Runge-Kutta - Numerical Solutions of Differential Equations

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1 Introduction

As with all dynamical systems, it is interesting to observe the position and velocity of an object as functions of time. There are many approximations that can be made to obtain answers, some of which are more accurate than others. Different techniques were used to observe simple harmonic motion as a function of time.

The first of which, the Euler's method, for evolving differential equations determines a velocity by taking the previous velocity, and extrapolating the slope of the that velocity (constant acceleration) for further determination of the next values in the function. The problem with the Eulers method, as will be seen, is that unless an unreasonably small step size (on the order of microseconds) is used, error quickly builds up and data is rendered useless. A much better approximation takes into account a change of this slope, and thus a non-constant acceleration that progresses forward in time. The 2nd order and 4th order Runge-Kutta methods will be studied in this lab.

2 Theory

In its general form, consider the following differential equation where the right hand side is a function of both time and another function dependent on time.

$$\frac{dy}{dt} = f(t, y(t))$$

From this equation, the 2nd order Runge-Kutta method estimates y(t) as follows.

$$\begin{split} k_1 &= dt * f(t,y(t)) \Rightarrow k_2 = dt * f(t + \frac{dt}{2},y(t) + \frac{k_1}{2}) \\ y(t + dt) &= y(t) + k_2 \end{split}$$

If we consider the simplest simple harmonic oscillator, a mass-on-a-spring, we get the following, coupled differential equations.

$$\frac{dx}{dt} = \mathbf{v}(t), \ \frac{dv}{dt} = \mathbf{f}(t) = -(\frac{k}{m}) \ast \mathbf{x}(t)$$

By applying the 2nd order Runge-Kutta (RK2), we get the following two equations.

$$\begin{aligned} \mathbf{x}(t+dt) &= \mathbf{x}(t) + \mathbf{k}_2, \, \mathbf{k}_2 = \mathrm{d}t * (\mathbf{v}(t) + (-\frac{k}{m}) * \mathbf{x}(t) * \frac{dt}{2}) \\ \mathbf{v}(t+dt) &= \mathbf{v}(t) + \mathbf{k}_2, \, \mathbf{k}_2 = \mathrm{d}t * (-\frac{k}{m}) * (\mathbf{x}(t) + \mathbf{v}(t) * \frac{dt}{2}) \end{aligned}$$

The RK2 method produces more accurate data than Euler's method by calculating the slope at the midpoint of the interval based off of Euler's approximation. This midpoint slope is then used to make a better extrapolation of the endpoint of the interval. It is interesting to see how energy is conserved between the two methods. Obviously, a simple harmonic oscillator is a conservative system, therefore, we should not get an increase or decrease of energy throughout it's time-development. Table 1 includes a quantification of how well energy is conserved.

The RK2 method is a significant improvement from Euler's method, however, we can get even better data with the 4th order Runge-Kutta technique. RK4 may not always produce more accurate data than RK2, but it is more stable, which becomes important with more complicated systems. The RK4 formulation is as follows.

$$k_{1} = dt * f(t,y)$$

$$k_{2} = dt * f(t + \frac{dt}{2}, y(t) + k_{1}/2)$$

$$k_{3} = dt * f(t + \frac{dt}{2}, y(t) + k_{2}/2)$$

$$k_{4} = dt * f(t + dt, y(t) + k_{3})$$

$$\Rightarrow y(t + dt) = y(t) + \frac{1}{6} * (k_{1} + 2k_{2} + 2k_{3} + k_{4})$$

Both RK2 and RK4 methods were implemented into the code as functions. The unique thing about casting RK2 and RK4 as functions, is that a programmer can easily change the forces applicable to the problem by swapping out a single equation. Without these functions, a new piece of code must be produced for every type of force law. With a general form numerical approximation, a wide range of forces may be input; further, the values of these functions may be determined at small intervals. The RK2 and RK4 methods were applied to a pendulum, with both large and small amplitude oscillations. The pendulum follows the following mathematical equations.

$$\mathrm{mL}\frac{d^2\theta}{dt^2} = -\mathrm{mgsin}(\theta)$$

This standard equation can be identified in the general, coupled differential equations form as follows.

$$\frac{d\theta}{dt} = w; \ \frac{d^2\theta}{dt^2} = \frac{dw}{dt} = -\frac{g}{L}\sin(\theta)$$

This pendulum was observed with both small-amplitude and large-amplitude oscillations. The period of the oscillation was also studied as a function of initial pendulum angle.

After an adequate code was produced, and accurate results were obtained, a more real-world situation was considered, one with drag. A linear drag force term ($F_{drag} = -bv$). The pendulum was studied with underdamped, critically damped, and overdamped drag coefficients.

3 Data/Calculations

Energy conservation is an extremely important law in the natural sciences. In order to properly simulate scientific models, conservation laws must be upheld. The following table displays the fractional error of different techniques used in this lab at different time intervals.

dt (ms)	Euler FracErr	RK2 FracErr	RK4 FracErr
1	0.0512721	1.25 E-8	2.49 E-14
10	0.848845	1.25 E-5	6.95 E-11
100	143.773	0.125783	6.94 E-6
300	1.779 E6	0.401906	1.67 E-3

Table 1 - Fractional errors for different numerical differential equationsolutions as a function of step size.

Referring to the following Figure 1, one can see why the Euler's method approximation is not an accurate assessment of a conservative system. Figure 1 displays the run away effect of energy.



