# NUMERICAL ANALYSIS FOR PARTIAL DIFFERENTIAL EQUATIONS A.A. 2019/2020

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#### Lab 3

#### Galerkin-finite element method for elliptic problems

### Exercise 1

In the unit square  $\Omega \equiv (0,1) \times (0,1)$  we consider the following problem:

$$\begin{cases}
-\Delta u = 8\pi^2 \sin(2\pi x) \sin(2\pi y) & \text{in } \Omega, \\
u = 0 & \text{on } \partial\Omega.
\end{cases}$$
(1)

1. Give the weak formulation and prove the well posedness of the problem.

The problem considered features homogeneous Dirichlet conditions. The weak formulation is obtained multiplying the first equation of the system by a generic function  $v \in V \equiv H_0^1$  and integrating by parts the Laplacian term. Calling  $f = 8\pi^2 \sin(2\pi x)\sin(2\pi y)$  we get

$$\int_{\Omega} \nabla u \cdot \nabla v \, d\omega = \int_{\Omega} f v \, d\omega.$$

The weak formulation of problem (1) reads: Find  $u \in V$  s.t.

$$a(u,v) = \int_{\Omega} \nabla u \cdot \nabla v \, d\omega = \int_{\Omega} f v \, d\omega = F(v) \quad \forall v \in V.$$
 (2)

The bilinear form is symmetric, continuous, coercive in V. We have indeed

$$|a(u,v)| < ||u||_V ||v||_V \quad \forall u, v \in V.$$

Moreover for any  $u \in V$  we have

$$a(u, u) = \|\nabla u\|_{L^2(\Omega)}^2 \ge \frac{1}{1 + c_{\Omega}^2} \|u\|_V^2,$$

where in the last step we have used the Poincaré inequality. Finally we can prove that

$$|F(v)| \le ||f||_{L^2(\Omega)} ||v||_V \quad \forall v \in V.$$

From the Lax-Milgram lemma, solution to (2) exists and is unique.

2. Implement in Matlab a linear finite element solver for problem (1), focusing in particular on the assembly of the linear system and of the load vector stemming after the Galerkin finite element approximation.

The implementation of the finite element solver involves the definition of the data structure Dati within the function C\_dati.m and the modification of the function C\_matrix2D.m For the former we have:

```
1 function [Dati]=C dati(test)
  if test="Test1"
4 Dati = struct ( 'name',
                                        test,...
5
                   ... % Test name
                   'domain',
                                        [0,1;0,1],...
6
                   ... % Domain bounds
7
                   'exact sol',
                                        '\sin(2*pi*x).*\sin(2*pi*y)',...
8
                   ... % Definition of exact solution
9
                   'force',
                                        8*pi^2*sin(2*pi*x).*sin(2*pi*y),...
                   ... % Forcing term
11
                   'grad exact 1',
                                        2*pi*cos(2*pi*x).*sin(2*pi*y)',...
                   ... % Definition of exact gradient (x comp)
                   grad_exact_2',
                                         2*pi*sin(2*pi*x).*cos(2*pi*y)',...
14
                   ... % Definition of exact gradient (y comp)
                   'fem',
                                        'P1',...
16
                   ... % P1-fe
17
18
                   'nqn 1D',
                                         4,...
                   ... % Number of quad. points per edge
19
                   'nqn 2D',
                                         3,...
20
                   ... % Number of quad. points per triangle
21
                                        'TS', ...
                   'MeshType',
22
                   ... % Triangular Structured mesh
23
                   'refinement_vector', [2,3,4,5],...
24
                   ... % Refinement levels for the error analysis
25
                                      'N ' , . . .
                   'visual graph',
26
                   ... % Visualization of the solution
27
                   'plot errors',
                                         'Y' ...
28
                   ...% Compute Errors
29
                  );
30
31 end
```

The assembly of the linear system and of the load vector is computed in C\_matrix2D.m by using this strategy:

