



**UNIVERZITET U NOVOM SADU**  
**FAKULTET TEHNIČKIH NAUKA**  
**KATEDRA ZA AUTOMATIKU I UPRAVLJANJE SISTEMIMA**

# Matlab - ODE primeri

Modeliranje i simulacija sistema

Upravljanje, modelovanje i simulacija sistema

# Leonhard Euler



Born	15 April 1707 <a href="#">Basel, Switzerland</a>
Died	18 September 1783 (aged 76) [OS: 7 September 1783] <a href="#">Saint Petersburg, Russian Empire</a>
Residence	<a href="#">Kingdom of Prussia, Russian Empire</a> <a href="#">Switzerland</a>
Nationality	<a href="#">Swiss</a>
Fields	<a href="#">Mathematics</a> and <a href="#">physics</a>
Institutions	<a href="#">Imperial Russian Academy of Sciences</a> <a href="#">Berlin Academy</a>
<a href="#">Alma mater</a>	<a href="#">University of Basel</a>
<a href="#">Doctoral advisor</a>	<a href="#">Johann Bernoulli</a>
Doctoral students	<a href="#">Nicolas Fuss</a> <a href="#">Johann Hennert</a> <a href="#">Joseph Louis Lagrange</a> <a href="#">Stepan Rumovsky</a>

# Ojlerove (*Euler*) metode

```
t = (0:5)';  
y0 = 1;  
ya = anaResenje(t,y0);  
  
y1 = euler2a(@difJedn,5,y0,1.0);  
y05= euler2a(@difJedn,5,y0,0.5);  
[t3,y3]=rkutta3(@difJedn,0,5,y0,1.0);
```

```
% Test 1  
[t ya y1 y1-ya y05 y05-ya y3 y3-ya]
```

```
% Test 2  
tol=0.001; hmin=0.01;  
[te2, ye2]=euler2b(@difJedn,5,y0,hmin,tol,tol);  
plot(t,ya,'o',te2,ye2,'.-',t,y01,'.')
```

```
function [t1,y1c,e] = euler2(f,t0,y0,h)  
dy0 = f(t0,y0); % izvod u tacki (t0,y0)  
y1p = y0 + dy0*h;  
t1 = t0 + h;  
dy1 = f(t1,y1p); % izvod u tacki (t1,y1p)  
e = (dy1-dy0)*h/2.0; % estimacija greske  
y1c = y1p + e; % korekcija
```

```
function Y=euler2a(f,tk,y0,h)  
t0 = 0;  
Y = y0;  
nsteps = 1/h;  
for s=1:tk  
    for i=1:nsteps  
        [t1,y1,e]=euler2(f,t0,y0,h);  
        y0=y1;  
        t0=t1;  
    end  
    Y = [Y; y1];  
end
```

```
function dy=difJedn(t,y)  
% opis DJ  
alpha=1.0; lambda=1.0;  
dy(1)=lambda*exp(-alpha*t)*y(1);
```

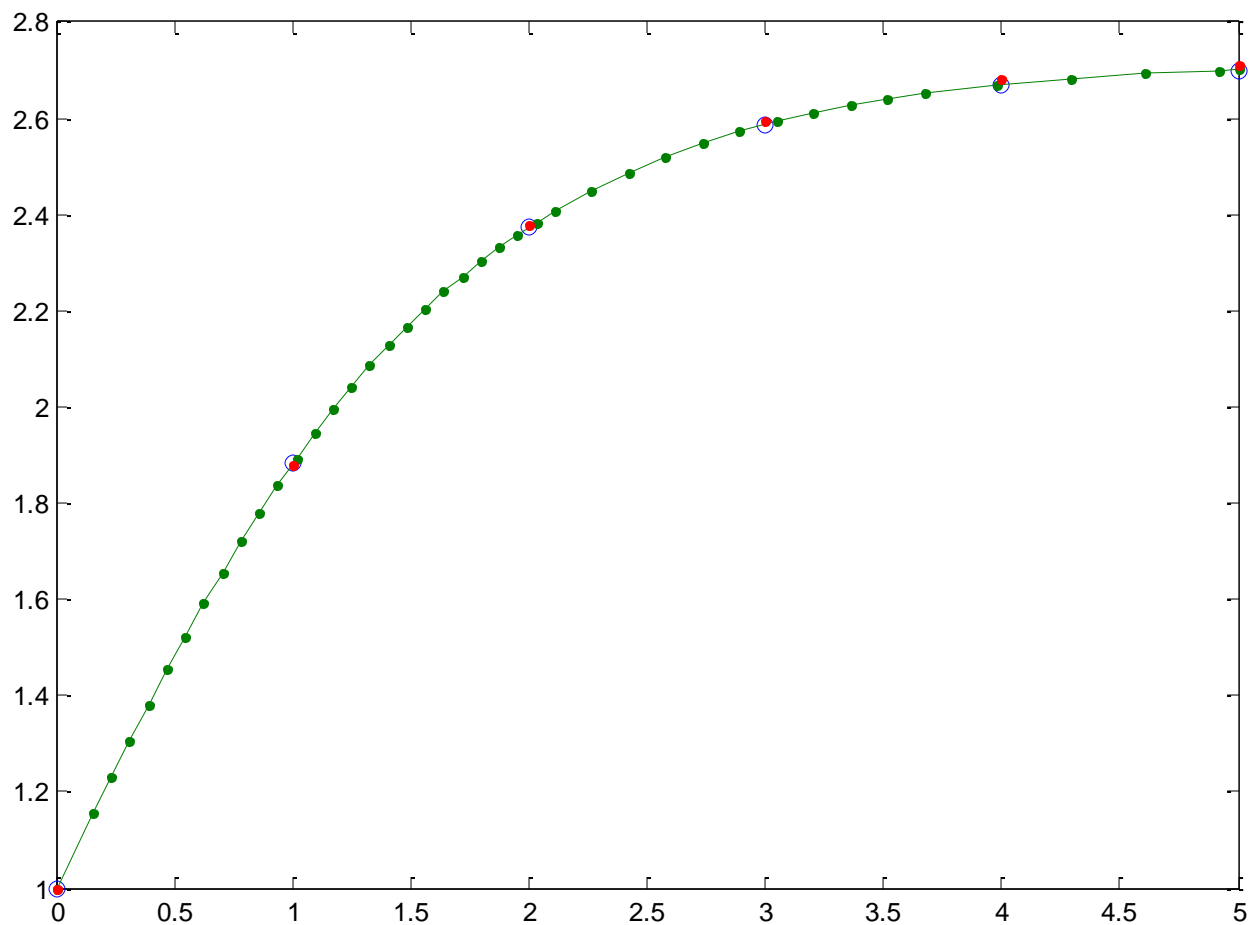
```
function y=anaResenje(t,y0)  
% analitičko rešenje  
alpha=1.0; lambda=1.0;  
y = y0*exp(lambda/alpha*(1-exp(-alpha*t)));
```

