

Welcome to **instats**

The Session Will Begin Shortly
(At the top of the hour, Eastern USA time)

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START

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Nonlinear Time Series Analysis, Part I: Detecting Nonlinearity

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Seminar Overview

- Day 1
 - Session 1: Introduction to Nonlinear Time Series (NTLS)
 - **Session 2: Behaviors and State Spaces**
- Day 2
 - Session 3: State Spaces (continued)
 - Session 4: Recurrences
- Day 3
 - Session 5: Tests
 - Session 6: Singular Spectrum Analysis and Noise
- Day 4
 - Session 7: Surrogate Data
 - Session 8: Convergent Cross Mapping

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Derivatives, Differences, and Dynamics

- Recall: Differences are not dynamic because of the time delay
 - But differences estimate derivatives for dynamics
- Some nomenclature

Symbol	Spoken	Description
x^*	<i>x star</i>	Fixed point
$x(t)$	<i>x of t</i>	x as a function of continuous time
x_t	<i>x sub t</i>	x as a function of discrete time
\dot{x}	<i>x dot</i>	Velocity (1 st derivative) of x
\hat{x}	<i>x hat</i>	Statistical estimate of x

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Population: Linear approach

$$P'(t) = \dot{P} = b_p P(t) - d_p P(t) = b_p P - d_p P$$

$$\Delta P_t = P_{t+1} - P_t = b_p P_t - d_p P_t$$

- where:
 - P is the population (at time t for $P(t)$, P , and P_t , and at time $t+1$ for P_{t+1})
 - b_p is the birth rate, assumed to be constant
 - d_p is the death rate, also assumed to be constant
- [Population models](#)

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Population: Logistic Model

- Another population model:

$$x_{t+1} = Rx_t(1 - x_t)$$

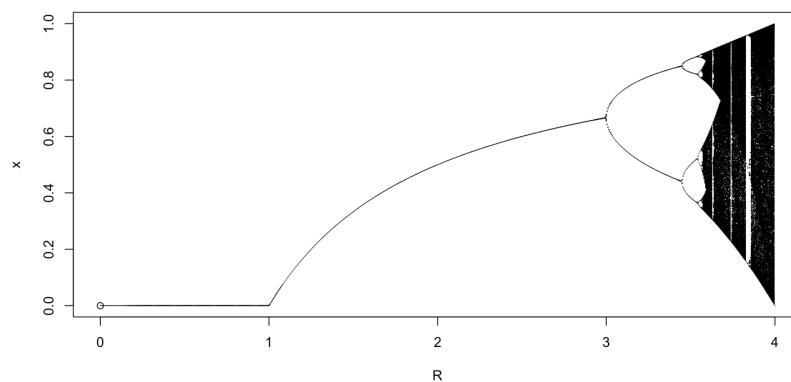
- where:

- x is the normalized population (relative to the carrying capacity)
- t is the (discrete) time
- R is a parameter that reflects the combined birth and death rates

- [Population models](#)

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Changing Behaviors

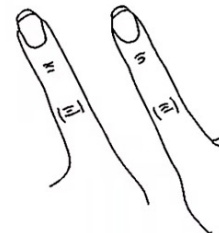


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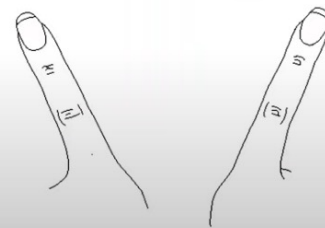
Haken-Kelso-Bunz (HKB) Model

- Flexing fingers
- Two modes
 - Both stable at low frequencies
 - One stable at high frequencies
- look at [landscape in R](#).

symmetrisch
(in-phase)



parallel
(anti-phase)



