S. MishraL. ScarabosioJ. Sukys

## Numerical Methods for Partial Differential Equations

ETH Zürich D-MATH

## Homework Problem Sheet 3

#### Introduction.

This assignment if fully devoted to the Finite Element Method in 2D.

The first problem concerns the implementation of Linear Finite Elements for the diffusion equation with Dirichlet boundary conditions. The implementation will be developed step by step under the perspective of "finite element assembly" of the Galerkin matrix and the right-handside error. The second problem is aimed to discretize the same Dirichlet problem but this time by means of *quadratic finite elements*.

Particular attention is given in the problems to the convergence properties of the solution.

In the online handout you can find the mesh data structures that you need to test your routines and perform the convergence studies.

Every file  $\star$  . mat refers to a mesh and contains a struct. For the convergence studies, the meshes are ordered in increasing order for number of degrees of freedom.

Each struct, let's call it Mesh, contains the following fields:

- Mesh.Coordinates:  $N_V \times 2$  array, with  $N_V$  the number of vertices, containing the vertex coordinates:
- Mesh.Edges:  $N_E \times 2$  array, with  $N_E$  the number of edges; the *i*-th row contains the indices of the two vertices connected by the edge i;
- Mesh. Elements:  $N_{El} \times 3$  array, with  $N_{El}$  the number of elements; the *i*-th row contains the *indices* of the three vertices of the element *i*:
- Mesh.BdFlags:  $N_E \times 2$  array, with  $N_E$  the number of edges, containing the edge boundary flags; the convention is that the boundary flag is 0 is the edge is an interior edge, it is negative for boundary condition flags;
- Mesh. Vert2Edge:  $N_V \times N_V$  array, with  $N_V$  the number of vertices; Mesh. Vert2Edge (i, j) contains the index of the edge connecting the vertices i and j.

To load the mesh data structures, in MATLAB you can use the command load, in Python the code would be

```
from scipy.io import loadmat
Mesh = loadmat(path_to_file)
print Mesh['Coordinates']
print Mesh['Edges']
```

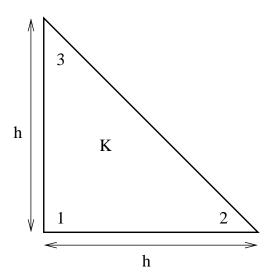


Figure 3.1: Reference element for 2D linear finite elements (h = 1).

## **Problem 3.1 2D Linear Finite Elements (Core problem)**

We consider the problem

$$-\operatorname{div}(D(\boldsymbol{x})\operatorname{\mathbf{grad}} u(\boldsymbol{x})) = f(\boldsymbol{x}) \quad \text{in } \Omega \subset \mathbb{R}^2$$
(3.1.1)

$$u(\mathbf{x}) = g(\mathbf{x}) \quad \text{on } \partial\Omega$$
 (3.1.2)

where D is uniformly positive and bounded in  $\Omega$ , g is a continuous function of  $\partial\Omega$  and  $f\in L^2(\Omega)$ .

We solve (3.1.1)-(3.1.2) by means of Galerkin discretization based on piecewise linear finite elements on triangular meshes of  $\Omega$ .

- (3.1a) Write the variational formulation for (3.1.1)-(3.1.2), specifying the bilinear form and the linear form.
- (3.1b) Show that the solution to the variational formulation in subproblem (3.1a) exists and is unique when g = 0.
- (3.1c) Implement the function

$$shap = shap_LFE(x)$$

which computes the the value of the three local shape functions  $\lambda_i(\boldsymbol{x})$ , i=1,2,3, on the reference element depicted in Fig.3.1 at the points x (a  $N\times 2$  matrix, where each rows contains the coordinates of a point), and returns the values in the  $N\times 3$  matrix shap (each row corresponding to the evaluation of the basis functions in a point).

## (3.1d) Implement the function

$$shap = qrad_shap_LFE(x)$$

which returns the values of the derivatives of local shape functions  $\lambda_i(x)$ , i = 1, 2, 3. The input argument x follows the same convention as in shap\_LFE(x), while the output shap is a  $N \times 6$  matrix containing the gradients of the shape functions evaluated at the N points (the first two columns contain the gradient of  $\lambda_1$ , and so on).