- 1. compute local stiffness matrix A\_loc and local load vector load
- 2. add the local results to the corresponding global ones through the connectivity matrix connectivity

```
1 function [A, f]=C matrix2D(Dati, femregion)
2 % [A, f] = C_matrix2D(Dati, femregion)
3 %
4 % Assembly of the stiffness matrix A and rhs f
5 %
6 %
       called in C main2D.m
7 %
8 %
       INPUT:
9 %
              Dati
                                       see C dati.m
                           : (struct)
10 %
              femregion
                           : (struct)
                                       see C create femregion.m
11 %
12 %
       OUTPUT:
13 %
             Α
                           : (sparse(ndof, ndof) real) stiffnes matrix
14 %
              f
                           : (sparse(ndof,1) real) rhs vector
15
17 addpath FESpace
18 addpath Assembly
19
```

```
20 fprintf ('=
                                                                             =\n ' )
21 fprintf('Assembling matrices and right hand side ... \n');
22 fprintf('=
                                                                             =\n ' )
24
25 % connectivity infos
                = femregion.ndof; % degrees of freedom
26 ndof
                = femregion.nln; % local degrees of freedom
27 nln
                = femregion.ne; % number of elements
28 ne
  connectivity = femregion.connectivity; % connectivity matrix
31
32 % shape functions
33 [basis] = C shape basis(Dati);
34
35 % quadrature nodes and weights for integrals
36 [nodes 2D, w 2D] = C quadrature(Dati);
37
38 % evaluation of shape bases
39 [dphiq, Grad] = C evalshape(basis, nodes 2D);
40
41
42 % Assembly begin ...
43 A = sparse(ndof, ndof); % Global Stiffness matrix
                            % Global Load vector
44 f = sparse(ndof, 1);
45
  for ie = 1 : ne
46
47
      % Local to global map --> To be used in the assembly phase
48
       iglo = connectivity (1:nln, ie);
49
50
51
       [BJ, pphys 2D] = C get Jacobian (femregion.coord(iglo,:), nodes 2D, Dati.
      MeshType);
                   = Jacobian of the elemental map
      \% BJ
53
      % pphys 2D = vertex coordinates in the physical domain
54
55
                                                                         =%
56
      % STIFFNESS MATRIX
57
58
59
      % Local stiffness matrix
60
       [A loc] = C lap loc(Grad, w 2D, nln, BJ);
61
62
      % Assembly phase for stiffness matrix
63
      A(iglo, iglo) = A(iglo, iglo) + A loc;
64
65
66
      \% FORCING TERM ——RHS
67
      %
68
69
      % Local load vector
70
       [load] = C loc rhs2D(Dati.force, dphiq, BJ, w 2D, pphys 2D, nln);
71
      % Assembly phase for the load vector
73
       f(iglo) = f(iglo) + load;
74
75
76 end
```

This is achieved between the lines 48 and 78 of the presented code. In particular the local contributions are computed through the following functions

```
1 function [K loc]=C lap loc(Grad, w 2D, nln, BJ)
2 % [K loc]=C lap loc(Grad, w 2D, nln, BJ)
3 %
4 % Build the local stiffness matrix for the term grad(u)grad(v)
5 %
6 %
        called in C matrix2D.m
7 %
8 %
       INPUT:
9 %
              Grad
                           : (array real) evaluation of the gradient on
10 %
                             quadrature nodes
11 %
              w 2D
                           : (array real) quadrature weights
12 %
              nln
                           : (integer) number of local unknowns
13 %
              BJ
                           : (array real) Jacobian of the map
14 %
15 %
       OUTPUT:
16 %
                           : (array real) Local stiffness matrix
              K loc
17
18
19 K loc=zeros (nln, nln);
20
  for i=1:nln
21
       for j=1:nln
22
           for k=1:length (w 2D)
23
               Binv = inv(BJ(:,:,k));
                                         % inverse
24
                                         % determinant
25
               Jdet = \det(BJ(:,:,k));
26
               K_{loc}(i,j) = K_{loc}(i,j) + (Jdet.*w_{2}D(k)) .* (Grad(k,:,i) *
      Binv) * (Grad(k,:,j) * Binv )');
27
           end
      end
28
29 end
function [f]=C loc rhs2D(force, dphiq, BJ, w 2D, pphys 2D, nln)
2 % [f]=C loc rhs2D(force, dphiq, BJ, w 2D, pphys 2D, nln)
3 %
4 % Build the right hand side vector (fv)
5 %
6 %
        called in C matrix2D.m
7 %
8 %
       INPUT:
9 %
                           : (string) expression of the forcing term
              force
10 %
                           : (array real) basis functions evaluated at q.p.
              dphiq
11 %
                           : (array real) Jacobian of the map
              BJ
12 %
              w 2D
                           : (array real) quadrature weights
13 %
              pphys 2D
                           : (array real) quadrature nodes in the physical
14 %
                                           space
15 %
              nln
                           : (integer) number of local unknowns
16 %
17 %
       OUTPUT:
18 %
                           : (array real) Local right hand side
19
20
f = zeros(nln, 1);
22 % evaluation of the right hand side on the physical nodes
23 x = pphys 2D(:,1);
y = pphys \ 2D(:,2);
F = eval(force);
```

```
27 % Evaluation of the local r.h.s. 

28 for s = 1:nln 

29 for k = 1:length(w_2D) 

30 Jdet = det(BJ(:,:,k)); % determinant 

f(s) = f(s) + w_2D(k)*Jdet*F(k)*dphiq(1,k,s); 

21 end 

22 end
```

3. Compute the  $H^1(\Omega)$  and  $L^2(\Omega)$  errors as function of the mesh grid h, knowing that the exact solution to problem (1) is  $u_{ex} = \sin(2\pi x)\sin(2\pi y)$ . Gather these results in a table and provide a comment on them, moving from the theoretical knowledge.

