

## Kuramoto–Sivashinsky Equation

1. Consider the pattern formation equation

$$u_t + uu_x + \nu u_{xx} + \mu u_{xxxx} = 0 \quad \text{with} \quad u(0, x) = u_0(x)$$

on the domain  $[-1, 1]$  with periodic boundary conditions. Approximate  $u$  and  $uu_x$  using discrete Fourier series as

$$u(x, t) \approx \sum_{n=-N/2+1}^{N/2} y_j(t) e^{\pi i n x} \quad \text{and} \quad (uu_x)(x, t) \approx \sum_{n=-N/2+1}^{N/2} B_n(y(t)) e^{\pi i n x}$$

where  $y = (y_0, \dots, y_{N/2}, y_{-N/2+1}, \dots, y_{-1})$  to obtain the system of ordinary differential equations

$$\frac{dy_n}{dt} + B_n(y) - \nu \pi^2 n^2 y_n + \mu \pi^4 n^4 y_n = 0.$$

Note that  $B_n$  depends on  $t$  through  $y$  and may be computed using the subroutine developed in class for the viscous Burger equations. Write a program to integrate  $y_n$  on the interval  $[0, T]$  using the split Euler scheme

$$y_{n,j+1} = (y_{n,j} - h B_n(y_{\cdot,j})) \exp(\nu \pi^2 n^2 h - \mu \pi^4 n^4 h)$$

where  $y_{\cdot,j} = (y_{0,j}, \dots, y_{N/2,j}, y_{-N/2+1,j}, \dots, y_{-1,j})$  and  $y_{n,j} \approx y_n(t_j)$  with  $t_j = jh$ .

Modifications of the file `burger.c` from April 18 yields the program

```

1 #include <math.h>
2 #include <complex.h>
3 #include <stdio.h>
4 #include <stdlib.h>
5 #include <sys/time.h>
6 #include <sys/resource.h>
7
8 #include "fft.h"
9
10 complex f(complex x){
11     return cos(M_PI*x)+sin(3*M_PI*x);
12 }
13
14 void makeB(int N,complex Y[N],complex B[N]){
15     complex Z[N];
16     fift(N,Y,Z);
17     for(int n=0;n<N;n++){
18         Z[n]=Z[n]*Z[n]/2;
19     }

```

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```

20     fft(N,Z,B);
21     for(int n=-N/2+1;n<N/2;n++){
22         int l;
23         if(n<0) l=n+N; else l=n;
24         B[l]=M_PI*I*n*B[l];
25     }
26     B[N/2]=0;
27 }
28
29 int main(){
30     double t=1.0;
31     double nu=0.01;
32     double mu=0.00001;
33     {
34         struct rlimit rlim={RLIM_INFINITY,RLIM_INFINITY};
35         setrlimit(RLIMIT_STACK,&rlim);
36     }
37     int N=128;
38     complex X[N],Y[N],Z[N],B[N];
39     for(int k=-N/2+1;k<=N/2;k++){
40         int l;
41         if(k<0) l=k+N;
42         else l=k;
43         X[l]=f(2.0*k/N);
44     }
45     fft(N,X,Y);
46     int J=16384;
47     double h=t/J;
48     for(int j=0;j<J;j++){
49         makeB(N,Y,B);
50         for(int n=-N/2+1;n<=N/2;n++){
51             int l;
52             if(n<0) l=n+N;
53             else l=n;
54             double pi2n2=M_PI*M_PI*n*n;
55             Y[l]=(Y[l]-h*B[l])
56                 *exp((nu-mu*pi2n2)*pi2n2*h);
57         }
58     }
59     fifft(N,Y,Z);
60     printf("#%21s %22s %22s\n", "x", "Re(u)", "Im(u)");
61     for(int n=-N/2+1;n<=N/2;n++){
62         double x=2.0/N*n;
63         int l;

```

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```

64     if(n<0) l=n+N;
65     else l=n;
66     printf("%22.14e %22.14e %22.14e\n",x,Z[l]);
67 }
68 printf("# u(0,%d)=%g %g\n",Z[0]);
69 return 0;
70 }

```

Note the files `fft.c` and `fft.h` used by the above program are exactly the same as those developed in class.

- Set  $u_0(x) = \cos(\pi x) + \sin(3\pi x)$ ,  $\mu = 0.00001$ ,  $\nu = 0.01$ ,  $N = 128$  and  $h = T/J$  where  $T = 1$  and  $J = 16384$ . Verify that  $u(0, T) \approx 0.32$ . Draw a plot of  $u(x, T)$  versus  $x$ .