(3.1e) Implement the routine STIMA\_Heat\_LFE to compute the element (stiffness) matrices. The function header is

```
Aloc = STIMA_Heat_LFE(Vertices, QuadRule, FHandle)
```

Here, Vertices is a  $3 \times 2$ -vector providing the coordinates of the element vertices, QuadRule.w is a vector with quadrature weights and QuadRule.x is a vector with quadrature points relative to  $\hat{K}$ . The function should return a  $3 \times 3$  matrix Aloc containing the element stiffness matrix. FHandle is a handle to the function D.

HINT: Use grad\_shap\_LFE to compute the gradients of the shape functions.

(3.1f) Implement the routine LOAD\_LFE to compute the *element vector*. The function header is

```
Lloc = LOAD_LFE(Vertices, QuadRule, FHandle)
```

and follows the same convention as STIMA\_Heat\_LFE.

(3.1g) Implement a function

```
A = assemMat_LFE (Mesh, EHandle, varargin)
```

that assembles the Galerkin matrix A given the mesh structure Mesh and a routine EHandle to assemble the element matrix. In your implementation make a call EHandle (Vertices, varargin{:}), where Vertices are the coordinates of an element  $K_i$ . Here for EHandle = STIMA\_Heat\_LFE the variable argument list varargin should carry the parameters QuadRule, FHandle.

HINT: Use the sparse format to store the matrix A.

(3.1h) Implement a function

```
L = assemLoad_LFE (Mesh, QuadRule, FHandle)
```

to compute the right-hand side vector L given the mesh structure Mesh, the quadrature rule via QuadRule and a handle to the function f via FHandle.

HINT: Proceed as for assemMat\_LFE and use LOAD\_LFE.

(3.1i) Implement a routine

```
[U,FreeDofs] = assemDir_LFE(Mesh,BdFlag,GHandle)
```

which accepts in input the mesh, the flag BdFlag associated to the Dirichlet boundary and the function handle GHandle to the boundary data g(x). As output, this function should return the degrees of freedom which are not on the Dirichlet boundary, and initialize the solution vector U incoporating the Dirichlet boundary conditions for the entries of U associated to nodes on the Dirichlet boundary.

In this problem the convention is that the boundary flag is -1 if the edge is on the Dirichlet boundary.

to plot the FE solution given the vector of coefficients U and the structure Mesh containing the field Mesh. Coordinates.

## (3.1k) Implement a function

```
err = L2Err_LFE(Mesh,u,QuadRule,FHandle)
```

that computes the  $L^2$ -error of the FEM function given by the coefficient vector  $\mathbf{u}$  and the mesh Coordinates to the exact solution given as the function handle FHandle.

HINT: Proceed computing the local contributions element-wise and then summing them up to get the total error.

## (3.11) Implement a function

```
err = H1SErr_LFE(Mesh,u,QuadRule,FHandle)
```

that computes the  $H^1$ -seminorm error of the FEM function given by the coefficient vector  $\mathbf{u}$  and the mesh Coordinates to the exact solution gradient given as the function handle FHandle.

HINT: Proceed element-wise as in subproblem subproblem (3.1k).

## (3.1m) Implement a function

$$[N, 12, h1s] = main\_LFE (Mesh)$$

to compute the FE solution U to (3.1.1) with coefficient D(x)=1 and exact solution  $u_{\rm ex}=\cos(2\pi x)\cos(2\pi y)$  on the square  $\Omega=(0,1)^2$ . The function should return the number N of degrees of freedom (in this case the nodes which are not on the boundary) and the  $L^2$ -norm and  $H^1$ -seminorm errors.

Inside the function, use the routine implemented in task (3.1j) to plot the solution. As quadrature rule, use the sixth-order quadrature rule P706 () given in the handout.