The computation of the  $H^1(\Omega)$  and  $L^2(\Omega)$  errors is implemented in the provided function C\_compute\_errors. The error plots can be obtained through the function C\_convergence\_test and the results are reported in Figure 1. As one can see the theoretical convergence rates are verified, in particular a quadratic (resp. linear) order of convergence is obtained with respect to the  $L^2(\Omega)$ -norm (resp.  $H^1(\Omega)$ -norm). See also Table 1.

```
1 function [errors table, rates]=C convergence test(test name)
2 % [errors table, rates]=C mesh test(test name)
3 %=
4 % Error analysis varying the mesh size h
5 %
6 % Example of usage: [errors table, rates] = C mesh test('Test1')
7 %
8 %
       INPUT:
9 %
                            : (string) test case name, see C dati.m
              test name
10 %
11 %
       OUTPUT:
              errors table: (struct) containing the computed errors
12 %
13 %
                          : (struct) containing the computed rates
14
  warning off;
16
  addpath Assembly
  addpath Boundary Conditions
  addpath Errors
  addpath MeshGeneration
  addpath FESpace
  addpath Postprocessing
23
24
  Dati=C dati(test name);
  refinement vector=Dati.refinement vector;
  num test=length(refinement vector);
28
29
  for k=1:num test
30
       [errors, solutions, femregion, Dati]=C main2D(test name, refinement vector(k));
31
      Error L2(k)=errors. Error L2;
      Error SEMI H1(k)=errors.Error SEMI H1;
33
      Error H1(k)=errors.Error H1;
34
      Error_inf(k)=errors.Error inf;
35
      ne(k)=femregion.ne;
36
      h(k)=femregion.h;
37
       fprintf('
                                                              =\n ' ) ;
38
       fprintf('End test %i\n',k);
39
       fprintf('=
40
```

```
41 end
  p=femregion.degree;
42
44 %ERROR TABLE
  errors table=struct('ne',ne,...
45
                        'h',h,...
46
                        'Error_L2', Error_L2,...
47
                        'Error SEMI H1', Error SEMI H1,...
48
                        'Error_H1', Error_H1,...
49
                       'Error inf', Error inf);
50
53
54 %TABLE
  rate L2=log10 (Error L2(2:num test)./Error L2(1:num test-1))./log10 (h(2:num test)./
      h(1:num\_test-1));
  rate SEMI H1=log10 (Error SEMI H1(2:num test)./ Error SEMI H1(1:num test-1))./
      log 10 (h (2: num test)./h (1: num test - 1));
  rate H1=log10 (Error H1(2:num test)./ Error H1(1:num test-1))./log10(h(2:num test)
      ./h(1:num test-1));
  rate \inf = \log 10 (Error \inf (2: \text{num test})./ Error \inf (1: \text{num test} - 1))./\log 10 (h(2:
      num test)./h(1:num test-1);
  rates=struct('rate L2', rate L2,...
60
                 'rate_SEMI_H1', rate_SEMI_H1,...
61
                 'rate_H1', rate_H1,...
62
                 'rate_inf', rate_inf);
63
64
65
66 % ERROR PLOTS
67 \text{ hs} = \text{subplot}(2,1,1);
  loglog(h,h.^(p+1),'-+b','Linewidth',2);
  hold on
  loglog (h, Error L2, '-or', 'Linewidth',2);
  hold on
  legend (sprintf ('h^%i',p+1),'||.|| {L^2}');
  title ('Errors');
  ylabel ('L^2-error')
  xlabel('h');
75
  hs.FontSize = 12;
76
  hs = subplot(2,1,2);
  loglog(h,h.^(p),'-+b','Linewidth',2);
  hold on
  loglog(h, Error_H1, '-or', 'Linewidth', 2);
  hold on
  legend(sprintf('h^%i',p),'||.||_{H^1}');
  ylabel('H^1-error')
  xlabel('h');
  hold off
  hs.FontSize = 12;
```