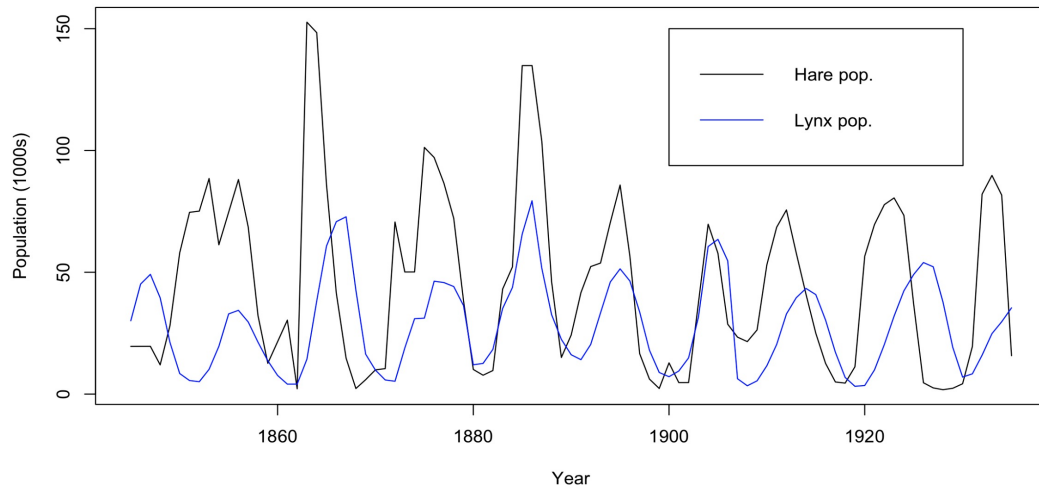
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Bifurcations in General

- Many types, including
 - Pitchfork bifurcation (logistic)
 - Supercritical Hopf bifurcation (HKB)
- The pitchfork is a *local* bifurcation
 - Stability changes
- Hopf is a *global* bifurcation
 - Topology (e.g., number of fixed points) changes
- Near the bifurcation point
 - Critical slowing down
 - Emerging unstable behaviors can grow rapidly

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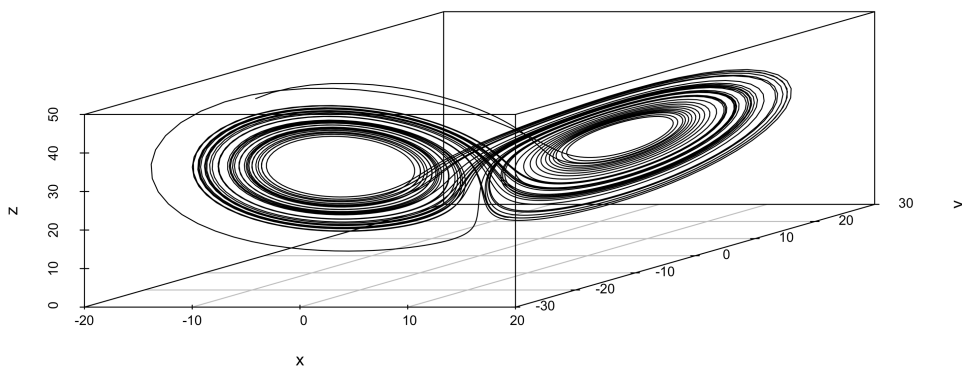
Coupled Variables: Lynx and Hare



- [Lynx and hare](#)

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Lorenz Model



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Lessons Learned

- Reconstructed v. Original
 - Same topology
- Parameters and behaviors
 - Change behaviors through model forms or parameters
 - Synergetics
- Noise – ugh!

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Shadow State Spaces

- Several approaches to reconstruction
 - Constant Delay
 - Maximally orthogonal
 - Principle Component Analysis
 - Reconstruction from Multivariate

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Constant Delay State Spaces

- Common in the literature, although not optimal
- Process
 - Dimension choice (theory, Takens)
 - Delay choice (ACF, MI)
 - False nearest neighbors (radius and Theiler window choices)
- [Delay State Spaces in RStudio](#)

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Questions

Reconvene at 1600 UTC

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STOP