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Unstable Periodic Orbits as a Unifying Principle in the Presentation of Dynamical Systems in the Undergraduate Physics Curriculum

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- Logistic map
- Lorenz attractor

3 Hydrodynamics

- Laminar and periodic flow
- Turbulent flow
- Chaos & turbulence

4 Computation

- **5** Current and future work
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 - Conclusions

| Periodic orbits are familiar | | | | | |
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| History | | | | | |
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- Gravitational two-body problem (Newton, 1687)
- Three-body problem (Euler, Lagrange, Jacobi)



• Gave rise to our appreciation of chaotic orbits (Poincaré)

| but still a source of new results! | | | | | |
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| New Results | | | | | |
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- New orbits found numerically (Moore, 1994)
- New orbits existence proven (Chenciner, Montgomery, 2001)

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| Lessons | | | | |
| Lessons learn | ed | | | |

- Some history of science
- Students may be invited to consider the difference between configuration space (ℝ³), and phase space (ℝ⁶ for two-body problem and ℝ⁹ for three-body problem).
- Reduction of dimensionality of phase space when constants of the motion are known (e.g., COM and relative coordinates)
- Students see that this is still a vibrant and active area of research.

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General Dynamical Systems

- Contrast dynamical systems in physics and mathematics
- State space M
- Evolution rule $\Phi_t : M \to M$
- Time t
 - Continuous time differential equation flow
 - Discrete time difference equation map
- Physics students will have seen Newton's equations
- Prior course in differential equations
- Stretch for them to see relationship to simple maps
- Too simple to be useful?

| Example: ⁻ | The Bernoulli | map | | |
|-----------------------|----------------------|---------------|-------------|-------------------------|
| Bernoulli map | | | | |
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- Discrete time dynamical system on the state space [0,1]
- Dynamical equation: $x_{n+1} = 2x_n |_{mod 1}$
- Example periodic orbit: $\frac{1}{3} \leftrightarrow \frac{2}{3}$
- Unstable: $0.33 \rightarrow 0.66 \rightarrow 0.32 \rightarrow 0.64 \rightarrow \cdots$ (Yorke)
- Map shifts base-two decimal point to the right
- Any rational number is a periodic point
- Rational numbers countable and dense in [0,1]
- UPOs can be ordered by period
- Irrational numbers give chaotic trajectories

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| Bernoulli map | | | | |

Example: Bernoulli map UPOs

| Period | Lyndon word | Initial condition | Obser | vables |
|--------|-------------|-----------------------------|--------------------------|----------------------------|
| T_p | Lp | <i>x</i> ₀ | $\sum_{j=0}^{T_p-1} x_j$ | $\sum_{j=0}^{T_p-1} x_j^2$ |
| 1 | 0 | $\overline{0} = 0$. | 0 | 0 |
| | 1 | $.\overline{1} = 1$ | 1 | 1 |
| 2 | 01 | $.\overline{01} = 1/3$ | 1 | 5/9 |
| 3 | 001 | $.\overline{001} = 1/7$ | 1 | 3/7 |
| | 011 | $.\overline{011} = 3/7$ | 2 | 10/7 |
| 4 | 0001 | $.\overline{0001} = 1/15$ | 1 | 17/45 |
| | 0011 | $.\overline{0011} = 1/5$ | 2 | 6/5 |
| | 0111 | $.\overline{0111} = 7/15$ | 3 | 107/45 |
| 5 | 00001 | $.\overline{00001} = 1/31$ | 1 | 11/31 |
| | 00101 | $.\overline{00101} = 5/31$ | 2 | 30/31 |
| | 00011 | $.\overline{00011} = 3/31$ | 2 | 34/31 |
| | 01011 | $.\overline{01011} = 11/31$ | 3 | 61/31 |
| | 00111 | $.\overline{00111} = 7/31$ | 3 | 65/31 |
| | 01111 | $.\overline{01111} = 15/31$ | 4 | 104/31 |

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| More lessons | | | | |
| Lessons learned | | | | |

- Very simple dynamical systems can exhibit both periodicity and chaos
- State space is generally replete with UPOs

| Logistic map | | | | |
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| Logistic map | | | | |
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- State space is again [0,1]
- One-parameter family of maps:

$$x_{n+1} = f_{\lambda}(x_n) := 4\lambda x_n (1-x_n).$$



- Pitchfork bifurcation, stable and unstable periodic orbits
- Easy programming exercise for students

| Periodic Orbits of Logistic Map | | | | | |
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| Logistic map | | | | | |
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• Finding period-two orbits:

- Solve: $x = f_{\lambda}(f_{\lambda}(x))$
- Minimize: $F(x, y) = [x f_{\lambda}(y)]^{2} + [y f_{\lambda}(x)]^{2}$



• Finding period-three orbits, etc:

- Solve: $x = f_{\lambda}(f_{\lambda}(f_{\lambda}(x)))$
- Minimize:

$$F(x, y, z) = [x - f_{\lambda}(y)]^{2} + [y - f_{\lambda}(z)]^{2} + [z - f_{\lambda}(x)]^{2}$$

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| Logistic map | | | | |
| Cantor Set | | | | |

- Logistic map with $\lambda > 1$
- Interval leaves state space in one iteration
- Preimages of interval leave in two iterations, etc.



