

Rezolvarea ecuațiilor și sistemelor de ecuații diferențiale ordinare (II)

Metode multipas

Prof.dr.ing. Gabriela Ciuprina

Universitatea "Politehnica" București, Facultatea de Inginerie Electrică

Suport didactic pentru disciplina *Metode numerice*, 2016-2017

Cuprins

- 1 Introducere
 - Unipas vs. multipas
 - Formule de integrare numerică Newton-Cotes
- 2 Metode multipas explicite
 - Metode Milne explicite
 - Metode Adams-Basforth
- 3 Metode multipas implice
 - Metode Milne implice
 - Metode Adams-Moulton
 - BDF (metoda lui Gear)
- 4 Exemple din mediile uzuale în care lucrezi
 - COMSOL
 - Matlab

Unipas vs. multipas

$$\frac{dx}{dt} = f(x, t) \quad \Rightarrow \quad x(t_B) - x(t_A) = \int_{t_A}^{t_B} f(x, t) dt$$

$$x(t_B) = x(t_A) + \int_{t_A}^{t_B} f(x, t) dt$$

Soluția se va calcula numeric în punctele discrete $t_0 = t_0, t_1, \dots, t_n = T$

Unipas

$$t_A = t_j \quad t_B = t_{j+1}$$

Multipas

$$t_A = t_j \quad t_B = t_{j+m}$$

$$x(t_{j+1}) = x(t_j) + \int_{t_j}^{t_{j+1}} f(x, t) dt \quad x(t_{j+m}) = x(t_j) + \int_{t_j}^{t_{j+m}} f(x, t) dt$$

$$x_{j+1} = x_j + I \quad I \approx \int_{t_j}^{t_{j+1}} f(x, t) dt \quad x_{j+m} = x_j + I \quad I \approx \int_{t_j}^{t_{j+m}} f(x, t) dt$$

$j = 0, n - 1, \quad x_0$ este cunoscut; $j = 0, n - m, \quad x_0$ este cunoscut;

Unipas vs. multipas

Metode unipas - folosesc informații din intervalul $[t_j, t_{j+1}]$

- Metode θ

$$-x_j + x_{j+1} = h [\theta f(x_j, t_j) + (1 - \theta)f(x_{j+1}, t_{j+1})]$$

Dacă $\theta = 1$ - metoda este explicită (Euler explicit)

Dacă $\theta \neq 1$ - metoda este implicită ($\theta = 0$ - Euler implicit, $\theta = 1/2$ - trapeze); necesită în general rezolvarea unei ecuații algebrice neliniare la fiecare pas de integrare.

- Metode Runge-Kutta

Unipas vs. multipas

Metode unipas - folosesc informații din intervalul $[t_j, t_{j+1}]$

- Metode θ

$$-x_j + x_{j+1} = h [\theta f(x_j, t_j) + (1 - \theta) f(x_{j+1}, t_{j+1})]$$

- Metode Runge-Kutta

$$-x_j + x_{j+1} = I$$

unde $I \approx \int_{t_j}^{t_{j+1}} f(x, t) dt$

$$I = h \sum_{i=1}^{\nu} b_i f(x(t_j + c_i h), t_j + c_i h)$$

unde $x(t_j + c_i h)$ nu sunt cunoscute și sunt aproximate cu formule liniare ale unor valori calculate succesiv.

Unipas vs. multipas

Metode unipas - folosesc informații din intervalul $[t_j, t_{j+1}]$

- Metode θ

$$-x_j + x_{j+1} = h [\theta f(x_j, t_j) + (1 - \theta) f(x_{j+1}, t_{j+1})]$$

- Metode Runge-Kutta - **explicite**

$$x_{j+1} = x_j + h\Phi, \quad j = 0, \dots, n-1 \quad (1)$$

$$\Phi = \sum_{i=1}^{\nu} b_i K_i \quad (2)$$

$$K_1 = f(x_j, t_j) \quad (3)$$

$$K_i = f\left(x_j + h \sum_{p=1}^{i-1} a_{ip} K_p, t_j + c_i h\right) \quad i = 2, \dots, \nu \quad (4)$$