Output of the program in the previous section is

#	x	Re(u)	Im(u)
-9.843750000000000e-01	-3.31351806656911e-01	1.11258388213050e-16	
-9.687500000000000e-01	-3.16957218591146e-01	-1.21515972428935e-16	
-9.531250000000000e-01	-3.02463087409271e-01	1.07346041763733e-16	
-9.375000000000000e-01	-2.87953426249133e-01	-5.96681815603358e-17	
-9.218750000000000e-01	-2.73478422140523e-01	1.66769539444308e-16	
-9.062500000000000e-01	-2.59055685242220e-01	3.29504120510636e-16	
-8.906250000000000e-01	-2.44679151592599e-01	2.07092641632399e-16	
-8.750000000000000e-01	-2.30330225781809e-01	1.68917551427243e-16	
-8.593750000000000e-01	-2.15987796028934e-01	2.37893201959357e-16	
-8.437500000000000e-01	-2.01634714427441e-01	1.30018931587702e-16	
-8.281250000000000e-01	-1.87260629233661e-01	1.14284935667640e-16	
-8.125000000000000e-01	-1.72861469361261e-01	1.64141838226762e-17	
-7.968750000000000e-01	-1.58437056185983e-01	6.96250247896069e-17	
-7.812500000000000e-01	-1.43987763453820e-01	2.74860331017367e-16	
-7.656250000000000e-01	-1.29511473234159e-01	3.75360818802149e-16	
-7.500000000000000e-01	-1.15001167369109e-01	3.58149542540770e-16	
-7.343750000000000e-01	-1.00443653122841e-01	6.03919855390463e-16	
-7.187500000000000e-01	-8.58192024640695e-02	7.25029083847747e-16	
-7.031250000000000e-01	-7.11022121698349e-02	4.05718479631744e-16	
-6.875000000000000e-01	-5.62625819901779e-02	3.21970983154562e-16	
-6.718750000000000e-01	-4.12679682324690e-02	3.47180780945896e-16	
-6.562500000000000e-01	-2.60868325351960e-02	2.80931863183286e-16	
-6.406250000000000e-01	-1.06926248436546e-02	2.27475642475127e-16	
-6.250000000000000e-01	4.93080622191200e-03	1.44992438724644e-16	
-6.093750000000000e-01	2.07822686530851e-02	-1.19069785813031e-17	
-5.937500000000000e-01	3.68348472322639e-02	-1.56978403943498e-17	
-5.781250000000000e-01	5.30263135509711e-02	-1.94495843056232e-16	
-5.625000000000000e-01	6.92492274421511e-02	-1.81344292438680e-16	
-5.468750000000000e-01	8.53421435631286e-02	-2.63441882597940e-16	
-5.312500000000000e-01	1.01084203338290e-01	-3.76528334211924e-16	
-5.156250000000000e-01	1.16195980288409e-01	-3.41079976776272e-16	
-5.000000000000000e-01	1.30349859862658e-01	-4.27756502209838e-16	
-4.843750000000000e-01	1.43192871546708e-01	-5.34058744850322e-16	
-4.687500000000000e-01	1.54383546799256e-01	-6.07238545702441e-16	
-4.531250000000000e-01	1.63641844803555e-01	-1.56331926584742e-16	

