

## 1 INTRODUCTION

Consider the linear convection-diffusion equation

$$\frac{\partial T}{\partial t} + v \frac{\partial T}{\partial y} = \alpha \frac{\partial^2 T}{\partial y^2}, \quad v = \sin(\pi y), \quad \alpha = \frac{1}{\text{Pr Re}}, \quad (1)$$

subject to the initial conditions

$$\begin{aligned} \text{(a)} \quad T(y, t = 0) &= \cos(2\pi y) \sin(\pi y) \\ \text{(b)} \quad T(y, t = 0) &= \cos(2\pi y), \end{aligned} \quad (2)$$

and parameters

$$\begin{aligned} \text{Re} &= 1 && \text{(Reynolds number, molten glass)} \\ \text{Pr} &= 25 && \text{(Prandtl number, molten glass)} \\ \Delta t &= 0.001 && \text{(Time step)} \\ L_y &= 2 && \text{(Domain } y\text{-length)} \\ N &= 2^n + 1 && \text{(Number of } y\text{-points, where } n = 5, 6). \end{aligned} \quad (3)$$

### 1.1 PROBLEM 1

Use the Fourier pseudo-spectral method to numerically integrate (1) with the given parameters. Use the Euler explicit method for time advancement. Higher resolution with  $n = 6$  will improve the accuracy of the method for the initial condition (a). Plot  $T$  as a function of time  $t$  at  $t = \{0.2, 2, 5, 10\}$ .

### 1.2 PROBLEM 2

Use the FTCS Euler explicit method with second-order finite differences for the same computation, and compare results to the Fourier pseudo-spectral method using the same mesh resolution.

## 2 METHODOLOGY

### 2.1 PROBLEM 1

We re-write (1) as

$$\frac{\partial T}{\partial t} = \alpha \frac{\partial^2 T}{\partial y^2} - v \frac{\partial T}{\partial y}. \quad (4)$$

The first and second spatial derivatives of  $T$  are calculated by taking the Fourier transform of  $T$ , multiplying the Fourier coefficients by  $ik_n$  and  $-k_n^2$ , respectively, and then taking the inverse Fourier transform. With values of  $\partial T / \partial t$  known at all grid points now, values of  $T$  at the next time step are calculated using the explicit Euler method,

$$T^{n+1} = T^n + \Delta t \frac{\partial T}{\partial t}. \quad (5)$$

## 2.2 PROBLEM 2

To implement the FTCS explicit method, we approximate (1) using forward-differences in time and central-differences in space as

$$\frac{T_i^{n+1} - T_i^n}{\Delta t} + v \frac{T_{i+1}^n - T_{i-1}^n}{2\Delta y} = \alpha \frac{T_{i+1}^n - 2T_i^n + T_{i-1}^n}{\Delta y^2}, \quad (6)$$

which can be solved for  $T_i^{n+1}$  as

$$T_i^{n+1} = T_i^n + \Delta t \left( \alpha \frac{T_{i+1}^n - 2T_i^n + T_{i-1}^n}{\Delta y^2} - v \frac{T_{i+1}^n - T_{i-1}^n}{2\Delta y} \right). \quad (7)$$

This constitutes an explicit equation for  $T^{n+1}$ , and thus we can step forward in time without the need to solve any matrix equations. We enforce periodic boundary conditions by wrapping  $T_{i-1}$  to  $T_N$  when  $i = 1$  and vice versa.

## 3 RESULTS

## 4 DISCUSSION

The FTCS method for initial condition (b) has difficulty capturing the diffusive behavior accurately; the limiting Fourier value is  $T \sim 0.765$  for both  $n = \{5, 6\}$ , whereas the FTCS method's limiting values are  $T \sim \{0.806, 0.788\}$  respectively.

