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Numerical Methods for Partial Differential Equations

ETH Zürich D-MATH

Homework Problem Sheet 6

Problem 6.1 Linear Finite Element implementation for 2D reaction-diffusion

In [NPDE, Section 3.3] we have studied the algorithmic aspects related to the linear finite element Galerkin discretization of two-dimensional, second-order linear variational problems posed on the Sobolev space $H^1(\Omega)$. In [NPDE, Section 3.4], you have seen the extension to more general finite element subspaces of $H^1(\Omega)$. The present exercise is meant to make you more familiar with the techniques learned in class.

To this end, we consider the following Neumann problem on the unit square $\Omega = [0, 1]^2$ with homogeneous Neumann data and reaction term (cf. [NPDE, Eq. (3.1.4)]):

$$u \in H^{1}(\Omega): \underbrace{\int_{\Omega} \operatorname{\mathbf{grad}} u \cdot \operatorname{\mathbf{grad}} v + u \, v \, d\mathbf{x}}_{:=\mathsf{a}(u,v)} = \underbrace{\int_{\Omega} f v \, d\mathbf{x}}_{:=\ell(v)} \quad \forall v \in H^{1}(\Omega). \tag{6.1.1}$$

We want to develop an efficient MATLAB code for the discretization of (6.1.1) on a triangular mesh using linear finite elements.

The mesh data structure contains the following fields, see also [NPDE, § 3.3.3]:

- Mesh.Coordinates: $N \times 2$ matrix, i-th row containing the coordinates of the i-th vertex, $i \in \{1, \dots, N\}$;
- Mesh. Elements: $M \times 3$ -matrix, j-th row

Recall that for piecewise linear finite elements on triangular meshes the so-called local shape functions (\rightarrow [NPDE, Def. 3.4.19]) agree with the barycentric coordinate functions λ_1 , λ_2 , and λ_3 of the triangles, see [NPDE, Fig. 84].

(6.1a) Implement the function

which returns the values of the gradients of local shape functions (i.e. the barycentric coordinate functions) $\lambda_i(x)$, i=1,2,3, in the vertices with coordinates contained in the 3×2 -matrix Vertices. The output grad is a 2×3 matrix containing the gradients of the shape functions evaluated at the vertices (the first column contains the gradient of λ_1 , the second one the gradient of λ_2 and the last one the gradient of λ_3).

(6.1b) Implement the routine

to compute the element matrix associated to the bilinear form

$$\mathsf{a}_1(u,v) = \int_\Omega \mathbf{grad}\, u \cdot \mathbf{grad}\, v \,\mathrm{d} oldsymbol{x}, \quad u,v \in H^1(\Omega),$$

and linear Lagrangian finite elements.

Here, Vertices is a 3×2 -vector providing the coordinates of the element vertices. The function should return a 3×3 matrix Aloc containing the element matrix.

(6.1c) Implement the routine

to compute the element matrix associated to the bilinear form

$$\mathsf{a}_2(u,v) = \int_{\Omega} u \, v \, \mathrm{d} \boldsymbol{x}, \quad u,v \in L^2(\Omega) \; ,$$

and linear Lagrangian finite elements on triangular elements. The input and output arguments are the same as for Elmat_Lapl_LFE.

HINT: Compute the entries of the element matrix by analytic evaluation of the two-dimensional integrals. In order to avoid cumbersome computations, you may rely on the general formula from [NPDE, Lemma 3.6.61].

(6.1d) Implement the routine

```
function Aloc = Elmat_LaplMass_LFE(Vertices)
```

to compute the element matrix associated to the bilinear form in (6.1.1) and linear Lagrangian finite elements.

The input and output arguments are the same as for Elmat_Lapl_LFE.

HINT: Combine the results from tasks (6.1b) and (6.1c).

(6.1e) Implement the routine

to compute the element vector philoc associated to the linear form in (6.1.1), for linear Lagrangian finite elements, see [NPDE, Section 3.3.6].

The input argument Vertices is a 3×2 -matrix containing the element vertices, and FHandle is a function handle to the function f. You can assume that FHandle accepts as input $K \times 2$ -matrices, for which each row $i = 1, \ldots, K, K \in \mathbb{N}$, contains the coordinates of a point, and then it returns the values of f in those points as a column vector of length K.