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-4.37500000000000e-01	1.70807620557024e-01	-1.84568271830666e-16
-4.21875000000000e-01	1.75899515267058e-01	-6.91528532885376e-17
-4.06250000000000e-01	1.79163604055794e-01	-4.51961503003540e-17
-3.90625000000000e-01	1.81101584984158e-01	-7.04631145238900e-17
-3.75000000000000e-01	1.82472138241455e-01	5.15862246622605e-16
-3.59375000000000e-01	1.84266458162419e-01	4.32182231268760e-16
-3.43750000000000e-01	1.87666805668354e-01	6.29619292669022e-16
-3.28125000000000e-01	1.94002475186267e-01	4.43882396103233e-16
-3.12500000000000e-01	2.04716118011815e-01	3.32133856450455e-16
-2.96875000000000e-01	2.21343557348961e-01	2.50036266291195e-16
-2.81250000000000e-01	2.45490368606730e-01	4.62210466422862e-16
-2.65625000000000e-01	2.78761349453151e-01	2.46991281579866e-16
-2.50000000000000e-01	3.22566756603715e-01	2.35431319251523e-16
-2.34375000000000e-01	3.77702158023782e-01	3.50650227897850e-16
-2.18750000000000e-01	4.43596781267447e-01	1.21345314207818e-16
-2.03125000000000e-01	5.17196085018776e-01	4.12657373535651e-16
-1.87500000000000e-01	5.91659087576547e-01	7.24426829581181e-16
-1.71875000000000e-01	6.55469925223065e-01	4.09630826081061e-16
-1.56250000000000e-01	6.93086630013680e-01	-2.70710202177339e-16
-1.40625000000000e-01	6.88412734140531e-01	-7.97745931827166e-16
-1.25000000000000e-01	6.31354587914266e-01	-1.21156131948922e-15
-1.09375000000000e-01	5.25165290151011e-01	-1.17764115443772e-15
-9.37500000000000e-02	3.89733867108123e-01	-1.09816528940388e-15
-7.81250000000000e-02	2.56780045018855e-01	-1.22145214083450e-15
-6.25000000000000e-02	1.58301887817140e-01	-6.53189077904371e-16
-4.68750000000000e-02	1.15236136453599e-01	-2.53033541742079e-16
-3.12500000000000e-02	1.33081364292119e-01	1.61235943340886e-16
-1.56250000000000e-02	2.05346848504086e-01	3.77095542278126e-16
0.00000000000000e+00	3.20251592879676e-01	7.33015536290293e-16
1.56250000000000e-02	4.65335165831655e-01	7.39228286516654e-16
3.12500000000000e-02	6.27328775404055e-01	9.81768158292314e-16
4.68750000000000e-02	7.87852809547353e-01	8.01235432154456e-16
6.25000000000000e-02	9.18248760312551e-01	7.59121299100717e-16
7.81250000000000e-02	9.79377432141319e-01	1.39013963828679e-16
9.37500000000000e-02	9.32888531038331e-01	-3.64385269880086e-16
1.09375000000000e-01	7.64479934207853e-01	-1.09741941230216e-15
1.25000000000000e-01	5.05479138108737e-01	-1.30212795620109e-15
1.40625000000000e-01	2.30000712027752e-01	-1.23315230566898e-15
1.56250000000000e-01	2.07844069715985e-02	-8.41426214959310e-16
1.71875000000000e-01	-7.17258726209691e-02	-1.04290222305438e-16
1.87500000000000e-01	-4.50326918442712e-02	3.00908833882873e-16
2.03125000000000e-01	6.99905997684596e-02	6.45553218813907e-16
2.18750000000000e-01	2.33434390914167e-01	6.35682814020543e-16
2.34375000000000e-01	4.11254926373351e-01	3.47605243186521e-16
2.50000000000000e-01	5.76786192207050e-01	7.18972025543946e-16
2.65625000000000e-01	7.05484234527058e-01	6.87186582237350e-16
2.81250000000000e-01	7.71886053726617e-01	4.75228903307087e-16
2.96875000000000e-01	7.55204914639850e-01	7.26515722441966e-17
3.12500000000000e-01	6.53412254112043e-01	1.83193105076417e-16
3.28125000000000e-01	4.96142428338487e-01	-1.10786216711981e-16
3.43750000000000e-01	3.42009132770786e-01	-4.82346466246509e-16
3.59375000000000e-01	2.55327528317693e-01	-8.27236230918772e-16
3.75000000000000e-01	2.74733643812349e-01	-9.92986161516141e-16
3.90625000000000e-01	3.91586774752935e-01	-1.10131332149474e-15

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```
4.062500000000000e-01  5.44835000137011e-01  -6.95709442977258e-16
4.218750000000000e-01  6.31933200479129e-01  -3.47151508942191e-16
4.375000000000000e-01  5.43694537762018e-01  1.26194563957402e-15
4.531250000000000e-01  2.29222152473109e-01  2.61446436404758e-15
4.687500000000000e-01  -2.44281736967607e-01  3.30802432876281e-15
4.843750000000000e-01  -7.09283875034358e-01  3.33653379229456e-15
5.000000000000000e-01  -1.00550932913463e+00  1.54320952641103e-15
5.156250000000000e-01  -1.07924267514872e+00  3.57589121801757e-16
5.312500000000000e-01  -9.86520324643311e-01  -4.33766198104760e-16
5.468750000000000e-01  -8.27241984486119e-01  -3.64498743701959e-16
5.625000000000000e-01  -6.84952095594911e-01  -6.98046420719801e-16
5.781250000000000e-01  -6.03276264545995e-01  -7.49164455871446e-16
5.937500000000000e-01  -5.88198427626110e-01  -5.58674299189489e-16
6.093750000000000e-01  -6.20389094105974e-01  -6.53330202452097e-16
6.250000000000000e-01  -6.70087858895247e-01  -1.14947229031513e-15
6.406250000000000e-01  -7.10723182591958e-01  -7.61307520203284e-16
6.562500000000000e-01  -7.27482277142688e-01  -1.25775984919374e-15
6.718750000000000e-01  -7.18761344800900e-01  -6.10829477290665e-16
6.875000000000000e-01  -6.91999697274606e-01  -5.83800138865299e-16
7.031250000000000e-01  -6.57634377158736e-01  -8.60186758333962e-16
7.187500000000000e-01  -6.24364422201492e-01  -2.87190075199119e-16
7.343750000000000e-01  -5.96971779494118e-01  -1.69342352654568e-16
7.500000000000000e-01  -5.76362379665659e-01  -1.53146739367282e-16
7.656250000000000e-01  -5.60860439591713e-01  1.00850047357189e-16
7.812500000000000e-01  -5.47816920765327e-01  -4.51881394859555e-17
7.968750000000000e-01  -5.34895871658251e-01  2.46123919841877e-16
8.125000000000000e-01  -5.20751853703667e-01  -3.30285043812718e-16
8.281250000000000e-01  -5.05113588200488e-01  -8.99695350002593e-17
8.437500000000000e-01  -4.88473424258001e-01  1.17867856441466e-16
8.593750000000000e-01  -4.71636663659740e-01  -3.25901146361475e-16
8.750000000000000e-01  -4.55331032712759e-01  -3.78894051020351e-16
8.906250000000000e-01  -4.39980211154990e-01  -2.33951583506334e-16
9.062500000000000e-01  -4.25651823598116e-01  -5.56931564899114e-16
9.218750000000000e-01  -4.12133629865041e-01  -1.11229116209345e-16
9.375000000000000e-01  -3.99069258618608e-01  -1.60527610726958e-16
9.531250000000000e-01  -3.86093361294106e-01  -3.84872525916317e-16
9.687500000000000e-01  -3.72926723560614e-01  5.11083050297342e-18
9.843750000000000e-01  -3.59418302504556e-01  8.91314452659763e-17
1.000000000000000e+00  -3.45539953114715e-01  -1.14396255532534e-16
# u(0,4200959)=0.320252 7.33016e-16
```

which shows

$$u(0, T) \approx 0.320252.$$

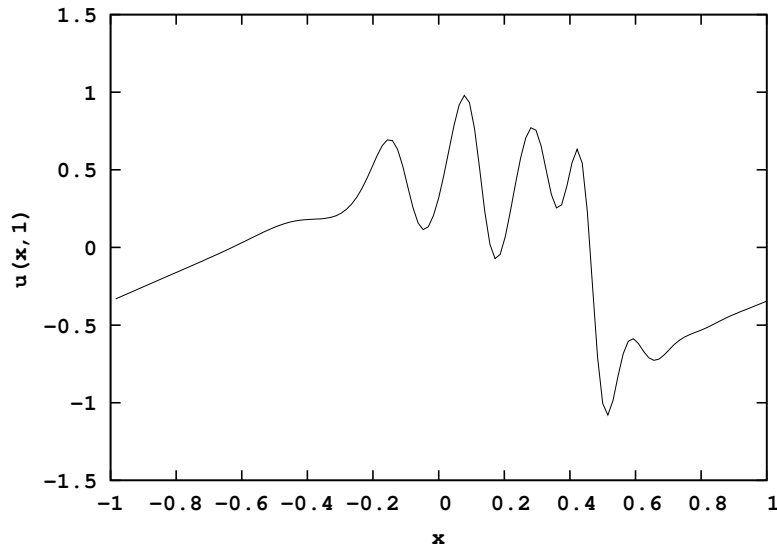
The gnuplot plotting script

```
set terminal postscript enhanced eps font "Courier-Bold"
set output 'plot2.eps'
set size 0.7,0.7
set xlabel "x"
set ylabel "u(x,1)"
set key left top
set key spacing 1.5
set style data lines
set sample 800
```

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```
plot [] [-1.5:1.5] "p2.out" ti ""
```

creates the graph



3. For convenience define  $\alpha_n = \nu\pi^2 n^2 h - \mu\pi^4 n^4 h$  and modify your code to use the split RK2 scheme given by

$$\begin{aligned} k_{1,n} &= -hB_n(y_{\cdot,j}) \\ k_{2,n} &= -he^{-\alpha_n} B_n(p) \quad \text{where} \quad p_n = (y_{n,j} + k_{1,n})e^{\alpha_n} \\ y_{n,j+1} &= (y_{n,j} + (k_{1,n} + k_{2,n})/2)e^{\alpha_n}. \end{aligned}$$

Let  $U^h$  be the approximation of  $u(T)$  using the split RK2 method with step size  $h$ . Graph  $\log \|U^h - U^{h/2}\|$  versus  $\log h$  where  $h = 2^{-j}$  for  $j = 6, \dots, 16$  and

$$\|U^h - U^{h/2}\| = \sqrt{\frac{2}{N} \sum_{\ell=-N/2+1}^{N/2} \left| U^h\left(\frac{2\ell}{N}\right) - U^{h/2}\left(\frac{2\ell}{N}\right) \right|^2}$$

to verify the order of convergence for the split RK2 method numerically. What happens if you take  $N = 256$ ?