## 5 REFERENCES

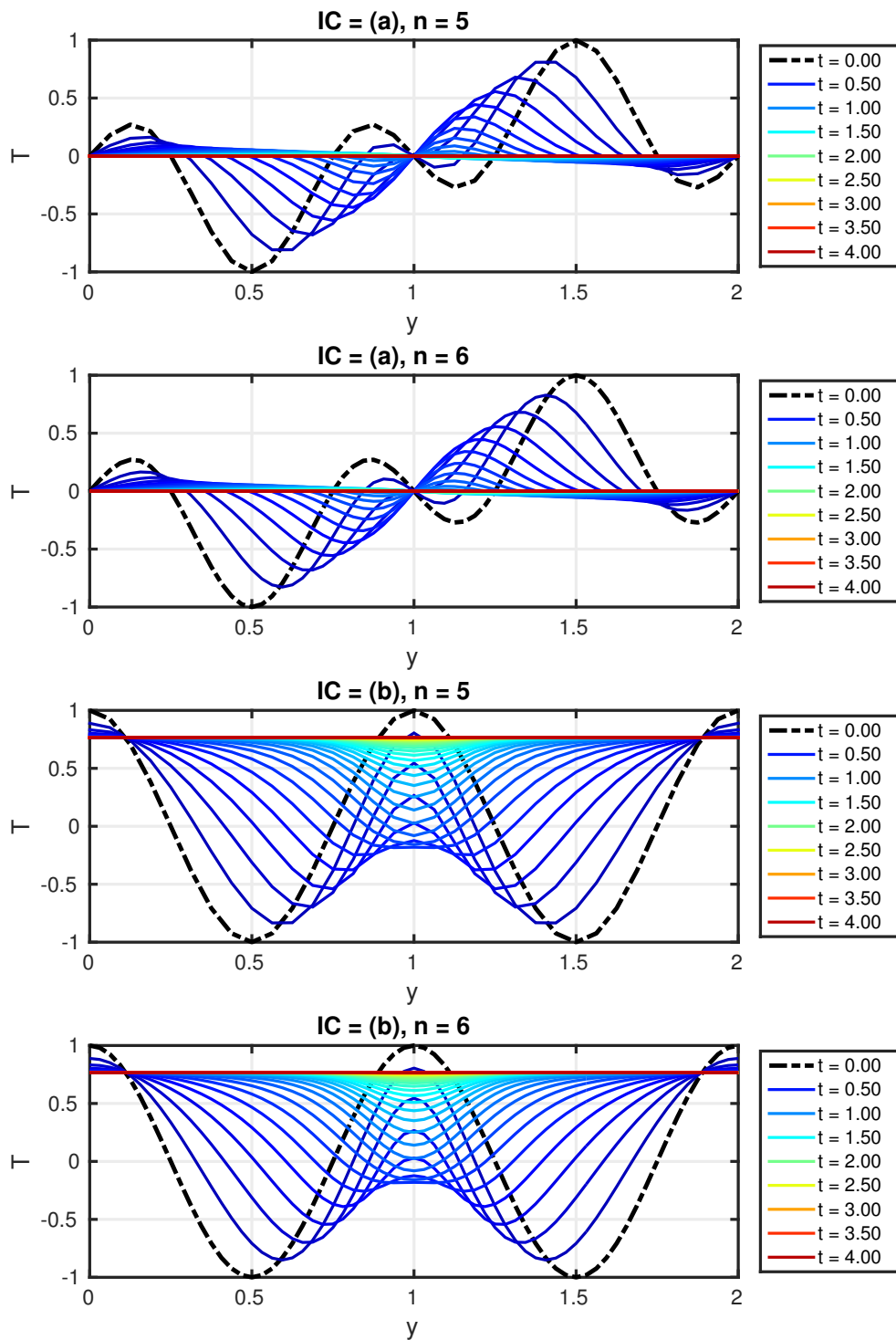
No external references were used other than the course notes for this assignment.