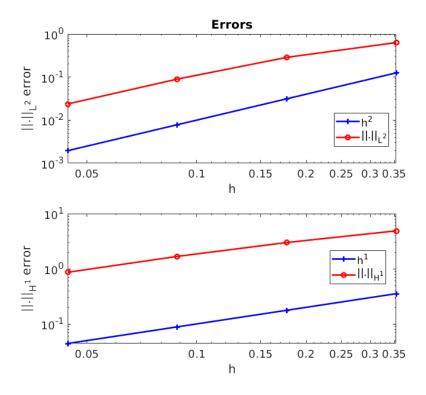


Figure 1: Computed  $H^1(\Omega)$  and  $L^2(\Omega)$  errors as function of the mesh grid h

	0.1768			
$  u-u_h  _{L^2(\Omega)}$	0.2862	0.0895	0.0238	0.0060
$  u-u_h  _{H^1(\Omega)}$	2.9914	1.6754	0.8634	0.4351

Table 1: Computed  $H^1(\Omega)$  and  $L^2(\Omega)$  errors as function of the mesh grid h.

#### Exercise 2

In the unit square  $\Omega \equiv (0,1) \times (0,1)$  we consider the following problem:

$$\begin{cases}
-\Delta u + 2u = 0, & \text{in } \Omega, \\
u = g \equiv e^{x+y}, & \text{on } \partial\Omega.
\end{cases}$$

1. Give the weak formulation and prove the well posedness of the problem. Find the analytical solution.

The problem considered features non homogeneous Dirichlet conditions. The weak formulation is obtained multiplying the first equation of the system by a generic function  $v \in V \equiv H_0^1$  and integrating by parts the Laplacian term. We get

$$\int_{\Omega} \nabla u \cdot \nabla v \, d\omega + 2 \int_{\Omega} uv \, d\omega = 0. \tag{3}$$

Le us introduce the lifting operator  $R_g$  such that  $R_g \in H^1(\Omega)$  and  $R_g|_{\partial\Omega} = g$ . We define a new unknown function  $\mathring{u} = u - R_g$  that, by definition, will belong to  $H^1_0(\Omega)$ . By replacing u in (3) with  $\mathring{u} + R_g$ , we get the following problem. Find  $\mathring{u} \in V$  s.t.

$$a(\overset{\circ}{u},v) = \int_{\Omega} \nabla \overset{\circ}{u} \cdot \nabla v \, d\omega + 2 \int_{\Omega} \overset{\circ}{u} v \, d\omega = -\int_{\Omega} \nabla R_g \cdot \nabla v \, d\omega - 2 \int_{\Omega} R_g v \, d\omega = F(v) \quad \forall v \in V.$$
(4)

The bilinear form is symmetric, continuous, coercive in V. We have indeed

$$|a(u,v)| \le 3||u||_V ||v||_V \quad \forall u, v \in V.$$

Moreover for any  $u \in V$  we have

$$a(u, u) \ge \|\nabla u\|_{L^2(\Omega)}^2 + 2\|u\|_{L^2(\Omega)}^2 \ge \|u\|_V^2.$$

Finally we can prove that

$$|F(v)| \le 3||R_g||_V||v||_V \quad \forall v \in V.$$

From the Lax-Milgram lemma, solution to (4) exists and is unique.

We assume that the solution has the form u = X(x)Y(y). Notice that in particular  $g = B_x(x)B_y(y)$ , where the boundary functions are  $B_x = e^x$  and  $B_y = e^y$ . With these positions, we write

$$-X''Y - XY'' + 2XY = 0.$$

Assuming  $X \neq 0$  and  $Y \neq 0$ , we reformulate the equation in the form

$$\frac{X''}{X} = 2 - \frac{Y''}{Y}.$$

The two sides of the equation above are functions of two different variables, so they are constants. For a real constant K, we have

$$\frac{X''}{X} = K.$$

Assume that K > 0, so to obtain

$$X = C_{1,K}e^{\sqrt{K}x} + C_{2,K}e^{-\sqrt{K}x}.$$

By prescribing the boundary function  $B_x$  we conclude that

$$C_{1,K} = \begin{cases} 1 & \text{for } K = 1, \\ 0 & \text{for } K \neq 1, \end{cases}$$
  $C_{2,K} = 0, \quad \forall K > 0.$ 

Proceeding similarly for Y (for K = 1) we obtain that  $Y = e^y$  and conclude that  $u_{ex} = e^{x+y}$ . Our theoretical analysis concludes that this is the only solution to the problem.

