did its unpredictability have on you?
  - What aspects would you expect to be able to predict?
  - How would you model it?
- ◆ For each example write paragraph summarizing answers.

Math computer lab: 2118 MSB

Thursdays we meet there, not in 185 Physics.

OS is Linux: Who needs help with Unix/Linux?

Create your account, go to

<http://www.math.ucdavis.edu/comp/class-accts>

Use virtual course number MAT 998Z.