

# SF1544

## Övning 6

# This övning

- numerical discretization of PDE
- Monte Carlo method
- Nonlinear Least square problem

# Heat equation

Problem

## Heat equation

$$\frac{\partial u}{\partial t} = \sigma \frac{\partial^2 u}{\partial x^2}$$

$$u(0, x) = g(x)$$

$$u(t, 0) = h(t)$$

$$u(t, 1) = r(t)$$

where the domain is

$$0 \leq t \leq 1$$

$$0 \leq x \leq 1$$

# Heat equation: discretization

Let consider the discretization

$$0 = t_1 < t_2 < \cdots < t_N = 1$$

$$0 = x_1 < x_2 < \cdots < x_N = 1$$

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$$0 = x_1 < x_2 < \cdots < x_N = 1$$

such that

$$t_{j+1} = t_j + \Delta t$$

$$x_{i+1} = x_i + \Delta x$$

## Heat equation: discretization

$$\frac{\partial u}{\partial t}(t_j, x_i) = \sigma \frac{\partial^2 u}{\partial x^2}(t_j, x_i)$$

# Heat equation: discretization

## Notation

$$u_i^j \approx u(t_j, x_i)$$

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### Heat equation: discretization

$$\frac{\partial u}{\partial t}(t_j, x_i) = \sigma \frac{\partial^2 u}{\partial x^2}(t_j, x_i)$$

### Heat equation: discretization interior points

$$\frac{u_i^{j+1} - u_i^j}{\Delta t} = \sigma \frac{u_{i+1}^j - 2u_i^j + u_{i-1}^j}{\Delta x^2}$$

# Heat equation: discretization

## Heat equation: discretization interior points

$$u_i^{j+1} = u_i^j - \frac{\sigma \Delta t}{\Delta x^2} (u_{i+1}^j - 2u_i^j + u_{i-1}^j)$$

# Heat equation: discretization

## Heat equation: discretization interior points

$$u_i^{j+1} = u_i^j - \frac{\sigma \Delta t}{\Delta x^2} (u_{i+1}^j - 2u_i^j + u_{i-1}^j)$$

## Heat equation: discretization intial and boundary conditions

$$u_i^1 = g(x_i)$$

$$u_1^j = h(t_j)$$

$$u_M^j = r(t_j)$$

# Heat equation: discretization (conclusion)

## Heat equation

$$\frac{\partial u}{\partial t} = \sigma \frac{\partial^2 u}{\partial x^2}$$

$$u(0, x) = g(x)$$

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## Heat equation: discretization interior points

$$u_i^{j+1} = u_i^j - \frac{\sigma \Delta t}{\Delta x^2} (u_{i+1}^j - 2u_i^j + u_{i-1}^j) \quad i=2, \dots, M-1, j=1, \dots, N-1$$

$$u_i^1 = g(x_i), \quad u_1^j = h(t_j), \quad u_M^j = r(t_j) \quad i=1, \dots, M, j=1, \dots, N$$

# Heat equation: example

## Heat equation

$$\frac{\partial u}{\partial t} = \frac{1}{\pi} \frac{\partial^2 u}{\partial x^2}$$

$$u(0, x) = \sin(\pi x)$$

$$u(t, 0) = 0$$

$$u(t, 1) = 0$$

# Matlab implementation: complete it!

```
close all; clear all; clc

M=100; N=M^2;
u=zeros(N,M);
t=linspace(0,1,N); dt=t(2)-t(1);
x=??????????????; dx=x(2)-x(1);

u(1,:) = ??????;
u(:,1) = ?";
u(:,end)= 0;

K=(dt/dx^2)*?????;
for j=1:N-1
    for i=2:M-1
        u(j+1,i)=u(j,i)+K*(u(j,i+1)-2*u(j,i)+u(j,i-1));
    end
end
imagesc(t,x,abs(u))
```

# Matlab implementation: solution

```
close all; clear all; clc

M=100; N=M^2;
u=zeros(N,M);
t=linspace(0,1,N); dt=t(2)-t(1);
x=linspace(0,1,M); dx=x(2)-x(1);

u(1,:) = sin(pi*x);
u(:,1) = 0;
u(:,end)= 0;

K=(dt/dx^2)*(1/pi);
for j=1:N-1
    for i=2:M-1
        u(j+1,i)=u(j,i)+K*(u(j,i+1)-2*u(j,i)+u(j,i-1));
    end
end
imagesc(t,x,abs(u))
```

# MATLAB DEMO

# Monte Carlo method

## Exercise

Compute the area included between the two parabolas

$$y = x^2 - x + \frac{1}{2}$$

$$y = -x^2 + x + \frac{1}{2}$$

for  $0 \leq x \leq 1$

# Monte Carlo method

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IDEA: generate  $N$  random points  $(x_i, y_i) \in [0, 1] \times [0, 1]$

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$$\frac{\# \text{ points between the parabolas}}{N} = \frac{\# \text{ area between the parabolas}}{\# \text{ total area}}$$

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$$\frac{\# \text{ points between the parabolas}}{N} = \frac{\# \text{ area between the parabolas}}{\# \text{ total area}}$$

$\# \text{ total area} = 1$

# MATLAB DEMO

# Matlab implementation: solution

```
close all  
clear all  
clc  
  
p1=@(x) x.^2-x+1/2;  
p2=@(x) -x.^2+x+1/2;  
x=linspace(0,1,100);  
plot(x,p1(x), '-k'); hold on  
plot(x,p2(x), '-r');  
  
N=1e4;  
j=0;  
for i=1:N  
    x=rand; y=rand;  
    if p1(x)<y && p2(x)>y  
        j=j+1;  
    end  
end  
Area=j/N
```

# Nonlinear Least Square problem

- 4.25 Följande tabell visar den uppmätta positionen  $y$  vid olika tidpunkter för en massa i ett dämpat svängningsförlopp:  $Y(t) = -0.17 e^{-bt}(\cos \omega t + \frac{b}{\omega} \sin \omega t)$ .

$t$	0.8	1.7	2.5	3.3	4.1
$y$	0.12	-0.09	0.06	-0.05	0.032

Utnyttja de fem mätningarna för att bestämma parametrarna  $b$  och  $\omega$  så bra som möjligt. Man vet att mätningarna gjorts nära max- och minlägena, vilket leder till följande goda startgissningar för parametrarna:  $\omega = \frac{2\pi}{t_3 - t_1}$  och  $b = \frac{\omega}{2\pi}(\ln y_1 - \ln y_3)$ .

# Matlab implementation: solution

```
close all
clear all
clc

t=[0.8 1.7 2.5 3.3 4.1]'; y=[0.12 -0.09 0.06 -0.05 0.032]';
a=-0.17; s=0.001;
w=2*pi/(t(3)-t(1)); b=(log(y(1))-log(y(3)))*w/(2*pi);
c=[w b]';
for iter=1:4
    F=a*exp(-b*t).* (cos(w*t)+b/w*sin(w*t)); f=F-y;
    fnorm=norm(f)

    ws=w+s; Fw=a*exp(-b*t).* (cos(ws*t)+b/ws*sin(ws*t));
    bs=b+s; Fb=a*exp(-bs*t).* (cos(w*t)+bs/w*sin(w*t));
    J=[(Fw-F)/s (Fb-F)/s];

    dc=-J\f; c=c+dc; w=c(1); b=c(2);
end
```