The program

```
1 #include <math.h>
2 #include <complex.h>
3 #include <stdio.h>
4 #include <stdlib.h>
5 #include <sys/time.h>
6 #include <sys/resource.h>
```

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```
7
8 #include "fft.h"
9
10 complex f(complex x){
11     return cos(M_PI*x)+sin(3*M_PI*x);
12 }
13
14 void makeB(int N,complex Y[N],complex B[N]){
15     complex Z[N];
16     fift(N,Y,Z);
17     for(int n=0;n<N;n++){
18         Z[n]=Z[n]*Z[n]/2;
19     }
20     fft(N,Z,B);
21     for(int n=-N/2+1;n<N/2;n++){
22         int l;
23         if(n<0) l=n+N; else l=n;
24         B[l]=M_PI*I*n*B[l];
25     }
26     B[N/2]=0;
27 }
28
29 double dist(int N,complex X[N],complex Y[N]){
30     double r=0;
31     for(int n=0;n<N;n++){
32         double Z=X[n]-Y[n];
33         r=r+Z*conj(Z);
34     }
35     return sqrt(r);
36 }
37
38 int main(){
39     double t=1.0;
40     double nu=0.01;
41     double mu=0.00001;
42     {
43         struct rlimit rlim={RLIM_INFINITY,RLIM_INFINITY};
44         setrlimit(RLIMIT_STACK,&rlim);
45     }
46     int N=128;
47     complex X[N],Y[N],Z[N],Zold[N],B[N];
48     for(int k=-N/2+1;k<=N/2;k++){
49         int l;
50         if(k<0) l=k+N;
```

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```

51     else l=k;
52     X[l]=f(2.0*k/N);
53 }
54 printf("#%7s %22s %22s %22s\n", "J", "|U^h-U^h/2|",
55     "Re(U^h(0,1))", "Im(U^h(0,1))");
56 for(int J=64;J<=131072;J=J*2){
57     fft(N,X,Y);
58     double h=t/J;
59     for(int j=0;j<J;j++){
60         complex k1[N],k2[N],tmp[N];
61         makeB(N,Y,B);
62         for(int n=-N/2+1;n<=N/2;n++){
63             int l=n<0?n+N:n;
64             double pi2n2=M_PI*M_PI*n*n;
65             double alpha=(nu-mu*pi2n2)*pi2n2*h;
66             k1[l]=-h*B[l];
67             tmp[l]=(Y[l]+k1[l])*exp(alpha);
68         } // k1=h f(yn,tn)
69         // tmp=(yn+k1)*exp(-ah)
70         makeB(N,tmp,B);
71         for(int n=-N/2+1;n<=N/2;n++){
72             int l=n<0?n+N:n;
73             double pi2n2=M_PI*M_PI*n*n;
74             double alpha=(nu-mu*pi2n2)*pi2n2*h;
75             k2[l]=-h*B[l]*exp(-alpha);
76         } // k2=h exp(ah)f(tmp,tn+h)
77         for(int n=-N/2+1;n<=N/2;n++){
78             int l=n<0?n+N:n;
79             double pi2n2=M_PI*M_PI*n*n;
80             double alpha=(nu-mu*pi2n2)*pi2n2*h;
81             Y[l]=(Y[l]+(k1[l]+k2[l])/2)*exp(alpha);
82         }
83     }
84     fift(N,Y,Z);
85     if(J>64){
86         double er=dist(N,Z,Zold);
87         printf("%8d %22.14e %22.14e %22.14e\n",J/2,er,Zold[0]);
88     }
89     memcpy(Zold,Z,N*sizeof(complex));
90 }
91 return 0;
92 }

```

produces the output

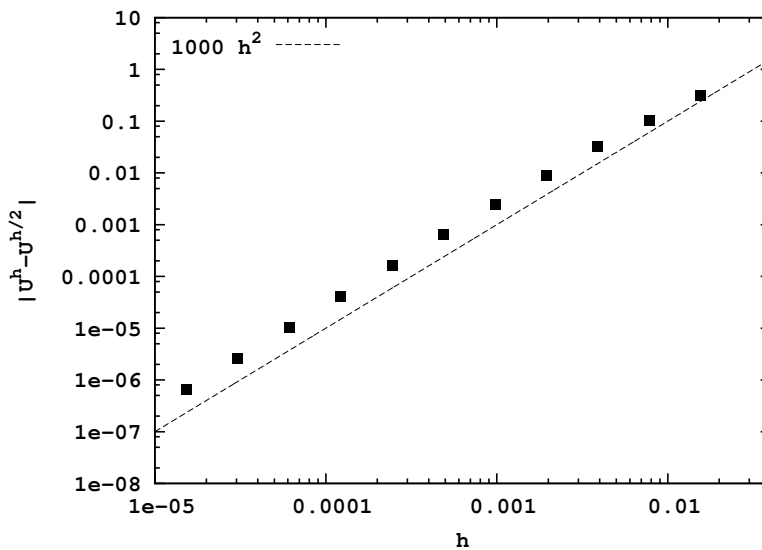
#	J	$ U^h-U^h/2 $	$\text{Re}(U^h(0,1))$	$\text{Im}(U^h(0,1))$
---	---	---------------	-----------------------	-----------------------



