## Numerical Treatment of Differential Equations: Homework 6

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March 11, 2011

Our finite difference code solves Laplace's equation

$$-\Delta u = f$$

by approximating the Laplacian with matrix operator **A**. **A** has eigenvalues  $\lambda^{a,b} = \frac{4}{h^2} \left\{ \sin^2 \left( \frac{a\pi h}{2} \right) + \sin^2 \left( \frac{b\pi h}{2} \right) \right\}$  and eigenvectors  $v_{ij}^{a,b} = \sin(ai\pi h)\sin(bj\pi h)$  for  $1 \le a, b \le m$ . If we set  $f = \lambda^{a,b}v^{a,b}$  we will be solving the eigenvalue problem

$$\mathbf{A}u = \lambda^{a,b}v^{a,b}$$

and we should exactly recover the solution  $u = v^{a,b}$ . Indeed, for various values of a and b we recover the exact eigenvectors to machine precision as shown in Figures (1) - (6).

If we instead replace our forcing function with the eigenvalues and eigenvectors of the continuous operator,  $\lambda_{a,b} = (a^2 + b^2)\pi^2$  and  $v_{a,b} = \sin(a\pi x)\sin(b\pi y)$ , respectively, we can observe the convergence of our discrete operator to the continuous. The final set of figures demonstrate this convergence for various values of a and b.

