# CHAPTER 1 A First Numerical Problem

Many problems encountered in physics involve ordinary differential equations. Examples include projectile motion, harmonic motion, and celestial mechanics, topics we will be discussing extensively in the next few chapters. We therefore begin with a problem involving a first-order differential equation and use it to introduce some computational techniques that will be employed extensively in later chapters. We will also proceed step by step through the construction of a program to deal with this problem, so as to illustrate in detail how a numerical approach is translated into a (working) computer program.

In this chapter it is not possible to provide a complete introduction to programming for students who have no previous exposure to the subject. Rather, our goal is to enable students with some (even limited) experience in programming to begin writing programs to treat the physics that will be encountered in this book. However, those students with no prior experience should not give up hope! With some extra effort and access to a good instructor or book on computer programming (or both), such students should be able to handle the material in this and later chapters.

#### 1.1 RADIOACTIVE DECAY

It is well known that many nuclei are unstable. A typical example is the nuclear isotope  $^{235}$ U (the uranium nucleus that contains 143 neutrons and 92 protons, for a total of 235 nucleons), which has a small, but not insignificant, probability for decaying into two nuclei of approximately half its size, along with an assortment of protons, neutrons, electrons, and alpha particles. This process of radioactive decay is random in the following sense. If you were given a single  $^{235}$ U nucleus, you would not be able to predict precisely when its decay would take place. The best you could do would be to give the *probability* for decay. An equivalent way to describe such a process would be to give the average time for decay; for  $^{235}$ U the mean lifetime is approximately  $1 \times 10^9$  years.

It is useful to imagine that we have a sample containing a large number of  $^{235}$ U nuclei, which would usually be the case if we were actually doing an experiment to study radioactive decay. If  $N_U(t)$  is the number of uranium nuclei that are present in the sample at time t, the behavior is governed by the differential equation

$$\frac{dN_U}{dt} = -\frac{N_U}{\tau} , \qquad (1.1)$$

where  $\tau$  is the "time constant" for the decay. You can show by direct substitution that the solution to this differential equation is

$$N_U = N_U(0) e^{-t/\tau} , \qquad (1.2)$$

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where  $N_U(0)$  is the number of nuclei present at t = 0. This solution may be familiar to you; similar equations and similar solutions are found in many other contexts.<sup>1</sup> We note that at time  $t = \tau$  a fraction  $e^{-1}$  of the nuclei that were initially present has not yet decayed. It turns out that  $\tau$  is also the mean lifetime of a nucleus.

#### 1.2 A NUMERICAL APPROACH

While the differential equation (1.1) can be solved without resorting to a numerical approach, this problem is useful for introducing several computational methods that will be used extensively in later chapters. With that in mind we now consider a simple method for solving this problem numerically. Our goal is to obtain  $N_U$  as a function of t. Given the value of  $N_U$  at one particular value of t (usually at t = 0), we want to estimate its value at later times. This is called an initial value problem, and various general approaches for solving such ordinary differential equations are discussed in Appendix A. Here we will describe one particularly useful line of attack that is based on the Taylor expansion for  $N_U$ ,

$$N_U(\Delta t) = N_U(0) + \frac{dN_U}{dt} \Delta t + \frac{1}{2} \frac{d^2 N_U}{dt^2} (\Delta t)^2 + \cdots , \qquad (1.3)$$

where  $N_U(0)$  is the value of our function at time t = 0,  $N_U(\Delta t)$  is its value at  $t = \Delta t$ , and the derivatives are evaluated at t = 0. If we take  $\Delta t$  to be small, then it is usually a good approximation to simply ignore the terms that involve second and higher powers of  $\Delta t$ , leaving us with

$$N_U(\Delta t) \approx N_U(0) + \frac{dN_U}{dt} \Delta t$$
 (1.4)

The same result can be obtained from the definition of a derivative. The derivative of  $N_U$  evaluated at time t can be written as

$$\frac{dN_U}{dt} \equiv \lim_{\Delta t \to 0} \frac{N_U(t + \Delta t) - N_U(t)}{\Delta t} \approx \frac{N_U(t + \Delta t) - N_U(t)}{\Delta t} , \qquad (1.5)$$

where in the last approximation we have assumed that  $\Delta t$  is small but nonzero. We can rearrange this to obtain

$$N_U(t + \Delta t) \approx N_U(t) + \frac{dN_U}{dt} \Delta t$$
, (1.6)

which is equivalent to (1.4). It is important to recognize that this is an *approxima*tion, which is why it contains the  $\approx$  symbol, not the = symbol. The error terms that were dropped in deriving this result are of order  $(\Delta t)^2$ , which makes them at least one factor of  $\Delta t$  smaller than any of the terms in (1.6). Hence, by making  $\Delta t$ small, we would expect that the error terms can be made negligible. This is, in fact, the case in many problems, but there are situations in which the error terms can

<sup>&</sup>lt;sup>1</sup>For example, an equation of this kind describes the time dependence of the voltage across a capacitor in an RC circuit.

still make life complicated. Therefore, it is important to be careful when discussing the errors involved in this numerical approach; we will return to this point later in this chapter, and in more detail in Appendix A.

From the physics of the problem we know the functional form of the derivative (1.1), and if we insert it into (1.6) we obtain

$$N_U(t + \Delta t) \approx N_U(t) - \frac{N_U(t)}{\tau} \Delta t$$
 (1.7)

This approximation forms the basis for a numerical solution of our radioactive decay problem. Given that we know the value of  $N_U$  at some value of t, we can use (1.7) to estimate its value a time  $\Delta t$  later.<sup>2</sup> Usually we are given, or can manage to discover, the initial value of the function, that is, the value at time t = 0. We can then employ (1.7) to estimate its value at  $t = \Delta t$ . This result can be used in turn to estimate the value at  $t = 2\Delta t$ ,  $3\Delta t$ , etc., and thereby lead to an approximate solution  $N_U(n\Delta t)$ at times  $n\Delta t$  where n is an integer.<sup>3</sup> We cannot emphasize too strongly that the numerical "solution" obtained in this way is only an approximation to the "true," or exact, solution. Of course, one of our goals is to make the difference between the two negligible.

The approach to calculating  $N_U(t)$  embodied in (1.6) and (1.7) is known as the *Euler method* and is a useful general algorithm for solving ordinary differential equations. We will use this approach, and closely related methods, extensively in this book. Other methods for solving equations of this kind will be discussed in later chapters, and more systematic discussions of all of these approaches and the typical errors associated with them are the subject of Appendix A. For now, the reader should realize that while the Euler method arises in a very natural way, it is certainly not the only algorithm for dealing with problems of this sort. We will see that the different approaches have their own strengths and weaknesses, which make them more or less suitable for different types of problems.

### 1.3 DESIGN AND CONSTRUCTION OF A WORKING PROGRAM: CODES AND PSEUDOCODES

In the previous section we introduced the Euler method as the basis for obtaining a numerical solution to our radioactive decay problem. We now consider how to translate that algorithm into a working computer program. Perhaps the first choice that one must make in writing a program is the choice of programming language. From the authors' experiences, there are many programming languages that are well suited for the kinds of problems we address in this book, and it is impossible for us to give example programs in all of these languages. However, it is possible to describe the structure of a program in a general way that is useful to users of many different languages. We will do this using a "language" known as *pseudocode*. This is not a precise programming language, but rather a description of the essential

<sup>&</sup>lt;sup>2</sup>As you might expect, the quality of this estimate, i.e., its *accuracy*, will depend on the value of  $\Delta t$ . This is a very important issue that we will be discussing in some detail below and in Appendix A.

<sup>&</sup>lt;sup>3</sup>Note that errors made each at each time step, i.e., each time (1.7) is used, will accumulate.

parts of an algorithm, expressed in "common" language. The idea is to give enough detail so that you (the readers of this book) can see how to translate each piece of pseudocode into the specific instructions of your favorite programming language. In most of this book, we will give our examples only in pseudocode. However, in this chapter we will work through an example using pseudocode along with actual codes in two popular languages, Fortran and C, so that you can see how the translation from pseudocode to an actual programming language can be done.<sup>4</sup> Working programs for many of the problems in this book are available in Fortran, C, and Basic at our Web site.<sup>5</sup>.

While programming, like handwriting, is a highly individualized process, there are certain recommended practices. After all, as in handwriting, it is important that we be able to understand programs written by others, as well as those we ourselves have written! With that in mind, this book will try to promote proper programming habits. The (admittedly very loose) analogy between handwriting and programming can be carried one step further. The first thing you should do in writing any program is to think. Before writing any detailed code, construct an outline of how the problem is to be solved and what variables or parameters will be needed. Indeed, the pseudocode version of a program will often provide this outline. For our decay problem we have already laid the foundation for a numerical solution in our derivation of (1.7). This equation also contains all of the variables we will need,  $N_U$ , t,  $\tau$ , and  $\Delta t$ . Our stated goal was to calculate  $N_U(t)$ , but since the numerical approximation (1.7) involves the values of  $N_U$  only at times t = 0,  $t = \Delta t, t = 2\Delta t$ , etc., we will actually calculate  $N_U$  at just these values of t. We will use an array to store the values of  $N_U$  for later use. An array is simply a table of numbers (which will be described in more detail shortly). The first element in our array, that is, the first entry in the table, will contain  $N_U$  at t = 0, the second element will be the value at  $t = \Delta t$ , and so on. Our general plan is then to apply (1.7) repetitively to calculate the values of  $N_{U}(t)$ .

The overall structure of the program consists of four basic tasks: (1) declare the necessary variables, (2) initialize all variables and parameters, (3) do the calculation, and (4) store the results.

# **EXAMPLE 1.1** Pseudocode for the main program portion of the radioactive decay problem

- Some comment text to describe the nature of the program.
  - $\triangleright$  Declare necessary variables and arrays.
  - $\triangleright$  initialize variables.
  - $\triangleright$  Do the actual *calculation*.
  - $\triangleright$  store the results.

 $<sup>^4 \</sup>rm We$  are certainly not implying that everyone should use Fortran or C, but these are the authors' favorites.

 $<sup>^5</sup>$ www.physics.purdue.edu/ $\sim$ giordano/comp-phys.html

Note that this is only the *main program*; the individual tasks such as initialization of variables and the actual calculation, will be done in subroutines or functions, which we will discuss below. First we consider how this main program might look in Fortran.<sup>6</sup>

radioactive decay main program in Fortran

```
c Simulation of radioactive decay
c Program to accompany "Computational Physics" by N. Giordano/H. Nakanishi
            program decay
c declare the arrays we will need
            double precision n_uranium(100), t(100)
c use subroutines to do the work
            call initialize(n_uranium,t,tau,dt,n)
            call calculate(n_uranium,t,tau,dt,n)
            call store(n_uranium,t,n)
            stop
            end
```

Our program begins with a few comment statements that identify the program and tell a little about what it is supposed to do. In Fortran, comment lines are indicated by the 'c' in the first character in a line. Similar features are present in most languages.

The first line program decay gives the name of the main program. The line double precision n\_uranium(100), t(100) declares the two arrays that will be used to store  $N_U$  and t. This is done in the main program because the subroutines that do the work will pass the arrays among ach other through the main program. The first array, n\_uranium(), will contain the calculated values of the number of uranium nuclei, while t() will contain the corresponding values of the time. Here we have arranged for our arrays n\_uranium() and t() to each hold 100 values, as we expect this to be enough for this problem (of course, many languages allow one to resize an array as needed during a calculation). Note that we have used the descriptive name n\_uranium to make the program easier to read and understand. It is also tempting to use the name time for the other array (instead of t), but some languages use time as a "reserved name" (e.g., the name of the time-of-day function), so to be safe we will avoid using it.

The rest of the work is done in three subroutines, initialize, calculate, and store which are called in succession. The subroutine names describe the function of each; these tasks correspond directly to the general program outline mentioned above. The call statements also include the names of the variables that each routine needs to do its job. The subroutine initialize sets the initial values of the variables, calculate uses the Euler method to do the computation,

<sup>&</sup>lt;sup>6</sup>In the example Fortran codes that we list in this chapter, we have chosen an old (some may say *ancient*) style for widest compatibility. Today's Fortrans (*Fortran90* and *Fortran95*), though backward compatible with these examples, allow codes to be written in much more robust and extensible ways. However, we are not teaching a computer language in this book, and thus have decided to stick with the style that is most compatible with whatever compiler the reader may have.

and store puts the results into a file for later use (such as a graphical display). We next consider these three routines.

## EXAMPLE 1.2 Pseudocode for subroutine initialize

- Prompt for and assign  $N_U(0)$ ,  $\tau$ , and  $\Delta t$ .
- Set initial value of time, t(0).
- Set number of time steps for calculation.

A Fortran version of this subroutine could read

Fortran version of subroutine initialize

```
subroutine initialize(nuclei,t,tc,dt,n)
С
        Initialize variables
        double precision nuclei(1),t(1)
        print *,'initial number of nuclei -> '
        read(5,*) nuclei(1)
        print *,'time constant -> '
        read(5,*) tc
        print *,'time step -> '
        read(5,*) dt
        print *,'total time -> '
        read(5,*) time
        t(1) = 0
        n=min(int(time/dt),100)
        return
        end
```

In Fortran all subroutines begin with the subroutine name statement where name is the subroutine name. As in most other languages, the variables listed in parenthesis after the word initialize are passed into and out of the subroutine from/to the calling routine. This variable list must be in correspondence with the list used when the subroutine is called from the main program (or anywhere else). Comparing the calling line and the first line of the subroutine, we see that some of the names in the variable list in the "calling" part of the program, n\_uranium,t,tau,dt,n, and the list in the "receiving" part of the program, nuclei,t,tc,dt,n are quite different. For example, the array names n\_uranium and nuclei do not agree. But, as in most languages, the array and variable names declared within a subroutine definition are *dummy* names, and only the corresponding arrays and variables in the calling program are actually used.

After getting the calling variables organized, the initialize subroutine sets the initial values of the number of nuclei and the time. These are just the first values in the arrays nuclei(1) and t(1). The print statements prompt the user for input, while the read statements take in the values. The last job is to set the value of n, which is the number of time steps to be performed.

The real work of computing the number of remaining nuclei is done in the subroutine calculate.

#### EXAMPLE 1.3 Pseudocode for subroutine calculate

- For each time step i (beginning with i = 1), calculate  $N_U$  and t at step i + 1:
  - $\triangleright N_U(t_{i+1}) = N_U(t_i) (N_U(t_i)/\tau)dt$  (Use the Euler method, (1.7))
  - $\triangleright t_{i+1} = t_i + \Delta t.$
  - $\triangleright$  repeat for n-1 time steps

In Fortran this can be written as

Subroutine calculate in Fortran

This routine loops through each time step using the do and continue statements (other languages have analogous facilities to write simple loops). The key statement is the one in which n\_uranium(i+1) is calculated. This statement contains all of the physics of the program and is closely analogous to (1.7). As mentioned above, the array n\_uranium corresponds to the variable  $N_U(t)$ , and the value stored in the ith element of n\_uranium is the number of uranium nuclei present at time t(i).

The final subroutine **store** writes the result to a file. It uses a standard **Fortran** approach to store the results in the file **decay.dat**. The values of t and  $N_U$  are written as pairs, with a separate line for each value of t. The results can then be read from this file, in order to plot the results, or use them in a subsequent calculation.

Subroutine store in Fortran

For convenience, our complete Fortran program is listed in one piece below.

Fortran version of radioactive decay program

```
c Simulation of radioactive decay
c Program to accompany "Computational Physics" by N. Giordano/H. Nakanishi
        program decay
c
        declare the arrays we will need
        double precision n_uranium(100), t(100)
        use subroutines to do the work
с
        call initialize(n_uranium,t,tau,dt,n)
        call calculate(n_uranium,t,tau,dt,n)
        call store(n_uranium,t,n)
        stop
        end
с
        subroutine initialize(nuclei,t,tc,dt,n)
        Initialize variables
с
        double precision nuclei(1),t(1)
        print *,'initial number of nuclei -> '
        read(5.*) nuclei(1)
        print *,'time constant -> '
        read(5,*) tc
        print *,'time step -> '
        read(5,*) dt
        print *,'total time -> '
        read(5,*) time
        t(1) = 0
        n=min(int(time/dt),100)
        return
        end
с
        subroutine calculate(n_uranium,t,tau,dt,n)
        Now use the Euler method
с
с
        Variable dimensioning is used for arrays n_uranium() and t()
        double precision n_uranium(n),t(n)
        do i = 1, n-1
                n_uranium(i+1) = n_uranium(i)-(n_uranium(i)/tau)*dt
                t(i+1) = t(i) + dt
        end do
        return
        end
с
        subroutine store(n_uranium,t,n)
        double precision n_uranium(n),t(n)
        open(1,file='decay.dat')
        do i=1,n
                write(1,20) t(i),n_uranium(i)
        end do
        close(1)
20
        format(1x,1p,2(e12.5,2x))
        return
        end
```

We have spent a lot of time discussing a Fortran program for the radioactive decay problem, but the basic ideas — the basic structure of the program — can be implemented in many other languages. Below we give a program written in C that does the same calculation, using the same program structure with the same algorithm. It begins by declaring the necessary variables, then uses subroutines initialize, calculate, and store, as outlined in the pseudocode in Example 1.3. These subroutines are quite similar to those in the Fortran program given at left, and produce identical results.

