# STATISTICS, PROBABILITY AND CHAOS

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# WHAT IS CHAOS?

- Chaotic systems are systems where small differences in initial conditions, such as those due to errors in measurements or due to rounding errors in numerical computation, can yield widely diverging outcomes.
- Lorenz defined Chaos as: When the present determines the future, but the approximate present does not approximately determine the future.
- A metaphor for this behavior is that a **butterfly** flapping its wings in Brazil can cause a tornado in Texas (butterfly effect).
- Why is chaos theory important for statistics?

### EXAMPLES OF CHAOTIC SYSTEMS

LOGISTIC MAP

LORENZ ATTRACTOR



Lorenz Attractor



### LOGISTIC MAP





### LYAPUNOV EXPONENT



### LORENZ SYSTEM



### LORENZ SYSTEM

The Lorenz system/attractor not only shows high sensitivity to initial conditions, but also to the predefined parameters



# HOW CAN WE ANALYZE CHAOTIC SYSTEMS?

- **Phase space analysis**: This involves plotting the behavior of the system in a multi-dimensional space, where each dimension represents a different variable or parameter.
- Lyapunov exponents: These are mathematical quantities that measure the sensitivity of a chaotic system to small perturbations in initial conditions.
- **Bifurcation diagrams**: These are graphical representations of how a chaotic system changes as a parameter is varied.
- **Time series analysis**: Time series analysis techniques can be used to identify and analyze trends, patterns, and correlations in the data over time.
- Probability distributions: Statistical techniques can be used to analyze the probability distribution of the system's behavior.
- Monte Carlo simulations (MCMC), Machine Learning

# QUESTIONS?