

Project FEM

Advanced Numerical Methods 10 credits 1TD050 12001 HT2022

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1 Theoretical background

The following linear advection equation

$$\partial_t u(\mathbf{x}, t) + \nabla \cdot \mathbf{f}(u(\mathbf{x}, t)) = 0, \quad (\mathbf{x}, t) \in \mathbf{\Omega} \times (0, T],$$

$$u(\mathbf{x}, t) = 0, \quad (\mathbf{x}, t) \in \partial \mathbf{\Omega} \times (0, T],$$

$$u(\mathbf{x}, 0) = u_0(\mathbf{x}), \quad \mathbf{x} \in \mathbf{\Omega}$$
(1)

is considered in a unit disk $\Omega = \{\mathbf{x} : x_1^2 + x_2^2 \le 1\}$ with homogeneous Dirichlet boundary condition on the boundary $\partial \Omega$ and initial data $u(\mathbf{x}, t) = u_0(\mathbf{x})$.

First a subspace $\chi \subseteq H^1$ is constructed for the weak formulation of Eq. (1)

$$\chi_0 := \{ v; ||v||^2 + ||\Delta v||^2 < \infty, v(\mathbf{x}, t) = 0 \text{ on } \partial \mathbf{\Omega} \}.$$
 (2)

Hence, a finite dimensional subspace of χ_h can be given by

$$\chi_{h,0} := \{ v; v \in C^0(\Omega), v | k_i \in P^1(k_i), \forall k \in \mathcal{T}_h, v(\mathbf{x}, t) = 0 \text{ on } \partial \Omega \}.$$
(3)

Thus, the Galerkin finite element formulation is given to be

Find
$$u_h \in \chi_{h,0}$$
 such that
$$(\partial_t u_h, v) + (\nabla \cdot \mathbf{f}(u), v) = 0$$

$$\forall v \in \chi_{h,0}.$$
 (4)

Rewriting the flux term in non-conservative form i.e , $\nabla \cdot \mathbf{f}(u) = \mathbf{f}'(u) \cdot \nabla u$, where $\mathbf{f}'(u) := 2\pi(-x_2, x_1)$, gives the following formulation

Find
$$u_h \in \chi_{h,0}$$
 such that
$$(\partial_t u_h, v) + (\mathbf{f}'(u_h).\nabla u_h, v) = 0$$

$$\forall v \in \chi_{h,0}.$$
(5)

Inserting $u_h = \sum_{N_j \in \mathcal{N}_h} \xi_j \phi_j$ with $\{\phi_i\}|_{N_i \in \mathcal{T}_h}$ being the basis of $\chi_{h,0}$, and ξ_i are the solution's values on the nodal points, gives

$$\sum_{\mathcal{N}_i} \left(\dot{\xi}_j(\phi_j, \phi_i) + \xi_j(\mathcal{B}_i \cdot \nabla \phi_j, \phi_i) \right) = 0.$$
 (6)

Thus, the semi-discrete Galerkin finite element formulation is obtained to be

$$\mathbb{M}\dot{\xi} + \mathcal{B}\mathbb{C}\xi,\tag{7}$$

where \mathbb{M} is the mass matrix, and \mathbb{C} is the convection matrix.

Applying the Crank-Nicolson method for time discretization of Eq.(7) gives the fully discrete Galerkin finite element method, that is

$$\frac{\mathbb{M}}{\Lambda T} \left[\xi^{n+1} - \xi^n \right] = \frac{1}{2} \left[-\mathcal{B} \mathbb{C} \xi^{n+1} - \mathcal{B} \mathbb{C} \xi^n \right], \tag{8}$$

$$\Rightarrow \frac{\mathbb{M}}{\Delta T} \xi^{n+1} + \frac{\mathcal{B}}{2} \mathbb{C} \xi^{n+1} = \frac{\mathbb{M}}{\Delta T} \xi^n - \frac{\mathcal{B}}{2} \mathbb{C} \xi^n, \tag{9}$$

$$\Rightarrow \left(\frac{\mathbb{M}}{\Delta T} + \frac{\mathcal{B}}{2}\mathbb{C}\right)\xi^{n+1} = \left(\frac{\mathbb{M}}{\Delta T} - \frac{\mathcal{B}}{2}\mathbb{C}\right)\xi^{n},\tag{10}$$

$$\Rightarrow \xi^{n+1} = \left(\frac{\mathbb{M}}{\Delta T} + \frac{\mathcal{B}}{2}\mathbb{C}\right)^{-1} \left(\frac{\mathbb{M}}{\Delta T} - \frac{\mathcal{B}}{2}\mathbb{C}\right) \xi^{n},\tag{11}$$

Which can be rewritten to be in the form

$$A\mathbf{u} = \mathbf{b}.\tag{12}$$

2 Problem 1.1

In this part, the solution of Eq. (1) is approximated with Galerkin finite element method in Eq. (11). Here, the initial data is given to be

$$u_0(\mathbf{x},0) = \frac{1}{2} \left(1 - \tanh\left(\frac{(x_1 - x_1^0)^2 - (x_2 - x_2^0)^2}{r_0^2}\right) \right),\tag{13}$$

where $r_0 = 0.25$, and $(x_1^0, x_2^0) = (0.3, 0)$. The time stepping is computed from $\Delta T = \text{CLF} \frac{h_{\text{max}}}{||\mathbf{f}'(u)||_{L_{\infty}}}$, where CLF = 0.5, and $||\mathbf{f}'(u_h)||_{L_{\infty}} = \max_{N_i \text{ in } K, i = 0, 1, 2} \left([(f_1'(u_h))^2 + (f_2'(u_h))^2]^{\frac{1}{2}}(N_i) \right)$.

The view of the solution for mesh sizes of $h_{max} = \frac{1}{8}$ and $h_{max} = \frac{1}{16}$ is shown, respectively, in (Click here) and (Click here). The simulation is given for a final time T = 1.