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64	3.10756616134137e-01	3.62392788177117e-01	3.02926086992450e-16
128	1.05375754534531e-01	3.32479909418346e-01	6.94485701585590e-16
256	3.19279016825811e-02	3.25954839634281e-01	4.74202925190848e-16
512	9.05131470037609e-03	3.24069379397074e-01	2.93195372494393e-16
1024	2.44362594469074e-03	3.23494049558329e-01	1.60684182973214e-15
2048	6.37757854926851e-04	3.23328738258165e-01	7.26334140402352e-16
4096	1.63099281278662e-04	3.23283920075056e-01	-2.65277166552891e-16
8192	4.12513197927348e-05	3.23272214231917e-01	-5.37899802824371e-16
16384	1.03734905032436e-05	3.23269220425602e-01	-5.43429233904047e-16
32768	2.60101359093303e-06	3.23268463233068e-01	1.23197892859528e-15
65536	6.51207475019377e-07	3.23268272820186e-01	-2.32832416541262e-17

with graph



The fact that the points agree with curve  $y = Kh^2$  where  $K \approx 1000$  implies the method is functioning as a second order method. We now take  $N = 256$  in line 46 of the above program and to obtain

#	J	$ U^h - U^{h/2} $	$\text{Re}(U^h(0,1))$	$\text{Im}(U^h(0,1))$
64		-nan	-nan	-nan
128		-nan	-nan	-nan
256		-nan	-nan	-nan
512	1.28004919089024e-02	3.24069391502699e-01	5.63954742249886e-16	
1024	3.45580884963594e-03	3.23494071892084e-01	9.84879328972843e-16	
2048	9.01925787087746e-04	3.23328759556400e-01	3.19414670226080e-16	
4096	2.30657203074667e-04	3.23283935481253e-01	2.10888953038715e-15	
8192	5.83381658781480e-05	3.23272225673768e-01	-4.46709403701998e-16	
16384	1.46703259371521e-05	3.23269230410368e-01	1.18716435426741e-15	
32768	3.67838795416100e-06	3.23268472798772e-01	9.33917298879351e-16	
65536	9.20946369043414e-07	3.23268282275223e-01	2.27038698774333e-15	

Note that for values of  $J$  equal to 64, 128 and 256 the computation returns *not a number* as the result. This is because larger values of  $N$  require smaller time steps in order for the method to be stable. When  $J = 65536$  the value of  $U^h(0,1) \approx 3.232682$  when either

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$N = 128$  or  $N = 256$ . This suggests that the exact solution  $u(0, 1)$  is equal 3.232682 to seven significant digits.

4. [Extra Credit] Repeat the previous question for the split RK4 method. Approximate the value of  $u(0, T)$  with as much precision as possible by increasing  $J$  and  $N$ .

Following the handout on split RK schemes, consider a differential equation of the form

$$\frac{dy}{dt} + ay = f(y, t) \quad \text{with} \quad y(t_n) = y_n.$$

Introduce the variables

$$w = e^{a(t-t_n)}y \quad \text{and} \quad g(w, t) = e^{a(t-t_n)}f(we^{-a(t-t_n)}, t)$$

to obtain the differential equation

$$\frac{dw}{dt} = g(w, t) \quad \text{with} \quad w(t_n) = y_n.$$

The four-stage fourth-order Runge-Kutta scheme for integrating  $w$  is

$$\begin{aligned} k_1 &= hg(w_n, t_n) \\ k_2 &= hg(w_n + k_1/2, t_n + h/2) \\ k_3 &= hg(w_n + k_2/2, t_n + h/2) \\ k_4 &= hg(w_n + k_3, t_n + h) \\ w_{n+1} &= w_n + (k_1 + 2k_2 + 2k_3 + k_4)/6. \end{aligned}$$

In terms of  $y$  and  $f$  this may be written

$$\begin{aligned} k_1 &= hf(y_n, t_n) \\ k_2 &= he^{ah/2}f((y_n + k_1/2)e^{-ah/2}, t_n + h/2) \\ k_3 &= he^{ah/2}f((y_n + k_2/2)e^{-ah/2}, t_n + h/2) \\ k_4 &= he^{ah}f((y_n + k_3)e^{-ah}, t_n + h) \\ y_{n+1} &= e^{-ah}(y_n + (k_1 + 2k_2 + 2k_3 + k_4)/6). \end{aligned}$$