Since f is given in procedural form, the entries of the element vectors can be computed only approximately by means of numerical quadrature, cf. [NPDE, § 3.3.44]. Use *composite edge midpoint quadrature rule* that, for a triangle K with vertices a^1 , a^2 , a^3 , and edge midpoints $m^1 := \frac{1}{2}(a^2 + a^3)$, $m^2 := \frac{1}{2}(a^1 + a^3)$, $m^3 := \frac{1}{2}(a^2 + a^1)$, reads

$$\int_{K} \varphi(\boldsymbol{x}) d\boldsymbol{x} \approx \frac{|K|}{3} (\varphi(\boldsymbol{m}^{1}) + (\varphi(\boldsymbol{m}^{2}) + (\varphi(\boldsymbol{m}^{3}))). \tag{6.1.2}$$

HINT: See [NPDE, Code 3.3.47] for a code performing the same task using the 2D trapezoidal quadrature rule [NPDE, Eq. (3.3.45)].

(6.1f) Implement an efficient MATLAB function

```
A = assemMat_LFE (Mesh, getElementMatrix)
```

that assembles the Galerkin matrix A associated to the bilinear form in (6.1.1), for linear Lagrangian finite elements. This routine receives in input the mesh data structure Mesh (as described at the beginning of the problem) and a function handle getElementMatrix to a function that expects a 3×2 -array of vertex coordinates and returns a 3×3 element matrix.

HINT: Use the MATLAB's sparse matrix data format to store A. Remember the discussion in class about the efficient way of filling a sparse matrix.

(6.1g) Implement the function

```
phi = assemLoad_LFE (Mesh, getElementVector, FHandle)
```

to assemble the right-hand side vector phi given the mesh structure Mesh, a handle to a function getElementVector expecting a 3×2 array of vertex coordinates as input and returning an element load vector as a column vector of size 3, and a handle FHandle to the function f.

HINT: The procedure is similar to the one for assemMat_LFE.

(6.1h) Implement the function

to compute the error $\|u-u_h\|_{L^2(\Omega)}$, where u is the exact solution to (6.1.1), passed in the function handle UHandle, and u_h is the discrete solution, passed through the coefficient vector U with respect to the nodal basis of $\mathcal{S}_1^0(\mathcal{M})$. The argument Mesh contains the mesh data structure.

To compute the integrals, use the 2D trapezoidal quadrature rule, see [NPDE, Eq. (3.3.45)].

(6.1i) Implement the function

to compute the error $|u - u_h|_{H^1(\Omega)}$, where u is the exact solution to (6.1.1), for which the gradient is passed in the function handle gradUHandle (that returns a column vector), and u_h is the

discrete solution, passed through the coefficient vector U. Assume that, given a $K \times 2$ -matrix of point coordinates, $K \in \mathbb{N}$, the function <code>gradUHandle</code> returns the value of <code>grad</code> u in these points in a $2 \times K$ -matrix. The input argument <code>Mesh</code> contains the mesh data structure.

To compute the integrals, again rely on the 2D trapezoidal quadrature rule, see [NPDE, Eq. (3.3.45)].

(6.1j) Implement a function

```
[U,L2err,H1serr] = mainNeumann(Mesh)
```

that, given in input a mesh data structure Mesh, computes the discrete solution u_h to (6.1.1) in the case that the exact solution is $u(\mathbf{x}) = \cos(2\pi x_1)\cos(2\pi x_2)$, plots the mesh and u_h . The function returns the coefficient vector U of u_h , the L^2 -norm and the H^1 -seminorm of the discretization error.

Create a plot of the discrete solution using the mesh Square.mat provided in the handout to be downloaded from the course webpage.

HINT: Given the exact solution, you can use (6.1.1) to obtain the right-hand side f.

HINT: To plot the mesh you can use the MATLAB function triplot, and to plot the solution you can use the function trisurf.

HINT: To load the mesh use the MATLAB function load.

HINT: Using the mesh given in the handout, the L^2 -norm error should be around 0.0020 and the H^1 -seminorm error around 0.6627.