3 Problem 1.2

The L_2 -norm of the error is computed to be

$$||e||_{L_2(\mathbf{\Omega})} = \left(\int_{\Omega} e^2 d\mathbf{x}\right)^{\frac{1}{2}},\tag{14}$$

where $e = u_{\text{exact}-u_u}$. The error satisfies the priori error estimate

$$||e||_{L_2(\mathbf{\Omega})} \le Ch^{\alpha}||u||_{H^2(\mathbf{\Omega})}.\tag{15}$$

Thus, looking at the logarithm of right hand side is $\alpha Ch||u||_{H^2(\omega)}$. The convergence rate α can be found by plotting the error value in log scale, interpolating, and then taking the slope of the resulting function. The results give the convergence rate a value of 1.6893.

Figure 1 presents the plot of the L_2 -norm of the error and h_{max}^{α} as a function of mesh sizes.

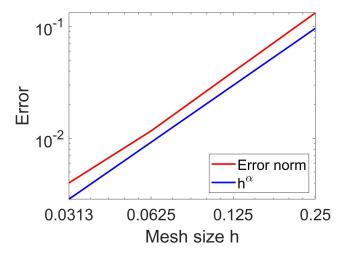


Figure 1: Plots of the L_2 -norm of the error and of h^{α} as a function of the mesh size.

4 Problem 1.3

Repeating the above analysis on the following discontinuous initial data

$$u_0(\mathbf{x}) = \begin{cases} 1, & \text{if } (x_1 - x_1^0)^2 + (x_2 - x_2^0)^2 \le r_0^2, \\ 0, & \text{otherwise,} \end{cases}$$
 (16)

yields the following simulations (Click here), and (Click here) for $h_{\text{max}=\frac{1}{8}}$ and $h_{\text{max}=\frac{1}{16}}$ respectively. Figure 2 presents the plot of L_2 -norm of the error and h_{max}^{α} as a function of the mesh sizes, where alpha is found to have the value 0.3228.

Comparing the Galerkin method for discontinuous initial data with the previous continuous initial data in 2, it is observed that the solution starts exhibiting strong oscillations (especially around the discontinuity) even for a more refined case, which contributes to the error observed in figure 2. When it comes to the shape of the solution, it is assumed that the sharp gradient and the discontinuity near the boundary introduce a shape-distortion of the solution that is due to the oscillatory behavior of the Fourier series of the basis function around the discontinuity (Gibbs phenomena).

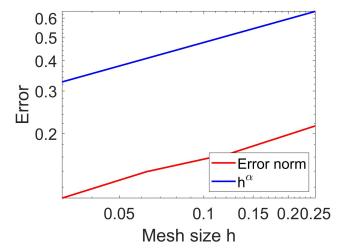


Figure 2: Plots of the L_2 -norm of the error and of h^{α} as a function of the mesh size.

5 Part 2

5.1 RV method

To handle the instability occurring in the standard Galerkin finite element method, The residual-based artificial viscosity method is applied to stabilize Eq. (4). Here, a diffusion term that depends on the residual of the solution is added to the standard form in Eq. (4). The new form gives

$$\frac{1}{k^n}(U_n - U_{n-1}) + \frac{1}{2}(\nabla \cdot F_n + \nabla \cdot F_n, v) + \frac{1}{2}(\epsilon_n(\nabla u_n + \nabla u_{n-1}, \nabla v)) = 0, \tag{17}$$

which can be rewritten to be

$$\frac{1}{k^n}(u_h^n, v) + \frac{1}{2}(\mathcal{B}.\nabla u_h^n, v) + \frac{1}{k^n}(\epsilon^n \nabla u_h^n, \nabla v) = \frac{1}{k^n}(u_h^{n-1}, v) - \frac{1}{2}(\mathcal{B}.\nabla u_h^{n-1}, v) - \frac{1}{2}(\epsilon^n \nabla u_h^{n-1}, \nabla v). \tag{18}$$

Thus, the matrix from follows

$$\frac{1}{k^n} \mathbb{M} \xi^n + \frac{1}{2} \mathbb{C} \xi^n + \frac{1}{2} \mathbb{S} \xi^n = \frac{1}{k^n} \mathbb{M} \xi^{n-1} - \frac{1}{2} \mathbb{C} \xi^{n-1} - \frac{1}{2} \mathbb{S} \xi^{n-1}, \tag{19}$$

$$\Rightarrow \left(\frac{1}{k^n}\mathbb{M} + \frac{1}{2}\mathbb{C} + \frac{1}{2}\mathbb{S}\right)\xi^n = \left(\frac{1}{k^n}\mathbb{M} - \frac{1}{2}\mathbb{C} - \frac{1}{2}\mathbb{S}\right)\xi^{n-1},\tag{20}$$

which has the form

$$A\mathbf{x} = \mathbf{b},\tag{21}$$

$$\Rightarrow \xi^{n} = \left(\frac{1}{k^{n}}\mathbb{M} + \frac{1}{2}\mathbb{C} + \frac{1}{2}\mathbb{S}\right)^{-1} \left(\frac{1}{k^{n}}\mathbb{M} - \frac{1}{2}\mathbb{C} - \frac{1}{2}\mathbb{S}\right)\xi^{n-1}.$$
 (22)

The matrix elements are $\mathbb{M}_{ij} = (\phi_i, \phi_j)$, $\mathbb{C}_{i,j} = (\beta_i . \nabla \phi_i, \phi_j)$ and $\mathbb{S}_{ij} = (\epsilon_K \nabla \phi_i, \nabla \phi_j)$.

