

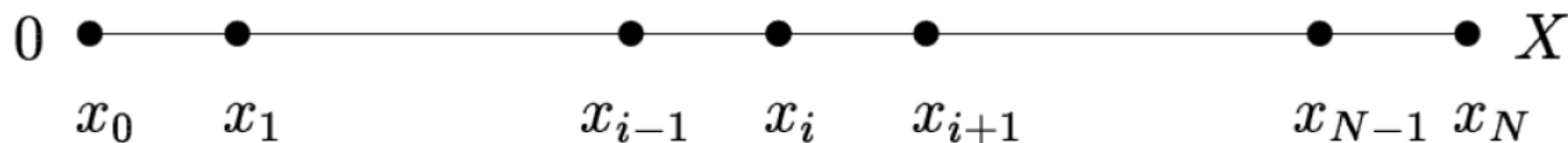
# Numeričke metode

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# 1D finite difference/konačne razlike

$$1D: \quad \Omega = (0, X), \quad u_i \approx u(x_i), \quad i = 0, 1, \dots, N$$

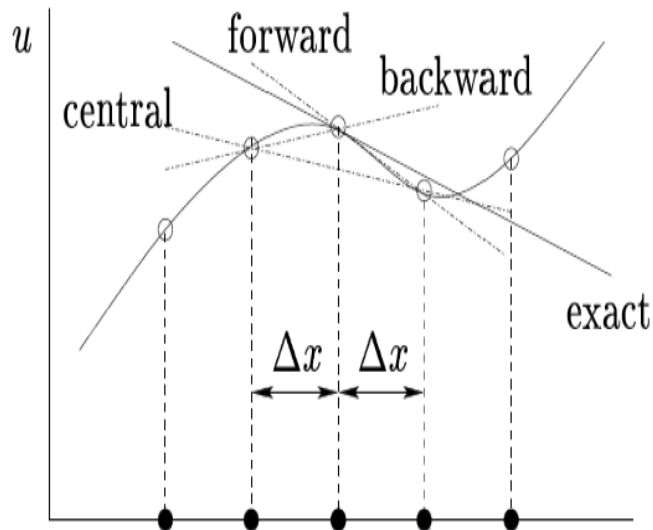
$$\text{Diskretizacija: } x_i = i\Delta x \quad \text{korak } \Delta x = \frac{X}{N}$$



$$\left( \frac{\partial u}{\partial x} \right)_i = \lim_{\Delta x \rightarrow 0} \frac{u(x_{i+1}) - u(x_i)}{\Delta x} = \lim_{\Delta x \rightarrow 0} \frac{u(x_i) - u(x_{i-1})}{\Delta x}$$

# konačne razlike

## Geometrijska interpretacija



$$\left(\frac{\partial u}{\partial x}\right)_i \approx \frac{u_{i+1} - u_i}{\Delta x}$$

naprijed

$$\left(\frac{\partial u}{\partial x}\right)_i \approx \frac{u_i - u_{i-1}}{\Delta x}$$

nazad

$$\left(\frac{\partial u}{\partial x}\right)_i \approx \frac{u_{i+1} - u_{i-1}}{2\Delta x}$$

centralna razlika

# konačne razlike

Ekspanzija Taylorovim redom

$$u(x) = \sum_{n=0}^{\infty} \frac{(x-x_i)^n}{n!} \left( \frac{\partial^n u}{\partial x^n} \right)_i, \quad u \in C^\infty([0, X])$$

$$T_1 : \quad u_{i+1} = u_i + \Delta x \left( \frac{\partial u}{\partial x} \right)_i + \frac{(\Delta x)^2}{2} \left( \frac{\partial^2 u}{\partial x^2} \right)_i + \frac{(\Delta x)^3}{6} \left( \frac{\partial^3 u}{\partial x^3} \right)_i + \dots$$

$$T_2 : \quad u_{i-1} = u_i - \Delta x \left( \frac{\partial u}{\partial x} \right)_i + \frac{(\Delta x)^2}{2} \left( \frac{\partial^2 u}{\partial x^2} \right)_i - \frac{(\Delta x)^3}{6} \left( \frac{\partial^3 u}{\partial x^3} \right)_i + \dots$$

$$T_1 \Rightarrow \left( \frac{\partial u}{\partial x} \right)_i = \frac{u_{i+1} - u_i}{\Delta x} - \frac{\Delta x}{2} \left( \frac{\partial^2 u}{\partial x^2} \right)_i - \frac{(\Delta x)^2}{6} \left( \frac{\partial^3 u}{\partial x^3} \right)_i + \dots$$