Unipas vs. multipas

Metode unipas - folosesc informații din intervalul $[t_j, t_{j+1}]$

- Metode θ

$$x_{j+1} = x_j + h [\theta f(x_j, t_j) + (1 - \theta) f(x_{j+1}, t_{j+1})]$$

- Metode Runge-Kutta - **implicite**

$$x_{j+1} = x_j + h\Phi, \quad j = 0, \dots, n-1 \quad (5)$$

$$\Phi = \sum_{i=1}^{\nu} b_i K_i \quad (6)$$

$$K_1 = f(x_j, t_j) \quad (7)$$

$$K_i = f(x_j + h \sum_{p=1}^{\nu} a_{ip} K_p, t_j + c_i h) \quad i = 2, \dots, \nu \quad (8)$$

Unipas vs. multipas

Metode multipas - folosesc informații din intervalul $[t_j, t_{j+m}]$

Metode liniare multipas¹

Calculul unui pas nou x_{j+m} se face folosind relația

$$a_0x_j + a_1x_{j+1} + \cdots + a_mx_{j+m} = h[b_0f(x_j, t_j) + b_1f(x_{j+1}, t_{j+1}) + \cdots + b_mf(x_{j+m}, t_{j+m})]$$

- a_i și b_i sunt aleși convenabil (convergență);
- $a_m = 1$;
- dacă $b_m = 0$ metoda este explicită;
- dacă $b_m \neq 0$ metoda este implicită;
- cazul $m = 1$, $a_0 = -1$ (din motive de convergență), $b_0 = \theta$, $b_1 = 1 - \theta \Rightarrow$ metode unipas de tip θ .

¹Există și metode neliniare multipas.

Formule de integrare numerică Newton-Cotes

Algoritmii multipas pentru rezolvarea ODE se bazează pe **formulele de cuadratură Newton-Cotes** (formule de integrare numerică scrise pentru rețelele de discretizare uniformă).

- 1 Formule NC "închise" - folosesc inclusiv valorile în capete. Se folosesc în calculul integralelor definite și în rezolvarea ODE cu **metodele multipas implice**.
- 2 Formule NC "deschise" - nu folosesc valorile în capete. Se folosesc în rezolvare ODE cu **metodele multipas explicite**.

Formule Newton-Cotes închise

Grid uniform x_0, x_1, \dots, x_n , pas h

$$f_i = f(x_i)$$

Formulele conțin f_0 și f_n .

n (gradul polinomului)	Pasul h	Numele uzual al formulei	Formula	Eroarea locală
1	$x_1 - x_0$	trapezului	$\frac{h}{2}(f_0 + f_1)$	$O(h^3)$
2	$x_1 - x_0 = \frac{x_2 - x_0}{2}$	Simpson 1/3	$\frac{h}{3}(f_0 + 4f_1 + f_2)$	$O(h^5)$
3	$x - 1 - x_0 = \frac{x_3 - x_0}{3}$	Simpson 3/8	$\frac{3h}{8}(f_0 + 3f_1 + 3f_2 + f_3)$	$O(h^5)$

Formule Newton-Cotes deschise

Grid uniform x_0, x_1, \dots, x_n , pas h

$$f_i = f(x_i)$$

Formulele nu conțin f_0 și f_n .

Gradul polinomului	Pasul h	Numele ușual al formulei	Formula	Eroarea locală
0	$x_1 - x_0 = \frac{x_2 - x_0}{2}$	regula dreptunghiului sau punctului din mijloc	$2hf_1$	$O(h^3)$
1	$x_1 - x_0 = \frac{x_3 - x_0}{3}$	trapezului	$\frac{3h}{2}(f_1 + f_2)$	$O(h^3)$
2	$x_1 - x_0 = \frac{x_4 - x_0}{4}$	regula lui Milne	$\frac{4h}{3}(2f_1 - f_2 + 2f_3)$	$O(h^5)$

Metode Milne explicite

$$x_{j+m} = x_j + I \quad I \approx \int_{t_j}^{t_{j+m}} f(x, t) dt$$

$j = 0, n - m$, x_0 este cunoscut;

Integrala I se aproximează cu formule Newton-Cotes deschise.