The artificial viscosity ϵ is computed for each element from

$$\epsilon_K^n = \min(C_{\text{vel}} h_K \beta_K, \ C_{\text{RV}} h_K^2 \frac{||R||_{\infty, K}}{||u_h^n - \overline{u_h^n}||_{\infty, \Omega}}), \tag{23}$$

where the residual $R(u_h)$ is given by

$$R(u_h^n) = \frac{1}{k^n} (u_h^n - u_h^{n-1}) + \mathcal{B}.\nabla u_h^n,$$
 (24)

 $C_{\text{vel}} = 1 \text{ and } C_{\text{RV}} = 0.25.$

For the continuous boundary condition in Eq. (13) the solution is viewed in (Click here) and (Click here) for $h_{\text{max}} = \frac{1}{8}$ and $h_{\text{max}} = \frac{1}{16}$, respectively. For the discontinuous boundary condition in Eq. (16) the solution is viewed in (Click here) and (Click here) for $h_{\text{max}} = \frac{1}{8}$ and $h_{\text{max}} = \frac{1}{16}$, respectively. When observing the solution for cases with low mesh resolution, it is possible to see the height of the disk diminishing as if it is melting away. This occurrence ceases when the mesh is sufficiently refined. It can be explained that due to the dependency of the viscosity coefficient on h_k in Eq. (23), a large mesh size exacerbates the diffusion affect. This can be observed in the large error for small mesh size in the plot 4 (a) and (c).

5.2 SUPG method

An alternative stabilization technique in given by the Streamline upwind Petrove-Galerkin method (SUPG) which follows

$$(\partial_t u_h + \mathcal{B}.\nabla u_h, v) + (\gamma(\partial_t u_h + \mathcal{B}.\nabla u_h), \mathcal{B}.\nabla v) = 0.$$
(25)

Applying the upwind time-stepping gives

$$\left(\frac{u_h^n-u_h^{n-1}}{k^n},v\right)+\left(\frac{1}{2}\mathcal{B}.\nabla u_h^n+\frac{1}{2}\mathcal{B}.\nabla u_h^{n-1},v\right)+\left(\frac{\gamma(u_h^n-u_h^{n-1})}{k^n},\mathcal{B}.\nabla v\right)+\left(\frac{\gamma\mathcal{B}}{2}.\nabla u_h^n-\frac{\gamma\mathcal{B}}{2}.\nabla u_h^{n-1},\mathcal{B}.\nabla v\right)=0,$$

$$(26)$$

$$\Rightarrow \frac{1}{k^{n}}(u_{h}^{n}, v) + \frac{1}{2}(\mathcal{B}.\nabla u_{h}^{n}, v) + \frac{1}{k^{n}}(\gamma u_{h}^{n}, \mathcal{B}.v) + \frac{1}{2}(\gamma \mathcal{B}.\nabla u_{h}^{n}, \mathcal{B}.\nabla v) = \frac{1}{k^{n}}(u_{h}^{n-1}, v) - \frac{1}{2}(\mathcal{B}.\nabla u_{h}^{n-1}, v) + \frac{1}{k^{n}}(\gamma u_{h}^{n-1}, \mathcal{B}.v) - \frac{1}{2}(\gamma \mathcal{B}.\nabla u_{h}^{n-1}, \mathcal{B}.\nabla v).$$
(27)

Thus, the matrix form is

$$\left(\frac{1}{k^n}\mathbb{M} + \frac{1}{2}\mathbb{C} + \frac{\gamma}{k^n}\mathbb{C}^T + \frac{\gamma}{2}\mathbb{S}\right)\xi^n = \left(\frac{1}{k^n}\mathbb{M} - \frac{1}{2}\mathbb{C} + \frac{\gamma}{k^n}\mathbb{C}^T - \frac{\gamma}{2}\mathbb{S}\right)\xi^{n-1},\tag{28}$$

$$\Rightarrow \xi^{n} = \left(\frac{1}{k^{n}}\mathbb{M} + \frac{1}{2}\mathbb{C} + \frac{\gamma}{k^{n}}\mathbb{C}^{T} + \frac{\gamma}{2}\mathbb{S}\right)^{-1} \left(\frac{1}{k^{n}}\mathbb{M} - \frac{1}{2}\mathbb{C} + \frac{\gamma}{k^{n}}\mathbb{C}^{T} - \frac{\gamma}{2}\mathbb{S}\right)\xi^{n-1}.$$
 (29)

The matrix elements in Eq. (29) are $\mathbb{M}_{ij} = (\phi_i, \phi_j)$, $\mathbb{C}_{i,j} = (\beta_i . \nabla \phi_i, \phi_j)$, $\mathbb{C}_{i,j}^T = (\phi_i, \beta_j . \nabla \phi_j)$ and $\mathbb{S}_{ij} = (\beta_i . \nabla \phi_i, \beta_j . \nabla \phi_j)$.

To prove the stability of the SUPG-method, set $v = u_h$ in Eq. (25). thus, follows that (here, u denotes u_h for notation-reduction, and u_n denotes the solution at time-step n)

$$(\partial_t u, u) + (\mathcal{B}.\nabla u, u) + (\partial_t u, \gamma \mathcal{B}.\nabla u) + (\mathcal{B}.\nabla u, \gamma \mathcal{B}.\nabla u) = 0.$$
(30)

Note that the second term is evaluated into zero. Thus

$$\frac{1}{2}\partial_t ||u||^2 + (\partial_t u, \gamma, \mathcal{B}.\nabla u) + (\mathcal{B}.\nabla u, \gamma \mathcal{B}.\nabla u) = 0$$
(31)

From the PDE $\partial_t u = -\mathcal{B}.\nabla u$. Thus substituting in (31) gives

$$\frac{1}{2}\partial_t ||u||^2 + (-\mathcal{B}.\nabla u, \gamma \mathcal{B}.\nabla u) + (\mathcal{B}.\nabla u, \gamma \mathcal{B}.\nabla u) = 0$$
(32)

$$\frac{1}{2}\partial_t ||u||^2 = 0. (33)$$

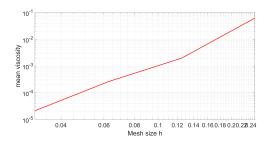
Thus, the method is stable.