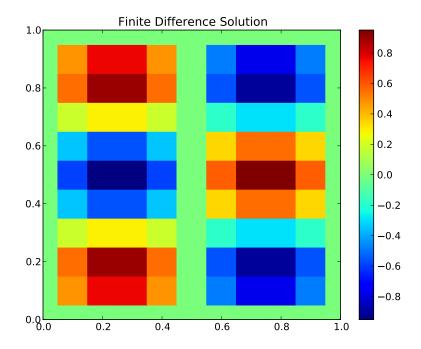


Figure 1: a = 2, b = 3, error = 2.24662632e - 16

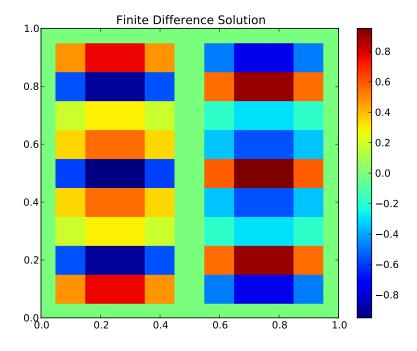


Figure 2: a = 2, b = 7, error = 6.56173233e - 16

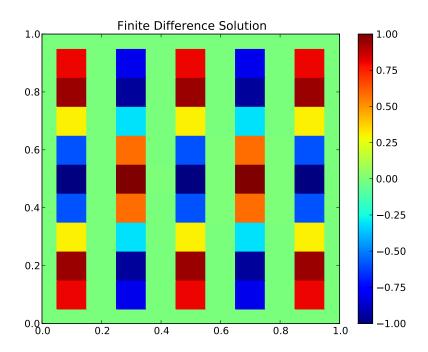


Figure 3: a = 5, b = 3, error = 5.12525209e - 16

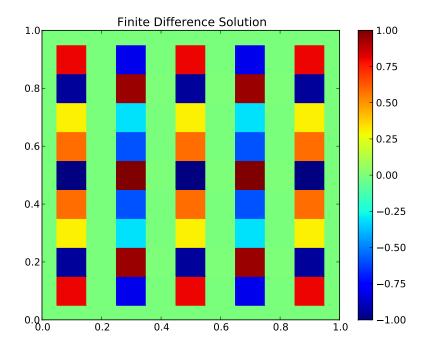


Figure 4: a = 5, b = 7, error = 4.37301726e - 16

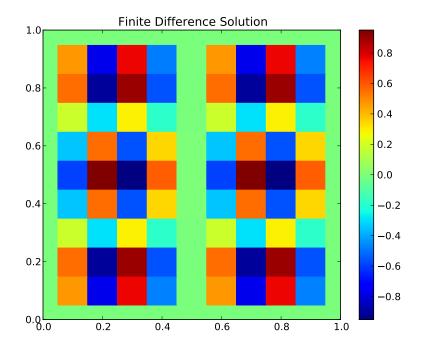


Figure 5: a = 8, b = 3, error = 6.98042995e - 16

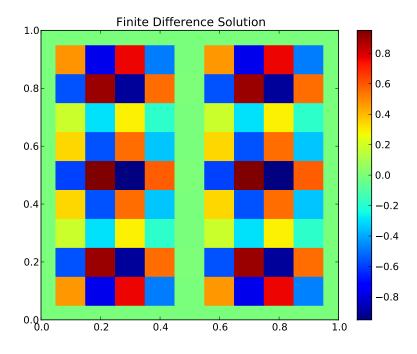


Figure 6: a = 8, b = 7, error = 3.56630134e - 16

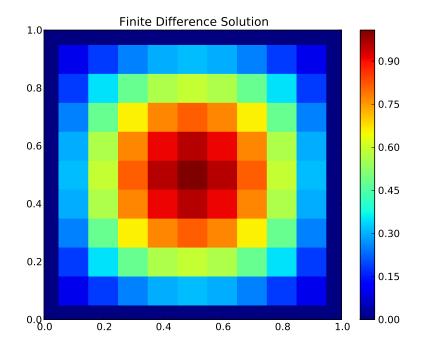


Figure 7: a = 1, b = 1: Eigenvector

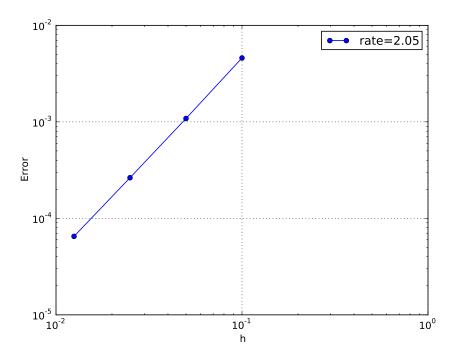


Figure 8: a = 1, b = 1: Convergence

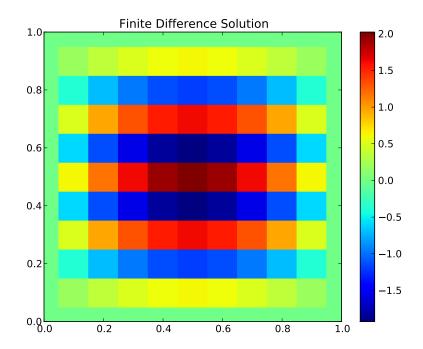


Figure 9: a = 1, b = 9: Eigenvector

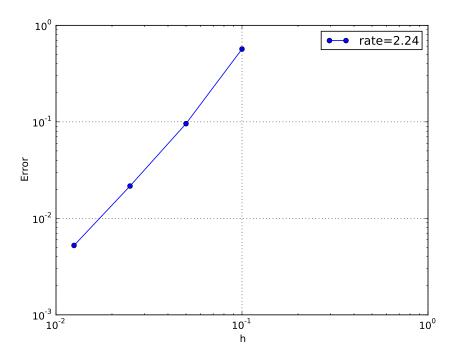


Figure 10: a = 1, b = 9: Convergence

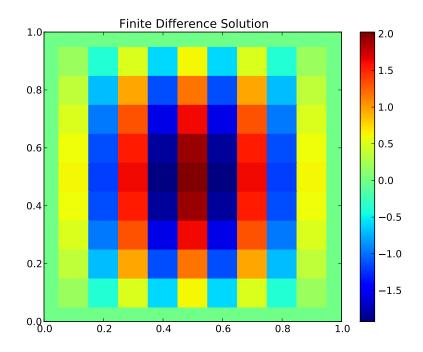


Figure 11: a = 9, b = 1: Eigenvector

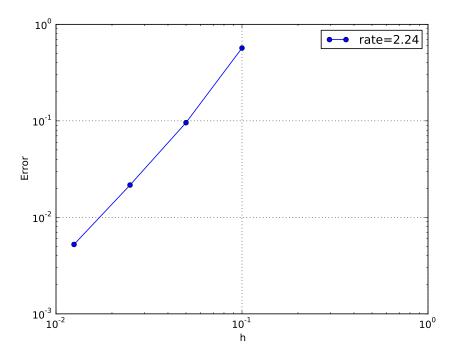


Figure 12: a = 9, b = 1: Convergence

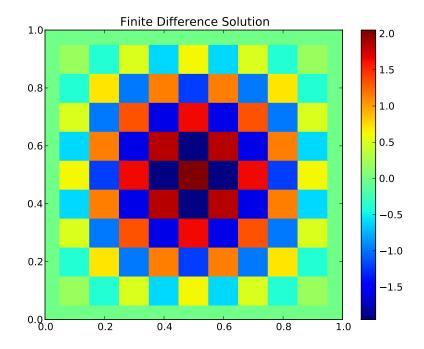


Figure 13: a = 9, b = 9: Eigenvector

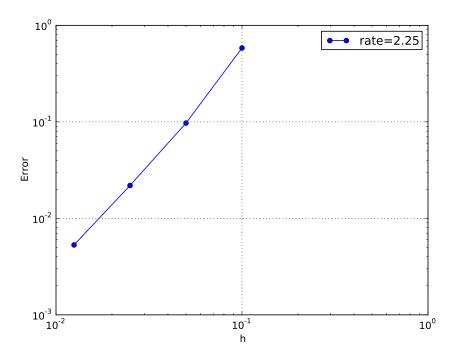


Figure 14: a = 9, b = 9: Convergence

## FDSolver.py

```
# Second Order Finite Difference Solver
# Solves a(x,y)u(x,y) - div(d(x,y)) grad(u(x,y))) = f(x,y)
# Written by: Truman Ellis
# Numerical Treatment of Differential Equations
# Spring 2011
from pylab import *
import code
close('all')
# Set eigenstate variables
aa = 9.
bb = 9.
# Define Initial Refinement
nx = 9
ny = 9
# Define problem domain
xmin = 0.
xmax = 1.
ymin = 0.
ymax = 1.
# Define boundary conditions
def g(x,y):
        return 0
# Define forcing function to allow for convergence tests
def f(x,y):
       # Lambda for discrete operator
       \#L = 4./hx**2*(sin(aa*pi*hx/2)**2 + sin(bb*pi*hx/2)**2)
       # Lambda for continuous operator
       L = (aa**2 + bb**2)*pi**2
       return L*sin(aa*pi*x)*sin(bb*pi*y)
def a(x,y):
      return 0
def d(x,y):
# Set functions for exact solution
def u_ex(x,y):
       return sin(aa*pi*x)*sin(bb*pi*y)
# Define element mapping
def IndexMap(i,j, ny):
return j + ny*i
