## Chaos

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## 1 Lyapunov exponents of the Lorenz equations

The Lorenz-equations are considered chaotic as they exhibit sensitive dependence on initial conditions. An important way to put this dependence into numbers are Lyapunov exponents. If the evolution of the distance between the solutions starting from two initial conditions  $\delta(t)$  is compared. The biggest Lyapunov exponents tells us how this distance will change with time<sup>1</sup>:

$$\|\delta(t)\| \sim \|\delta_0\| e^{\lambda t} \tag{1}$$

This means that a system with at least one positive Lyapunov exponent will become unpredictable after a certain time horizon is reached. This behavior can be observed in figure 1. The one of the four solutions spread out on the attractor even tough their initial conditions where only 0.1 apart. Conceptually the exponents are computed following the formula <sup>2</sup>:

$$\lambda = \lim_{n \to \infty} \left\{ \frac{1}{n} \sum_{i=0}^{n-1} \ln(f'(x_i)) \right\}$$
 (2)

However instead of the first derivative the Jacobian matrix is computed. The rows, which contain the spacial derivatives at a given point  $x_i$  of a given equation. In order to produce a scalar the square root of the dot product is computed for the row under consideration and then fed into the logarithm. Generally one obtains as many exponents as equations. In order to prevent nasty numerical surprises the rows of the Jacobian are kept orthogonal by the Gram-Schmidt algorithm.

To undertake numerical computations it is necessary to choose a value  $kkmax < \infty$  as a replacement for n. Furthermore a step size st is necessary. The time covered by the simulation would therefore be st \* kkmax. When starting the computation three input-parameters are at the users disposal. At first a suitable initial condition has to be chosen. In order to avoid any traveling time where the solutions move onto the attractor (see figure 1) the initial condition [0 1 20] has been chosen, which is on or very close to the attractor. Next step size and the number of iterations have to be picked. As an initial gees st = 0.01; kkmax = 1000 are proposed. The results are shown in figure 2. If only the number of iterations is increased it remains debatable if the solution quality actually increases. See figure 3. However if the step size is reduced by the same order of magnitude with which the number of iterations was increased, the solution precision does indeed improve. Check figure 4.

<sup>&</sup>lt;sup>1</sup>Strogatz p.328

<sup>&</sup>lt;sup>2</sup>Strogatz p.374

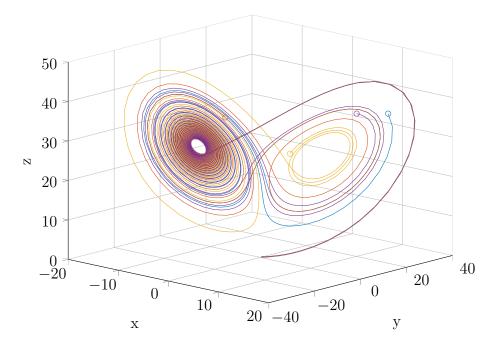


Figure 1: Numerical solution of the Lorenz equations for the four initial conditions (0.2, 0, 0), (0.2, 0, 0.1), (0.2, 0, 0.2), (0.2, 0, 0.3) for  $t \in [0, 20]$ . Solution end points are marked with circles.

## 2 The duffing Oscillator

$$\ddot{x} + k\dot{x} + x^3 = B\cos(t). \tag{3}$$

In Ueda's 1980 paper on "Steady Motions exhibited by Duffing's Equation"  $^3$ , the dynamics of equation 3 is analyzed for numerous different k and B value combinations. In this report the combination k = 1; B = 5 which should lead to stable results, will be compared to B = 7.5; k = 0.05, which is supposed to produce chaotic results. Results are shown in figures 5 and 6. As predicted in the paper chaotic behaviour does occur for the second parameter set. The initial conditions which are only 0.1 apart end up on completely different parts of the oscillator. A result that differs fundamentally from the behavior induced by the first parameter set. In this case the solutions are attracted to one stable path in the oscillator.

## 3 Chua's circuit

One last example of chaos is Chua's circuit. As the name hints it stems from circuit theory. Once more four sightly perturbed initial conditions are simulated, results are shown in figure 8. The Lyapunov exponents are found to be lyap = 0.3123 0.1702 -2.7140, with two exponents greater then zero indicating chaotic behavior. A prediction that is confirmed by the observation of perturbation sensitivity in the computed orbits.

<sup>&</sup>lt;sup>3</sup>http://www.iaea.org/inis/collection/NCLCollectionStore/\_Public/12/574/12574072.pdf

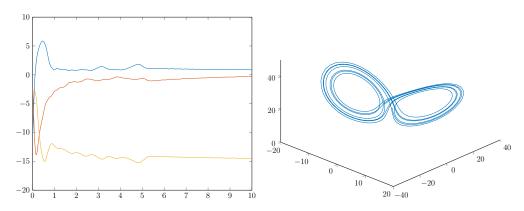


Figure 2:  $x = [0 \ 1 \ 20]$ '; st = 0.01; kkmax = 1000; lyap = 0.8512 -0.2526 -14.4998