For the continuous boundary condition in Eq. (13) the solution is viewed in (Click here) and (Click here) for $h_{\text{max}} = \frac{1}{8}$ and $h_{\text{max}} = \frac{1}{16}$, respectively. For the discontinuous boundary condition in Eq. (16) the solution is viewed in (Click here) and (Click here) for $h_{\text{max}} = \frac{1}{8}$ and $h_{\text{max}} = \frac{1}{16}$, respectively.

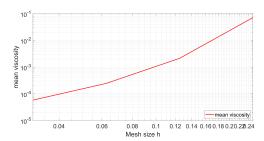
Table 1 shows that the RV-method possesses the best convergence rate for both cases on initial boundary conditions. However, the method is the most expensive computationally and time-consuming. While the GFEM and SUPG are contested in terms of convergence rate. Viewing the simulations for the case of discontinuous boundary condition, The stabilization methods appear to produce more accurate physical behavior compared to the standard-GFEM and the oscillation seems to be gone. The SUPG method still has a section in front of the moving disk which is higher than the expected behavior. From figure 5 (b), it seems that the L_2 -error plot does not reflect the advantage of the stabilization method unless the mesh is sufficiently refined. For the continuous boundary condition, no oscillations were observed using GFEM-method. The method is stable in this case and works as intended. Thus, there is no need to employ stabilization techniques and no reason to expect them to score better.

Table 1: Comparison between the convergence rates for the GFEM, RV and SUPG-methods.

Initial condition	GFEM	RV	SUPG
Continuous	1.6893	1.9944	1.5034
Discontinuous	0.3228	0.5400	0.3853



(a) continuous boundary condition.



(b) discontinuous boundary condition.

Figure 3: Plots of the mean viscosity in the final solution as function of the mesh-size.

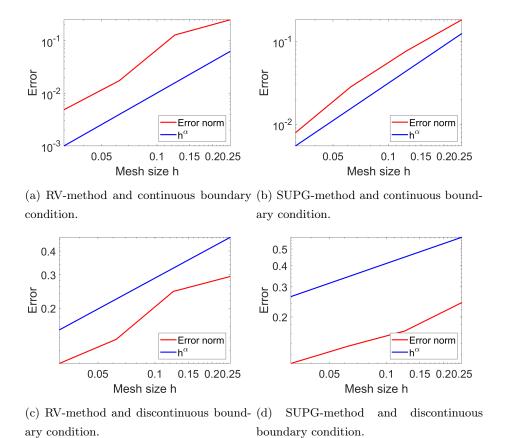


Figure 4: Plots of the L_2 -error and h_{\max} as function of the mesh-size for the stabilization method RV and SUPG.

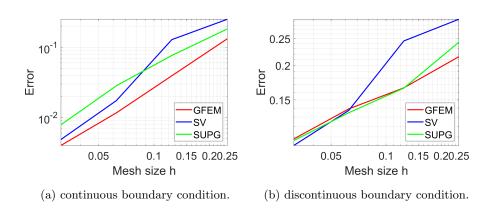


Figure 5: Plots of the L_2 -error as function of the mesh-size.

A Source code

A.1 main.m

```
((( Uncomment the line to get the results of each task))
2
   % (Problem 1.1)
3
  ANM_FEM_Part1.GFEM(1/8, "continuous", 1)
5
   %ANM FEM Part1GFEM(1/16, "continuous", 1)
6
   % (Problem 1.2)
9
10
   ANM_FEM_Part1.plot_errors([1/32 1/16 1/8 1/4], "continuous")
12
13
14
   15
   % (Problem 1.3)
16
17
   \label{eq:continuous} \mbox{\ensuremath{\%}ANM\_FEM\_Part1.GFEM} (1/8\,, \ \ \mbox{\ensuremath{"}} \mbox{\ensuremath{discontinuous}\ \ensuremath{"}} \,, \ \ 1)
   %ANM FEM Part1.GFEM(1/16, "discontinuous", 1)
19
   %ANM FEM Part1.plot errors ([1/32 1/16 1/8 1/4], "discontinuous")
20
21
   22
   % (Probelm 2.2)
23
   %ANM FEM Part2. Solve (1/8, "continuous", "RV", 1);
25
   %ANM FEM Part2. Solve (1/16, "continuous", "RV", 1);
26
28
   %ANM FEM Part2. Solve (1/8, "continuous", "SUPG", 1);
29
   %ANM FEM Part2. Solve (1/16, "continuous", "SUPG", 1);
30
31
   \% to plot the error with h^{\ }\{\ | \ alpha\}
32
   ANM FEM Part2.plot errors ([1/32 1/16 1/8 1/4], "continuous", "RV")
33
   \label{eq:continuous} \mbox{\em $\mathbb{Z}$} \mbox{\em ANM\_FEM\_Part2.plot\_errors} \left( \left[ 1/32 \ 1/16 \ 1/8 \ 1/4 \right], \ \ \mbox{\em continuous} \ \mbox{\em $\mathbb{Z}$} \right)
35
36
   37
   % (Probelm 2.3)
38
39
40
   ANM_FEM_Part2. Solve(1/8, "discontinuous", "RV", 1);
   %ANM FEM Part2. Solve (1/16, "discontinuous", "RV", 1);
41
42
   %ANM FEM Part2. Solve (1/8, "discontinuous", "SUPG", 1);
43
  %ANM_FEM_Part2. Solve (1/16, "discontinuous", "SUPG", 1);
44
45
   % to plot the error with h^{\alpha}
46
47
   \% ANM\_FEM\_Part2.\,plot\_errors\,([\,1/\,3\,2\ 1/\,16\ 1/\,8\ 1/\,4\,]\,,\ "\,discontinuous\,"\,,\ "RV"\,)
  %ANM_FEM_Part2.plot_errors([1/32 1/16 1/8 1/4], "discontinuous", "SUPG")
48
```