# Taylorov red

$$T_2 \Rightarrow \left( \frac{\partial u}{\partial x} \right)_i = \frac{u_{i+1} - u_i}{\Delta x} + \frac{\Delta x}{2} \left( \frac{\partial^2 u}{\partial x^2} \right)_i - \frac{(\Delta x)^2}{6} \left( \frac{\partial^3 u}{\partial x^3} \right)_i + \dots$$

pogreška:  $\mathcal{O}(\Delta x)$

$$T_1 - T_2 \Rightarrow \left( \frac{\partial u}{\partial x} \right)_i = \frac{u_{i+1} - u_{i-1}}{2\Delta x} - \frac{(\Delta x)^2}{6} \left( \frac{\partial^3 u}{\partial x^3} \right)_i + \dots$$

pogreška:  $\mathcal{O}(\Delta x)^2$

# druga derivacija

$$T_1 + T_2 \Rightarrow \left( \frac{\partial^2 u}{\partial x^2} \right)_i = \frac{u_{i+1} - 2u_i + u_{i-1}}{(\Delta x)^2} + \mathcal{O}(\Delta x)^2$$

$$\begin{aligned} \left( \frac{\partial^2 u}{\partial x^2} \right)_i &= \left[ \frac{\partial}{\partial x} \left( \frac{\partial u}{\partial x} \right) \right]_i = \lim_{\Delta x \rightarrow 0} \frac{\left( \frac{\partial u}{\partial x} \right)_{i+1/2} - \left( \frac{\partial u}{\partial x} \right)_{i-1/2}}{\Delta x} \\ &\approx \frac{\frac{u_{i+1} - u_i}{\Delta x} - \frac{u_i - u_{i-1}}{\Delta x}}{\Delta x} = \frac{u_{i+1} - 2u_i + u_{i-1}}{(\Delta x)^2} \end{aligned}$$

# Miješana derivacija, 2D

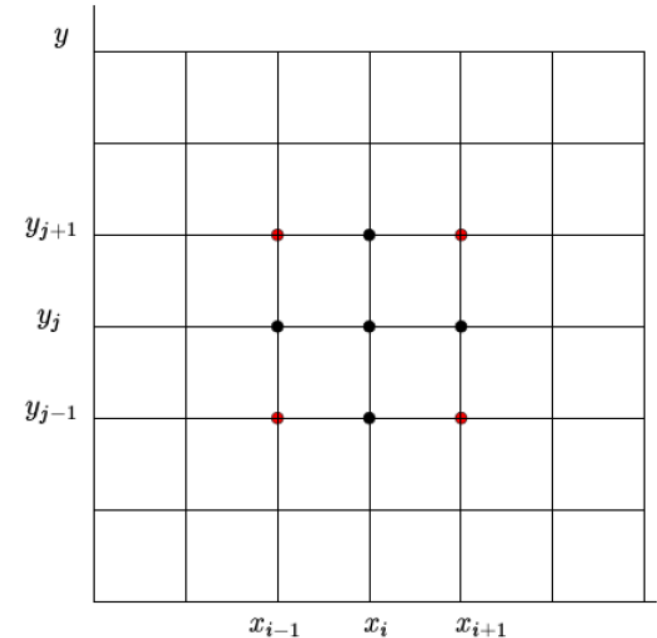
$$2D: \quad \frac{\partial^2 u}{\partial x \partial y} = \frac{\partial}{\partial x} \left( \frac{\partial u}{\partial y} \right) = \frac{\partial}{\partial y} \left( \frac{\partial u}{\partial x} \right)$$

$$\left( \frac{\partial^2 u}{\partial x \partial y} \right)_{i,j} = \frac{\left( \frac{\partial u}{\partial y} \right)_{i+1,j} - \left( \frac{\partial u}{\partial y} \right)_{i-1,j}}{2\Delta x} + \mathcal{O}(\Delta x)^2$$

$$\left( \frac{\partial u}{\partial y} \right)_{i+1,j} = \frac{u_{i+1,j+1} - u_{i+1,j-1}}{2\Delta y} + \mathcal{O}(\Delta y)^2$$

$$\left( \frac{\partial u}{\partial y} \right)_{i-1,j} = \frac{u_{i-1,j+1} - u_{i-1,j-1}}{2\Delta y} + \mathcal{O}(\Delta y)^2$$

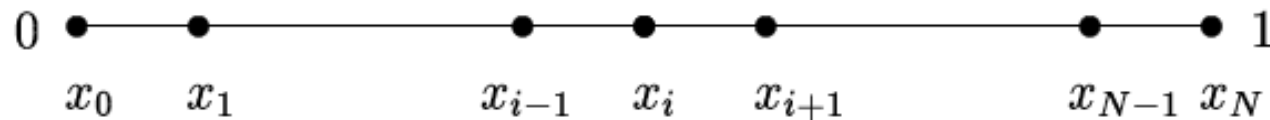
$$\left( \frac{\partial^2 u}{\partial x \partial y} \right)_{i,j} = \frac{u_{i+1,j+1} - u_{i+1,j-1} - u_{i-1,j+1} + u_{i-1,j-1}}{4\Delta x \Delta y} + \mathcal{O}[(\Delta x)^2, (\Delta y)^2]$$