2. Give the linear finite element approximation using Matlab on uniform grids.

Let  $V_h$  be the subspace of V of linear finite elements. The Galerkin finite element formulation of (4) reads: find  $u_h \in V_h$  s.t.

$$a(u_h, v_h) = F(v_h) \quad \forall v_h \in V_h. \tag{5}$$

By introducing a basis  $\{\varphi_j\}_{j=1}^{N_h}$  for the space  $V_h$  we can write the generic element of the stiffness matrix A assciated to (5) in the form

$$A_{ij} = \int_{\Omega} \nabla \varphi_j \cdot \nabla \varphi_i \, d\omega + 2 \int_{\Omega} \varphi_j \varphi_i \, d\omega, \quad i, j = 1, ..., N_h.$$

To assembly the linear system and the load vector we can proceed as for the previous exercise. Here, in particular, we need to compute the local stiffnes matrix as the sum of two contribution A\_loc and M\_loc. The former can be computed by using the C\_lap\_loc.m function whereas the latter through the C\_mass\_loc.m function defined below.

```
function [M loc]=C mass loc(dphiq, w 2D, nln, BJ)
2 % [M loc]=C mass loc(dphiq,w 2D, nln, BJ)
  % Build the local mass matrix for the term (uv)
  %
       called in C matrix2D.m
  %
       INPUT:
                          : (array real) evaluation of the basis function on
  %
              dphiq
10 %
                             quadrature nodes
11 %
              w 2D
                           : (array real) quadrature weights
12 %
                           : (integer) number of local unknowns
13 %
              BJ
                           : (array real) Jacobian of the map
14 %
15 %
       OUTPUT:
16 %
              M loc
                           : (array real) Local mass matrix
17
  M loc=zeros(nln, nln);
18
19
  for i=1:nln
20
      for j=1:nln
21
           for k=1:length (w 2D)
22
               Jdet = det(BJ(:,:,k)); % determinant
23
               M loc(i,j) = M loc(i,j) + (Jdet.*w 2D(k)) .* dphiq(1,k,i).* dphiq
24
      (1,k,j);
25
           end
26
27 end
```

The results are then summed up together to obtain the global stiffness matrix A.

```
% Local stiffness matrix
[A_loc] = C_lap_loc(Grad,w_2D,nln,BJ);
[M_loc] = C_mass_loc(dphiq,w_2D,nln,BJ);

% Assembly phase for stiffness matrix
A(iglo,iglo) = A(iglo,iglo) + Dati.mu*A_loc + Dati.sigma*M_loc;
```

Notice that we have added to the Dati structure the additional fields Dati.mu and Dati.sigma and defined the new test case Test2.

```
function [Dati]=C dati(test)
2
3 if test="'Test2'
4 Dati = struct ( 'name',
                                        test,...
                   ... % Test name
                   'domain',
                                        [0,1;0,1],...
6
                   ... % Domain bounds
                   'mu',
                                        1, ...
8
                   ... % Diffusive term ...
9
                   'sigma',
                                        2, \ldots
10
                   ... % Reactive term
11
                   'exact sol',
                                        '\exp(x+y)',\ldots
12
13
                   ... % Definition of exact solution
                   'force',
                                        0.*x.*y',...
14
                   ... % Forcing term
15
                   'grad exact 1',
                                        '\exp(x+y)',\ldots
16
                   ... % Definition of exact gradient (x comp)
17
                   'grad exact 2',
                                        '\exp(x+y)',\ldots
18
                   ... % Definition of exact gradient (y comp)
19
                   'fem',
                                        'P1',...
20
                   ... % P1-fe
21
                   'nqn 1D',
                                         4,...
22
                   ... % Number of quad. points per edge
23
                   'nqn 2D', 3,...
24
                   ... % Number of quad. points per triangle
25
                                'TS', ...
                   'MeshType',
26
                   ... % Triangular Structured mesh
27
                   refinement\_vector, [2,3,4,5],...
28
                   ... % Refinement levels for the error analysis
29
                                    'N ' , . . .
                   'visual graph',
30
                   ... % Visualization of the solution
31
                   'plot errors',
                                         Y' ...
32
                   ...% Compute Errors
33
                  );
34
35 end
```

3. Compute the  $H^1(\Omega)$  and  $L^2(\Omega)$  errors as function of the mesh grid h. Gather these results in a table and provide a comment on them, moving from the theoretical knowledge.

As for the previous exercise, the error plots can be obtained through the function  $C_{convergence\_test}$  and the results are reported in Figure 2. As one can see the theoretical convergence rates are verified, in particular a quadratic (resp. linear) order of convergence is obtained with respect to the  $L^2(\Omega)$ -norm (resp.  $H^1(\Omega)$ -norm). See also Table 2.