# Ojlerove (*Euler*) metode – Test 1

t	ya	ye1	ye1-ya	ye05	ye05-ya	yrk3	yrk3-ya
0.0	1.0000	1.0000	0	1.0000	0	1.0000	0
1.0	1.8816	1.8679	-0.0137	1.8786	-0.0030	1.8732	-0.0083
2.0	2.3742	2.3843	0.0101	2.3786	0.0044	2.3642	-0.0100
3.0	2.5863	2.6131	0.0268	2.5952	0.0090	2.5761	-0.0102
4.0	2.6689	2.7033	0.0343	2.6799	0.0110	2.6588	-0.0101
5.0	2.7000	2.7373	0.0373	2.7118	0.0117	2.6899	-0.0101

Legenda:  
ya - analitičko rešenje  
ye1 - Euler 2. reda sa fiksnim korakom h=1  
ye05 - Euler 2. reda sa fiksnim korakom h=0.5  
ye3 - Euler 3. reda sa fiksnim korakom h=1

## Ojlerove (*Euler*) metode – Test 2



### Legenda:

Zeleno – Euler 2. reda sa promenljivim korakom

Crveno – Euler 2. reda sa  $h=0.5$

Kružići – tačno rešenje

# Carl Runge



Born	30 August 1856 Bremen, German Confederation
Died	3 January 1927 (aged 70) Göttingen, Weimar Republic
Residence	Germany
Citizenship	German
Fields	Mathematics Physics
Institutions	University of Hannover (1886–1904) Georg-August University of Göttingen (1904–1925)
Alma mater	Berlin University
Doctoral advisor	Karl Weierstrass Ernst Kummer
Doctoral students	Max Born
Known for	Runge–Kutta method Runge's phenomenon Laplace–Runge–Lenz vector

# Martin Wilhelm Kutta



Born	November 3, 1867 <a href="#">Pitschen, Upper Silesia</a>
Died	December 25, 1944 (aged 77) <a href="#">Fürstenfeldbruck</a>
Residence	<a href="#">Germany</a>
Nationality	<a href="#">German</a>
Fields	<a href="#">Mathematician</a>
Institutions	<a href="#">University of Stuttgart</a> <a href="#">RWTH Aachen</a>
<a href="#">Alma mater</a>	<a href="#">University of Breslau</a> <a href="#">University of Munich</a>
<a href="#">Doctoral advisor</a>	<a href="#">C. L. Ferdinand Lindemann</a> <a href="#">Gustav A. Bauer</a>
Other academic advisors	<a href="#">Walther Franz Anton von Dyck</a>
Known for	<a href="#">Runge-Kutta method</a> <a href="#">Zhukovsky-Kutta aerofoil</a> <a href="#">Kutta–Joukowski theorem</a> <a href="#">Kutta condition</a>