# Primjer: 1D Poisson

Problem s rubnim uvjetima (BVP, boundary value problem, BC boundary condition)

$$-\frac{\partial^2 u}{\partial x^2} = f \quad \text{in } \Omega = (0, 1), \quad u(0) = u(1) = 0$$



$$u_i \approx u(x_i), \quad f_i = f(x_i) \quad x_i = i\Delta x, \quad \Delta x = \frac{1}{N}, \quad i = 0, 1, \dots, N$$

$$\begin{cases} -\frac{u_{i-1} - 2u_i + u_{i+1}}{(\Delta x)^2} = f_i, & \forall i = 1, \dots, N-1 \\ u_0 = u_N = 0 \end{cases} \quad \text{Dirichletov rubni uvjet}$$

Neumannov rubni uvjet: postavlja se uvjet na gradijent funkcije

Robinov uvjet: kombinacija uvjeta Dirichleta i Neumanna



# 1D Poisson

$$\left\{ \begin{array}{l} i = 1 \\ i = 2 \\ i = 3 \\ \dots \\ i = N - 1 \end{array} \right. \begin{array}{l} -\frac{u_0 - 2u_1 + u_2}{(\Delta x)^2} \\ -\frac{u_1 - 2u_2 + u_3}{(\Delta x)^2} \\ -\frac{u_2 - 2u_3 + u_4}{(\Delta x)^2} \\ \dots \\ \frac{u_{N-2} - 2u_{N-1} + u_N}{(\Delta x)^2} \end{array} = \begin{array}{l} f_1 \\ f_2 \\ f_3 \\ \dots \\ f_{N-1} \end{array}$$

$$Au = F$$

$$A \in \mathbb{R}^{N-1 \times N-1} \quad u, F \in \mathbb{R}^{N-1}$$

$$A = \frac{1}{(\Delta x)^2} \begin{bmatrix} 2 & -1 & & & \\ -1 & 2 & -1 & & \\ & -1 & 2 & -1 & \\ & & \dots & \dots & \\ & & & -1 & 2 \end{bmatrix}, \quad u = \begin{bmatrix} u_1 \\ u_2 \\ u_3 \\ \vdots \\ u_{N-1} \end{bmatrix}, \quad F = \begin{bmatrix} f_1 \\ f_2 \\ f_3 \\ \vdots \\ f_{N-1} \end{bmatrix}$$



# drugi tipovi rubnih uvjeta

Nehomogeni Dirichlet BC:  $u(0) = g_0$

prva jednažba  $u_0 = g_0 \Rightarrow \frac{2u_1 - u_2}{(\Delta x)^2} = f_1 + \frac{g_0}{(\Delta x)^2}$

Nehomogeni Neumann BC:  $\frac{\partial u}{\partial x}(1) = g_1$

$$\frac{u_{N+1} - u_{N-1}}{2\Delta x} = g_1 \Rightarrow u_{N+1} = u_{N-1} + 2\Delta x g_1$$

$$-\frac{u_{N-1} - 2u_N + u_{N+1}}{(\Delta x)^2} = f_N \longrightarrow \frac{-u_{N-1} + u_N}{(\Delta x)^2} = \frac{1}{2}f_N + \frac{g_1}{\Delta x}$$

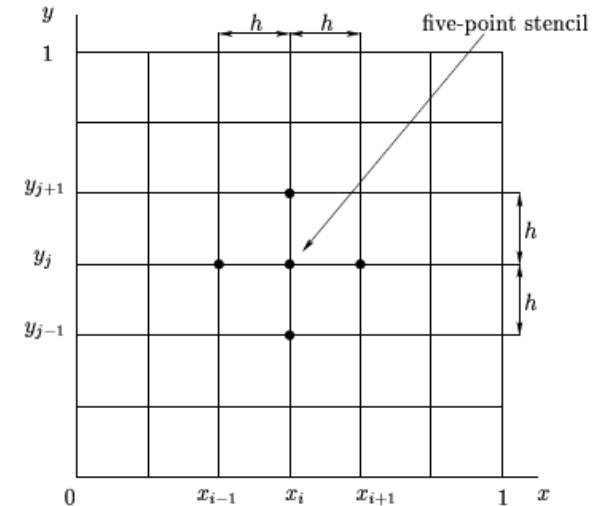
Nehomogeni Robin BC:  $\frac{\partial u}{\partial x}(1) + \alpha u(1) = g_2$

$$\frac{u_{N+1} - u_{N-1}}{2\Delta x} + \alpha u_N = g_2 \Rightarrow u_{N+1} = u_{N-1} - 2\Delta x \alpha u_N + 2\Delta x g_2$$

$$-\frac{u_{N-1} - 2u_N + u_{N+1}}{(\Delta x)^2} = f_N \longrightarrow \frac{-u_{N-1} + (1 + \alpha\Delta x)u_N}{(\Delta x)^2} = \frac{1}{2}f_N + \frac{g_2}{\Delta x}$$

# 2D Poisson

$$\begin{cases} -\frac{\partial^2 u}{\partial x^2} - \frac{\partial^2 u}{\partial y^2} = f & \text{in } \Omega = (0, 1) \times (0, 1) \\ u = 0 & \text{on } \Gamma = \partial\Omega \end{cases}$$