## APPENDIX: MATLAB CODE

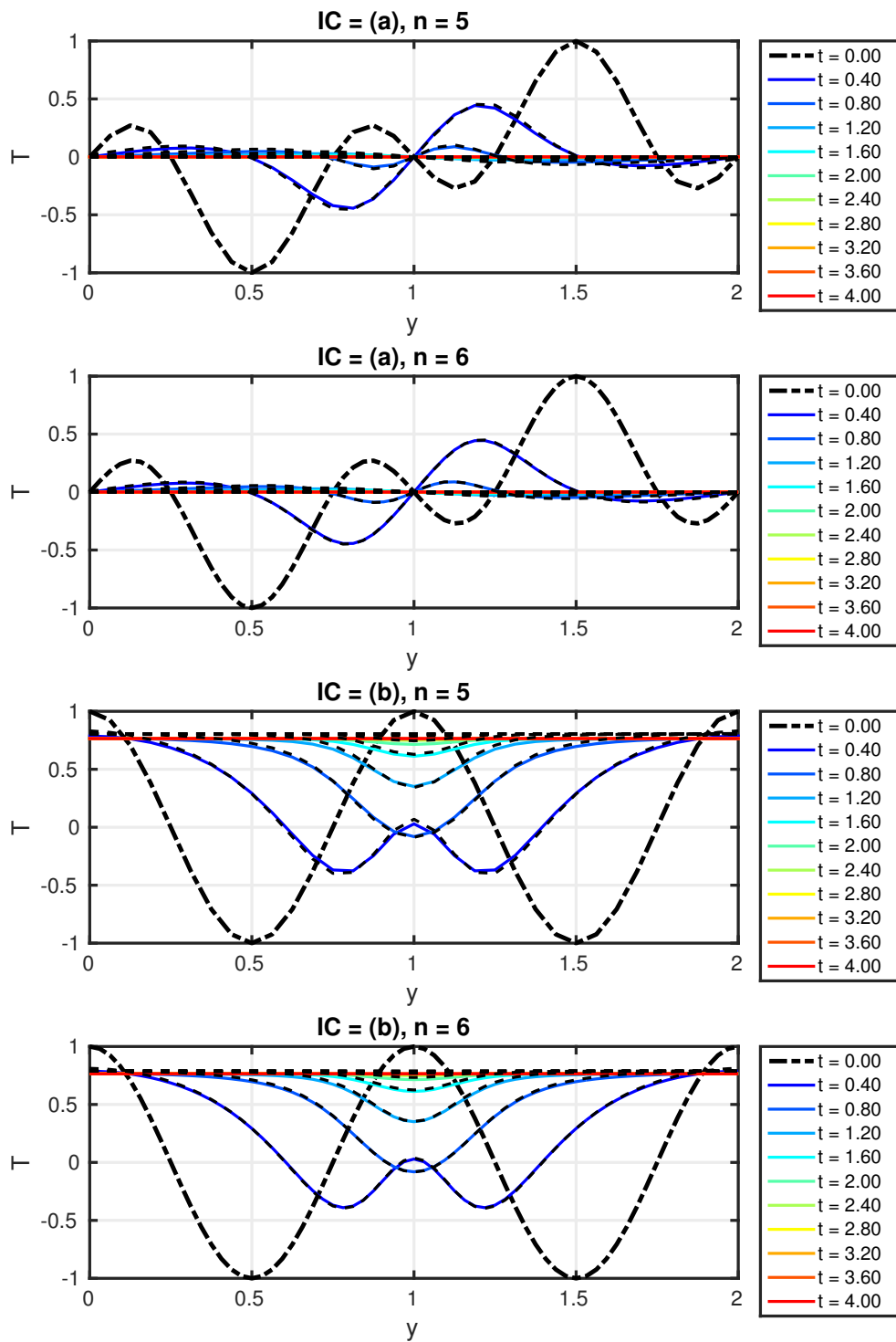
The following code listings generate all figures presented in this homework assignment. The Fourier codes `find_dfdn.m` and `find_d2fdn2.m` are provided by Prof. Biringen.