\begin{array}{ccc} def & \texttt{ReverseMap}(\texttt{k}\,,\,\,\texttt{ny}\,) : \\ & & \texttt{return} & (\texttt{k}//\texttt{ny}\,,\,\,\texttt{k}\%\texttt{ny}\,) \end{array}
# Set number of refinement steps for convergence test
nref = 4
error = zeros(nref)
ndofs = zeros(nref)
hs = zeros(nref)
for r in range(0,nref):
    if r > 0:
             nx = 2*(nx+1)-1
             ny = 2*(ny+1)-1
       ndofs[r] = nx*ny
       \begin{array}{lll} \text{hx} &= & (\text{xmax} - \text{xmin}) / (\text{nx} + 1) \\ \text{hy} &= & (\text{ymax} - \text{ymin}) / (\text{ny} + 1) \end{array}
       hs[r] = hx
       \begin{array}{lll} {\tt X} &= {\tt linspace} \, (\, {\tt xmin} \;,\;\; {\tt xmax} \;,\;\; {\tt nx} + 2) \\ {\tt xh} &= & 0.5 * (\, {\tt X} \, [\, 0 \colon -1\, ] + {\tt X} \, [\, 1 \colon ] \,) \end{array}
       Y = linspace(ymin, ymax, ny+2)

yh = 0.5*(Y[0:-1]+Y[1:])
       x = X[1:-1]

y = Y[1:-1]
       {\tt A} \; = \; {\tt zeros} \; (\, (\, {\tt nx*ny} \; , \, {\tt nx*ny} \, ) \, )
       u = zeros(nx*ny)
       exact = zeros(nx*ny)
       b = zeros(nx*ny)
        for i in range (0,nx):
              for j in range (0,ny):
                     \label{eq:linear_problem} \begin{array}{l} \texttt{A}\left[\texttt{IndexMap}\left(\mathtt{i}\,,\mathtt{j}\,,\mathtt{ny}\right),\texttt{IndexMap}\left(\mathtt{i}\,,\mathtt{j}\,,\mathtt{ny}\right)\right] = \mathtt{a}\left(\mathtt{x}\left[\mathtt{i}\right],\mathtt{y}\left[\mathtt{j}\right]\right) \\ + \left(\mathtt{d}\left(\mathtt{xh}\left[\mathtt{i}\!+\!1\right],\ \mathtt{y}\left[\mathtt{j}\right]\right) \end{array}\right)
```

```
+ d(xh[i], y[j]))/(hx**2) \
                      \begin{array}{c} + \ (d(x[i], yh[j+1]) \setminus \\ + \ d(x[i], yh[j]))/(hy**2) \\ b[IndexMap(i,j,ny)] += f(x[i],y[j]) \end{array}
                           (i < nx-1):
                              {\tt b\,[\,IndexMap\,(\,i\,,\,j\,,\,ny\,)\,]} \;\; + = \; {\tt g\,(\,xmax\,,\,y\,[\,j\,]\,)\,/\,hx\,**2}
                           (i > 0):
                               \texttt{A} \, [\, \texttt{IndexMap} \, (\, \mathtt{i} \, , \, \mathtt{j} \, , \, \mathtt{ny} \, ) \, \, , \, \texttt{IndexMap} \, (\, \mathtt{i} \, -1 \, , \, \mathtt{j} \, , \, \mathtt{ny} \, ) \, ] \, \, = \, -\mathtt{d} \, (\, \mathtt{xh} \, [\, \mathtt{i} \, ] \, \, , \, \, \, \mathtt{y} \, [\, \mathtt{j} \, ] \, ) \, / \, \mathtt{hx} \, **2 \, 