Uniformna mreža, konstantan korak, N broj koraka

$$\Delta x = \Delta y = h, \quad N = \frac{1}{h}$$

$$u_{i,j} \approx u(x_i, y_j), \quad f_{i,j} = f(x_i, y_j), \quad (x_i, y_j) = (ih, jh), \quad i, j = 0, 1, \dots, N$$

$$\begin{cases} -\frac{u_{i-1,j} + u_{i,j-1} - 4u_{i,j} + u_{i+1,j} + u_{i,j+1}}{h^2} = f_{i,j}, & \forall i, j = 1, \dots, N-1 \\ u_{i,0} = u_{i,N} = u_{0,j} = u_{N,j} = 0 & \forall i, j = 0, 1, \dots, N \end{cases}$$



# 1D jednađba vođenja topline

$$\frac{\partial u}{\partial t} = \beta \frac{\partial^2 u}{\partial x^2}, \quad a \leq x \leq b$$

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

$$u(a, t) = g_0(t), \quad u(b, t) = g_1(t)$$

$$u_i^{k+1} = u_i^k + r(u_{i-1}^k - 2u_i^k + u_{i+1}^k)$$

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

$$r = \beta \Delta t / (\Delta x)^2.$$

Rubni uvjeti

$$u_0^k = g_0(t_k) = g_0^k, \quad u_{N+1}^k = g_1(t_k) = g_1^k$$

$$i = 1, \quad u_1^{1+k} = u_1^k + r(u_0^k - 2u_1^k + u_2^k)$$

$$i, \quad u_i^{1+k} = u_i^k + r(u_{i-1}^k - 2u_i^k + u_{i+1}^k)$$

$$i = N, \quad u_N^{1+k} = u_N^k + r(u_{N-1}^k - 2u_N^k + u_{N+1}^k)$$

Sustav jednađbi



# Implicitna metoda

Za derivaciju po vremenu koristimo Eulerov metod unazad, a prostor centralnom konačnom razlikom. Metoda je implicitna u vremenu, rješenje u  $k+1$  vremenu je međusobno povezano. Algoritam je uvijek stabilan.

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

$$i = 1, \quad u_1^{k+1} - r (u_0^{k+1} - 2u_1^{k+1} + u_2^{k+1}) = u_1^k$$

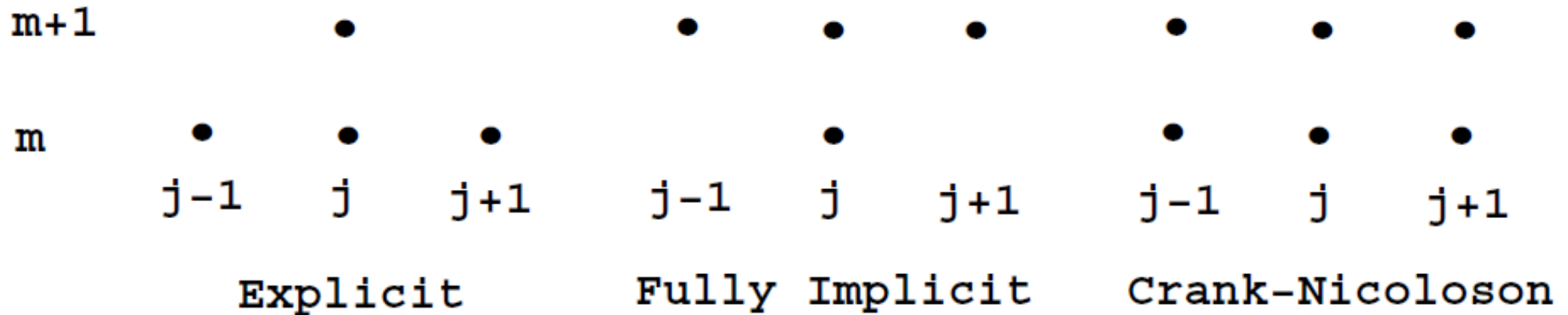
$$i, \quad u_i^{k+1} - r (u_{i-1}^{k+1} - 2u_i^{k+1} + u_{i+1}^{k+1}) = u_i^k$$

$$i = N, \quad u_N^{k+1} - r (u_{N-1}^{k+1} - 2u_N^{k+1} + u_{N+1}^{k+1}) = u_N^k$$



$$\begin{pmatrix} (1+2r) & -r & & & & \\ -r & (1+2r) & -r & & & \\ & -r & (1+2r) & -r & & \\ & & & \ddots & \ddots & \\ & & & -r & (1+2r) & -r \\ & & & & -r & (1+2r) \end{pmatrix} \begin{pmatrix} u_1^{k+1} \\ u_2^{k+1} \\ \vdots \\ u_i^{k+1} \\ \vdots \\ u_N^{k+1} \end{pmatrix} = \\
 = \begin{pmatrix} u_1^k \\ u_2^k \\ \vdots \\ u_i^k \\ \vdots \\ u_N^k \end{pmatrix} + r \begin{pmatrix} g_0^{k+1} \\ 0 \\ 0 \\ \vdots \\ 0 \\ g_1^{k+1} \end{pmatrix}$$

