## Modeling Nonlinear Systems: Chaos and Fractals



## **Nonlinear Dynamics**: time evolution equations (e.g., Newton's 2nd law)/field equations contain nonlinear terms

## **There are many nonlinear systems in physics**:

Mechanical systems: driven/coupled oscillators

Astrophysics: **three-body problem**; stability of solar system; KAM theorem

General Relativity: Einstein equations Electronics: nonlinear circuits Hydrodynamics: turbulences Climate science: weather patterns



## **Some nonlinear systems outside of physics** :

Biology: predator-prey models Chemistry: certain reactions… Physiology: heart arrhythmias Economics: stock market trends Simple example: the **logistic equation** for population growth, modeled as a differential equation…

$$
\frac{dx}{dt} = r x(1-x)
$$

…or as a difference equation…

$$
x_{n+1} = r x_n (1 - x_n)
$$

…graphed in Python:



Bifurcations for  $r > 3$ , chaotic long-term behavior for  $r \geq 3.57$  ...,

Initial value problems (IVPs) usually have a unique solution; they are *deterministic*. Characteristic for nonlinear dynamical systems is their *Sensitive Dependence on Initial Conditions* (SDIC): similar initial conditions produce very different long-term behaviors. This is known as **deterministic chaos**.

The geometry of deterministic chaos often shows self-similar patterns: **fractals**.





Fractals are everywhere: