### Lab 6

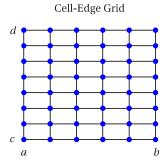
# The 2-D Wave Equation With Staggered Leapfrog

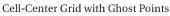
#### Two dimensional grids

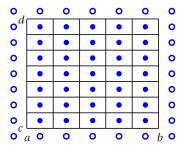
In this lab we will do problems in two spatial dimensions, x and y, so we need to spend a little time thinking about how to represent 2-D grids. For a simple rectangular grid where all of the cells are the same size, 2-D grids are pretty straightforward. We just divide the x-dimension into equally sized regions and the y-dimension into equally sized regions, and the two one dimensional grids intersect to create rectangular cells. Then we put grid points either at the corners of the cells (cell-edge) or at the centers of the cells (cell-centered). On a cell-center grid we'll usually want ghost point outside the region of interest so we can get the boundary conditions right.

NumPy has a nice way of creating rectangular two-dimensional grids using the meshgrid command. You can create 2-d rectangle defined by  $x \in [a, b]$  and  $y \in [c, d]$  and then plot a function on that grid this way:

```
from mpl_toolkits.mplot3d import Axes3D
import matplotlib.pyplot as plt
from matplotlib import cm
import numpy as np
# Make 1D x and y arrays
Nx=20
a = -1.5
x,hx = np.linspace(a,b,Nx,retstep = True)
Ny=10
c = -1.2
d=1.2
y, hy = np.linspace(c,d,Ny,retstep = True)
# Make the 2D grid and evaluate a function
X, Y = np.meshgrid(x,y,indexing='ij')
Z = X**2 + Y**2
# Plot the function as a surface.
fig = plt.figure(1)
ax = fig.gca(projection='3d')
surf = ax.plot_surface(X, Y, Z, cmap=cm.viridis)
plt.xlabel('x')
plt.ylabel('y')
fig.colorbar(surf)
```







**Figure 6.1** Two types of 2-D grids.

The argument indexing='ij' in the meshgrid function switches the ordering of the elements in the resulting matrices from the matrix indexing convention Z[row, col] to the function indexing convention  $Z[x_i, y_i]$  for representing  $Z(x_i, y_i)$ .

- **P6.1** (a) Use the code fragment above in a program to create a 30-point celledge grid in x and a 50-point cell-edge grid in y with a = 0, b = 2, c = -1, d = 3. Switch back and forth between the argument indexing='ij' and indexing='xy', and look at the different matrices that result. Convince the TA that you know what the difference is. (HINT: When we write matrices, rows vary in the y dimension and columns vary in the x direction, whereas with  $Z(x_i, y_i)$  we have a different convention. NumPy's naming convention seems backward to us, but we didn't come up with it. Sorry.) We recommend that you use the indexing='ij' convention, as it tends to more readable code for representing  $Z(x_i, y_i)$ .
  - (b) Using this 2-D grid, evaluate the following function of x and y:

$$f(x,y) = e^{-(x^2 + y^2)} \cos\left(5\sqrt{x^2 + y^2}\right)$$
 (6.1)

Use the plot\_surface command to make a surface plot of this function. Properly label the *x* and *y* axes with the symbols *x* and *y*, to get a plot like Fig. 6.2.

There are a lot more options for plotting surfaces in Python, but we'll let you explore those on your own. For now, let's do some physics on a two-dimensional grid.

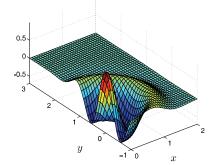


Figure 6.2 Plot from Problem 6.1. The graphic in this figure was created with Matlab. Python's graphics engine is sort of privative in comparison to Matlab's, so you won't get something quite so nice. In particular, getting the scaling right is painful in Python.

# The two-dimensional wave equation

The wave equation for transverse waves on a rubber sheet is <sup>1</sup>

$$\mu \frac{\partial^2 z}{\partial t^2} = \sigma \left( \frac{\partial^2 z}{\partial x^2} + \frac{\partial^2 z}{\partial y^2} \right) \tag{6.2}$$

In this equation  $\mu$  is the surface mass density of the sheet, with units of mass/area. The quantity  $\sigma$  is the surface tension, which has rather odd units. By inspecting the equation above you can find that  $\sigma$  has units of force/length, which doesn't seem right for a surface. But it is, in fact, correct as you can see by performing the following thought experiment. Cut a slit of length L in the rubber sheet and think about how much force you have to exert to pull the lips of this slit together. Now imagine doubling L; doesn't it seem that you should have to pull twice as hard

<sup>&</sup>lt;sup>1</sup>N. Asmar, *Partial Differential Equations and Boundary Value Problems* (Prentice Hall, New Jersey, 2000), p. 129-134.

to close the slit? Well, if it doesn't, it should; the formula for this closing force is given by  $\sigma L$ , which defines the meaning of  $\sigma$ .

We can solve the two-dimensional wave equation using the same staggered leapfrog techniques that we used for the one-dimensional case, except now we need to use a two dimensional grid to represent z(x, y, t). We'll use the notation  $z_{j,k}^n = z(x_j, y_k, t_n)$  to represent the function values. With this notation, the derivatives can be approximated as

$$\frac{\partial^2 z}{\partial t^2} \approx \frac{z_{j,k}^{n+1} - 2z_{j,k}^n + z_{j,k}^{n-1}}{\tau^2}$$
 (6.3)

$$\frac{\partial^2 z}{\partial x^2} \approx \frac{z_{j+1,k}^n - 2z_{j,k}^n + z_{j-1,k}^n}{h_x^2}$$
 (6.4)

$$\frac{\partial^2 z}{\partial y^2} \approx \frac{z_{j,k+1}^n - 2z_{j,k}^n + z_{j,k-1}^n}{h_y^2}$$
 (6.5)

where  $h_x$  and  $h_y$  are the grid spacings in the x and y dimensions. We insert these three equations into Eq. (6.2) to get an expression that we can solve for z at the next time (i.e.  $z_{j,k}^{n+1}$ ). Then we use this expression along with the discrete version of the initial velocity condition

$$\nu_0(x_j, y_k) \approx \frac{z_{j,k}^{n+1} - z_{j,k}^{n-1}}{2\tau}$$
 (6.6)

to find an expression for the initial value of  $z_{j,k}^{n-1}$  (i.e. zold) so we can get things started.

**P6.2** (a) Derive the staggered leapfrog algorithm for the case of square cells with  $h_x = h_y = h$ . Write a program that animates the solution of the two dimensional wave equation on a square region that is  $[-5,5] \times [-5,5]$  and that has fixed edges. Use a cell-edge square grid with the edge-values pinned to zero to enforce the boundary condition. Choose  $\sigma = 2$  N/m and  $\mu = 0.3$  kg/m<sup>2</sup> and use a displacement initial condition that is a Gaussian pulse with zero velocity

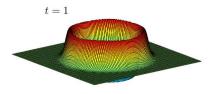
$$z(x, y, 0) = e^{-5(x^2 + y^2)}$$
(6.7)

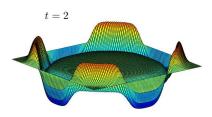
This initial condition doesn't strictly satisfy the boundary conditions, so you should pin the edges to zero.

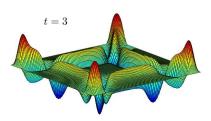
Getting the animation to work can be tricky, so here is a framework of code for the animation loop:

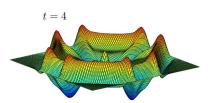
```
from mpl_toolkits.mplot3d import Axes3D
import matplotlib.pyplot as plt
import numpy as np
```

# your code to initialize things









**Figure 6.3** A wave on a rubber sheet with fixed edges.

```
tfinal=10
t=np.arange(0,tfinal,tau)
skip=10
fig = plt.figure(1)
# here is the loop that steps the solution along
for m in range(len(t)):
    # Your code to step the solution
    # make plots every skip time steps
    if m % skip == 0:
        plt.clf()
        ax = fig.gca(projection='3d')
        surf = ax.plot\_surface(X,Y,z)
        ax.set_zlim(-0.5, 0.5)
        plt.xlabel('x')
        plt.ylabel('y')
        plt.draw()
        plt.pause(0.1)
```

Run the simulation long enough that you see the effect of repeated reflections from the edges.

(b) You will find that this two-dimensional problem has a Courant condition similar to the one-dimensional case, but with a factor out front:

$$\tau < fh\sqrt{\frac{\mu}{\sigma}} \tag{6.8}$$

where  $\sqrt{\sigma/\mu}$  is the wave speed and f is an arbitrary constant. Determine the value of the constant f by numerical experimentation. (Try various values of  $\tau$  and discover where the boundary is between numerical stability and instability.)

- (c) Also watch what happens at the center of the sheet by making a plot of z(0,0,t) there. In one dimension the pulse propagates away from its initial position making that point quickly come to rest with z=0. This also happens for the three-dimensional wave equation. But something completely different happens for an even number of dimensions; you should be able to see it in your plot by looking at the behavior of z(0,0,t) before the first reflection comes back.
- (d) Finally, change the initial conditions so that the sheet is initially flat but with the initial velocity given by the Gaussian pulse of Eq. (6.7). In one dimension when you pulse the system like this the string at the point of application of the pulse moves up and stays up until the reflection comes back from the ends of the system. (We did this experiment with the slinky in Lab 5.) Does the same thing happen in the middle of the sheet when you apply this initial velocity pulse?

Answer this question by looking at your plot of z(0,0,t). You should find that the two-dimensional wave equation behaves very differently from the one-dimensional wave equation.

#### Elliptic, hyperbolic, and parabolic PDEs

Let's step back and look at some general concepts related to solving partial differential equations. Three of the most famous PDEs of classical physics are

(i) Poisson's equation for the electrostatic potential V(x, y) given the charge density  $\rho(x, y)$ 

$$\frac{\partial^2 V}{\partial x^2} + \frac{\partial^2 V}{\partial y^2} = \frac{-\rho}{\epsilon_0} + \text{Boundary Conditions}$$
 (6.9)

(ii) The wave equation for the wave displacement y(x, t)

$$\frac{\partial^2 y}{\partial x^2} - \frac{1}{c^2} \frac{\partial^2 y}{\partial t^2} = 0 + \text{Boundary Conditions}$$
 (6.10)

(iii) The thermal diffusion equation for the temperature distribution T(x, t) in a medium with diffusion coefficient D

$$\frac{\partial T}{\partial t} = D \frac{\partial^2 T}{\partial x^2} + \text{Boundary Conditions}$$
 (6.11)

To this point in the course, we've focused mostly on the wave equation, but over the next several labs we'll start to tackle some of the other PDEs.

Mathematicians have special names for these three types of partial differential equations, and people who study numerical methods often use these names, so let's discuss them a bit. The three names are *elliptic*, *hyperbolic*, and *parabolic*. You can remember which name goes with which of the equations above by remembering the classical formulas for these conic sections:

ellipse: 
$$\frac{x^2}{a^2} + \frac{y^2}{b^2} = 1$$
 (6.12)

hyperbola: 
$$\frac{x^2}{a^2} - \frac{y^2}{b^2} = 1$$
 (6.13)

parabola: 
$$y = ax^2$$
 (6.14)

Compare these equations with the classical PDE's above and make sure you can use their resemblances to each other to remember the following rules: Poisson's equation is elliptic, the wave equation is hyperbolic, and the diffusion equation is parabolic. These names are important because each different type of equation requires a different type of algorithm and boundary conditions.