Radioactive decay program in C

```
/* decay.c
* Simulation of radioactive decay
 * Program to accompany "Computational Physics" by N. Giordano/H. Nakanishi
*/
#include <math.h>
#include <stdio.h>
#define MAX 100
double n_uranium[MAX]; /* number of uranium atoms
                                                    */
double t[MAX];
                       /* store time values here
                                                     */
double dt;
                       /* time step
                                                     */
double tau;
                       /* decay time constant
                                                     */
double t_max;
                       /* time to end simulation
                                                     */
main()
ſ
       initialize(n_uranium,t,&tau,&dt);
       calculate(n_uranium,t,tau,dt);
       store(n_uranium,t);
}
/*
        initialize the variables */
initialize(nuclei,t,tc,dt)
double *nuclei,*t,*tc,*dt;
{
       printf("initial number of nuclei -> ");
       scanf("%lf",&(nuclei[0])); /* begin using arrays at index 0 */
       printf("time constant -> ");
       scanf("%lf",tc);
       printf("time step -> ");
        scanf("%lf",dt);
       t[0] = 0.0;
       return;
}
/* calculate the results and store them in the arrays t() and n_u() */
calculate(nuclei,t,tc,dt)
double *nuclei,*t,tc,dt;
{
        int i;
        for(i = 0; i < MAX-1; i++) {</pre>
               nuclei[i+1] = nuclei[i] - (nuclei[i] / tc) * dt;
               t[i+1] = t[i] + dt;
```

```
}
        return:
}
/*
        save the results to a file */
store(nuclei,t)
double *nuclei,*t;
Ł
        FILE *fp_out;
        int i;
        fp_out = fopen("decay.dat","w");
        for(i = 0; i < MAX; i++) {</pre>
                fprintf(fp_out,"%g\t%g\n",t[i],nuclei[i]);
        }
        fclose(fp_out);
        return;
}
```

We have given specific example programs in Fortran and C, as these are languages that we (the authors) use in our everyday work.<sup>7</sup> However, this certainly does *not* mean that one of these languages is the best choice for you; that is a judgment that you must make.

Next we come to an *extremely* important point, that is a key issue in nearly all the problems we will discuss in this book. Our program decay calculates how  $N_U$ varies with time, and puts the results as numbers into a file. However, we still have the job of understanding the results. In this problem, and in most cases, this job of understanding is best done by examining the results in graphical form. While there will be times when the result of a calculation can be expressed or conveyed as one or two numbers, it will usually happen that our calculations produce a lot of numbers. Making sense of such results is almost always simplest when the results are displayed graphically. In our decay problem we will want to make a graph of  $N_{U}$  as a function of t. Methods for producing a graphical display, either on a video display or on paper, can vary a lot from one computer platform and language to another, and there is no way that we can possibly give a full discussion of how you should go about it on your particular system. Some languages have very powerful graphics capabilities "built-in" (e.g., Matlab and Mathematica), while in other cases you may need to use separate graphics programs to display the results in the file decay.dat.

The ability to easily display results in graphical form is *absolutely essential* for work in computational physics. Fortunately, virtually all computer systems have the programs you will need (so you will not have to write your own!). Before you go much further in this book we urge you to learn how to use the graphics capabilities of your particular system.

Figure 1.1 shows an example of the output produced by our radioactive decay program, along with the exact result, Equation (1.2). Here we have used the initial values  $n\_uranium(1) = 100$  and t(1) = 0, along with a time constant of 1 s and a time step of 0.05 s. We will consider the choice of time step later. For now we note only that our calculated values compare well with the exact result.

<sup>&</sup>lt;sup>7</sup>This may also give you some idea of when we first learned to program.