# Crank-Nicolson

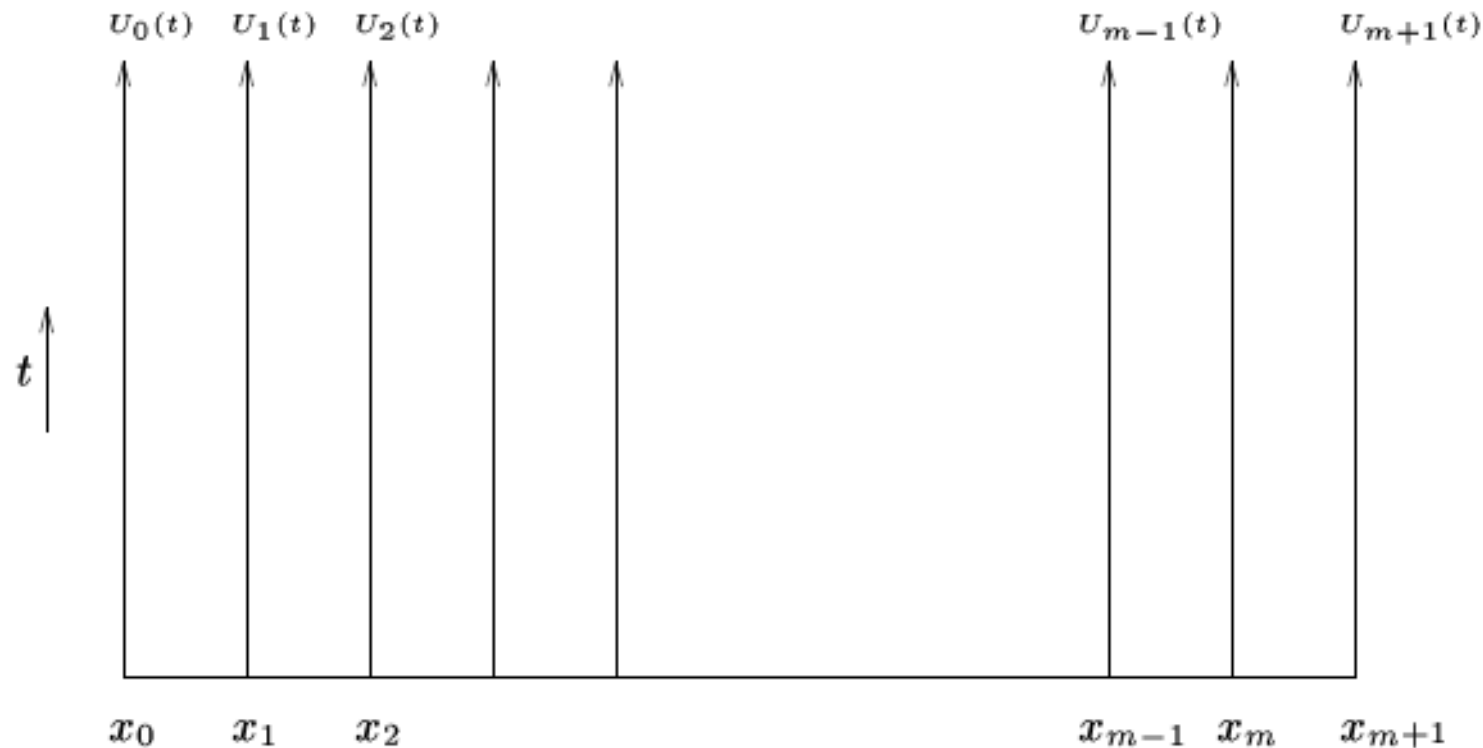


Crank-Nicolson metoda predstavlja srednju vrijednost implicitne i eksplicitne metode u prostoru, vremenski dio je implicitan.

$$u_j^{m+1} - u_j^m = \frac{\Delta t}{2h^2} (u_{j+1}^{m+1} - 2u_j^{m+1} + u_{j-1}^{m+1} + u_{j+1}^m - 2u_j^m + u_{j-1}^m)$$



# MOL



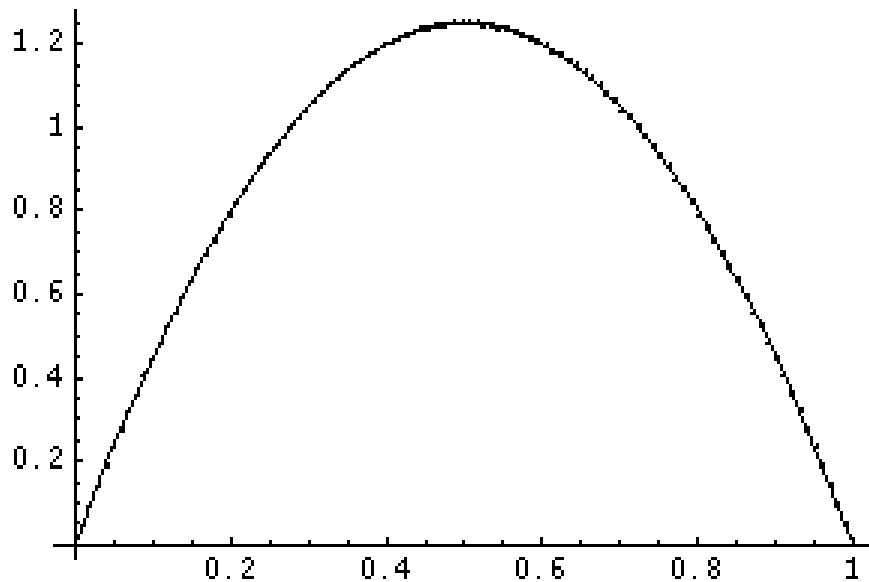
Riješenje napreduje duž linije vremena. Riješenje sustava dobivamo korištenjem metoda za ODJ.