# ode23/ode45 – uticaj tolerancije računanja

```
global lambda alpha ncall;      % Globalne promenljive
lambda=1.0; alpha=1.0;         % Model parameteri

for ncase=1:4
    reltol=1.0e-02^(ncase+1); % tolerancije racunanje
    abstol=reltol;

    ncall=0;                    % reset brojaca

    t0=0.0; tf=10.0; tout=[t0:1.0:tf]';

    y0=1.0;                    % Inicijana vrednost

    options=odeset('RelTol',reltol,'AbsTol',abstol);
    [t,y]=ode23('ode1p7',tout,y0,options);

    % Prikaz rezultata
    fprintf('reltol = abstol = %6.2e\n\n',reltol);
    fprintf('  t   ye   y   erry\n');

    ye=y0*exp((lambda/alpha)*(1-exp(-alpha*t)));
    erry=y0-y;
    fprintf('%5.1f%9.4f%9.4f%15.10f\n',[t,ye,y,err]);

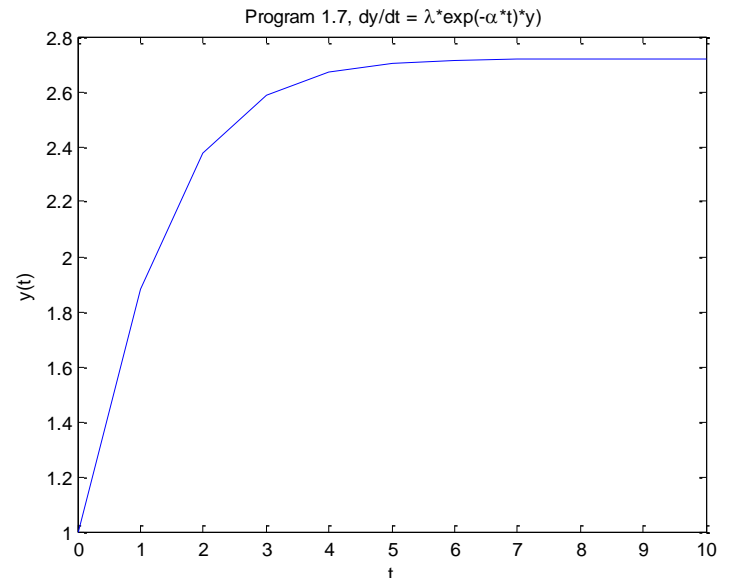
    fprintf('\n ncall = %5d\n',ncall);
end
```

```
function yt=ode1p7(t,y)

% globalne promenljive
global lambda alpha ncall;

% ODE
yt(1)=lambda*exp(-alpha*t)*y(1);

% inkrementiraj brojca
ncall=ncall+1;
```





# ode23

reltol = abstol = 1.00e-004

t	ye	y	erry
0.0	1.0000	1.0000	0.0000000000
1.0	1.8816	1.8816	-0.0000020034
2.0	2.3742	2.3743	-0.0000638807
3.0	2.5863	2.5864	-0.0000933201
4.0	2.6689	2.6691	-0.0001103656
5.0	2.7000	2.7002	-0.0001284242
6.0	2.7116	2.7117	-0.0001434300
7.0	2.7158	2.7160	-0.0001552112
8.0	2.7174	2.7175	-0.0001581733
9.0	2.7179	2.7181	-0.0001592608
10.0	2.7182	2.7183	-0.0001592537

ncall = 73

reltol = abstol = 1.00e-006

t	ye	y	erry
0.0	1.0000	1.0000	0.0000000000
1.0	1.8816	1.8816	-0.0000003221
2.0	2.3742	2.3742	-0.0000012721
3.0	2.5863	2.5863	-0.0000016231
4.0	2.6689	2.6689	-0.0000018847
5.0	2.7000	2.7000	-0.0000021190
6.0	2.7116	2.7116	-0.0000023452
7.0	2.7158	2.7158	-0.0000025176
8.0	2.7174	2.7174	-0.0000026866
9.0	2.7179	2.7179	-0.0000028883
10.0	2.7182	2.7182	-0.0000029806

ncall = 268

reltol = abstol = 1.00e-008

t	ye	y	erry
0.0	1.0000	1.0000	0.0000000000
1.0	1.8816	1.8816	-0.0000000072
2.0	2.3742	2.3742	-0.0000000188
3.0	2.5863	2.5863	-0.0000000229
4.0	2.6689	2.6689	-0.0000000260
5.0	2.7000	2.7000	-0.0000000285
6.0	2.7116	2.7116	-0.0000000309
7.0	2.7158	2.7158	-0.0000000331
8.0	2.7174	2.7174	-0.0000000354
9.0	2.7179	2.7179	-0.0000000374
10.0	2.7182	2.7182	-0.0000000394

ncall = 1180

reltol = abstol = 1.00e-010

t	ye	y	erry
0.0	1.0000	1.0000	0.0000000000
1.0	1.8816	1.8816	-0.0000000001
2.0	2.3742	2.3742	-0.0000000003
3.0	2.5863	2.5863	-0.0000000003
4.0	2.6689	2.6689	-0.0000000003
5.0	2.7000	2.7000	-0.0000000004
6.0	2.7116	2.7116	-0.0000000004
7.0	2.7158	2.7158	-0.0000000004
8.0	2.7174	2.7174	-0.0000000004
9.0	2.7179	2.7179	-0.0000000005
10.0	2.7182	2.7182	-0.0000000005

ncall = 5392

# ode45

reltol = abstol = 1.00e-004

t	ye	y	erry
0.0	1.0000	1.0000	0.0000000000
1.0	1.8816	1.8815	0.0000785756
2.0	2.3742	2.3742	0.0000230677
3.0	2.5863	2.5862	0.0000132883
4.0	2.6689	2.6689	0.0000149230
5.0	2.7000	2.7000	0.0000165095
6.0	2.7116	2.7115	0.0000172423
7.0	2.7158	2.7158	0.0000175329
8.0	2.7174	2.7174	0.0000176427
9.0	2.7179	2.7179	0.0000176835
10.0	2.7182	2.7181	0.0000177068

ncall = 73

reltol = abstol = 1.00e-006

t	ye	y	erry
0.0	1.0000	1.0000	0.0000000000
1.0	1.8816	1.8816	0.0000010053
2.0	2.3742	2.3742	0.0000010986
3.0	2.5863	2.5863	0.0000011560
4.0	2.6689	2.6689	0.0000010643
5.0	2.7000	2.7000	0.0000010083
6.0	2.7116	2.7116	0.0000009776
7.0	2.7158	2.7158	0.0000009652
8.0	2.7174	2.7174	0.0000009604
9.0	2.7179	2.7179	0.0000009586
10.0	2.7182	2.7182	0.0000009579

ncall = 85

reltol = abstol = 1.00e-008

t	ye	y	erry
0.0	1.0000	1.0000	0.0000000000
1.0	1.8816	1.8816	0.0000000237
2.0	2.3742	2.3742	0.0000000012
3.0	2.5863	2.5863	0.0000000128
4.0	2.6689	2.6689	0.0000000112
5.0	2.7000	2.7000	0.0000000428
6.0	2.7116	2.7116	0.0000000092
7.0	2.7158	2.7158	0.0000000014
8.0	2.7174	2.7174	-0.0000000231
9.0	2.7179	2.7179	-0.0000000081
10.0	2.7182	2.7182	0.0000000077

ncall = 163

reltol = abstol = 1.00e-010

t	ye	y	erry
0.0	1.0000	1.0000	0.0000000000
1.0	1.8816	1.8816	0.0000000001
2.0	2.3742	2.3742	-0.0000000001
3.0	2.5863	2.5863	-0.0000000001
4.0	2.6689	2.6689	0.0000000003
5.0	2.7000	2.7000	0.0000000004
6.0	2.7116	2.7116	-0.0000000004
7.0	2.7158	2.7158	0.0000000003
8.0	2.7174	2.7174	0.0000000002
9.0	2.7179	2.7179	-0.0000000003
10.0	2.7182	2.7182	0.0000000001

ncall = 385

# ode45 – Diferencijalna jednačina 1. reda

```
>> global lambda alpha ncall;
>> lambda=1; alpha=1; ncall=0;
>> tout = [0 10];
>> y0 = 1;
>> [t,y]=ode45('ode1p7',tout,y0);
>> ncall           % broj poziva f-je
ncall =
    67

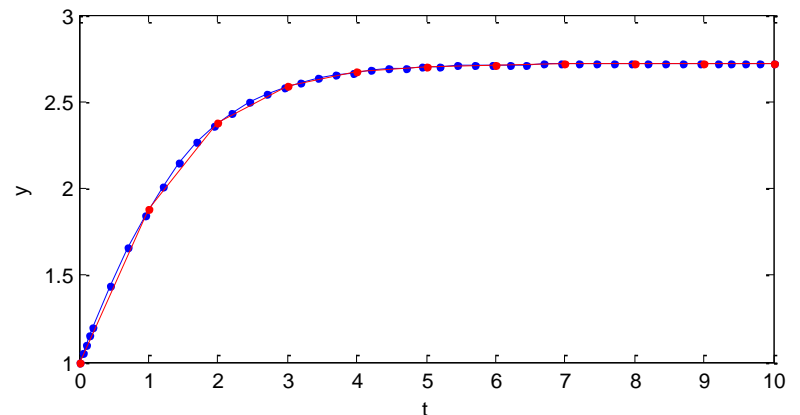
>> [t y]
ans =
    0    1.0000
    0.0502    1.0502
    0.1005    1.1003
    0.1507    1.1502
    0.2010    1.1997
    0.4510    1.4375
    0.7010    1.6551
    0.9510    1.8472
    1.2010    2.0119
    1.4510    2.1503
    1.7010    2.2648
    1.9510    2.3581
    2.2010    2.4334
    2.4510    2.4937
    ...
    9.8002    2.7181
   10.0000    2.7181

>> size(t,1)           % broj vrsta u t
ans =
    45
```

```
>> ncall=0;
>> tout = [0:1:10];
>> [t,y]=ode45('ode1p7',tout,y0);

>> ncall
ncall =
    67

>> [t y]
ans =
    0    1.0000
    1.0000    1.8816
    2.0000    2.3742
    3.0000    2.5862
    4.0000    2.6689
    5.0000    2.7000
    6.0000    2.7115
    7.0000    2.7158
    8.0000    2.7173
    9.0000    2.7179
   10.0000    2.7181
```