A.2 ANM FEM Part1.m

```
1 classdef ANM_FEM_Part1
2 methods(Static)
3 function CN = GFEM(hmax, command, plotting)
4 CFL = 0.5;
5 T = 1;
6
7 geometry = @circleg ;
```

```
[p, e, t] = initmesh(geometry, 'hmax', hmax);
8
9
                      \quad if \ command == "continuous"
                            u = Functions\_part1.initial\_u\_continuous\left(p\left(1\,,:\right)\,,p\left(2\,,:\right)\right)\,';
10
11
12
                            u = Functions\_part1.initial\_u\_discrete\left(p\left(1\,,:\right)\,,p\left(2\,,:\right)\right)\,';
13
                      end
14
                      u\,i\;=\;u\,;
15
16
                      M = Functions\_part1.Mass(p,t);
17
                      C = Functions part1. Convection(p,t);
18
19
                      I = eye(length(p));
20
21
22
                      % compute the time-stepping
                      F_prime_norm = Functions_part1.L_inf_norm(p);
23
                      k \ = \ CFL*hmax/F\_prime\_norm\,;
24
25
                      {\tt timing} \; = \; 0 \, ;
26
                      m = round(T/k);
27
                      28
29
30
                            timing = timing+ k;
31
32
                            %display(timing)
33
                            A = (M/k+C/2);
34
35
                            b \; = \; ( \  \, (M/\,k\,\text{-}\,C\,/\,2\,) \;\; * \;\; u \;\; ) \; ; \label{eq:b}
                            A(e(1, :), :) = I(e(1, :), :);
36
                            b\ (\ e\ (1\ ,:))\ =\ 0\,;
37
38
                            u\,=\,A\backslash\,b\,;
39
                            if plotting == 1
40
                                  figure (1)
41
42
                                  pdeplot(p,e,t,'XYData',u,'ZData',u)
                                  xlabel('x')
43
                                  ylabel('y')
44
                                  zlabel('u')
45
                                  set (gca, 'FontSize',10)
46
                                 \%file_name = 'ANM_imagesd16\image' + string(i) + '.png';
47
48
                                 %saveas(gcf,file_name)
49
                            end
50
51
52
                      e = ui - u;
                      error = sqrt(e'*M*e);
53
54
                      CN = error;
55
                      fprintf('For hmax = \%0.4f the error = \%f \n\n',hmax, error);
56
57
58
                \begin{array}{ll} \textbf{function} & P = & \texttt{plot\_errors} \, (\, h \, , \, \, \text{command}) \end{array}
59
                      Error = zeros(1, length(h));
60
61
                      for i = 1: length(h)
                            Error(i) = ANM FEM Part1.GFEM(h(i), command, 0);
62
63
64
                      alpha \; = \; polyfit \left( \, log \left( \, h \, \right) \, , log \left( \, Error \, \right) \, , 1 \, \right) \, ;
65
66
67
                      %ch = polyval(alpha,h);
68
                      figure(2)
                      xticks([1/32, 1/16, 1/8, 1/4])
69
                      loglog(h, Error, 'r', 'LineWidth',2)
70
71
                      hold on
                      \textcolor{red}{\log \log \left(\,h\,,h\,.\,\widehat{}\,\,\operatorname{alpha}\left(\,1\,\right)\,,\,\,^{\prime}\,b^{\,\prime}\,,\,^{\prime}\,\operatorname{LineWidth}\,^{\prime}\,,2\,\right)}
72
73
74
                      xlabel ('Mesh size h', 'FontSize', 15)
```

```
ylabel ('Error', 'FontSize', 15)
75
76
             %xlim([0 1/2])
             legend ( \ \{'Error\ norm', 'h^{\langle alpha\}'\} \ , 'location', \ 'SouthEast')
77
             set (gca, 'FontSize', 20)
78
79
80
         end
      end
81
82
  end
83
```