Listing 1: Problem\_1.m

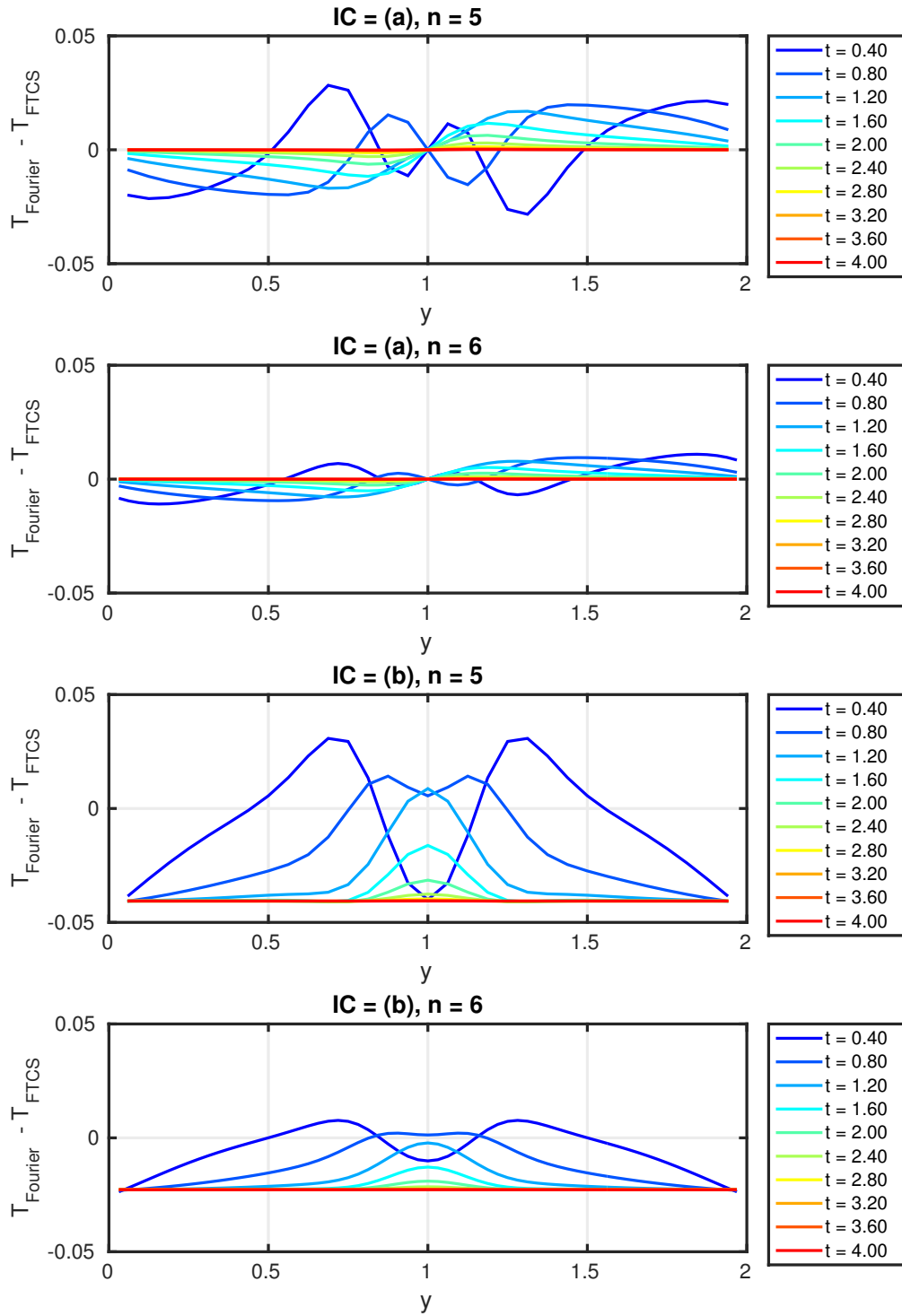
```
1 function [T_history] = Problem_1(varargin)
2
3     %%%%%%
4     % Solves the linear convection-diffusion equation using the Fourier pseudo-spectral
5     % method.
6     %
7     % Ryan Skinner, November 2015
8     %%%
9
10    Set_Default_Plot_Properties();
11
12    switch length(varargin)
13        case 0
14            n_plot = 41;
15        case 1
16            n_plot = varargin{1};
17        otherwise
18            error('Too many arguments passed to Problem_1');
19    end
20
21    cases = {{ 'a', 5 }, { 'a', 6 }, { 'b', 5 }, { 'b', 6 }};
22    T_history = cell(length(cases), 1);
```



**Figure 1:** Solutions to the linear convection-diffusion equation using the Fourier pseudo-spectral method for different initial conditions and mesh resolution parameters. Most interesting behavior occurs when  $t < 4$ . Trends can be extrapolated to future times  $t = 5, 10$ , which are not shown. Initial condition displayed as black dot-dashed line ( $\cdot - \cdot -$ ).