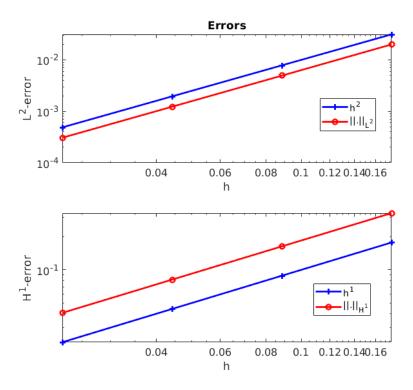


Figure 2: Computed  $H^1(\Omega)$  and  $L^2(\Omega)$  errors as function of the mesh grid h

h	0.1768	0.0884	0.0442	0.0221
11 10 (22)				3.0716e-04
$  u-u_h  _{H^1(\Omega)}$	0.3263	0.1630	0.0815	0.0408

Table 2: Computed  $H^1(\Omega)$  and  $L^2(\Omega)$  errors as function of the mesh grid h.

## Exercise 3

A simple model used in oceanography is due to Stommel<sup>1</sup>. In this model ocean is assumed to be flat and with uniform depth H, and no vertical movement of the water free boundary it is considered (since it is small compared with the horizontal one). Only Coriolis force, wind action on the surface and friction at the bottom are included. Incompressibility implies that there exists a function  $\psi$ , called *stream function*, related to the velocity components by the equations

$$u = -\frac{\partial \psi}{\partial y}, v = \frac{\partial \psi}{\partial x}.$$

In Stommel model for a rectangular ocean  $\Omega = (0, L_x) \times (0, L_y)$ ,  $\psi$  is solution to the following elliptic problem

$$\begin{cases}
-\Delta \psi - \alpha \frac{\partial \psi}{\partial x} = \gamma \sin(\pi y/L_y), & \text{in } \Omega, \\
\psi = 0, & \text{on } \partial\Omega,
\end{cases}$$
(6)

with  $\alpha = \frac{H\beta}{R}$ ,  $\gamma = \frac{W\pi}{RL_y}$ , being R the friction coefficient on the bottom, W a coefficient associated with the surface wind,  $\beta = df/dy$  where f is the Coriolis parameter, which is in general function only of y (latitude).

1. Give the weak formulation of (6). Prove the well-posedness of the problem.

The weak formulation of the problem is obtained with the usual procedure and reads: find  $\psi \in V \equiv H_0^1(\Omega)$  such that

$$a(\psi, v) = \int_{\Omega} \nabla \psi \cdot \nabla v \, d\omega - \alpha \int_{\Omega} \frac{\partial \psi}{\partial x} v \, d\omega = \gamma \int_{\Omega} \sin(\pi y / L_y) v \, d\omega \quad \forall v \in V.$$
 (7)

Well posedness analysis relies on the Lax-Milgram Lemma. With arguments similar to the ones used in the previous exercise, we can verify that the bilinear form  $a(\cdot, \cdot)$  defined in (7) is continuous and coercive. For the coercivity, we just notice that we can write the second term on the left hand side of (7) as

$$\alpha \int_{\Omega} \frac{\partial \psi}{\partial x} v \, d\omega = \int_{\Omega} \nabla \cdot (\mathbf{b}\psi) v,$$

with  $\mathbf{b} = (\alpha, 0)^{\top}$ . Notice that

$$\alpha \int_{\Omega} \frac{\partial \psi}{\partial x} \psi \, d\omega = \int_{\Omega} \nabla \cdot (\mathbf{b}\psi) \psi = 0.$$

From  $\nabla \cdot \mathbf{b} = 0$ , we have in fact

$$\psi \nabla \cdot (\mathbf{b}\psi) = \psi \mathbf{b} \cdot \nabla \psi = \frac{1}{2} \mathbf{b} \cdot \nabla \psi^2 = \frac{1}{2} \nabla \cdot (\mathbf{b}\psi^2).$$

Therefore, since  $\psi = 0$  on  $\partial\Omega$ ,

$$\int_{\Omega} \nabla \cdot (\mathbf{b}\psi)\psi \, d\omega = \frac{1}{2} \int_{\Omega} \nabla \cdot (\mathbf{b}\psi^2) \, d\omega = \frac{1}{2} \int_{\partial \Omega} \psi^2 \mathbf{b} \cdot \mathbf{n} \, d\gamma = 0.$$

Since the functional  $F(\cdot)$  defined on the right hand side of (7) is linear and continuous, we conclude that the solution exists and is unique.