- (3.1n) Run the routine implementated in task (3.1m) to produce a plot of the solution. For the mesh, load the mesh Square5.mat given in the handout.
- (3.10) Consider again the case  $u_{\rm ex}=\cos(2\pi x)\cos(2\pi y)$  and D(x)=1 on the unit square. Implement a script called <code>cvg\_LFE</code> to perform the convergence study for the error in the  $L^2$ -norm and  $H^1$ -seminorm.

Produce loglog plots of the errors versus the number of degrees of freedom.

Use the meshes contained in the file Square.zip given in the handout.

Which rates of convergence do you observe?

HINT: You may use the function main\_LFE implemented in task (3.1m).

We are now going to solve (3.1.1)-(3.1.2) on the L-shaped domain  $\Omega = (-1,1)^2 \setminus ((0,1) \times (-1,0))$ , as depicted in Fig.3.2.

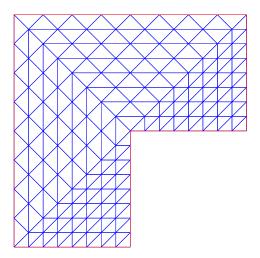


Figure 3.2: Domain for subproblems (3.1p)-(3.1r)

We consider the case that the exact solution is, in polar coordinates,  $u=r^{\frac{2}{3}}\sin(\frac{2}{3}\varphi)$ , for  $(r,\varphi)\in[0,1)\times[0,2\pi)$ . The right-handside is then f=0 and the boundary data  $g=u_{|\partial\Omega}$ .

## (3.1p) Implement a function

```
uex = uex_LShap_L2(x)
```

to compute the exact solution  $u=r^{\frac{2}{3}}\sin(\frac{2}{3}\varphi)$  given the  $N\times 2$  vector of point coordinates x, and store the values in the column vector uex.

#### (3.1q) Implement a function

```
uex = uex_LShapH1S(x)
```

to compute the gradient of the exact solution  $u=r^{\frac{2}{3}}\sin(\frac{2}{3}\varphi)$  given the  $N\times 2$  vector of point coordinates x, and store the values in the  $N\times 2$  vector uex.

(3.1r) Modify the routine main\_LFE implemented in subproblem (3.1m) and the script cvg\_LFE implemented in subproblem (3.1o) to perform the convergence study for the L-shaped domain. Use the meshes contained in the zip file Lshape.zip given in the handout. Which rates of convergence to you observe?

Give a motivation for your results.

Listing 3.1: Testcalls for Problem 3.1

```
Mesh = load(['Square' num2str(1) '.mat']);
DHandle = @(x) 1;
FHandle = @(x) 8*pi^2*cos(2*pi.*x(:,1)).*cos(2*pi.*x(:,2));
Uex = @(x) cos(2*pi.*x(:,1)).*cos(2*pi.*x(:,2));
```

```
fprintf('\n\n##shap_LFE:')
  shap_LFE([0.3 0.6])
  fprintf('\n\n##grad_shap_LFE:')
  grad_shap_LFE([0.4 0.4])
11
  fprintf('\n\n##STIMA_Heat_LFE:')
  STIMA_Heat_LFE([0 0; 1 1/4; 1/8 1], P706(), DHandle)
  fprintf('\n\n##LOAD_LFE:')
15
  LOAD_LFE([0 0; 1 1/4; 1/8 1],P706(),FHandle)
17
  fprintf('\n\n##assemMat_LFE:')
  A = assemMat_LFE(Mesh, @STIMA_Heat_LFE, P706(),DHandle);
  A = full(A);
  A(1:6,1:6)
  A(20:25,20:25)
23
  fprintf('\n\n##assemLoad_LFE:')
L = assemLoad_LFE (Mesh, P706(), FHandle);
  L(1:3)
  fprintf('\n\n##assemDir_LFE:')
  [U,FreeDofs] = assemDir_LFE (Mesh, -1, Uex);
  FreeDofs
```