Listing 6.1: Testcalls for Problem 6.1

```
Vertices = [0 0; 1 0; 0 1];
 FHandle = @(x) x(:,1).*x(:,2);
 Mesh = load (['Square.mat']);
  fprintf('\n##gradbarycoords')
  gradbarycoords_ref(Vertices)
  fprintf('\n##Elmat_Lapl_LFE')
  Elmat_Lapl_LFE_ref(Vertices)
11
  fprintf('\n##Elmat_Mass_LFE')
12
  Elmat_Mass_LFE_ref(Vertices)
13
  fprintf('\n##Elmat LaplMass LFE')
15
  Elmat_LaplMass_LFE_ref(Vertices)
16
17
  fprintf('\n##localLoadLFE')
18
  localLoadLFE_ref(Vertices, FHandle)
  fprintf('\n##assemMat_LFE')
 A = assemMat_LFE_ref(Mesh, @Elmat_LaplMass_LFE);
 A(1:10,1:10)
```

```
fprintf('\n##assemLoad_LFE')
L = assemLoad_LFE_ref(Mesh,@localLoadLFE,FHandle);
L(1:10)
```

Listing 6.2: Output for Testcalls for Problem 6.1

```
testcall
  ##gradbarycoords
  ans =
      -1
6
             1
                   0
      -1
             0
  ##Elmat_Lapl_LFE
  ans =
11
     1.0000 -0.5000 -0.5000
12
     -0.5000 0.5000
                                0
13
     -0.5000
                 0 0.5000
14
15
  ##Elmat_Mass_LFE
16
  ans =
17
18
      0.0833 0.0417 0.0417
      0.0417 0.0833 0.0417
20
      0.0417
                0.0417
                         0.0833
21
22
  ##Elmat_LaplMass_LFE
23
  ans =
24
25
     1.0833 -0.4583 -0.4583
     -0.4583 0.5833 0.0417
27
     -0.4583
               0.0417
                         0.5833
28
29
  ##localLoadLFE
30
  ans =
31
32
           0
33
      0.0208
34
      0.0208
36
37
  ##assemMat_LFE
  ans =
38
39
     (1, 1)
                 1.0001
40
     (2, 2)
                 1.0002
41
     (3,3)
                 1.0001
42
     (4, 4)
                 1.0002
```

```
(5,5)
                       2.0002
       (6, 6)
                       2.0002
45
       (7,7)
                       4.0005
46
       (8, 8)
                       2.0002
47
       (9, 9)
                       2.0002
48
      (10, 10)
                       2.0002
49
50
51
   ##assemLoad_LFE
   ans =
52
53
       1.0e-03 *
54
55
               0
56
        0.0038
57
        0.1602
58
        0.0038
        0.0025
60
        0.0025
61
        0.2441
62
        0.2441
63
        0.2441
64
        0.0012
```

Problem 6.2 Rigidity of Piecewise Polynomial Continuous Functions

[NPDE, Section 3.3] and, particular, [NPDE, Section 3.5] probably created the impression that the construction of a viable finite element space is straightforward: one starts from a mesh, fixes a piecewise polynomial space and, finally, finds suitable locally supported basis functions. However, at each stage this procedure can fail, which is strikingly demonstrated in this problem.

Let $\mathcal{M} = \{K\}$ be a tensor product mesh, see [NPDE, Section 3.4.1], as depicted in Figure 6.1 with N_x , N_y grid lines in x- and y-direction, respectively. All cells (elements) are rectangles, and there are $N = N_x N_y$ vertices in the mesh.

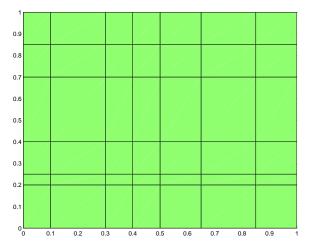


Figure 6.1: A tensor product mesh.

(6.2a) Define the function space

$$W_N = \{ v \in H_0^1(\Omega) \mid v |_K \in \mathcal{P}_1(\mathbb{R}^2), \, \forall K \in \mathcal{M} \},$$

of piecewise linear functions (see [NPDE, Def. 3.4.8]) on each element of \mathcal{M} , that are zero at the boundary. What is the dimension of W_N ?

HINT: Remember from [NPDE, § 3.3.8] that an (affine) linear function $\mathbb{R}^2 \mapsto \mathbb{R}$ is already fixed by prescribing values in three non-collinear points.

