

# Numerical Methods

## 5633

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# Numerical methods for ordinary differential equations

- **Initial value problem (IVP):** find a function  $\mathbf{y}(t)$  s.t.

$$\frac{dy}{dt} = f(t, y(t)), \quad y(t_0) = y_0$$

- IVP: if  $t$  - seen as time, we can view the equation as modelling a process that moves forward from some initial time  $t_0$
- Function  $f: \mathbb{R}^{n+1} \rightarrow \mathbb{R}^n$  ( $n > 0$ )
- **initial point  $t_0$ :** given scalar value, often  $t_0 = 0$
- **initial value  $y_0$ :** given vector in  $\mathbb{R}^n$
- **Goal:** find the unknown function  $y(t)$

$$y'(t) - f(t, y(t)) = 0, \quad \forall t > t_0, \quad y(t_0) = y_0$$

# Numerical methods for ordinary differential equations

- Numerical solution for ODE, Initial Value Problem:
  - Euler's method: forward, backward, midpoint, trapezoid, predictor-corrector
  - Runge-Kutta method (2nd and 4th order)

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# (Forward) Euler's method

$$y_n = y_{n-1} + h f(t_{n-1}, y_{n-1})$$

```
dy.dx=function(x,y){1-y}  
  
h=1/16.0  
y0=1  
start=0  
end=1  
  
ys<-euler(dy.dx, start=0, end=1, h=1/16.0, y0=0)  
ys<-euler(dy.dx, start=0, end=1, h=1/32.0, y0=0)
```

```
# R code for the solution of the Initial Value Problem (IVP)  
# using Euler's method  
#  
# Function Euler requires as input:  
#   - dy.dx: function defining IVP  
#   - h: stepsize, h*nsteps=(end-start)  
#   - y0: initial value  
#   - start: start of the interval  
#   - end: end of the interval  
#  
# Output    - ys is a solution vector, containing values for  
y(tk) after k=0...nstep iterations  
  
euler<-function(dy.dx=function(x,y){},h=1E-7,y0=1,start=0,end=1)  
{  
  nsteps <- (end-start)/h  
  ys <- numeric(nsteps+1)  
  ys[1] <- y0  
  for (i in 1:nsteps) {  
    x <- start + (i-1)*h  
    ys[i+1] <- ys[i] + h*dy.dx(x,ys[i])  
  }  
  ys  
}
```

# Error in Euler's method

$n=h^{-1}$	$E_n(y'+y=1, y(0)=0)$	$E_n(y'=y, y(0)=1)$
16	0.118053E-01	0.803533E-01
32	0.582415E-02	0.412917E-01
64	0.289292E-02	0.209369E-01
128	0.144173E-02	0.105428E-01
256	0.719686E-03	0.529020E-02
512	0.359550E-03	0.264983E-02
1024	0.179702E-03	0.132610E-02

# Numerical methods for ordinary differential equations

- Numerical solution for ODE, Initial Value Problem:
  - Euler's method: forward, backward, midpoint, **trapezoid, predictor-corrector**
  - Runge-Kutta method (2nd and 4th order)

# Trapezoid rule predictor-corrector method

$$\bar{y}_{n+1} = y_n + h f(t_n, y_n)$$

$$\bar{y}_{n+1} = y_n + \frac{1}{2} h [f(t_{n+1}, \bar{y}_{n+1}) + f(t_n, y_n)]$$

→ Algorithm for the Trapezoid Predictor Corrector:

```
1. input t0,y0,h,n  
2. f=function(t0,y0){ . . . }  
3. for k in 1:n  
    {  
        # First, predict  
        f0=f(t0,y0)  
        ybar=y0+h*f0  
        # Next, correct  
        y0=y0+0.5*h*(f0+f(t+h,ybar))  
        # Update for next pass through the loop  
        y0=y  
        t0=t  
    }
```

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- Numerical solution for ODE, Initial Value Problem:
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# Runge-Kutta method

- Predictor-corrector written as a single recursion:

$$y_{n+1} = y_n + \frac{1}{2}h[f(t_{n+1}, y_n + hf(t_n, y_n)) + f(t_n, y_n)]$$

- Allow for an arbitrary average of the two slopes:

$$y_{n+1} = y_n + c_1 hf(t_n, y_n) + c_2 hf(t_n + \alpha h, y_n + \beta hf(t_n, y_n))$$

- Truncation error is  **$O(h^2)$**  if (see derivation done in class):

$$1 - c_1 - c_2 = 0; \quad \frac{1}{2} - c_2\alpha = 0; \quad \frac{1}{2} - c_2\beta = 0$$

- One possible solution (trapezoid rule predictor-corrector):

$$c_1 = c_2 = \frac{1}{2}; \quad \alpha = \beta = 1$$

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# Runge-Kutta method

- Algorithm for the fourth-order Runge-Kutta:

```
1. input t0,y0,h  
2. for k in 1:n  
    {  
        t=t0+k*h  
        t2=t0+0.5h  
        v1=f(t0,y0)  
        v2=f(t2,y0+0.5*h*v1)  
        v3=f(t2,y0+0.5*h*v2)  
        v4=f(t,y0+h*v3)  
        y=(h/6.0)*(v1+2.0*(v2+v3)+v4)  
        y0=y  
        t0=t  
    }
```

- Implemented in R together with many other methods for ODE: <https://CRAN.R-project.org/package=deSolve>