# Primjer 1D poisson

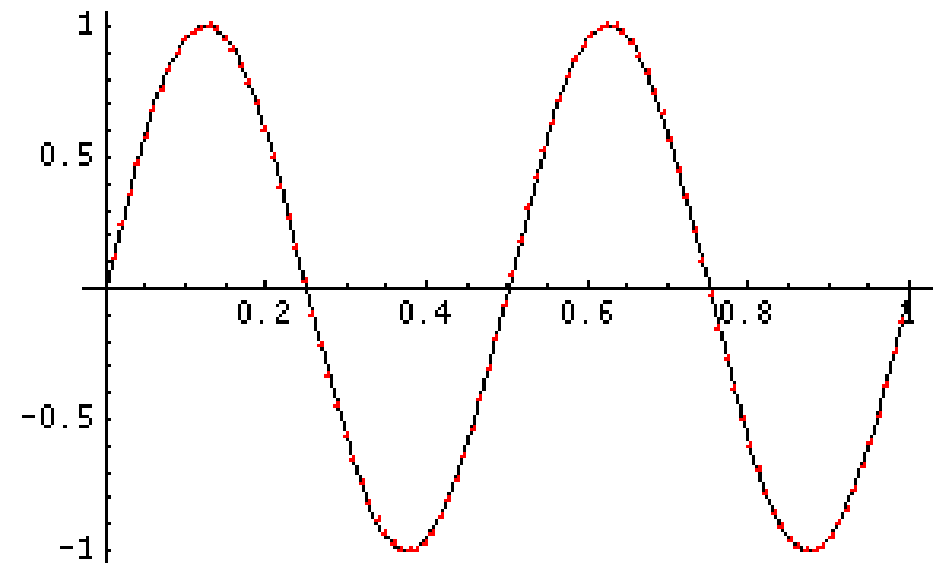
$$-\frac{\partial^2 u}{\partial x^2} = f \quad \text{in } \Omega = (0, 1), \quad u(0) = u(1) = 0$$

$$f(x) = 10$$

```
nd1 = NDSolve[{u''[x] == -10, u[0] == 0, u[1] == 0}, u[x], {x, 0, 1}]  
tn1 = Plot[u[x] /. nd1, {x, 0, 1}, PlotRange -> All]
```



$$f(x) = 16\pi^2 \sin 4\pi x$$



# poisson

```
#include <stdlib.h>
#include <stdio.h>
#include <math.h>
#include "nrutil.h"
float InitTemp(float );
float KonstTemp(float );

int main()
{
    unsigned long N,M,i,j,l;
    float h,k,r,T,L;
    float TO,TN,Tini;
    /* matrica ya temperaturu */
    float **U,*f,*x,d;
    FILE *fp;
    char fname[20];
    int *indx;
    float (*InitFunc)(float);
    /* parametri */

    L=1.0; /* duljina domene u prostoru */

    /* InitFunc=InitTemp; */
    InitFunc=KonstTemp;
    M=3000;
    N=100;
    h=L/((float) N+1.0);
    k=T/((float) M);
    r=k/(h*h);

    U=matrix(1,N,1,N);
    f=vector(1,N);
    indx=ivector(1,N);
    x=vector(1,N);
    for(i=1;i<N+1;i++)
        for(j=1;j<N+1;j++)
            U[i][j]=0.0;

    U[1][1]=2.0;
    U[1][2]=-1;

    for (i=2;i<=N-1;i++)
    {
        f[i]=h*h*InitFunc(i*h);
        for (j=i-1 ; j<i+2; j++)
        {
            if ( i==j )
                U[i][j]= 2;
            else
                U[i][j]=-1;
        }
    }
    U[N][N]=2.0; U[N][N-1]=-1;
    ludcmp(U,N,indx,&d); lubksb(U,N,indx,f);

    PRINT TO FILE .....
    .....
    return 1;
}
```

```
float InitTemp(float x)
{
    float rez,pi=3.14;
    rez=16.0*pi*pi*sin(4*pi*x);
    return rez;
}
```