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| Still more lessons | | | | |
| Lessons Learned | | | | |

- The notions of transient behavior and attracting set
- Period doubling route to chaos
- Pitchfork bifurcation
- UPOs discovered by either root finding or minimization
- $\bullet\,$ Cantor-set nature of state space when $\lambda>1$

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| Lorenz attractor | | | | |
| Lorenz attractor | | | | |

- $\bullet\,$ Continuous time dynamical system on the state space \mathbb{R}^3
- Dynamical equations:



• Attracting set has periodic orbits

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| Lorenz attractor | | | | |

Unstable Periodic Orbits of Lorenz Attractor

- Correspond to any binary sequence (e.g., 11110)
- Dense in the attractor
- System is hyperbolic



- If you know all UPOs with period < T, you can make statistical predictions of any observable (DZF formalism).
- UPOs and their properties can be tabulated, stored, and made available in a curated database.

| These can be tabulated | | | | |
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| Lorenz attractor | | | | |
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| | Economica | | Communities | Communication of Communication |

• Viswanath, Nonlinearity 16 (2003) 1035-1056



 $\bullet\,$ Tabulated up to ~ 20 symbols

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| More lessons | | | | |
| Lessons Learn | ned | | | |

- These observations work for continuous-time dynamical systems
- The same labeling of orbits used in the Bernoulli map works for the Lorenz attractor
- Symbolic dynamics

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| Laminar and periodic flow | | | | | |
| Stable periodic orbits | | | | | |

- Laminar (stationary) flow is a fixed point in function space
- von Kármán vortex street is a closed periodic orbit in function space

| Turbulent flow in two dimensions | | | | |
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| Turbulent flow | | | | |
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- Reference: N.T. Ouellette, J.P. Gollub, "Curvature Fields, Topology, and the Dynamics of Spatiotemporal Chaos," *Phys. Rev. Lett.* **99** (2007) 194502.
- Periodic flow in square domain
- Periodic force

 $\mathbf{F} = A \sin(2\pi mx) \sin(2\pi ny) \mathbf{e}_x + A \cos(2\pi mx) \cos(2\pi ny) \mathbf{e}_y$

- Flow closely follows **F** for low Re
- Turbulent for high Re

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| Yet more lessons | | | | |
| Lessons Learn | ned | | | |

• All this can be made to work for dynamical systems on infinite-dimensional state-spaces

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| Chaos & turbulence | | | | | |
| Unstable Periodic Orbits (UPOs) | | | | | |

- Attracting sets in a wide variety of dynamical systems are replete with periodic orbits
- If the dynamics are hyperbolic, the UPOs are unstable
- The UPOs are dense in the attracting set
- The UPOs are countable and have measure zero in the attracting set
- In spite of zero measure, UPOs are exceedingly important, as averages over the natural measure can be derived from them
- "The skeleton of chaos" (Cvitanovic)

| Attracting sets and turbulent averages | | | | |
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| Chaos & turbulence | | | | |
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- The driven Navier-Stokes equations in the turbulent regime describe nonlinear dynamics in an infinite-dimensional (function) space
- These dynamics possess an attracting set
- The attracting set is finite-dimensional, and its dimension grows as a power law in Reynolds number (Constantin, Foias, Manley, Temam, 1985)
- Long-time averages over this attracting set impart a "natural measure" to it
- The problem of turbulence is that of extracting averages of observables over this natural measure

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| Shooting method | | | | |
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- Computing UPOs I: Shooting Method
 - Begin on surface of codimension one in function space
 - Evolve NS equations until return to that surface
 - Use Newton-Raphson to close the gap
 - Serial in time
 - Constructed to obey equations of motion, but not periodic

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| Relaxation method | | | | |

Computing UPOs II: Relaxation Method

- Begin with periodic orbit that is smooth
- Relax to solution of NS equations using variational principle

$$\Delta([f], T) = \frac{1}{2} \sum_{t=0}^{T-1} \sum_{\mathbf{r}} \sum_{j} \left| f_j(\mathbf{r}, t+1) - f_j(\mathbf{r}, t) - \frac{1}{\tau} \left[f_j^{eq}(\mathbf{r}, t) - f_j(\mathbf{r}, t) \right] \right|^2$$

- Constructed to be periodic, but not obey equations of motion
- Conjugate-gradient algorithm
- Higher-order differencing needed
- Local spline fitting to orbit needed
- Enormous amounts of memory are needed

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| General HPC tools | | | | | | | |
| Work in Progress I | | | | | | | |



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| Work in progress | | | | | | | |
| Work in Progress II | | | | | | | |

- LUPO: Laboratory for unstable periodic orbits
- Shell models of turbulence (Tang, Boghosian)
- 2D Navier-Stokes (Lätt, Smith, Boghosian)
- 3D Navier-Stokes (Faizendeiro, Coveney, Boghosian)

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| Conclusions | | | | |
| Conclusions | | | | |

- UPOs are a unifying concept in dynamical systems
- Connects mathematical and physical way of understanding dynamical systems
- Improved understanding of fluid UPOs may lead to new statistical descriptions of turbulence
- HPC is just at the point where this can be done for infinite-dimensional systems
- LUPO will give students a way to experiment with such systems
- Creation of a UPO database will help spread and share information about UPOs