A.3 ANM FEM Part2.m

```
classdef ANM FEM Part2
           methods (Static)
2
                 function \ CN = \ Solve (hmax, \ initial\_condition \ , \ method \ , \ plotting)
3
                      CFL = 0.5;
4
                      T = 1;
 5
 6
                      gamma = hmax/2;
                       geometry = @circleg ;
                       [\, p \ , e \ , \ t \ ] \ = \ initmesh \left( \ geometry \, , \ \ 'hmax \ ' \ , \ hmax \ ) \, ;
 8
9
                       if initial_condition == "continuous"
10
                            u = Functions\_part2.initial\_u\_continuous\left(p\left(1\,,:\right)\,,p\left(2\,,:\right)\right)\,';
11
12
                       {\tt elseif initial\_condition} == "discontinuous"
13
                            u \, = \, Functions\_part2 \, . \, initial\_u\_discrete \, (\, p \, (\, 1 \, , : ) \, \, , p \, (\, 2 \, , : ) \, ) \, \, ';
14
15
16
                       end
17
                      ui = u;
18
19
                      M = Functions\_part2.Mass(p,t);
                      C \, = \, Functions\_part2 \, . \, Convection \, (\, p \, , \, t \, ) \, ;
20
                      I = eye(length(p));
21
22
                      \% compute the time-stepping
                      beta\_inf\_norm \ = \ Functions\_part2 \, . \, Beta\_inf\_norm \, (\, p\,) \, ;
23
                      k \, = \, CFL*hmax/beta\_inf\_norm\,;
24
25
                      {\tt timing} \; = \; 0 \, ;
26
                      m = round(T/k);
                      %m eps = 0;
27
28
                       if method == "RV"
29
                            Res = zeros(length(p));
30
                            for i = 1:m
31
32
                                  {\tt timing} \; = \; {\tt timing+} \; \; k \, ;
33
34
                                  %display(timing)
35
                                   {\tt epsilons} \ = \ {\tt Functions\_part2.Epsilon} \, (\, {\tt p} \, , {\tt t} \, , {\tt Res} \, , \ {\tt hmax}) \, ;
                                  m_eps = mean(epsilons);
36
                                  S = Functions part2.Stiffness(p,t, epsilons);
37
                                  A \, = \, \left( \begin{array}{ccc} M/\,k \, + \, C/2 \, + \, 1/2 * S \end{array} \right);
39
                                  A(e(1, :), :) = I(e(1, :), :);
40
41
                                  b (e(1,:)) = 0;
42
                                  u_prev = u;
                                  u = A \backslash b;
43
44
45
                                  Res = (1/k*(u - u\_prev ) + M \backslash C*u) ;
                                  \mathrm{Res} \, = \, \mathrm{Res}/\mathrm{max}\big(\, u \ \text{-} \ \mathrm{mean}\big(\, u\,\big)\,\big)\,;
46
                                  % max(Res)
47
48
                                   if plotting == 1
                                        figure (1)
49
                                        pdeplot(p,e,t,'XYData',u,'ZData',u)
50
51
                                        xlabel('x')
                                        ylabel('y')
52
```

```
zlabel('u')
 53
 54
                                       zlim([-0.3, 1.2])
                                       \operatorname{set}(\operatorname{gca}, \operatorname{`FontSize'}, 10)
 55
                                       file_name = 'RV_d_16\image' + string(i) + '.png';
 56
                                 %
                                      saveas (gcf, file_name)
 57
 58
                                  end
 59
 60
 61
                            end
 62
 63
                       {\tt elseif method} = {\tt "SUPG"}
 64
 65
                            S = Functions_part2.SUPG_Stiffness(p,t);
 66
 67
                            \quad \text{for} \quad i \ = \ 1\!:\!m
 68
                                  timing = timing+ k;
 69
 70
                                 %display(timing)
                                 A \, = \, \left( \begin{array}{ccc} M/k \, + \, C/2 \, + \, gamma/k * C' & + \, gamma/2 * S \end{array} \right);
 71
                                  72
                                 A(\ e\,(1\ ,:)\ ,:)\ =\ I\,(\ e\,(1\ ,:)\ ,:)\;;
 73
 74
                                  b\ (\ e\ (1\ ,:))\ =\ 0\,;
                                  u \, = \, A \backslash \, b \, ;
 75
 76
 77
                                  if plotting == 1
                                        figure (1)
 78
                                       pdeplot(p,e,t,'XYData',u,'ZData',u)
 79
 80
                                       xlabel('x')
                                       ylabel('y')
 81
                                       zlabel('u')
 82
 83
                                       zlim ([-0.3,1.2])
                                       \mathtt{set}\,(\,\mathtt{gca}\,,\,{}^{\scriptscriptstyle |}\,\mathtt{FontSize}\,{}^{\scriptscriptstyle |}\,,10)
 84
                                       % file name = 'SUPG_d_16\image' + string(i) + '.png';
 85
                                       % saveas(gcf, file name)
 86
 87
                                  end
                            end
 88
                       e\,l\,s\,e
 89
 90
                            return;
                       end
 91
                       e = ui - u;
 92
 93
                       \begin{array}{ll} {\tt error} \; = \; {\tt sqrt} \, (\, {\tt e} \, {\tt '} \! * \! M \! * \! e \, ) \; ; \end{array}
                      CN = error;
 94
 95
 96
                       fprintf('For hmax = \%0.4f the error = \%f \n\n',hmax, error);
 97
                 end
 98
 99
100
                 {\bf function} \  \, {\bf Error} \, = \, {\bf plot\_errors} \, (h, \ initial\_conditions \, , \ method)
                       Error = zeros(1, length(h));
101
                      \%eps = zeros(1,length(h));
102
103
104
                       for i = 1: length(h)
105
106
                            disp(i)
                            Error(i) = ANM FEM Part2. Solve(h(i), initial conditions, method, 0);
107
                       end
108
109
110
                       alpha = polyfit(log(h), log(Error), 1);
111
112
                       disp(alpha)
                      % ch = polyval(alpha,h);
113
                       figure (2)
114
                       xticks([1/32, 1/16, 1/8, 1/4])
115
116
                       loglog(h, Error, 'r', 'LineWidth', 2)
117
                       loglog(h,h.^alpha(1),'b','LineWidth',2)
118
119
                      %loglog(h, eps, 'r', 'LineWidth', 2)
```

```
120
              grid on
121
              xlabel ('Mesh size h', 'FontSize', 15)
122
              ylabel('Error', 'FontSize', 15)
123
              %x \lim ([0 \ 1/2])
124
              %legend( {'mean viscosity'} ,'location', 'SouthEast')
125
126
              legend( {'Error norm', 'h^{\alpha}'} ,'location', 'SouthEast')
127
128
              set (gca, 'FontSize',20)
129
          end
130
131
       end
132
   end
133
```