# ode45 – Dve diferencijalne jednačine 1. reda = model 2. reda

```
function yt=ode1p8(t,y)
% parametri modela
a=5.5; b=4.5;
% jednacine
yt(1)=-a*y(1)+b*y(2);
yt(2)= b*y(1)-a*y(2);
yt=yt';
```

```
t0=0.0; tf=6.0; tout=[t0 tf];
a=5.5; b=4.5;
y10=0.0; y20=2.0; y0=[y10 y20]';
```

```
[t,y]=ode45('ode1p8',tout,y0);
```

```
lambda1=-(a-b); lambda2=-(a+b);
exp1=exp(lambda1*t); exp2=exp(lambda2*t);
y1e=(y10+y20)/2.0*exp1-(y20-y10)/2.0*exp2;
y2e=(y10+y20)/2.0*exp1+(y20-y10)/2.0*exp2;
```

```
[t1,y1]=ode45('ode1p8',t0:tf,y0);
```

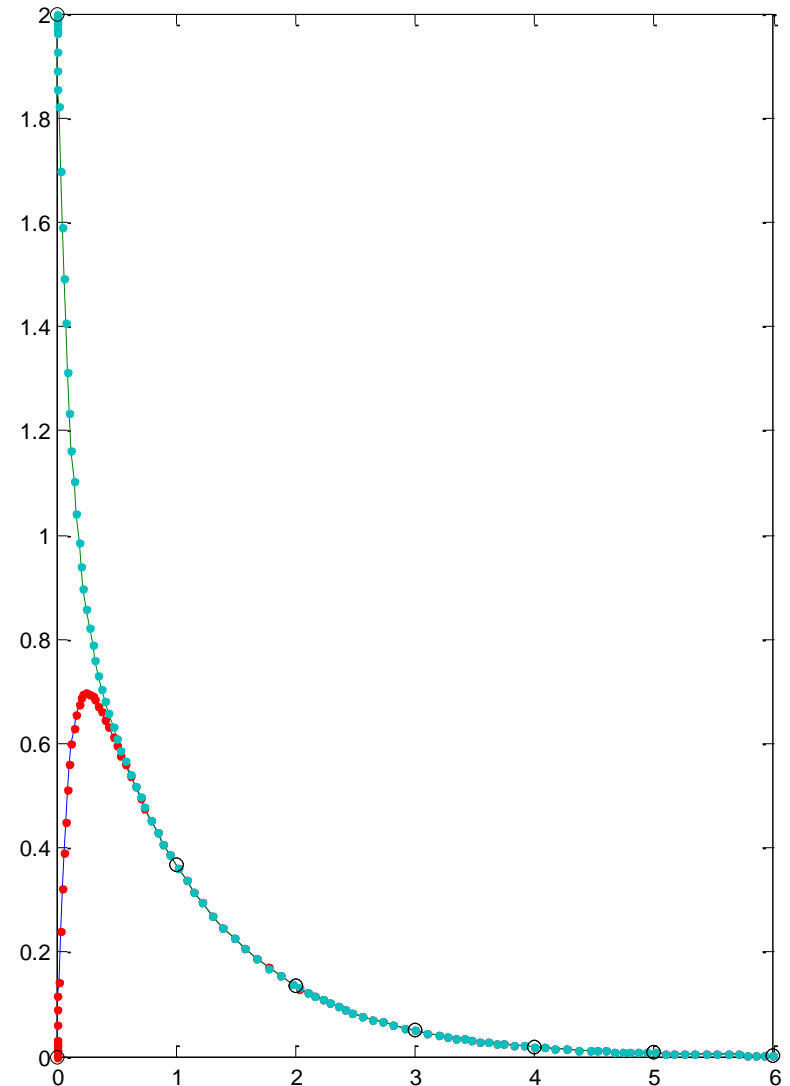
```
plot(t,[y1e y2e],t,y,'.',t1,y1,'ok');
xlabel('t'), ylabel('y1(t),y2(t)')
```

```
>> size(t)
```

```
ans =
    117     1
```

```
>> size(y)
```

```
ans =
    117     2
```



# Lotka–Volterra jednačina

- Model dinamičkog biološkog sistema gde dve vrste imaju odnos: grabljivica-plen

$$\frac{dx}{dt} = x(\alpha - \beta y)$$
$$\frac{dy}{dt} = -y(\gamma - \delta x)$$

Deterministički  
Kontinualan  
Nelinearan  
model 2. reda

$x$  – broj jedinki plena (npr. zečevi)

$y$  – broj jedinki grabljivica (npr. lisice)

izvodi predstavljaju porast broja populacije,  $t$  vreme, a parametri  $\alpha, \beta, \delta, \gamma$  određuju njihovu interakciju.

