## Computer Methods in Engineering Exercise 6

In this exercise we will work on using the conjugate gradient method to solve an elliptic equation. More specifically, we will solve the Laplace equation we encountered in Exercise 3 . Recall that Exercise 3 was considering flow in porous media as governed by the Darcy equation:

$$\vec{q} = -\frac{k}{u} \nabla p \quad ,$$

were q is the volumetric flow rate, k is the permeability (a measure for how well the porous medium allows for transport of fluids),  $\mu$  is the viscosity of the fluid, and p is the fluid pressure. At steady state this gives the Laplace equation  $\nabla^2 p = 0$ . We considered a two-dimensional model, thus

$$\nabla = \left(\frac{\partial}{\partial x}, \frac{\partial}{\partial y}\right)$$

Assume a sand-body connecting two fluid reservoirs at different pressure. The left reservoir has a pressure  $p_l = 1 \times 10^5\,\mathrm{Pa}$ , while the right reservoir has a pressure  $p_r = 2 \times 10^5\,\mathrm{Pa}$ . The sand-body has a shape between the two reservoirs as outlined in Fig. 1, where the grid cell size is  $100\,\mathrm{m} \times 100\,\mathrm{m}$ . Further, assume a viscosity of  $1 \times 10^{-3}\,\mathrm{Pa}\,\mathrm{s}$ , a permeability of  $1 \times 10^{-10}\,\mathrm{m}^2$ , and assume a sand body thickness of  $10\,\mathrm{m}$ .

We saw in Exercise 3 that this gave the matrix representation for the pressure field as  $A\vec{P} = \vec{b}$ , where the *A* matrix was given as

ſ	-3	1	0	0	0	1	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0 -	1
	1	-3	1	0	0	0	1	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	1
	0	1	-3	1	0	0	0	1	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	
	0	0	1	-3	1	0	0	0	1	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	
	0	0	0	1	-2	0	0	0	0	1	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	
İ	1	0	0	0	0	-4	1	0	0	0	1	0	0	0	0	0	0	0	0	0	0	0	0	0	0	ĺ
İ	0	1	0	0	0	1	-4	1	0	0	0	1	0	0	0	0	0	0	0	0	0	0	0	0	0	İ
İ	0	0	1	0	0	0	1	-4	1	0	0	0	1	0	0	0	0	0	0	0	0	0	0	0	0	İ
İ	0	0	0	1	0	0	0	1	-4	1	0	0	0	1	0	0	0	0	0	0	0	0	0	0	0	İ
	0	0	0	0	1	0	0	0	1	-3	0	0	0	0	1	0	0	0	0	0	0	0	0	0	0	1
	0	0	0	0	0	1	0	0	0	0	-3	1	0	0	0	1	0	0	0	0	0	0	0	0	0	
-	0	0	0	0	0	0	1	0	0	0	1	-4	1	0	0	0	1	0	0	0	0	0	0	0	0	l
A =	0	0	0	0	0	0	0	1	0	0	0	1	-4	1	0	0	0	1	0	0	0	0	0	0	0	
-	0	0	0	0	0	0	0	0	1	0	0	0	1	-4	1	0	0	0	1	0	0	0	0	0	0	
-	0	0	0	0	0	0	0	0	0	1	0	0	0	1	-3	0	0	0	0	1	0	0	0	0	0	۱
	0	0	0	0	0	0	0	0	0	0	1	0	0	0	0	-3	1	0	0	0	1	0	0	0	0	
	0	0	0	0	0	0	0	0	0	0	0	1	0	0	0	1	-4	1	0	0	0	1	0	0	0	ı
	0	0	0	0	0	0	0	0	0	0	0	0	1	0	0	0	1	-4	1	0	0	0	1	0	0	ı
	0	0	0	0	0	0	0	0	0	0	0	0	0	1	0	0	0	1	-4	1	0	0	0	1	0	i
	0	0	0	0	0	0	0	0	0	0	0	0	0	0	1	0	0	0	1	-4	0	0	0	0	1	ĺ
	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	1	0	0	0	0	-2	1	0	0	0	
	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	1	0	0	0	1	-3	1	0	0	
	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	1	0	0	0	1	-3	1	0	
1	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	1	0	0	0	1	-3	1_	
L	. 0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	1	0	0	0	1	-3 _	ı

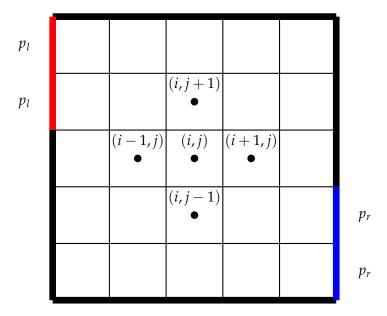


Figure 1: Grid representation of the sand-body connecting the two reservoirs. Thick black lines indicate no-flow boundaries, while red lines indicate boundaries connected to the left reservoir, and blue lines indicate boundaries connected to the right reservoir.

and the vector  $\vec{b}$  as



## Problem 1

Write a Python code to solve for the pressure  $\vec{P}$  using the steepest decent method. If you want a residual smaller than  $10^{-8}$ , how many iterations do you need.