A.4 Functions_part1.m

```
{\tt classdef\ Functions\_part1}
 2
           methods (Static)
3
4
                \% aAssemble the convection matrix
5
                 function C = Convection(p, t)
 7
                     C = sparse(size(p,2), size(p,2));
 8
9
                      \begin{array}{ll} \textbf{for} & i = 1 \colon \mathbf{size} \ (\ t \ , 2 \ ) \end{array}
                            nodes = t(1:3,i);
10
11
                           x1 = p(1, nodes);
                            x2 = p(2, nodes);
12
13
                            area \, = \, polyarea \, (\, x1 \, , x2 \, ) \, ; \\
                            dx2\_phi \; = \; \left[ \; x2\left(2\right) - x2\left(3\right) \; ; \; \; x2\left(3\right) - x2\left(1\right) \; ; \; \; x2\left(1\right) - x2\left(2\right) \; \right] / \; 2 / \; area \; ;
14
                            dx1\_phi \, = \, \left[ \, x1 \, (3) \, - x1 \, (2) \, ; \, \, x1 \, (1) \, - x1 \, (3) \, ; \, \, x1 \, (2) \, - x1 \, (1) \, \right] / \, 2 \, / \, area \, ;
15
16
                            C_{local} = ones(3,1).*(2*pi)*(x1'.*dx1_phi -x2'.*dx2_phi)'* area/3;
17
                           C(nodes, nodes) = C(nodes, nodes) + C_local;
18
19
20
                     end
21
                 end
22
23
                 % Assemble the mass matrix
24
                 \quad \quad function \ M = \ Mass(p,t)
                                                                        \%t:matrix(4*triangel_number) the first 3 ...
                       are corner points and 4 is subdomain number
                                                                         \%p:matrix(2*nodes_number) 1 is x and 2 ...
26
                                                                               is y
                                                                         \% \ \operatorname{size} \left( \right. t \left. \right. , 2 \left. \right) : \ \operatorname{triangel} \ \operatorname{number} \, ,
                                                                         \% size(p,2): point number
28
                       M = sparse(size(p,2), size(p,2)); % matrix of all the nodes
29
                       for K = 1: size(t,2)
                                                                        % iterate over all the triangels,
30
31
                             nodes = t(1:3,K);
                                                                        % define the node K
                             x1 = p(1, nodes);
                                                                        % node x-coordinate of the node K
32
                             x2 = p(2, nodes);
                                                                        \% node y- coorinate of the node K
33
34
                             area=polyarea(x1,x2);
35
                             M local = [2 1 1; 1 2 1; 1 1 2]*area/12;
36
37
                             \label{eq:modes} M(\,nodes\,,nodes\,)\,=\,M(\,nodes\,,nodes\,)+\,\,M\,\_local\,;
                       end
38
                 end
39
40
                 \% Compute |\,|\,F\,'\,(\,U\,)\,|\,|\,\_(\,{\rm omega}\,\,\,)\,\,{\rm for}\,\, the CLF
41
42
                 function norm = L_inf_norm(p)
43
                       i\ =\ 1\,;
                       ls = zeros(1, size(p,2));
44
```

```
45
                         \begin{array}{ll} \textbf{for} & \mathbf{k} = 1 : \mathbf{size}(p, 2) \end{array}
46
47
                               x1 = p(1, k);
48
49
                               x2 \; = \; p\,(\,2\,\,,\  \  \, k\,)\;;
50
                               f1 = 2*pi*x1;
51
                               f2 = -2*pi * x2;
52
                               \begin{array}{lll} \textbf{ls}\,(\,i\,) \;=\; (\,f\,1\,\,\widehat{}\,2\;+\;f\,2\,\,\widehat{}\,2\,)\,\,\widehat{}\,(\,0\,.\,5\,)\;; \end{array}
53
                               i = i+1;
54
55
56
                         norm = max(ls);
                  end
57
58
                  % Initial continuous data
59
                  \begin{array}{ll} \textbf{function} & ID \, = \, initial\_u\_continuous\,(\,x1\,,x2\,) \end{array}
60
                         r = 0.25;
61
                         x1_0 = 0.3;
62
                        x2_0^- = 0;
63
                         \stackrel{-}{ID} = 0.5* (1 - tanh(( (x1-x1_0).^2 + (x2-x2_0).^2 )/r^2 - 1));
64
65
                  end
66
                  %_
                  % Initial discontinuous data
67
                  function ID = initial_u_discrete(x1,x2)
68
                         r \ = \ 0\,.\,2\,5\,;
69
                        x1 0 = 0.3;
70
                         x2 0 = 0;
71
72
                         ID = zeros(1, length(x1));
                          for i = 1: length(x1) 
73
                               if \ (\ (x1(i)-x1\_0)^2 + (x2(i)-x2\_0)^2 \ ) <= r^2
74
75
                                      ID(i) = 1;
                               end
76
                         end
77
78
79
                  end
80
81
            end
82
       end
```