- Pretpostavke:
  - Plen uvek ima dovoljno hrane
  - Zalihe hrane za grabljivice zavise od populacije plena
  - Stopa promene populacije je proporcionalna njenoj veličini
  - Okruženje se ne menja u korist jedne vrste i nema genetske adaptacije

# Promena populacije Plen-Grabljivica

- Promena populacije plena

- Raste srazmerno broju jedinki zbor reprodukcije
- Oprada srazmerno učestanosti susreta sa grabljivicama

$$\frac{dx}{dt} = \alpha x - \beta xy$$

- Promena populacije grabljivica

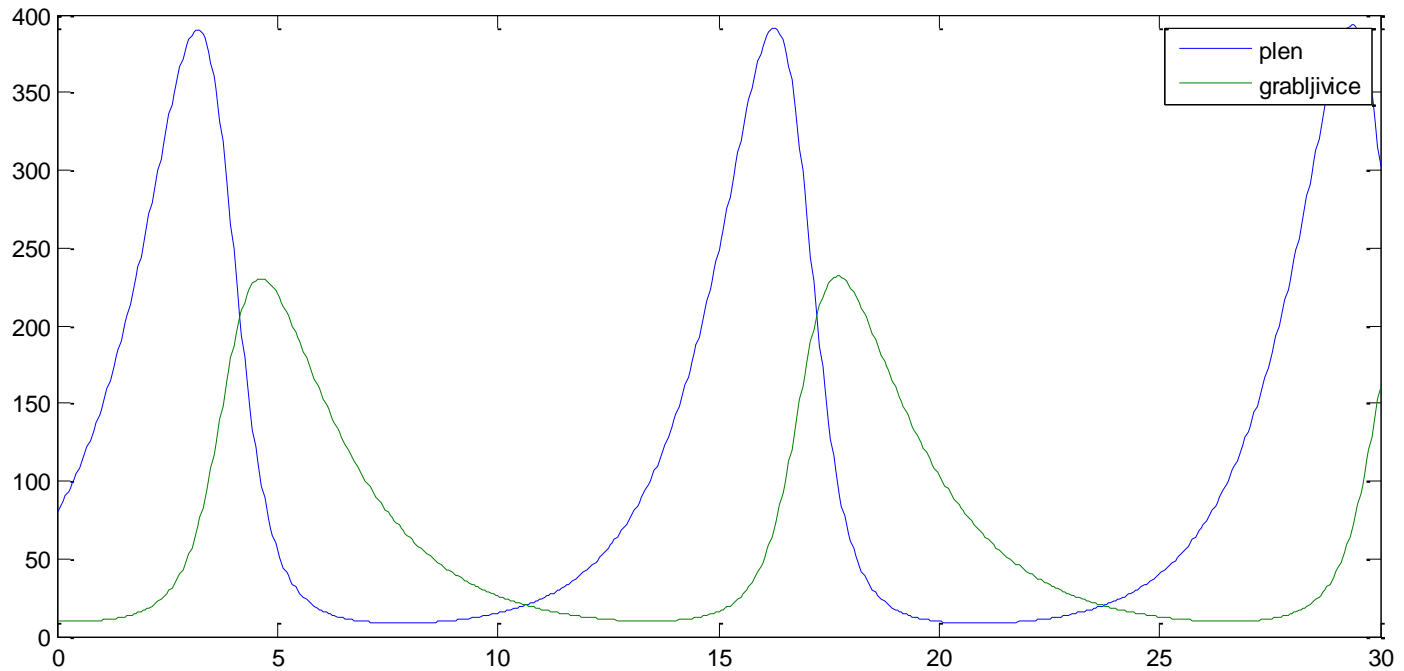
- Raste srazmerno ishrani
- Opada zbog prirodne smrti

$$\frac{dy}{dt} = -\gamma y + \delta xy$$

# Simulacija

```
function zp = lotka7(t,z,alpha,beta,gama,delta)
% Lotka-Volterra model
x = z(1); y = z(2);
zp = [ x*(alpha - beta*y)
      -y*(gama - delta*x) ];
```

```
al = 0.7; be = 0.01; ga = 0.8; de = 0.05;
tout = 0:0.05:30;
[t,x] = ode45(@lotka7,tout,[40; 80],[], al, be, ga, de);
plot(t,x)
```