## Listing 3.2: Output for Testcalls for Problem 3.1

```
>> test_call
  ##shap_LFE:
  ans =
      0.1000
                 0.3000 0.6000
6
  ##grad_shap_LFE:
  ans =
                           0
      -1
           -1
                    1
                                 0
                                        1
11
  ##STIMA_Heat_LFE:
13
  ans =
15
     0.6855 \quad -0.3306 \quad -0.3548
16
     -0.3306
                0.5242 - 0.1935
17
     -0.3548 \quad -0.1935 \quad 0.5484
18
  ##LOAD_LFE:
  ans =
```

```
1.2638
23
         2.3698
24
         2.5917
25
26
   ##assemMat_LFE:
27
   ans =
28
29
          1
                   0
                            0
                                     0
                                              0
                                                      0
30
          0
                   1
                            0
                                     0
                                                      0
                                              0
31
          0
                   0
                            1
                                     0
                                              0
                                                      0
32
          0
                   0
                            0
                                              0
                                                      0
                                     1
33
                                              2
          0
                   0
                            0
                                     0
                                                      0
34
          0
                   0
                            0
                                     0
                                              0
                                                      2
35
36
   ans =
37
38
          4
                  -1
                           -1
                                     0
                                              0
                                                      0
39
         -1
                   4
                            0
                                     0
                                              0
                                                      0
40
         -1
                   0
                                              0
                                                      0
41
          0
                   0
                            0
                                     4
                                              0
                                                     -1
42
          0
                   0
                            0
                                     0
                                              4
                                                     -1
43
          0
                   0
                            0
                                                      4
                                   -1
                                            -1
44
45
   ##assemLoad_LFE:
46
   ans =
47
48
         0.6366
49
         0.9995
50
         0.6366
51
52
   ##assemDir_LFE:
53
   FreeDofs =
54
55
          7
                  12
                           18
                                   20
                                            21
                                                     22
                                                              23
                                                                      24
                                                                                25
```

## **Problem 3.2 2D Quadratic Finite Elements**

We consider the problem

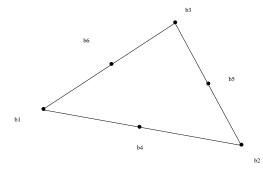
$$-\operatorname{div}(D(\boldsymbol{x})\operatorname{\mathbf{grad}} u(\boldsymbol{x})) = f(\boldsymbol{x}) \quad \text{in } \Omega \subset \mathbb{R}^2$$
(3.2.1)

$$u(\mathbf{x}) = g(\mathbf{x}) \quad \text{on } \partial\Omega$$
 (3.2.2)

where D is uniformly positive and bounded in  $\Omega$ , g is a continuous function of  $\partial\Omega$  and  $f\in L^2(\Omega)$ .

We solve (3.2.1)-(3.2.2) by means of Galerkin discretization based on *piecewise quadratic* finite elements on triangular meshes of  $\Omega$ .

For quadratic finite elements with affine element mapping a specific choice of element shape functions is given by



$$b_1(\mathbf{x}) := -\lambda_1(\mathbf{x})(1 - 2\lambda_1(\mathbf{x})),$$

$$b_2(\mathbf{x}) := -\lambda_2(\mathbf{x})(1 - 2\lambda_2(\mathbf{x})),$$

$$b_3(\mathbf{x}) := -\lambda_3(\mathbf{x})(1 - 2\lambda_3(\mathbf{x})),$$

$$b_4(\mathbf{x}) := 4\lambda_1(\mathbf{x})\lambda_2(\mathbf{x}),$$

$$b_5(\mathbf{x}) := 4\lambda_2(\mathbf{x})\lambda_3(\mathbf{x}),$$

$$b_6(\mathbf{x}) := 4\lambda_3(\mathbf{x})\lambda_1(\mathbf{x}).$$

## (3.2a) Implement the function

$$shap = shap_QFE(x)$$

which computes the the value of the six local shape functions  $\lambda_i(\boldsymbol{x})$ ,  $i=1,\ldots,6$ , on the reference element at the points x (a  $N\times 2$  matrix, where each rows contains the coordinates of a point), and returns the values in the  $N\times 6$  matrix shap (each row corresponding to the evaluation of the basis functions in a point).

## (3.2b) Implement the function

$$shap = grad_shap_QFE(x)$$

to compute the gradients of the shape functions, following the same convention as in grad\_shap\_LFE.