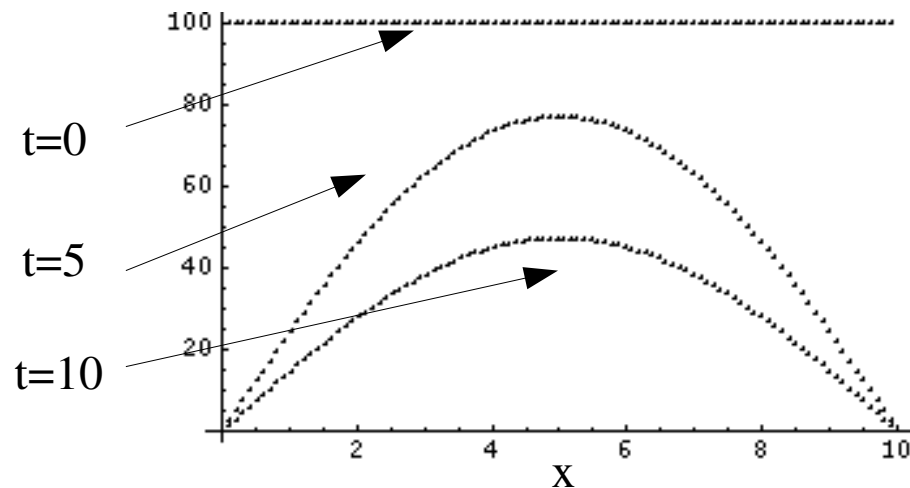
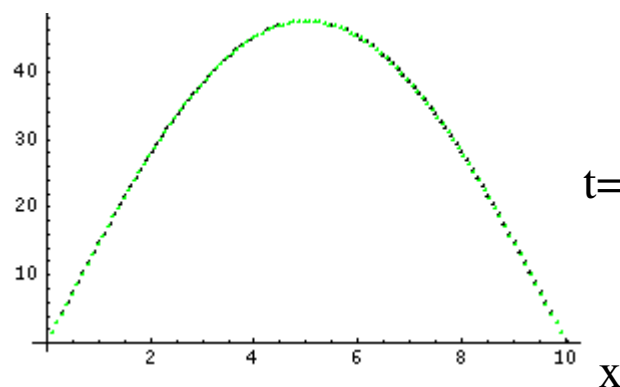
```
float KonstTemp(float x)
{
    return 10.0;
}
```

# vođenje topline

$$\frac{\partial u}{\partial t} = \beta \frac{\partial^2 u}{\partial x^2}, \quad a \leq x \leq b$$

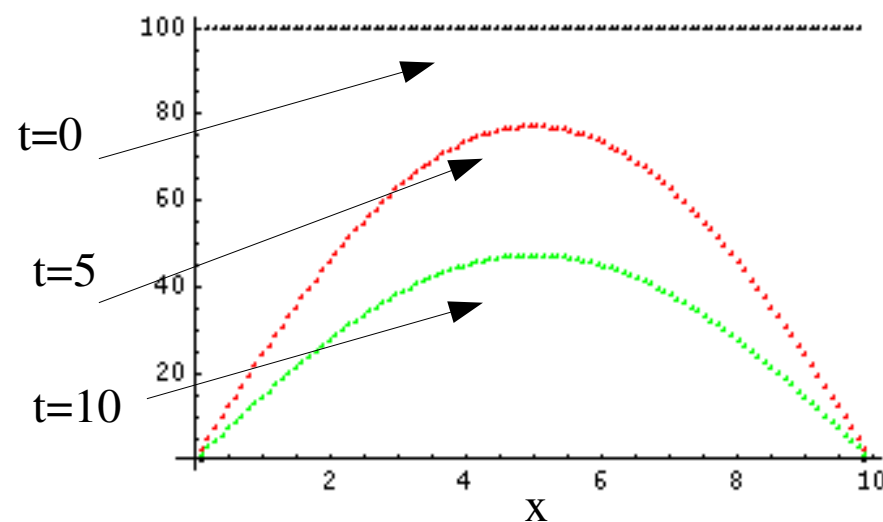
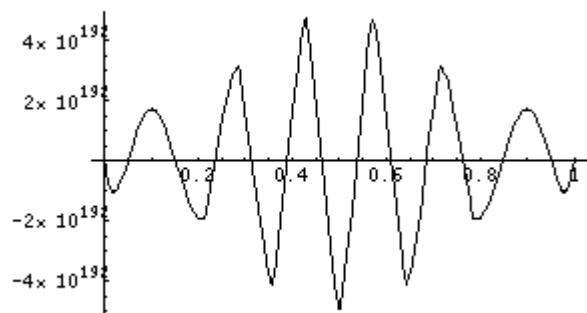
eksplicitna  
metoda

Usporedba  
eksplicitne  
i MOL metode



`NDSolve[{D[u[x, t], t] + D[u[x, t], {x, 2}] == 0, u[0, t] == 0, u[1, t] == 0, u[x, 0] == 100}, u[x, t], {x, 0, 1}, {t, 0, 1}]`