# Analiza uticaja susreta grabljivica i plena

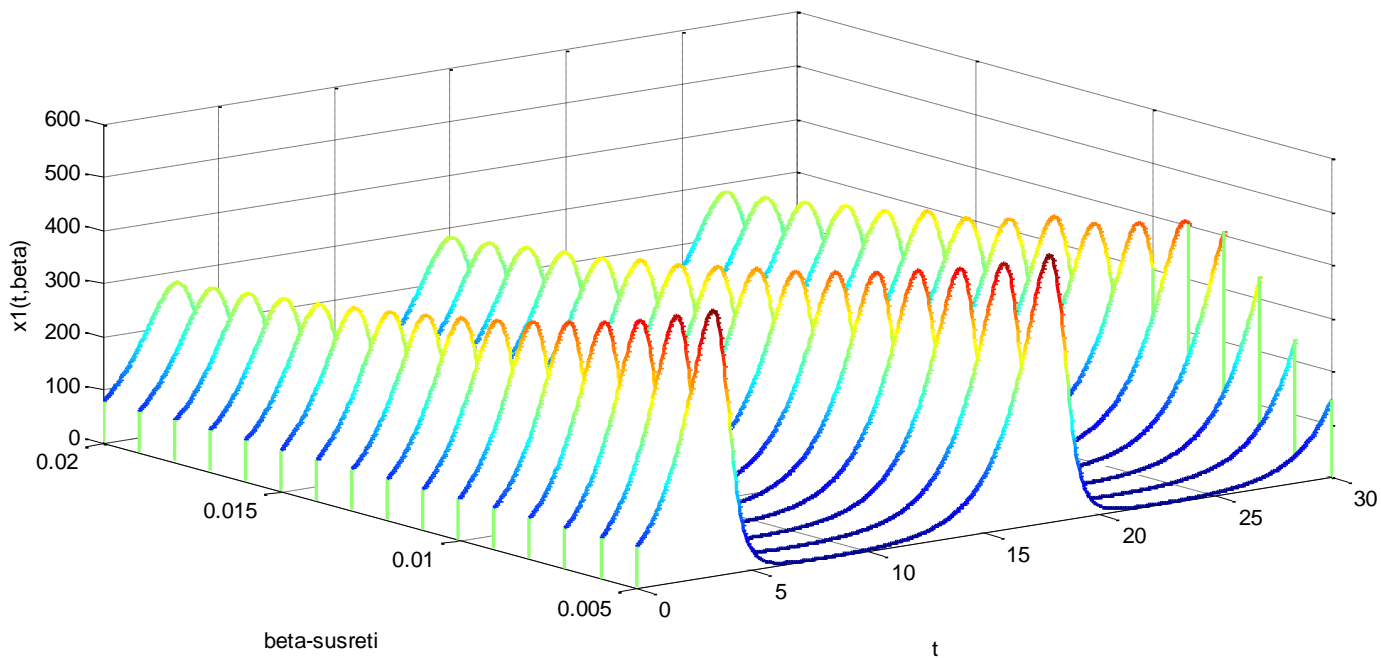
```
al = 0.7; ga = 0.5; de = 0.005;
beta = 0.005:0.001:0.02;          % parametar susretanja
tout = 0:0.05:30;

xx = []; yy = [];
for be = beta
    [t,x] = ode45(@lotka7, tout, [80; 10], [], al, be, ga, de );
    xx = [xx x(:,1)];
    yy = [yy x(:,2)];
end

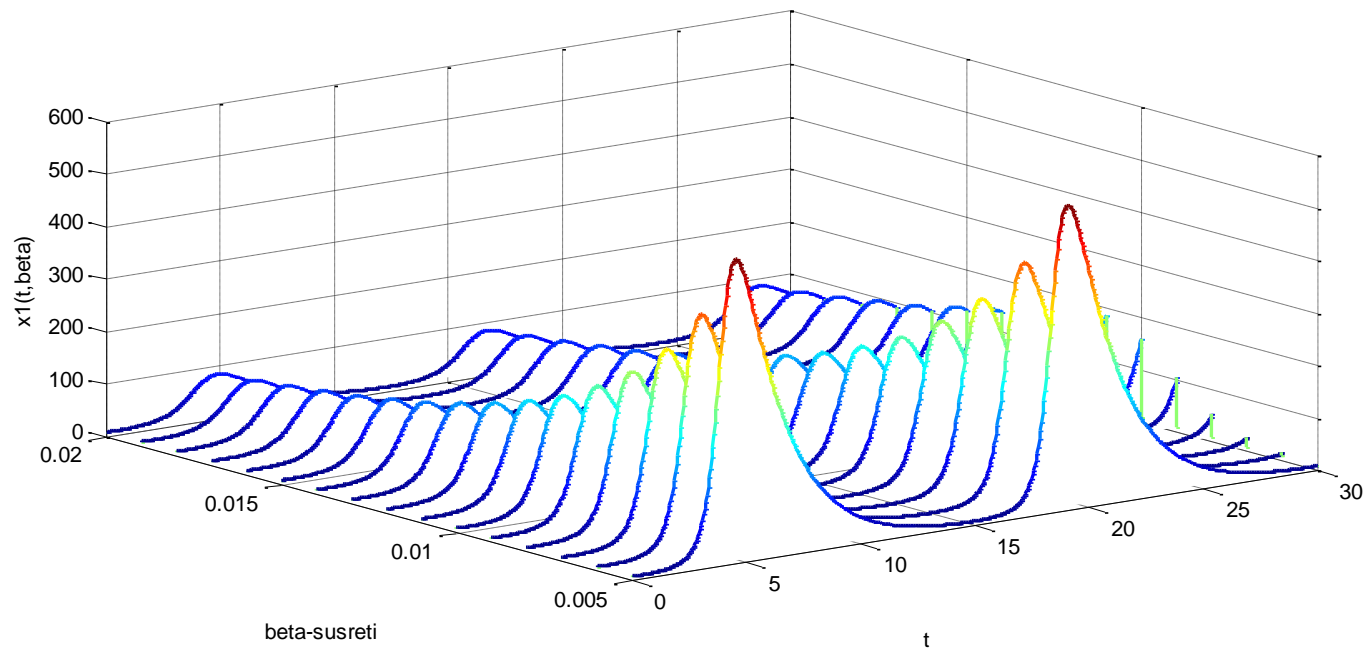
[X,Y]=meshgrid(t,beta);
g=waterfall(X,Y,xx');
xlabel('t'), ylabel('beta-susreti'), zlabel('x1(t,beta)')
set(g,'linewidth',2), title('Populacija plena')
pause
g=waterfall(X,Y,yy');
xlabel('t'), ylabel('beta-susreti'), zlabel('x1(t,beta)')
set(g,'linewidth',2), title('Populacija grabljivica')
```



