## Computational Physics - Exercise 8

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## 1 Fixed Points of the Lorenz dynamical System

The Lorenz attractor problem is given by the following coupled set of differential equations

$$\dot{x} = -\sigma(x - y) \tag{1}$$

$$\dot{y} = rx - y - xz \tag{2}$$

$$\dot{z} = xy - bz \tag{3}$$

The fixed points for this problem are  $\lambda_1 = (0,0,0)$  for all r and  $\lambda_{2,3} = (\pm a_0, \pm a_0, r-1)$  with  $a_0 = \sqrt{b(r-1)}$  for r > 1.

In this exercise we want to examine the stability of  $\lambda_{2,3}$  by the Jacobian taken at the fixed points, and then looking for its eigenvalues by means of finding the zero points of the following characteristic polynomial:

$$P(\lambda) = \lambda^3 + (1+b+\sigma)\lambda^2 + b(\sigma+r)\lambda + 2\sigma b(r-1)$$
(4)

We first plot  $P(\lambda)$  as a function of  $\lambda$ . For that we use  $\sigma = 10, b = 8/3$ :

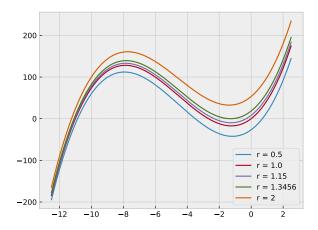


Figure 1: Characteristic Polynomial of the Lorenz attractor

To check if the points are stable, one has to examine the eigenvalues of the Jacobimatrix at the stationary point. If an eigenvalue has a positive real part, then the point is unstable. If all realparts are negative the point is stable. That means:

For r < 1 All Solutions unstable, because there is always at least one  $\lambda > 0$  For 1 < r < 1.3456 all  $\lambda < 0$  and the Solution is stable two of the three roots vanish, and the remaining root is < 0, so in theory, those solutions are stable too.

Note, that this is only correct for the characteristic Polynomial. Later we will see that the Fix Point (0,0,0) at r < 1 is indeed stable, since the Jacobian has a different

shape, and hence, there is a different polynomial. In the r < 1 case the only fixpoint is x = y = z = 0 and all eigenvalues of the resulting Jacobimatrix are negative (shown in lecture at 12.6). As a result, the simulations for r < 0 reach the stable point of x = y = z = 0 in Figure (3).

Next we determine the (complex) roots for different values of r:

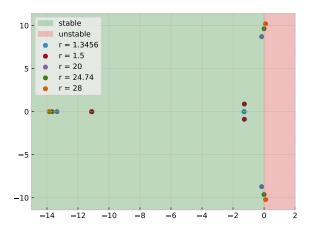


Figure 2: (Complex) roots of the Characteristic Polynomial

For  $1 < r < r_{\rm crit,1} = 1.3456$ , all Fixpoints are < 0 and real, and are hence stable. For  $r_{\rm crit,1} < r < r_{\rm crit,2} = 24.74$ , the real parts of the fixed points are still < 0 and the Fixpoints (including the complex conjugate ones) are hence stable. For  $r > r_{\rm crit,2}$ , the real part of the complex conjugate roots becomes > 0. The Fixed points are hence unstable.

## 2 The Lorenz attractor

We solve the Lorenz equations numerically with rk4, for the values r = 0.5, 1.15, 1.3456, 24 and 28. For that we use the previously integrated Runge-Kutta-4 algorithm (see Exercise 2). All we need to do is to integrate the coupled Lorenz equations:

```
def f(y0,x0): # y0 array that consists of [x,y,z]
   deriv = np.array([
        - sig*(y0[0] - y0[1]),
   r*y0[0] - y0[1] - y0[0]*y0[2],
   y0[0]*y0[1] - b*y0[2]])
   return deriv
```

Using rk4, we plot the trajectories for all r each with Starting point  $C_+$  and  $C_-$ :

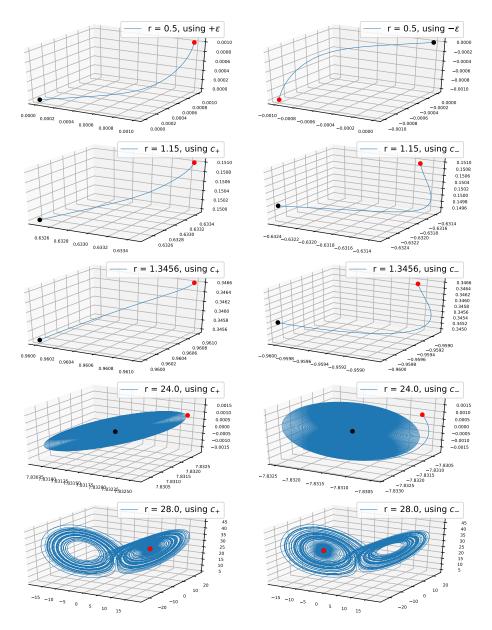


Figure 3: Determining Fixed points of the Lorenz dynamical System (the red dot describes the starting point, the black dot the fix point)

As discussed before, the fixed points for r < 1 are stable. The same app The same applies to all other points until we hit the value  $r_{\rm crit,2} \approx 24.74$ . Here, there is an oscillation around the fixed point that goes on for a while. For large enough t, a second "disk" emerges, and the oscillation changes back and forth between the two.

Finally, we take a closer look at the case r=27. We determine the sequence  $z_k$ , where  $z_k$  is a local maximum in z on the solution curve after k Periods. For that, we write a small block of code, that extracts all local maxima from the solution curve by a simple algorithm, and writes them into a one-dimensional array:

Then we plot  $z_{k+1}$  as a function of  $z_k$ . For small z, we see a linear relationship, to which we create a fit and determine its slope: As seen in Figure 4, m > 1. The theory of discrete

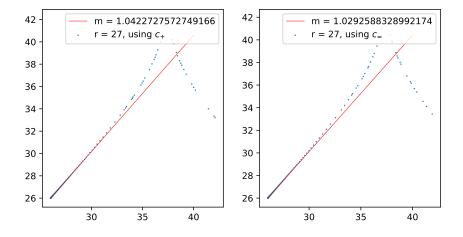


Figure 4: Determining the slope of  $z_{k+1}/z_k$ 

maps says, that there is no periodic solution if |m| > 1. For r = 27 > 24.74 that coincides with our previous assumption.