**Figure 2:** Solution comparison between the Fourier pseudo-spectral method (colored lines) and the FTCS method (---) for  $t < 4$ . Initial condition displayed as black dot-dashed line ( $\cdot-\cdot-$ ). Agreement between the Fourier and FTCS methods is decent. The limiting Fourier value is  $T \sim 0.765$  for both  $n = \{5, 6\}$ , whereas the FTCS method's limiting values are  $T \sim \{0.806, 0.788\}$  respectively. Further analysis is deferred to Figure 3.



**Figure 3:** Difference between the Fourier pseudo-spectral and FTCS solutions at evenly-spaced discrete times  $t < 4$ , omitting the initial condition. Different initial conditions and spatial resolutions produce different behavior.

```

23     for case_i = 1:length(cases)
24
25         IC_str = cases{case_i}{1};
26         n = cases{case_i}{2};
27
28         % Spatial domain.
29         nn = 2^n + 1;
30         Ly = 2.0;
31         y = linspace(0, Ly, nn)';
32
33         % Temporal domain.
34         dt = 0.001;
35         if strcmp(IC_str, 'a')
36             t_final = 4;
37         else
38             t_final = 4;
39         end
40         t = [0:dt:t_final];
41
42         % Physical parameters.
43         Re = 1;
44         Pr = 25;
45         alpha = 1 / (Re * Pr);
46         v = sin(pi*y);
47
48         % Initialize solution.
49         T = nan(nn,length(t));
50         if strcmp(IC_str, 'a')
51             T(:,1) = cos(2*pi*y) .* sin(pi*y);
52         else
53             T(:,1) = cos(2*pi*y);
54         end
55
56         %%%
57         % Solve problem numerically.
58         %%%
59
60         for t_n = 1:(length(t)-1)
61
62             Tn = T(:,t_n);
63
64             dTdy = find_dfndn( Tn',nn,Ly)';
65             d2Tdy2 = find_d2fdn2(Tn',nn,Ly)';
66
67             % Update solution.
68             T(:,t_n+1) = Tn + dt * (alpha * d2Tdy2 - v .* dTdy);
69
70         end
71
72         %%%
73         % Process results.
74         %%%
75
76         cmap = jet(n_plot);
77         step_numbers = round(linspace(1,length(t),n_plot));
78         hf = figure(case_i);
79         set(hf, 'Position', [100,500,900,300]);
80         hold on;
81         plot_handles = [];
82         for t_n = 1:length(step_numbers)
83             tmp = sprintf('t = %.2f', t(step_numbers(t_n)));
84             if t_n == 1
85                 hp = plot(y, T(:,step_numbers(t_n)), 'k-.', 'LineWidth', 3, 'DisplayName', tmp);
86             else
87                 hp = plot(y, T(:,step_numbers(t_n)), 'DisplayName', tmp, 'Color', cmap(t_n,:));
88             end
89             if(mod(t_n-1,5) == 0 || n_plot <= 11)
90                 plot_handles(end+1) = hp;
91             end

```

```

92     end
93     title(sprintf('IC = (%s), n = %.0f',IC_str,n));
94     xlabel('y');
95     ylabel('T');
96     ylim([-1,1]);
97     xlim([0,Ly]);
98     hleg = legend(plot_handles);
99     set(hleg,'Location','eastoutside');
100
101     T_history{case_i} = T;
102
103     end
104
105     disp('Done. ');
106
107 end

```

**Listing 2: find\_dfdn.m**

```

1 function dfdn = find_dfdn(f,nn,L)
2 % ASEN 5327 Class Notes Fall 2010
3 N=nn-1;
4 n=[0:(N/2)-1 -(N/2):-1];
5 %L=1; %show fuction is periodic on wavelength of L
6 kn=2*pi*n./L;
7 kn((N/2)+1)=0;
8
9 %find Fourier components
10 f_tilde=fft(f,N);
11 dfdn=ifft(i*kn.*f_tilde,N);
12 dfdn(nn)=dfdn(1);
13
14 end