(6.2b) Define the function space

$$V_N = \{ v \in H^1(\Omega) \mid v|_K \in \mathcal{P}_1(\mathbb{R}^2) \, \forall K \in \mathcal{M} \},$$

of piecewise linear functions on each element of \mathcal{M} . What is the dimension of V_N ?

(6.2c) Define the function space

$$V_N = \{ v \in H^1(\Omega) \mid v|_K \in \mathcal{Q}_1(\mathbb{R}^2) \, \forall K \in \mathcal{M} \},$$

of piecewise bi-linear functions on each element of \mathcal{M} , see [NPDE, Def. 3.4.13]. What is the dimension of this V_N ?

(6.2d) If we abandon nice "confoming" finite element meshes and even admit "hanging nodes", additional difficulties loom. To appreciate this, now consider the non-conforming triangular mesh \mathcal{M} of $\Omega=]0,1[^2$ in Figure 6.2. There, the hanging nodes are located on the midpoints of the edges of the other triangle.

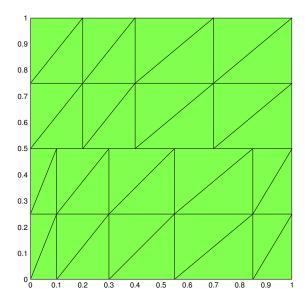


Figure 6.2: Non-conforming triangular mesh

Determine the dimension of the space

$$W_N = \{ v \in C^0(\overline{\Omega}) \mid v|_K \in \mathcal{P}_1(\mathbb{R}^2) \, \forall K \in \mathcal{M}, v|_{\partial\Omega} = 0 \},$$

and describe a basis of locally supported functions.

(6.2e) What is the dimension of the space obtained from W_N by dropping the boundary condition $v|_{\partial\Omega}=0$. Also in this case describe a basis and specify the supports of the basis functions.

Problem 6.3 Convection Bi-linear Form

Hitherto, in class we have exclusively studied (linear) variational problems with symmetric bilinear forms, which are connected with quadratic minimization problems, as explained in [NPDE, Section 2.2.3]. Yet, many PDE models have variational formulations that involve non-symmetric bilinear forms. A simple representative will be examined in this problem. We will practise multi-dimensional integration by parts from [NPDE, Section 2.5.1] and also some local computations connected with Galerkin discretization by means of linear finite elements, see [NPDE, Section 3.3.5].

Let $\Omega \subset \mathbb{R}^2$ be a bounded polygonal domain. We define the *convection bilinear form* as

$$\mathsf{a}(u,v) = \int_{\Omega} (\mathbf{b}(\mathbf{x}) \cdot \mathbf{grad} \, u(\mathbf{x})) v(\mathbf{x}) \, d\mathbf{x}, \qquad u \in H^1(\Omega), \ v \in L^2(\Omega),$$

where $\mathbf{b}: \Omega \to \mathbb{R}^2$ is a vector field, with each component in $H^1(\Omega)$.

(6.3a) Show that for $u, v \in H_0^1(\Omega)$

$$a(u, v) = -\int_{\Omega} u(\mathbf{x}) \operatorname{div}(\mathbf{b}(\mathbf{x})v(\mathbf{x})) \, d\mathbf{x}.$$

HINT: Use Green's formula [NPDE, Thm. 2.5.9]

(6.3b) Show that, if $\operatorname{div} \mathbf{b}(\mathbf{x}) = 0$, then

$$a(u, u) = 0, \quad \forall u \in H_0^1(\Omega).$$

HINT: Use the general product rule [NPDE, Lemma 2.5.4].

(6.3c) Show that, if div $\mathbf{b}(\mathbf{x}) = 0$ and $\mathbf{b}(\mathbf{x}) \cdot \mathbf{n} = 0$ on $\partial \Omega$, then

$$\mathsf{a}(u,u)=0, \quad \forall u \in H^1(\Omega).$$

(6.3d) Show that

$$\mathsf{a}(u,u)>0, \quad \forall u\in H^1_0(\Omega),$$

if $-\operatorname{div} \mathbf{b}(\mathbf{x})$ is uniformly positive (see [NPDE, Def. 2.2.15]).