(3.2c) Implement the routine STIMA\_Heat\_QFE to compute the element (stiffness) matrices. The function header is

and the conventions are the same as in STIMA Heat, LFE.

(3.2d) Implement the routine LOAD\_QFE

to compute the *element vector*, which follows the same convention as LOAD\_LFE.

We now consider the assembly part.

The global order of basis function for quadratic finite elements is the following:

- first the basis functions associated to the vertices are stored; the basis function associated to the vertex with index i is  $b_N^i(\boldsymbol{x})$ ;
- then, the basis functions associated to the midpoints, i.e. to the edges, are considered: the basis function associated to the edge i is  $b_N^{N_V+i}(\boldsymbol{x})$ , with  $N_V$  the number of vertices.

## (3.2e) Implement a function

that assembles the Galerkin matrix A and follows the same convention as assem\_Mat\_LFE.

HINT: Use the sparse format to store the matrix A.

The field Mesh. Vert2Edge may be useful.

## (3.2f) Implement a function

```
L = assemLoad_QFE (Mesh, QuadRule, FHandle)
```

to compute the right-hand side vector L, following the same conventions as in assemLoad\_LFE.

#### (3.2g) Implement a routine

```
[U,FreeDofs] = assemDir_QFE(Mesh,BdFlag,GHandle)
```

following the same principles as assemDir\_LFE.

## (3.2h) Implement a function

```
err = L2Err_QFE(Mesh,u,QuadRule,FHandle)
```

that computes the  $L^2$ -error of the FEM function given by the coefficient vector  $\mathbf{u}$  and the mesh Mesh to the exact solution given as the function handle FHandle.

## (3.2i) Implement a function

```
err = H1SErr_QFE(Mesh,u,QuadRule,FHandle)
```

that computes the  $H^1$ -seminorm error of the FEM function given by the coefficient vector  $\mathbf{u}$  and the mesh Mesh to the exact solution gradient given as the function handle FHandle.

### (3.2j) Implement a function

```
[N, 12, h1s] = main_QFE (Mesh)
```

to compute the FE solution U to (3.2.1) with coefficient D(x)=1 and exact solution  $u_{\rm ex}=\cos(2\pi x)\cos(2\pi y)$  on the square  $\Omega=(0,1)^2$ . The routine follows the same conventions as main\_LFE, but this time you don't need to plot the solution.

Again, as quadrature rule, use the sixth-order quadrature rule P706 () given in the handout.

(3.2k) Consider again the case  $u_{\rm ex}=\cos(2\pi x)\cos(2\pi y)$  and D(x)=1 on the unit square. Implement a script called <code>cvg\_QFE</code> to perform the convergence study for the error in the  $L^2$ -norm and  $H^1$ -seminorm.

Produce loglog plots of the errors versus the number of degrees of freedom.

Use the meshes contained in the file Square.zip given in the handout.

Which rates of convergence do you observe?

HINT: Use the function main\_QFE implemented in task (3.2j).

Now we consider again (3.2.1)-(3.2.2) on the L-shaped domain  $\Omega = (-1,1)^2 \setminus ((0,1) \times (-10))$ . We take again the case that the exact solution is, in polar coordinates,  $u = r^{\frac{2}{3}} \sin(\frac{2}{3}\varphi)$ , for  $(r,\varphi) \in [0,1) \times [0,2\pi)$ .

(3.21) Modify the routine  $main_QFE$  implemented in subproblem (3.2j) and the script  $cvg_QFE$  implemented in subproblem (3.2k) to perform the convergence study for the L-shaped domain. Use the meshes contained in the zip file Lshape. zip given in the handout. Which rates of convergence to you observe?

Compare your results with the case of Linear Finite Elements and give a motivation for the behavior that you observe.

HINT: You may use the routines  $uex_LShap_L2(x)$  and  $uex_LShapH1S(x)$  implemented for the previous problem for the computation of the exact solution and its gradient.