```

**Listing 3: find\_d2fdn2.m**

```

1 function d2fdn2 = find_d2fdn2(f,nn,L)
2 %ASEN5327 Class notes Fall 2010
3 N=nn-1;
4 n=[0:(N/2)-1 -(N/2):-1];
5 kn=2*pi*n./L;
6 kn((N/2)+1)=0;
7 f_tilde=fft(f,N);
8 d2fdn2=ifft(-(kn.^2).*f_tilde,N);
9 d2fdn2(nn)=d2fdn2(1);
10 end

```

**Listing 4: Problem\_2.m**

```

1 function [] = Problem_2()
2
3     %%%%%
4     % Solves the linear convection-diffusion equation using the FTCS explicit method.
5     %
6     % Ryan Skinner, November 2015
7     %%%
8
9     Set_Default_Plot_Properties();
10
11     % Display results from Problem 1 at only a few time steps.
12     n_plot = 11;
13     T_prob1 = Problem_1(n_plot);
14
15     cases = {{ 'a',5},{ 'a',6},{ 'b',5},{ 'b',6}};
16     for case_i = 1:4
17
18         IC_str = cases{case_i}{1};

```

```

19     n = cases{case_i}{2};
20
21     % Spatial domain.
22     nn = 2^n + 1;
23     Ly = 2.0;
24     y = linspace(0, Ly, nn)';
25     dy = y(2) - y(1);
26
27     % Temporal domain.
28     dt = 0.001;
29     if strcmp(IC_str, 'a')
30         t_final = 4;
31     else
32         t_final = 4;
33     end
34     t = [0:dt:t_final];
35
36     % Physical parameters.
37     Re = 1;
38     Pr = 25;
39     alpha = 1 / (Re * Pr);
40     v = sin(pi*y);
41
42     % Initialize solution.
43     T = nan(nn, length(t));
44     if strcmp(IC_str, 'a')
45         T(:,1) = cos(2*pi*y) .* sin(pi*y);
46     else
47         T(:,1) = cos(2*pi*y);
48     end
49
50     %%%
51     % Solve problem numerically.
52     %%%
53
54     for t_n = 1:(length(t)-1)
55
56         Tn = T(:,t_n);
57
58         for i = 1:nn
59             if i == 1 ; Tn1l=Tn(nn); else Tn1l=Tn(i-1); end % Periodic BCs
60             if i == nn; Tn1l=Tn( 1); else Tn1l=Tn(i+1); end % Periodic BCs
61             T(i,t_n+1) = Tn(i) + dt * ( alpha * (Tn1l - 2*Tn(i) + Tn1l) / (dy^2) ...
62                                     - v(i) * (Tn1l - Tn1l) / (2*dy) );
63         end
64     end
65
66     %%%
67     % Process results.
68     %%%
69
70
71     step_numbers = round(linspace(1,length(t),n_plot));
72     figure(case_i);
73     hold on;
74     for t_n = 2:length(step_numbers)
75         plot(y, T(:,step_numbers(t_n)), 'k--');
76     end
77
78     cmap = jet(n_plot);
79     hf = figure(length(cases) + case_i);
80     set(hf, 'Position', [100,500,900,300]);
81     hold on;
82     plot_handles = [];
83     for t_n = 2:length(step_numbers)
84         tmp = sprintf('t = %.2f', t(step_numbers(t_n)));
85         method_err = (T_prob1{case_i}{:,step_numbers(t_n)} - T(:,step_numbers(t_n)));
86         hp = plot(y(2:end-1), method_err(2:end-1), 'DisplayName', tmp, 'Color', cmap(t_n,:));
87         if(mod(t_n-1,5) == 0 || n_plot <= 11)

```



```

88         plot_handles(end+1) = hp;
89     end
90 end
91 title(sprintf('IC = (%s), n = %.0f',IC_str,n));
92 xlabel('y');
93 ylabel('T_{Fourier} - T_{FTCS}');
94 ylim([-0.05,0.05]);
95 xlim([0,Ly]);
96 hleg = legend(plot_handles);
97 set(hleg,'Location','eastoutside');
98
99 end
100
101 disp('Done. ');
102
103 end

```