The resulting program

```
1 #include <math.h>
2 #include <complex.h>
3 #include <stdio.h>
4 #include <stdlib.h>
5 #include <sys/time.h>
6 #include <sys/resource.h>
```

7

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```
8 #include "fft.h"
9
10 complex f(complex x){
11     return cos(M_PI*x)+sin(3*M_PI*x);
12 }
13
14 void makeB(int N,complex Y[N],complex B[N]){
15     complex Z[N];
16     fift(N,Y,Z);
17     for(int n=0;n<N;n++){
18         Z[n]=Z[n]*Z[n]/2;
19     }
20     fft(N,Z,B);
21     for(int n=-N/2+1;n<N/2;n++){
22         int l;
23         if(n<0) l=n+N; else l=n;
24         B[l]=M_PI*I*n*B[l];
25     }
26     B[N/2]=0;
27 }
28
29 double dist(int N,complex X[N],complex Y[N]){
30     double r=0;
31     for(int n=0;n<N;n++){
32         double Z=X[n]-Y[n];
33         r=r+Z*conj(Z);
34     }
35     return sqrt(r);
36 }
37
38 int main(){
39     double t=1.0;
40     double nu=0.01;
41     double mu=0.00001;
42     {
43         struct rlimit rlim={RLIM_INFINITY,RLIM_INFINITY};
44         setrlimit(RLIMIT_STACK,&rlim);
45     }
46     int N=128;
47     complex X[N],Y[N],Z[N],Zold[N],B[N];
48     for(int k=-N/2+1;k<=N/2;k++){
49         int l;
50         if(k<0) l=k+N;
51         else l=k;
```

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```

52     X[l]=f(2.0*k/N);
53 }
54 printf("#%7s %22s %22s %22s\n", "J", "|U^h-U^h/2|",
55     "Re(U^h(0,1))", "Im(U^h(0,1))");
56 for(int J=64;J<=131072;J=J*2){
57     fft(N,X,Y);
58     double h=t/J;
59     for(int j=0;j<J;j++){
60         complex k1[N],k2[N],k3[N],k4[N],tmp[N];
61         makeB(N,Y,B);
62         for(int n=-N/2+1;n<=N/2;n++){
63             int l=n<0?n+N:n;
64             double pi2n2=M_PI*M_PI*n*n;
65             double alpha=(nu-mu*pi2n2)*pi2n2*h;
66             k1[l]=-h*B[l];
67             tmp[l]=(Y[l]+k1[l]/2)*exp(alpha/2);
68         } // k1=h f(yn,tn)
69         // tmp=(yn+k1/2)*exp(-ah/2)
70         makeB(N,tmp,B);
71         for(int n=-N/2+1;n<=N/2;n++){
72             int l=n<0?n+N:n;
73             double pi2n2=M_PI*M_PI*n*n;
74             double alpha=(nu-mu*pi2n2)*pi2n2*h;
75             k2[l]=-h*B[l]*exp(-alpha/2);
76             tmp[l]=(Y[l]+k2[l]/2)*exp(alpha/2);
77         } // k2=h exp(ah)f(tmp,tn+h)
78         // tmp=(yn+k2/2)*exp(-ah/2)
79         makeB(N,tmp,B);
80         for(int n=-N/2+1;n<=N/2;n++){
81             int l=n<0?n+N:n;
82             double pi2n2=M_PI*M_PI*n*n;
83             double alpha=(nu-mu*pi2n2)*pi2n2*h;
84             k3[l]=-h*B[l]*exp(-alpha/2);
85             tmp[l]=(Y[l]+k3[l])*exp(alpha);
86         } // k3=h exp(ah)f(tmp,tn+h)
87         // tmp=(yn+k3)*exp(-ah)
88         makeB(N,tmp,B);
89         for(int n=-N/2+1;n<=N/2;n++){
90             int l=n<0?n+N:n;
91             double pi2n2=M_PI*M_PI*n*n;
92             double alpha=(nu-mu*pi2n2)*pi2n2*h;
93             k4[l]=-h*B[l]*exp(-alpha);
94         } // k4=h exp(ah)f(tmp,tn+h)
95         for(int n=-N/2+1;n<=N/2;n++){