Figure 1: Violation of the conservation of energy implies an inadequate piece of code.

In the following figure, one can see the run away effect of energy in the Euler's method vs the conservation of energy of the RK2 method. Notice that within 3 periods, the Euler's method amplitude has tripled.



Velocity/Position

-5

Velocities and Positions as a Function of Time for Different Methods

 $-10 \begin{bmatrix} -10 \\ -15 \\ 0 \end{bmatrix} = \begin{bmatrix} 1 \\ -15 \end{bmatrix} = \begin{bmatrix} 1$

+ * * *

Figure 2: The position and velocity of the simple harmonic oscillator determined by two methods.

As stated in Theory, the simple harmonic oscillator was converted into a simple pendulum that began it's motion at different angles. In order to ensure that the program was producing reasonable results, the position and velocity was plotted as a function of many different starting angles. Figures 3-10 display this behavior.



Figure 3: A pendulum whose initial angle was 0.0 radians. With no initial potential energy, the pendulum is static.



Figure 4: A pendulum whose initial angle was 0.5 radians. With an initial





Simple Harmonic Pendulum w/ Initial Position 1.0 Radians

Figure 5: A pendulum whose initial angle was 1.0 radians.



Simple Harmonic Pendulum w/ Initial Position 1.5 Radians





Figure 7: A pendulum whose initial angle was 2.0 radians.



Simple Harmonic Pendulum w/ Initial Position 2.5 Radians

Figure 8: A pendulum whose initial angle was 2.5 radians. With a higher initial potential energy than the previous, the simple harmonic motion

displays a higher amplitude and slightly longer period than the last. Notice the slight bowing effect of the velocity. This is due to the gravitational force having an angular dependence.



Figure 9: A pendulum whose initial angle was 2.9 radians. With a higher initial potential energy than the previous, the simple harmonic motion displays a higher amplitude and slightly longer period than the last. Notice an even larger bowing effect of the velocity. When the pendulum begins at an angle larger than 90 degrees, some of the gravitational force is negated by the normal force of the fixed rod holding the bob. This is why the bob accelerates less and thus has a lesser slope in certain parts of the graph.



Figure 10: A pendulum whose initial angle was π radians. With the highest gravitational potential energy, the bob is initially unaffected. This is because the rod supporting it is directly under it at the beginning of the simulation.

This explains the seemingly flat velocity for the first ~ 4 seconds of the simulation.

In observing Figures 3-10, it is evident that the period changes as a function of initial angular position. This is contradictory to what is taught in basic mechanics course. This is because in basic mechanics courses, the $\sin(\theta) = \theta$ approximation is made. This approximation is only allowed if the angular displacement is small. Since significantly larger angular displacements were used, the period is no longer constant. Figure 11 displays oscillation period as a function of initial angle.



Figure 11: Notice the apparent exponential increase of oscillatory period as a function of initial angle. Note, 'apparent' exponential increase because the last point on this graph is associated with a vertical pendulum bob and therefore, the next point would begin a new cycle of oscillatory period values.

As mentioned in Theory, it is important to make simulations that abide by real physical rules, one of which is conservation of energy. The following figures, Figures 12-15 display the energies of different tehniques used in this lab.



Figure 12: The total energy of RK2 and RK4 methods with an initial bob angle of 1 radian. Note that although RK2 seems to run away, it only increases by 0.0014 units of energy over a span of 100 seconds. RK4 seems to not deviate at all, indicating an excellent differential equation solving code.



Total Energy of RK2 and RK4 as a Function of Time (initial position = 2.9 rad, dt = 10 ms)

Figure 13: The total energy of RK2 and RK4 methods with an initial bob angle of 2.9 radians. Two things to note, the oscillatory behavior of the total energy of the RK2 method, albeit a total oscillation of 0.003 units of energy, and the stability of RK4. Again, the total energy fluctuations of RK4 cannot even be seen on this scale.

It is also extremely valuable to look at the fractional error of the energies produced by the code.



Figure 14: The fractional error of energy of RK2 and RK4 methods. The graph is done on a logscale to depict how miniscule the fractional error actually is. This graph is representative of an initial angular displacement of 1 radian.



Figure 15: The fractional error of energy of RK2 and RK4 methods, also on a logarithmic scale. This graph is representative of an initial angular displacement of 2.9 radians.

The final phenomenon observed in this lab was the addition of drag forces to the pendulum. As is known from study of classical mechanics, a harmonic oscillator can be damped in three ways; an oscillator may be underdamped, overdamped or critically damped. The following figure, Figure 16 displays all three cases. Referring to the drag force equation above, $b_{underdamped} = 0.05 \frac{kg}{s}$, $b_{overdamped} = 10.0 \frac{kg}{s}$, and $b_{criticallydamped} = 2.0 \frac{kg}{s}$.



Figure 16: An excellent depiction of a single harmonic oscillator undergoing different damping constants.

4 Conclusion

There are a few different approaches to solving coupled differential equations; a few of which are better than others. This lab was an excellent exploration of the different techniques available to computer programmers. It was determined that the 4th order Runge-Kutta technique was the best of those used in this lab. I am sure there are other, even more accurate approximations to differential equations. These techniques will prove to be extremely valuable in future programming endeavors. Another valuable sub-lesson in this lab was the use of functions. Properly defining and pointing to functions may save lines of spaghetti code and will prove extremely important for code efficiency.

5 References

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