From now on assume that the vector field is constant on Ω : $\mathbf{b}(x) := \mathbf{b}, \forall x \in \Omega$.

We perform a Finite Element Galerkin discretization of the linear variational problem: Seek $u \in H^1_0(\Omega)$ such that

$$\mathsf{a}(u,v) = \ell(v), \quad \forall v \in L^2(\Omega),$$

on a triangular mesh \mathcal{M} and based on the discrete trial and test space $\mathcal{S}^0_{1,0}(\mathcal{M})$ (linear finite elements as [NPDE, Section 3.3]). The nodal basis of "tent functions" as introduced in [NPDE, Section 3.3.3] is used throughout.

(6.3e) Write a C++ function

that computes the element matrix for $a(\cdot, \cdot)$ on a triangle K with vertices a^1, a^2, a^3 , whose coordinates are passed in as a1, a2, a3. The argument b supplies the vector b.

Objects of type Coord_t and Vector2D represent vectors with 2 components and must allow component access via [0] and [1].

Matrix objects provide the following methods and types

- value_t.
- index_t
- rows()
- cols()
- value_t operator(index_t, index_t) const to access the matrix values.
- value_t & operator(index_t, index_t) to assign the matrix values.

the elmat instance passed as argument can be assumed to have the right size.

A C++ template file is available in the lecture's webpage as guidance for implementation.

Remark: Note that essential conditions don't matter at the level of element matrices.

HINT: Revising [NPDE, Section 3.3.5] might be useful, particularly to compute the gradients.

Listing 6.3: Testcall for subproblem (6.3e) (fragment from main file).

```
// test call:
       // initialize vertices and b vector
2
       coord_t a1(0,1), a2(2,1), a3(1,3);
3
       vector_t b(2); b.setOnes();
4
       // initialize local matrix and call locMatConvect
5
       matrix_t local(3,3);
6
      locMatConvect(a1, a2, a3, b, local);
7
       // print the obtained matrix
       std::cout << "local matrix for element with vertices : ("</pre>
              << a1.transpose() << ") , (" << a2.transpose() << ") , ("
10
              << a3.transpose() << ") : \n \n" << local << std::endl;
11
```

Listing 6.4: Output for Testcalls for subproblem (6.3e)

```
local matrix for element with vertices : (0 1) , (2 1) , (1 3) :

-0.5 0.166667 0.333333

-0.5 0.166667 0.333333

-0.5 0.166667 0.333333
```

(6.3f) Show that the Galerkin matrix is skew-symmetric.

HINT: A square matrix **A** is skew-symmetric, if $\mathbf{A}^T = -\mathbf{A}$. Also recall the computations of subproblem (6.3a).

Problem 6.4 Hybrid-Mesh Galerkin Matrices and Right-Hand Side Vectors

In [NPDE, Rem. 3.5.16] we saw that both linear and bilinear Lagrangian finite elements can be easily blended on a 2D hybrid mesh comprising both quadrilaterals and triangles. In this exercise we study the details of such a finite element method with focus on local computations and assembly.

Figure 6.3 displays a hybrid mesh \mathcal{M} consisting of 13 vertices, 8 triangular elements and 4 quadrilateral elements. The coordinates of some of the vertices are

$$a^7 = (0,0), \quad a^1 = (0,1), \quad a^4 = (1,1)/\sqrt{2}, \quad a^3 = (0,1)/\sqrt{2}.$$

The coordinates of the rest follow from symmetry.

In this problem we will compute the Galerkin matrix for (bi-)linear Lagrangian finite elements [NPDE, Section 3.5] on such a mesh for the bilinear form associated with $-\Delta$

$$\mathsf{a}(u,v) = \int_{\Omega} \operatorname{grad} u(\mathbf{x}) \cdot \operatorname{grad} v(\mathbf{x}) \, d\mathbf{x}, \quad u,v \in H^{1}(\Omega), \tag{6.4.1}$$

and the right-hand side vector arising from the linear form

$$\ell(v) = \int_{\Omega} f(\mathbf{x})v(\mathbf{x}) \, d\mathbf{x}, \tag{6.4.2}$$

with $f \in C^0(\Omega)$.

(6.4a) What is the dimension of the finite element space $S_1^0(\mathcal{M})$?

HINT: See [NPDE, Rem. 3.5.16].