                             b[IndexMap(i,j,ny)] += g(xmin,y[j])/hx**2
                       if (j
                                 < ny -1)
                              (ј
                                 > 0):
                              \begin{array}{ll} {\tt A} \, [\, {\tt IndexMap} \, (\, {\tt i} \, , \, {\tt j} \, , {\tt ny} \, ) \, \, , {\tt IndexMap} \, (\, {\tt i} \, , \, {\tt j} \, -1, {\tt ny} \, ) \, ] \, \, = \, - {\tt d} \, (\, {\tt x} \, [\, {\tt i} \, ] \, , \, \, \, {\tt yh} \, [\, {\tt j} \, ] \, ) \, / \, {\tt hy} \, * \, * \, 2 \, . \end{array}
                              # Calculate exact solution
                      exact[IndexMap(i,j,ny)] = u_ex(x[i],y[j])
       # Solve for finite difference solution
       u = linalg.solve(A,b)
        error[r] = sqrt(((u-exact)**2).sum()/(nx*ny))
       # Plotting
        if r == 0:
               X = append(X, xmax)
               Y = append(Y, ymax)
               U = zeros((nx+2, ny+2))
               E = zeros((nx+2, ny+2))
               for i in range (0, nx):
              for i in range(0, nx):
    for j in range(0, ny):
        U[i+1,j+1] = u[IndexMap(i,j,ny)]
        E[i+1,j+1] = exact[IndexMap(i,j,ny)]

for i in range(0,nx+2):
    U[i,0] = g(X[i],Y[0])
    U[i,-1] = g(X[i],Y[-1])
    E[i,0] = g(X[i],Y[0])
    E[i,-1] = g(X[i],Y[-1])

for j in range(0, ny+2):
    U[0,j] = g(X[0],Y[j])
                       \begin{array}{l} \text{In large (0, ny+z):} \\ \text{U[0,j]} = \text{g(X[0],Y[j])} \\ \text{U[-1,j]} = \text{g(X[-1],Y[j])} \\ \text{E[0,j]} = \text{g(X[0],Y[j])} \\ \text{E[-1,j]} = \text{g(X[-1],Y[j])} \\ \end{array} 
              figure(1)
pcolor(X, Y, U.T)
colorbar()
               title ('Finite Difference Solution')
               figure(2)
               pcolor(X, Y, E.T)
colorbar()
               title('Exact Solution')
               show()
figure(3)
loglog(hs, error, '-o')
(m,b) = polyfit(log(hs),log(error),1)
xlabel('h')
ylabel('Error')
grid()
legend(('rate=%.2f' % (m,),), loc='best')
```