Elliptic equations require the same kind of boundary conditions as Poisson's equation: V(x, y) specified on all of the surfaces surrounding the region of interest. Notice that there is no time delay in electrostatics. When all of the bounding voltages are specified, Poisson's equation says that V(x, y) is determined instantly throughout the region surrounded by these bounding surfaces. Because of the finite speed of light this is incorrect, but Poisson's equation is a good approximation to use in problems where things happen slowly compared to the time it takes light to cross the computing region.

To understand hyperbolic boundary conditions, think about a guitar string described by the transverse displacement function y(x,t). It makes sense to give spatial boundary conditions at the two ends of the string, but it makes no sense to specify conditions at both t=0 and  $t=t_{\rm final}$  because we don't know the displacement in the future. This means that you can't pretend that (x,t) are like (x,y) in Poisson's equation and use "surrounding"-type boundary conditions. But we can see the right thing to do by thinking about what a guitar string does. With the end positions specified, the motion of the string is determined by giving it an initial displacement y(x,0) and an initial velocity  $\partial y(x,t)/\partial t|_{t=0}$ , and then letting the motion run until we reach the final time. So for hyperbolic equations the proper boundary conditions are to specify end conditions on y as a function of time and to specify the initial conditions y(x,0) and  $\partial y(x,t)/\partial t|_{t=0}$ .

Parabolic boundary conditions are similar to hyperbolic ones, but with one difference. Think about a thermally-conducting bar with its ends held at fixed temperatures. Once again, surrounding-type boundary conditions are inappropriate because we don't want to specify the future. So as in the hyperbolic case, we can specify conditions at the ends of the bar, but we also want to give initial conditions at t = 0. For thermal diffusion we specify the initial temperature T(x,0), but that's all we need; the "velocity"  $\partial T/\partial t$  is determined by Eq. (6.11), so it makes no sense to give it as a separate boundary condition. Summarizing: for parabolic equations we specify end conditions and a single initial condition T(x,0) rather than the two required by hyperbolic equations.

If this seems like an arcane side trip into theory, we're sorry, but it's important. When you numerically solve partial differential equations you will spend 10% of your time coding the equation itself and 90% of your time trying to make the boundary conditions work. It's important to understand what the appropriate boundary conditions are.

Finally, there are many more partial differential equations in physics than just these three. Nevertheless, if you clearly understand these basic cases you can usually tell what boundary conditions to use when you encounter a new one. Here, for instance, is Schrödinger's equation:

$$i\hbar\frac{\partial\psi}{\partial t} = -\frac{\hbar^2}{2m}\frac{\partial^2\psi}{\partial x^2} + V\psi \tag{6.15}$$

which is the basic equation of quantum (or "wave") mechanics. The wavy nature of the physics described by this equation might lead you to think that the proper boundary conditions on  $\psi(x, t)$  would be hyperbolic: end conditions on  $\psi$  and

initial conditions on  $\psi$  and  $\partial \psi/\partial t$ . But if you look at the form of the equation, it looks like thermal diffusion. Looks are not misleading here; to solve this equation you only need to specify  $\psi$  at the ends in x and the initial distribution  $\psi(x,0)$ , but not its time derivative.

And what are you supposed to do when your system is both hyperbolic and parabolic, like the wave equation with damping?

$$\frac{\partial^2 y}{\partial x^2} - \frac{1}{c^2} \frac{\partial^2 y}{\partial t^2} - \frac{1}{D} \frac{\partial y}{\partial t} = 0$$
 (6.16)

The rule is that the highest-order time derivative wins, so this equation needs hyperbolic boundary conditions.

**P6.3** Make sure you understand this material well enough that you are comfortable answering basic questions about PDE types and what types of boundary conditions go with them on a quiz and/or an exam. Then explain it to the TA to pass this problem off.