**Solution:** 

```
import numpy as np
import matplotlib.pyplot as plt
from math import *
import time
def steepdesc(A, b, x, maxiter, eps) :
  success = False
```

Exercise 5 Page 2 of 5

```
\#Iterate over estimates of x
  for i in range(0, maxiter):
   #Find search direction:
   r = b-np.dot(A, x)
   res = sqrt(np.dot(r,r))
   fval = 0.5*np.dot(x, np.dot(A, x)) - np.dot(b, x)
    #print("Iteration: ",i,"f value: ",fval,"Error: ",res,"Position: ...
        ",x,"Direction: ",r)
   if(res < eps):
     success = True
     break
    #Compute alfa
   alpha = np.dot(r,r)/np.dot(r,np.dot(A,r))
   #update solution
   x = x + alpha * r
  print('Stepest decent number of iterations:',i)
  return [x, success]
def cg(A, b, x, maxiter, eps) :
 success = False
 r = b-np.dot(A, x)
 d = r
  #Iterate over estimates of x
 for i in range(0, maxiter):
   #Evaluate error:
   rr = b-np.dot(A, x)
   res = sqrt(np.dot(rr,rr))
    #print("Iteration: ",i,"Error: ",res,"Position: ",x,"Direction: ",d)
   if(res < eps):
     success = True
     break
   #Compute alfa
   tmpr=np.dot(r,r) #store temporarily inner-product of r at previous step
   alpha = tmpr/np.dot(r,np.dot(A,d))
   #Update position
   x = x + alpha * d
   #Update r:
   r = r-alpha*np.dot(A,d)
   #Compute beta
   beta = np.dot(r,r)/tmpr
   d = r + beta*d
 return [x, success]
#Grid size
innSide=5
#innCells=(innSide,innSide)
#Boundary conditions
p1=1E5
pr=2E5
A=np.zeros((innSide**2,innSide**2))
b=np.zeros(innSide**2)
#Set up matrix A for all internal cells
```

Exercise 5 Page 3 of 5

```
for jj in range(0,innSide):
  for ii in range(0,innSide):
   cellNum=ii+innSide*jj
   if ii>0:
     A[cellNum, cellNum] -=1
     A[cellNum, cellNum-1]+=1
    if ii<innSide-1:</pre>
      A[cellNum, cellNum]-=1
      A[cellNum, cellNum+1]+=1
    if jj>0:
      A[cellNum, cellNum]-=1
      A[cellNum, ii+innSide*(jj-1)]+=1
    if jj<innSide-1:</pre>
      A[cellNum, cellNum] -=1
      A[cellNum, ii+innSide*(jj+1)]+=1
#Add boundaries to matrix A
#and to vector b
A[0,0] = 1
b[0] = -p1
A[5,5] = 1
b[5] = -p1
A[19, 19] -= 1
b[19]=-pr
A[24,24]=1
b[24] = -pr
eps=1.0e-08
maxiter = 10000
x0=np.zeros(25)
x, success = steepdesc(A, b, x0, maxiter, eps)
print(x, success)
x0=np.zeros(25)
tic=time.time()
x, success = cg(A, b, x0, maxiter, eps)
toc=time.time()
print('Time of CG: ',toc-tic)
print(x, success)
tic=time.time()
x=np.dot(np.linalg.inv(A),b)
toc=time.time()
print('Time of numpy: ',toc-tic)
print(x)
```

Need 1191 iterations.

## Problem 2

Write a Python code to solve for the pressure  $\vec{P}$  using the conjugate gradient method. How does your solution compare with the solution you obtained in Exercise 3 . Compare the time used by your own python code for the conjugate gradient method to the numpy library linalg.inv.

## **Solution:**

*The solutions are exactly the same.* 

Exercise 5 Page 4 of 5

On my computer the CG used 4.8E-4s, while numpy used 3.0E-4s. This is quite comparable.

Exercise 5 Page 5 of 5