<sup>&</sup>lt;sup>1</sup>Stommel H. (1948) The westward intensification of wind-driven ocean currents. *Trans. Amer. Geophys. Union* 29(202).

2. Compute the analytical solution of the model (6) for a constant  $\beta$ .

We can compute this solution following the separation of variables approach. In particular, we assume

$$\psi(x,y) = X(x)Y(y),$$

with with  $X(0) = X(L_x) = 0$  and  $Y(0) = Y(L_y) = 0$ . Moreover, the forcing term depends only on y in the form  $\gamma \sin(\pi y/L_y)$ . Observe that the left hand side of the equation in (6) reads now

$$-X''Y - XY'' - \alpha X'Y$$

and that the second derivative of a sinus function is still a sinus function with the same frequency. This suggests to do the following educated guess,

$$Y(y) = \sin(\pi y/L_y),$$

which fulfills the boundary conditions. We have then

$$\left(-X'' + \frac{\pi^2}{L_y^2}X - \alpha X'\right)\sin(\pi y/L_y) = \gamma \sin(\pi y/L_y).$$

The problem is now reduced to the solution of the constant coefficient ordinary differential equation

$$X'' + \alpha X' - \frac{\pi^2}{L_y^2} X = -\gamma.$$

A particular solution is clearly given by

$$X_P = \frac{L_y^2 \gamma}{\pi^2}.$$

The general solution to the homogeneous equation reads

$$X_H(x) = C_1 e^{\lambda_1 x} + C_2 e^{\lambda_2} x$$

where  $\lambda_{1,2}$  are the roots of the algebraic equation

$$\lambda^2 + \alpha\lambda - \frac{\pi^2}{L_y^2} = 0,$$

i.e.,  $\lambda_{1,2} = -\frac{\alpha}{2} \pm \sqrt{\left(\frac{\alpha}{2}\right)^2 + \frac{\pi^2}{L_y^2}}$ . For  $X = X_P + X_H$ , when we prescribe the boundary conditions  $X(0) = X(L_x) = 0$  we find  $C_1$  and  $C_2$ , and the final solution reads

$$\psi = -\gamma \frac{L_y^2}{\pi^2} (pe^{\lambda_1 x} + (1-p)e^{\lambda_2 x} - 1) \sin(\pi y/L_y)$$

with  $p = (1 - e^{\lambda_2 L_x})/(e^{\lambda_1 L_x} - e^{\lambda_2 L_x})$ .

3. Solve the problem numerically with linear finite elements, using the Stommel's parameters:  $L_x=10^5~m,~L_y=2\pi10^4~m,~H=200~m,~W=0.3~10^{-7}m^2s^{-2},~R=0.6~10^{-3}ms^{-1}.$  Assume at first  $\beta=0$  and then  $\beta=5~10^{-10}m^{-1}s^1$ . Comment the results.

Galerkin approximation of (7) has the usual form: find  $\psi_h \in V_h$  s.t.  $a(\psi_h, v_h) = F(v_h)$  for any  $v_h \in V_h$ , being  $V_h$  the subspace of piece-wise linear functions.

By introducing a basis  $\{\varphi_j\}_{j=1}^{N_h}$  for the space  $V_h$  we can write the generic element of the stiffness matrix A assciated to the bilinear form  $a(\cdot,\cdot)$  in the form

$$A_{ij} = \int_{\Omega} \nabla \varphi_j \cdot \nabla \varphi_i \, d\omega - \alpha \int_{\Omega} \frac{\partial \varphi_j}{\partial x} \varphi_i \, d\omega, \quad i, j = 1, ..., N_h,$$

while for the load vector we have

$$b_i = \gamma \int_{\Omega} \sin(\pi y/(2\pi)) \varphi_i d\omega \quad i = 1, ..., N_h.$$

To assembly the linear system and the load vector we can proceed as for the previous exercise. Here, in particular, we need to compute the local stiffnes matrix as the sum of two contribution A\_loc and Adv\_loc. The former is computed with the C\_lap\_loc.m function whereas the latter through the C\_adv\_loc.m function defined below.

```
function [ADV loc]=C adv loc(Grad, dphiq, beta, w 2D, nln, BJ)
4 ADV loc=sparse(nln, nln);
  for i=1:nln
6
       for j=1:nln
           for k=1:length (w 2D)
                Binv = inv(BJ(:,:,k));
                                                                % inverse
9
                                                                % determinant
10
                Jdet = det(BJ(:,:,k));
               ADV_{loc(i,j)} = ADV_{loc(i,j)} + (Jdet.*w_2D(k)) .* dphiq(1,k,i) *( (
11
      beta) * (Grad(k,:,j) * Binv )');
           end
       end
13
14 end
```

The results are then summed up together to obtain the global stiffness matrix A.