MOL  
metoda



# Temperatura eksplicitni FD

```
#include <stdlib.h>
#include <stdio.h>
#include "nrutil.h"

void main()
{
    unsigned long N,M,i,j,l;
    float h,k,r,T,L;
    float T0,TN,Tini;
    /* matrica ya temperaturu */
    float** U;
    FILE *fp;
    char fname[20];
    /* parametri */
    T=10; /* 10 sec konacno vrijeme */
    L=10.0; /* duljina domene u prostoru */
    /* pocetne i rubne temperature */
    T0=TN=0; Tini=100;
    M=3000;
    N=100;
    h=L/((float) N-1.0);
    k=T/((float) M);
    r=k/(h*h);

    if ( r > .5)
    {
        printf("nestabilna shema, podesi N i M, r=%f\n",r);
        exit(1);
    }
    U=matrix(0,M,0,N);
    for (i=0;i<N;i++) {U[0][i]=Tini;}
    for(j=0;j<M;j++) { U[j][0]= T0; U[j][N-1]=TN;}

    for (j=0 ; j<M-1; j++)
    {
        for (i=1 ; i<N-1 ;i++)
        {
            U[j+1][i] = r * U[j][i-1] + (1 - 2 * r)* U[j][i] + r * U[j][i+1];
        }
    }
    /* otvori file i spremi odabrane podatke */
    for (l=0;l<3;l++)
    {
        sprintf(fname,"Temp%i.dat",l);
        if (!(fp=fopen(fname,"w")))
        { printf("Error opening file\n"); exit(1);}
        if (l==0)
        j= 0;
        else if (l== 1)
        j=M/2;
        else if (l==2)
        j= M-1;
        for (i=0 ; i<N ;i++)
        {
            fprintf(fp,"%10.5f %10.5f\n",i*h,U[j][i]);
        }
        fclose(fp);
    }
    exit(1);
}
```



# Temperatura MOL

```
#include <stdio.h>
#include <stdlib.h>
#define NRANSI
#include "nr.h"
#include "nrutil.h"

#define NVAR 100
#define NSTEP 3000

float r;
extern float **y,*xx;
/* referencing declaration */

void main()
{
    unsigned long N,M,i,j,l;
    float h,T,L;
    float T0,TN,Tini;
    /* matrica ya temperaturu */
    float *v;
    FILE *fp;
    char fname[20];

    T=10; /* 10 sec konacno vrijeme */
    L=10.0; /* duljina domene u prostoru */
    /* pocetne i rubne temperature */
    T0=TN=0; Tini=100;
    M=NSTEP;
    N=NVAR;
    h=L/((float) N+1.0);
    r=1.0/(h*h);

    v=vector(1,NVAR);
    xx=vector(1,NSTEP+1);
    y=matrix(1,NVAR,1,NSTEP+1);
    for (i=1;i<=N;i++)
        v[i]=Tini;
    v[1]=v[N]=0;
    rkdump(v,NVAR,0.0,T,NSTEP,derivs);

    /* otvori file i spremi odabrane podatke */
    for (l=0;l<3;l++)
    {
        sprintf(fname,"TempMOL%i.dat",l);
        if (!(fp=fopen(fname,"w")))
        { printf("Error opening file\n"); exit(1);}
        if (l==0)
            j= 1;
            else if (l== 1)
                j=M/2;
            else if (l==2)
                j= M-1;
        printf("Data for t=%g\n",xx[j]);
        for (i=1 ; i<=N ;i++)
        {
            fprintf(fp,"%10.5f %10.5f\n",i*h,y[i][j]);
        }

        fclose(fp);
    }

    exit(1);}

void derivs(float x, float y[], float dy[]) {
    unsigned long i,N;
    N=NVAR;
    dy[1] =r*(-2*y[1]+y[2]);
    for ( i=2; i<=N-1;i++)
    {
        dy[i] = r*(y[i-1]-2*y[i]+y[i+1]);
    }
    dy[N] =r*(y[N-1]-2*y[N]);}
```

# Kompajliranje

```
gcc -o poisson1 poisson_exfd.c ludcmp.c lubksb.c -I nrutils/ nrutils/nrutil.c -lm
gcc -o heatMOL heat_MOL.c -I nrutils/ nrutils/nrutil.c rk4.c rkdumb.c
gcc -o heat_ex heat_explicitfd.c -I nrutils/ nrutils/nrutil.c
```

```
f77 -o hmol heatMOL.for rk4.for
```

Usporedbe rješenja i grafički prikaz nalaze se u TempDist.nb notebooku.  
Programi se nalaze u v9 direktoriju.

# Zadatak za praktikum

Riješi 1D poissonov problem pomoću RK metode za  $f(x)=10$  i  $f(x) = 16\pi^2 \sin 4\pi x$ .

Problem je što ne možemo specificirati rubni uvjet za  $x=1$  kod RK metode, već moramo znati derivaciju u  $x=0$ . Problemi s rubnim uvjetima rješavaju se pomoću relaksacijske ili shooting metode (vidi Numerical recipes poglavlje 17).

Budući da je problem jednostavan iz analitičkog rješenja možemo odrediti vrijednost derivacije na lijevom kraju, tj.  $u'(0)=5$  i  $u'(0)=4\pi$ .

Usporedi rješenje s onim dobivenim pomoću metode konačnih razlika.

# *Literatura*

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