Populacija plena



Populacija grabljivica



# Van der Pol oscillator

- Van der Pol oscilator je nekonzervativni oscilator sa nelinearnim prigušenjem.
- Opisuje se diferencijalnom jednačinom 2. reda:

$$\frac{d^2x}{dt^2} - \mu(1-x^2)\frac{dx}{dt} + x = 0$$

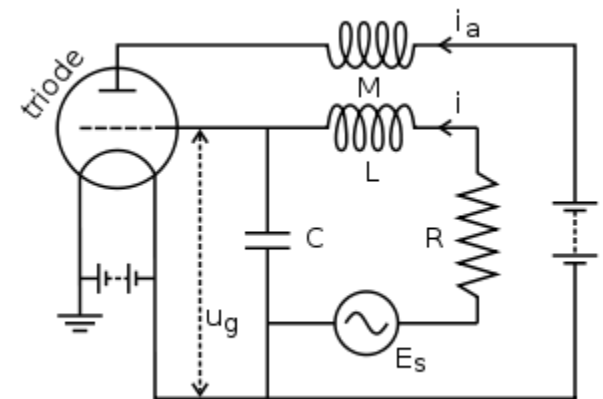
gde je  $x$  promenljiva zavisna od vremena  $t$ , a  $\mu$  je parametar (mera nelinearnosti i jačina prigušenja)

- Ovaj oscilator je 1920. godine osmislio holandski el. inženjer i fizičar Balthasar van der Pol dok je radio za Philips.

## Balthasar van der Pol



Born	January 27, 1889 <a href="#">Utrecht</a>
Died	October 6, 1959 (aged 70) <a href="#">Wassenaar</a>
Nationality	<a href="#">Dutch</a>
Fields	<a href="#">Physics</a>
Notable awards	<a href="#">IEEE Medal of Honor</a>



# Van der Pol jednačina

- Diferencijalna jednačina 2. reda:  $\frac{d^2 x}{dt^2} - \mu(1 - x^2) \frac{dx}{dt} + x = 0$
- Uvodimo smenu:  $y = \frac{dx}{dt}$
- Nakon diferenciranja dobijamo:  $\frac{dy}{dt} = \frac{d^2 x}{dt^2} = \mu(1 - x^2) \frac{dx}{dt} - x$
- Konačno model od dve diferencijalne jednačine 1. reda (ekvivalentan polaznoj jednačini)

$$\frac{dx}{dt} = y$$

$$\frac{dy}{dt} = \mu(1 - x^2)y - x$$

```
function zprim = vdpol(t, z, mi)
% Opis Van der Pol-ove dif. jednacine
x = z(1);
y = z(2);
xprim = y;
yprim = mi*(1-x^2)*y - x;
zprim = [xprim; yprim];
```

# Van der Pol simulacija

```
tp = 0; tk = 100; x0 = [0.5 0];

mi = 0.2;
[t, x] = ode45( @vdpol, [tp tk], x0, [], mi);
subplot(3,1,1), plot( t, x(:,1) ),
title('mi=0.2'), axis([0 100 -3 3])

mi = 1;
[t, x] = ode45( @vdpol, [tp tk], x0, [], mi);
subplot(3,1,2), plot( t, x(:,1) ),
title('mi=1'), axis([0 100 -3 3])

mi = 10;
[t, x] = ode45( @vdpol, [tp tk], x0, [], mi);
subplot(3,1,3), plot( t, x(:,1) ),
title('mi=10'), axis([0 100 -3 3])
```