Listing 3.3: Testcalls for Problem 3.2

```
Mesh = load (['Square' num2str(1) '.mat']);
2 DHandle = @(x) 1;
  FHandle = @(x) 8*pi^2*cos(2*pi.*x(:,1)).*cos(2*pi.*x(:,2));
  Uex = @(x) cos (2*pi.*x(:,1)).*cos(2*pi.*x(:,2));
  fprintf('\n\n##shap_QFE:')
  shap_QFE([0.3 0.6])
  fprintf('\n\n##grad_shap_QFE:')
  grad_shap_QFE([0.4 0.8])
10
11
  fprintf('\n\n##STIMA_Heat_QFE:')
12
  STIMA_Heat_QFE([0 0; 1 0; 0 1],P706(),DHandle)
13
14
  fprintf('\n\n##LOAD_QFE:')
15
  LOAD_QFE([0 0; 1 0; 0 1],P706(),FHandle)
17
  fprintf('\n\n##assemMat_QFE:')
18
  A = assemMat_QFE(Mesh, @STIMA_Heat_QFE, P706(), DHandle);
  A = full(A);
  A(1:3,1:3)
 A(26:28, 26:28)
22
23
  fprintf('\n\n##assemLoad_QFE:')
 L = assemLoad_QFE (Mesh, P706(), FHandle);
26 L(1:3)
```

```
L(26:28)

fprintf('\n\n##assemDir_QFE:')

[U,FreeDofs]=assemDir_QFE (Mesh,-1,Uex);

FreeDofs
```

Listing 3.4: Output for Testcalls for Problem 3.2

```
test_call
2
  ##shap_QFE:
  ans =
     -0.0800 -0.1200 0.1200 0.1200 0.7200
                                                     0.2400
6
7
  ##grad_shap_QFE:
  ans =
10
      1.8000 1.8000 0.6000
                                      0
                                               0 2.2000
11
        -2.4000 -1.6000 3.2000 1.6000 -3.2000 -4.0000
12
  ##STIMA_Heat_QFE:
13
  ans =
14
15
     1.0000
              0.1667
                        0.1667 -0.6667 -0.0000 -0.6667
     0.1667 0.5000
                             0 -0.6667 -0.0000
                                                    0.0000
17
               0
     0.1667
                       0.5000 0.0000 -0.0000 -0.6667
     -0.6667 \quad -0.6667 \quad 0.0000
                                 2.6667 -1.3333 -0.0000
                                         2.6667 -1.3333
     -0.0000
             -0.0000
                      -0.0000 -1.3333
20
              0.0000 -0.6667 -0.0000 -1.3333 2.6667
     -0.6667
21
22
  ##LOAD_QFE:
23
  ans =
24
25
     1.0920
     0.1993
27
     0.1993
28
     -1.7408
29
     5.2648
30
     -1.7408
31
32
  ##assemMat_QFE:
  ans =
34
35
      1.0000
                             0
                    0
36
              1.0000
          0
                             0
37
                        1.0000
          0
                    0
38
39
  ans =
41
```

```
2.6667
                   -0.0000
                                       0
42
      -0.0000
                    2.6667
                                       0
43
                                 5.3333
                           0
44
45
   ##assemLoad_QFE:
46
   ans =
47
48
        0.0590
49
        0.1889
50
        0.0590
51
52
   ans =
53
54
        0.5776
55
        0.5776
        0.7577
57
58
   ##assemDir_QFE:
59
   FreeDofs =
60
61
     Columns 1 through 20
62
63
         7
               12
                       18
                               20
                                      21
                                              22
                                                     23
                                                             24
                                                                     25
                                                                            28
                                                                                    34
                                       42
                 36
                        39
                                41
                                               44
                                                       45
                                                              46
                                                                      47
                                                                             48
65
     Columns 21 through 40
66
67
        49
               50
                       53
                               54
                                              58
                                                             60
                                                                     61
                                                                            62
                                      57
                                                     59
                                                                                    63
               64
                       65
                               66
                                      67
                                              68
                                                     69
                                                             70
                                                                     71
                                                                            72
69
     Columns 41 through 49
70
71
        73
               74
                       75
                              76
                                      77
                                                     79
                                              78
                                                             80
                                                                     81
72
```

# Published on March 31. To be submitted on April 14.

Last modified on April 11, 2014