```

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```

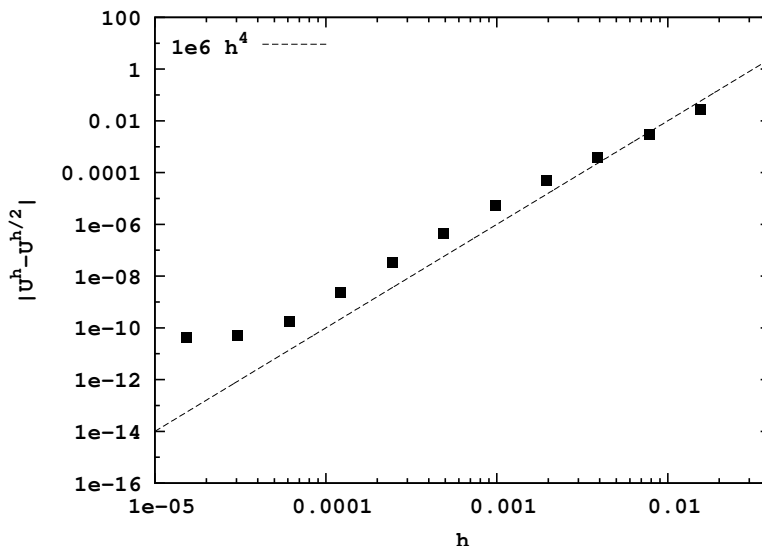
96         int l=n<0?n+N:n;
97         double pi2n2=M_PI*M_PI*n*n;
98         double alpha=(nu-mu*pi2n2)*pi2n2*h;
99         Y[l]=(Y[l]+(k1[l]+2*(k2[l]+k3[l])+k4[l])/6)*exp(alpha);
100     }
101 }
102 fift(N,Y,Z);
103 if(J>64){
104     double er=dist(N,Z,Zold);
105     printf("%8d %22.14e %22.14e %22.14e\n",J/2,er,Zold[0]);
106 }
107 memcpy(Zold,Z,N*sizeof(complex));
108 }
109 printf("# U(0,%g) = %22.14e %22.14e\n",t,Z[0]);
110 return 0;
111 }

```

produces the output

#	J	$ U^h-U^h/2 $	$\text{Re}(U^h(0,1))$	$\text{Im}(U^h(0,1))$
	64	2.72402815406515e-02	3.23640760157633e-01	1.03909936211011e-15
	128	2.96821538740276e-03	3.23259985624597e-01	1.89328804370281e-15
	256	3.87275914862941e-04	3.23263463508242e-01	7.95885709767297e-16
	512	4.84237267753036e-05	3.23267158775571e-01	-4.09123689787405e-16
	1024	5.18033719187727e-06	3.23268079784846e-01	-2.30420066707482e-16
	2048	4.57113411391895e-07	3.23268196440703e-01	1.56550662190613e-15
	4096	3.42276472679863e-08	3.23268208005985e-01	7.42705593206883e-16
	8192	2.29776793396823e-09	3.23268209038265e-01	-6.83318419208989e-16
	16384	1.70043261258641e-10	3.23268209114652e-01	-3.13036272250877e-16
	32768	4.96273832077227e-11	3.23268209128835e-01	1.23677652320853e-15
	65536	4.16109052696695e-11	3.23268209132976e-01	2.17225326268333e-15
# U(0,1) =		3.23268209134185e-01	4.03404523327544e-16	

with graph



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Note that the curve tracks the  $h^4$  line between  $J = 64$  and 16384 after which rounding error starts to accumulate. Without concern to the spatial resolution it appears that  $u(0, 1) \approx 3.2326820913$  to 11 significant digits when  $N = 128$ . However, this approximation needs to be independent of spatial resolution. To check this, we change the spatial resolution to  $N = 256$  in line 46 as was done with the second order method. The resulting output is

#	J	$ U^h - U^{h/2} $	$\text{Re}(U^h(0, 1))$	$\text{Im}(U^h(0, 1))$
	64	-nan	-nan	-nan
	128	-nan	-nan	-nan
	256	-nan	-nan	-nan
	512	6.84823211629319e-05	3.23267179228170e-01	1.31846727577388e-15
	1024	7.32608119311635e-06	3.23268096975500e-01	3.98658074945931e-16
	2048	6.46163156342597e-07	3.23268208386574e-01	-3.57117867775893e-16
	4096	4.85126228290894e-08	3.23268217793079e-01	1.62561863359529e-15
	8192	3.27973601136617e-09	3.23268218487246e-01	5.73419362671052e-16
	16384	2.42941113835187e-10	3.23268218534087e-01	1.50394736591826e-15
	32768	7.05011257131135e-11	3.23268218546220e-01	7.65102539785980e-16
	65536	5.94717313770905e-11	3.23268218550231e-01	1.77506983239390e-15
#	$U(0, 1) =$	3.23268218551390e-01	6.05055373234704e-16	

Increasing the spatial resolution now causes us to revise the estimate before to only 7 significant digits to obtain  $u(0, 1) \approx 3.232682$ . As suggested from Programming Project 2 on the use of Fourier series to approximate derivatives, increasing spatial resolution more without using higher precision arithmetic may not increase accuracy. Therefore, finding about 7 significant digits appears all we are able to do obtain at this point even with a fourth order method.