Notice that in the Dati structure we added the additional vector field Dati.beta and we defined the new test case Test3.

```
1 function [Dati]=C dati(test)
  if test="'Test3'
  Dati = struct ( 'name',
                                         test,...
                   ... % Test name
                                         [0 \ 1.e5; 0 \ 2*pi*1.e4], \dots
                   'domain',
6
                   ... % Domain bounds
                   'mu',
                   ... % Diffusive term ...
9
                   'sigma',
10
                   ... % Reactive term ...
11
                                        [-200*5.e-10/(0.6*1.e-3),0], \dots
12
                   ... % Advective term
13
                   'exact sol', '0.*x.*y',...
14
```

```
... % Definition of exact solution
15
                   'force',
                                         'pi*0.3*1.e-5/(0.6*1.e-3*2*pi*1.e4)*sin(pi
16
      *y/(2*pi*1.e4)), ...
                   ... % Forcing term
17
18
                   'grad exact 1',
                                         0.*x.*y',...
                   ... % Definition of exact gradient (x comp)
19
                   'grad_exact_2',
                                         0.*x.*y',...
20
                   ... % Definition of exact gradient (y comp)
21
                   'fem',
                                         'P1',...
22
                   ... % P1-fe
23
                   'nqn 1D',
24
                   ... % Number of quad. points per edge
25
                   'nqn 2D',
                                          3, \ldots
26
                   ... % Number of quad. points per triangle
27
                   'MeshType',
                                         'TS', ...
28
                   ... % Triangular Structured mesh
29
                   'refinement vector', [2,3,4,5],...
30
31
                   ... % Refinement levels for the error analysis
                                         'Y', ....
32
                   'visual graph',
                   ... % Visualization of the solution
33
                                          'N' ...
                   'plot_errors',
34
                   ...% Compute Errors
35
36
37
38 end
```

Input data listed above are computed through the script analytical\_solution\_Test3.m.

```
1 \text{ Lx} = 1.e5;
2 \text{ Ly} = 2*pi*1.e4;
3 H = 200;
4 \text{ W} = 0.3 * 1.e - 7;
R = 0.6 * 1.e - 3;
6 \% \text{ beta} = 0;
7 \text{ beta} = 5*1e-10;
9 alpha = H*beta/R;
_{10} gamma = W* pi / (R*Ly);
11
12 \text{ lambda1} = -\text{alpha} * 0.5 + \text{sqrt} ((\text{alpha} * 0.5)^2 + (\text{pi/Ly})^2);
lambda2 = -alpha*0.5 - sqrt((alpha*0.5)^2+(pi/Ly)^2);
15 c2 = (Ly/pi)^2*gamma*((exp(lambda1*Lx)-1)/(exp(lambda2*Lx)-exp(lambda1*Lx)));
   c1 = -c2 - (Ly/pi)^2*gamma;
17
   psi = @(x,y,c1,c2,lambda1,lambda2,Ly,gamma) (c1*exp(lambda1*x) + c2*exp(
18
        lambda2*x) + (Ly/pi)^2*gamma).*sin(pi/Ly*y);
19
x = linspace(0, Lx, 100);
   y = linspace(0, Ly, 1000);
[X,Y] = \mathbf{meshgrid}(x,y);
 \textcolor{red}{\mathtt{surf}}\left(X,Y,psi\left(X,Y,c1\,,c2\,,lambda1\,,lambda2\,,Ly\,,\textcolor{red}{\mathtt{gamma}}\right)\,,\,{}^{\prime}\,EdgeColor\,{}^{\prime}\,,\,{}^{\prime}\,none\,{}^{\prime}\,\right);
```

In Figure 3 are reported the computed solutions  $\psi_h$  obtained with  $\beta = 0$  and  $\beta = 5.10^{-10}$ . It is clear the effect of the advective term on the computed solution, cf. Figure 3 (right).

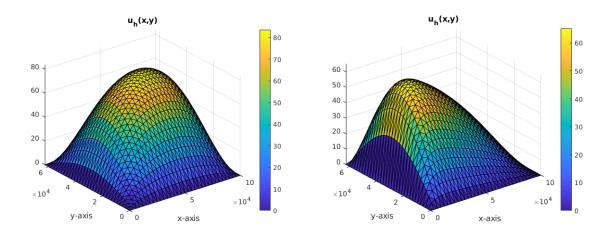


Figure 3: Computed solution  $\psi_h$  for problem (6) with  $\beta=0$  (left) and  $\beta=5.10^{-10}$  (right)