A.5 Functions_part2.m

```
classdef Functions_part2
 1
 2
          methods (Static)
 3
 4
               function A = Stiffness(p,t,eps)
 5
 6
                     A = sparse(size(p,2), size(p,2));
                     for K = 1: size(t,2)
 9
                          nodes = t(1:3,K);
                          x2 \, = \, p \, (\, 1 \, , nodes \, ) \; ;
10
                          x1 = p(2, nodes);
11
                          area=polyarea(x1,x2);
12
13
                          epsilon = eps(K);
                          dx2\_phi \ = \ \left[ \ x2 \, (2) \, - x2 \, (3) \ ; \ \ x2 \, (3) \, - x2 \, (1) \ ; \ \ x2 \, (1) \, - x2 \, (2) \, \right] / \, 2 / \, area \, ;
14
                          dx1 \text{ phi} = [x1(3)-x1(2); x1(1)-x1(3); x1(2)-x1(1)]/2/area;
15
16
17
                          AK = epsilon*(dx1 phi*dx1 phi'+dx2 phi*dx2 phi')*area;
18
                          A(nodes, nodes) = A(nodes, nodes) + AK;
19
                     end
20
21
               end
22
               %
23
```

```
function A = SUPG\_Stiffness(p,t)
24
25
                     A = sparse(size(p,2), size(p,2));
26
                     for K = 1: size(t,2)
27
                           nodes = t(1:3,K);
29
                           x2 = p(1, nodes);
                           x1 = p(2, nodes);
30
                           beta1 = 2*pi.*x1;
31
32
                           beta2 = -2*pi.*x2;
                           area=polyarea(x1,x2);
33
34
35
                           dx2\_phi \ = \ \left[ \ x2 \, (2) \, - x2 \, (3) \, ; \ \ x2 \, (3) \, - x2 \, (1) \, ; \ \ x2 \, (1) \, - x2 \, (2) \, \right] / \, 2 / \, area \, ;
                           dx1\_phi \; = \; \big[\,x1\,(3)\,-x1\,(2)\,\,; \;\; x1\,(1)\,-x1\,(3)\,\,; \;\; x1\,(2)\,-x1\,(1)\,\big]\,/\,2\,/\,\,area\,\,;
36
37
38
                           AK = (beta1'.*dx1_phi+ ...
39
                                beta2'.*dx2 phi).*(beta1'.*dx1 phi+beta2'.*dx2 phi)'*area;
40
                           A(nodes, nodes) = A(nodes, nodes) + AK;
41
                     end
               end
42
44
               \% aAssemble the convection matrix
                function C = Convection(p, t)
45
46
47
                    C = sparse(size(p,2), size(p,2));
                    for i = 1: size(t, 2)
48
                         nodes = t(1:3,i);
49
                         x1 = p(1, nodes);
50
                         x2 = p(2, nodes);
51
                         area = polyarea(x1, x2);
52
53
                         dx2\_phi \ = \ \left[ \ x2\left(2\right) - x2\left(3\right) \, ; \ \ x2\left(3\right) - x2\left(1\right) \, ; \ \ x2\left(1\right) - x2\left(2\right) \, \right] / \, 2 / \, area \, ;
                         dx1\_phi \, = \, \left[\, x1\,(3)\, - x1\,(2)\, \, ; \, \, \, x1\,(1)\, - x1\,(3)\, \, ; \, \, \, x1\,(2)\, - x1\,(1)\, \right]/\,2\,/\,\,area\, ;
54
55
                         C local = ones(3,1).*(2*pi)*(x1'.*dx1 phi -x2'.*dx2 phi)'* area/3;
56
57
                         C(nodes, nodes) = C(nodes, nodes) + C_local;
58
59
60
               end
61
62
               % Assemble the mass matrix
63
                                                                  \%t: matrix(4*triangel_number) the first 3 ...
64
               function M = Mass(p, t)
                     are corner points and 4 is subdomain number
65
                                                                  \%p:matrix(2*nodes_number) 1 is x and 2 ...
                                                                        is y
                                                                  % size(t,2): triangel number,
66
                                                                  \% size(p,2): point number
67
68
                     M = sparse(size(p,2), size(p,2)); % matrix of all the nodes
                     for K = 1: size(t,2)
                                                                  % iterate over all the triangels,
69
                           nodes = t(1:3,K);
                                                                  % define the node K
70
71
                           x1 = p(1, nodes);
                                                                  % node x-coordinate of the node K
                          x2 = p(2, nodes);
                                                                  % node y- coorinate of the node K
72
73
74
                           area=polyarea(x1,x2);
                           {\rm M\_local} \, = \, [\, 2 \  \, 1 \  \, 1; \  \, 1 \  \, 2 \  \, 1; \  \, 1 \  \, 1 \  \, 2\,] * {\rm area} \, / \, 12;
75
                          M(nodes, nodes) = M(nodes, nodes) + M local;
76
                     end
78
               end
79
80
               \% Compute |\,|\,F\,'\,(\,U\,)\,|\,|\,\_(\,{\rm omega}\,\,\,)\,\,{\rm for}\,\, the CLF
81
                function norm = Beta_inf_norm(p)
                     i = 1:
82
83
                     ls = zeros(1, size(p,2));
84
                     for k = 1: size(p,2)
85
86
                           x1 = p(1, k);
```

```
x2 = p(2, k);
88
 89
                              f1 \ = \ 2*{\color{red}{\bf pi}}* \ x1\,;
90
                              f2 = -2*pi * x2;
91
                              ls(i) = (f1^2 + f2^2)^(0.5);
 92
                              i = i+1;
93
94
                        norm = max(ls);
95
96
                  end
97
                 %
                 \% Res is the normalized residual
98
                  \begin{array}{lll} \textbf{function} & \textbf{epsilon} = & \textbf{Epsilon} \left( \, \textbf{p} \,, \textbf{t} \,\,, \,\, \, \textbf{Res} \,, \,\, \, \textbf{h} \,\, \, \right) \end{array}
99
                        C1 = 0.25;
100
                        C2 = 1.0;
101
                        eps = zeros(1, size(t,2));
102
                        for K = 1: size(t,2) % iterate over the elements
103
                              nodes = t(1:3,K);
104
                              x1 = 2*pi *p(1, nodes);
105
                              x2 = -2*pi *p(2, nodes);
106
                              beta_k = max((x1.^2 + x2.^2).^(0.5));
107
108
                              \operatorname{Res}_{k} = \max(\operatorname{Res}(\operatorname{nodes}));
109
                              \begin{array}{lll} {\bf eps} \, (K) \; = \; \min ( \; \; C1*h*beta\_k \; \; , \; \; C2*h^2*Res\_k \; \; ) \; ; \end{array}
                        end
110
111
                        epsilon = eps;
112
                  end
113
114
115
                 %_
                 % Initial continuous data
116
                  \begin{array}{ll} \textbf{function} & ID \ = \ initial\_u\_continuous\,(\,x1\,,x2\,) \end{array}
117
118
                        r \ = \ 0\,.\,2\,5\,;
                        x1 0 = 0.3;
119
                        x2 0 = 0;
120
121
                        ID = 0.5* (1 - tanh(( (x1-x1 0).^2 + (x2-x2 0).^2 )/r^2 - 1));
122
                  end
                 %
123
                 % Initial discontinuous data
124
                  \begin{array}{ll} function & ID = initial\_u\_discrete(x1,x2) \end{array}
125
                       r = 0.25;
126
127
                        x1_0 = 0.3;
                        x2_0 = 0;
128
                        ID = zeros(1, length(x1));
129
130
                        for i = 1: length(x1)
131
                               if \ (\ (x1(i)-x1\_0)^2 + (x2(i)-x2\_0)^2\ ) <= r^2
                                    ID(i) = 1;
132
                              end
133
134
                        end
135
                  end
136
137
138
            end
139
       end
```