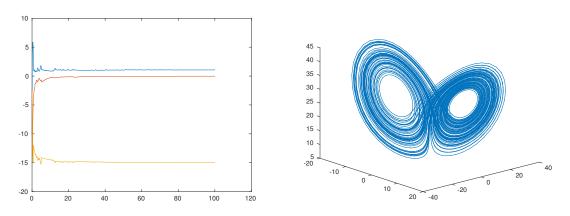


Figure 3:  $x = [0 \ 1 \ 20]$ '; st = 0.01; kkmax = 10000; lyap = 1.0749 -0.0312 -14.9990

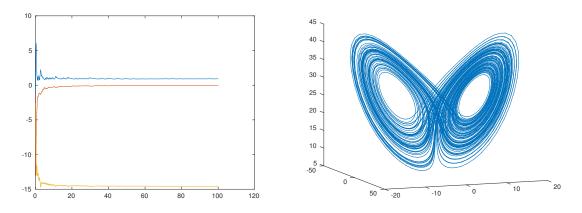


Figure 4:  $x = [0 \ 1 \ 20]$ '; st = 0.001; kkmax = 100000; lyap = 0.9035 -0.0150 -14.5896

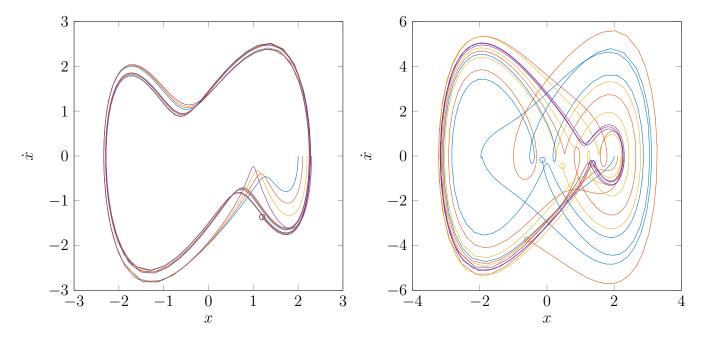


Figure 5: Stable Duffing-oscillator with k=1; B=5. Slightly perturbed initial conditions end up on the same path eventually (left). Chaotic Duffing-oscillator with B=7.5; k=0.05. Slightly perturbed initial conditions end up on different parts of the oscillator.

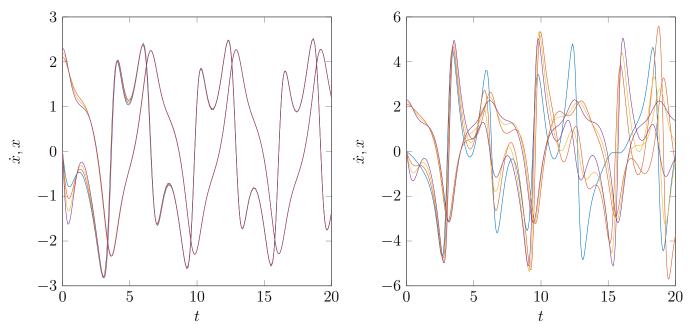


Figure 6: Time plot of the duffing oscillator's first and second derivative. For k = 1; B = 5(left) and B = 7.5; k = 0.05(right).

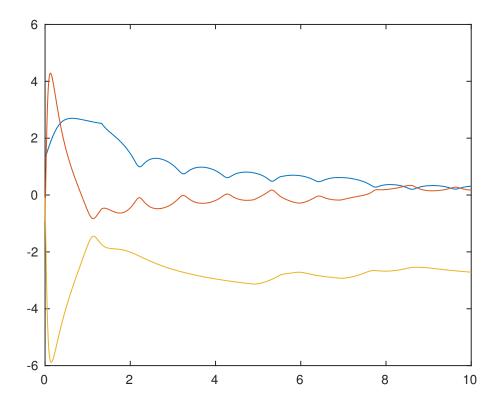


Figure 7: Evolution of the Liapunov exponents during first iterations of the Jacobian based algorithm.

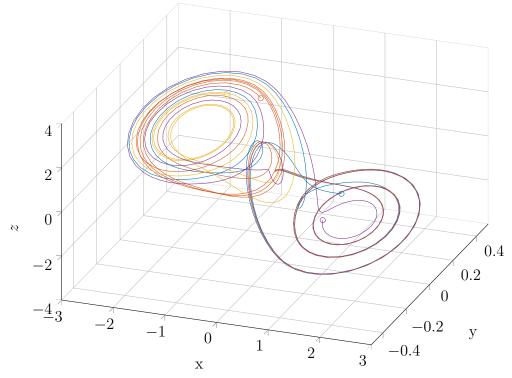


Figure 8: Simulation of Chua's circuit starting from  $\mathbf{x}_{1,0}=(0,0,0.1),\ \mathbf{x}_{2,0}=\mathbf{x}_{1,0}\cdot 1.1,\ \mathbf{x}_{3,0}=\mathbf{x}_{1,0}\cdot 1.2$  and  $\mathbf{x}_{4,0}=\mathbf{x}_{1,0}\cdot 1.3,\ \text{lyap}=0.3123\ 0.1702\ -2.7140.$