(6.4b) Compute the 4×4 element Galerkin matrix for one of the squares using the standard bilinear local shape functions from [NPDE, Eq. (3.5.10)]

HINT: All the square elements are equal, and they have side lengths $1/\sqrt{2}$. Number the nodes either clockwise or counterclockwise around the square (due to symmetry, any such numbering should yield the same matrix). There are two ways to compute their corresponding element matrices and you may choose either of them:

- 1. direct evaluation of the localized bilinear form a_K for pairs of local shape functions. Note that their gradients are not constant this time.
- 2. computation of the Galerkin matrix on the unit square, and subsequent transformation. See [NPDE, Eq. (3.5.10)] for the basis functions on the unit square. [NPDE, Section 3.7.3] explains transformation techniques. Your transformation Φ in this case will simply be a scaling.

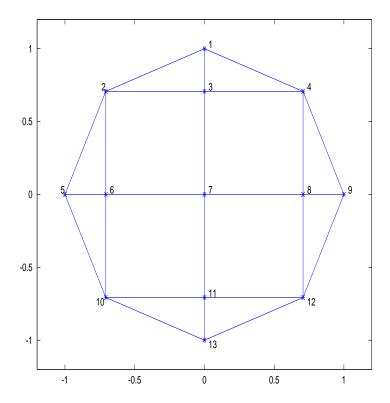


Figure 6.3: A hybrid mesh of triangles and quadrilaterals.

(6.4c) Compute the 3×3 element Galerkin matrix for the triangle with vertices 1, 2, 3 using the standard linear local shape functions (barycentric coordinate functions, see)

HINT: The triangle has side lengths $1/\sqrt{2}$, $1-1/\sqrt{2}$ and $\sqrt{2-\sqrt{2}}$. Check out [NPDE, Eq. (3.3.21)]. Use the local node numbering inherited from the global one (i.e. vertex 1 is number 1, and so on).

(6.4d) Compute the element right-hand side vector for a quadrilateral cell. For this, use the quadrature formula

$$\int_{K} f(\mathbf{x}) \, d\mathbf{x} \approx \frac{|K|}{4} \sum_{i=1}^{4} f(\mathbf{a}^{i}), \tag{6.4.3}$$

where \mathbf{a}^i are the vertices of the square K.

(6.4e) What is the full 13×13 Galerkin matrix for the numbering of nodes given in Figure 6.3?

HINT: Do an assembly "by hand" (see [NPDE, Section 3.6.3]). For each pair of neighboring vertices i, j, walk through the elements shared by i and j, find the local element contribution from subproblems (6.4b) or (6.4c) and sum them up.

(6.4f) Compute the full right-hand side vector using the local contributions found in subproblem (6.4d). For the local contributions from the triangles, you can use the corresponding quadrature rule there,

$$\int_{K} f(\mathbf{x}) \, d\mathbf{x} \approx \frac{|K|}{3} \sum_{i=1}^{3} f(\mathbf{a}^{i}),$$

with a^i the vertices of the triangle.

- (6.4g) [NPDE, Rem. 3.5.18] discusses the choice of interpolation nodes and, thus, implicitly, the choice of global shape functions, for quadratic Lagrangian finite elements on hybrid meshes. What is the dimension of $S_2^0(\mathcal{M})$, if \mathcal{M} is the hybrid mesh display in Figure 6.3?
- (6.4h) Write A_Q for the Galerkin matrix A_Q for a general linear second-order elliptic Neumann boundary value problem when the space $S_2^0(\mathcal{M})$ of quadratic Lagrangian finite elements on the hybrid mesh from Figure 6.3 is used as a trial and test space. Give a sharp bound on the number $\operatorname{nnz}(A_Q)$ of non-zero entries of A_Q .

HINT: In light of the supports of global shape functions, which pairs of them can interact in the bilinear form?

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References

[NPDE] Lecture Slides for the course "Numerical Methods for Partial Differential Equations". SVN revision # 74741.

[1] M. Struwe. Analysis für Informatiker. Lecture notes, ETH Zürich, 2009. https://moodle-app1.net.ethz.ch/lms/mod/resource/index.php?id=145.

[NCSE] Lecture Slides for the course "Numerical Methods for CSE".

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