$m = 2 \Rightarrow$ NC cu 1 punct interioar

$$x_{j+2} = x_j + 2hf(x_{j+1}, t_{j+1})$$

Metode Milne explicite

$$x_{j+m} = x_j + I \quad I \approx \int_{t_j}^{t_{j+m}} f(x, t) dt$$

$j = 0, n - m$, x_0 este cunoscut;

Integrala I se aproximează cu formule Newton-Cotes deschise.

$m = 3 \Rightarrow$ NC cu 2 puncte interioar

$$x_{j+3} = x_j + \frac{3h}{2}(f(x_{j+1}, t_{j+1}) + f(x_{j+2}, t_{j+2}))$$

Metode Milne explicite

$$x_{j+m} = x_j + I \quad I \approx \int_{t_j}^{t_{j+m}} f(x, t) dt$$

$j = 0, n - m$, x_0 este cunoscut;

Integrala I se aproximează cu formule Newton-Cotes deschise.

$m = 4 \Rightarrow$ NC cu 3 puncte interioare

$$x_{j+4} = x_j + \frac{4h}{3}(2f(x_{j+1}, t_{j+1}) - f(x_{j+2}, t_{j+2}) + 2f(x_{j+3}, t_{j+3})) + O(h^5)$$

Adams-Bashforth

Formula generală a metodelor liniare multipas:

$$a_0x_j + a_1x_{j+1} + \cdots + a_mx_{j+m} = h[b_0f(x_j, t_j) + b_1f(x_{j+1}, t_{j+1}) + \cdots + b_mf(x_{j+m}, t_{j+m})]$$

$$\Rightarrow x_{j+m}$$

unde $a_m = 1$

Familia Adams-Bashfort:

- $a_{m-1} = -1$
- $a_i = 0, \forall i < m-1$
- $b_m = 0$ (metodă explicită)

$$x_{j+m} = x_{j+m-1} + h[b_0f(x_j, t_j) + b_1f(x_{j+1}, t_{j+1}) + \cdots + b_{m-1}f(x_{j+m-1}, t_{j+m-1})]$$

$$x_{j+m} = x_{j+m-1} + \sum_{i=0}^{m-1} b_i f(x_{j+i}, t_{j+i})$$

Adams-Bashforth

Familia Adams-Bashfort:

$$x_{j+m} = x_{j+m-1} + \sum_{i=0}^{m-1} b_i f(x_{j+i}, t_{j+i})$$

b_i se determină astfel încât metoda are ordinul m

Metodă, ordin	b_0	b_1	b_2	b_3
AB cu 1 pas, ordin 1	1			
AB cu 2 pași, ordin 2	3/2	-1/2		
AB cu 3 pași, ordin 3	23/12	-16/12	5/12	
AB cu 4 pași, ordin 4	55/24	-59/24	37/24	-9/24

AB cu un pas este Euler explicit.

Metode Milne implice

$$x_{j+m} = x_j + I \quad I \approx \int_{t_j}^{t_{j+m}} f(x, t) dt$$

$j = 0, n - m$, x_0 este cunoscut;

Integrala I se aproximează cu formule Newton-Cotes închise.

Exemplu: $m = 2 \Rightarrow$ NC cu 3 puncte

$$x_{j+2} = x_j + \frac{h}{3}(f(x_j, t_j) + 4f(x_{j+1}, t_{j+1}) + f(x_{j+2}, t_{j+2}))$$

Ecuatie neliniara \Rightarrow are nevoie de o estimare initiala pentru x_{j+2} . Se poate face cu o formula Milne explicita.
Evaluarea primelor puncte se face cu metode unipas.

Adams-Moulton

Formula generală a metodelor liniare multipas:

$$a_0x_j + a_1x_{j+1} + \cdots + a_mx_{j+m} = h[b_0f(x_j, t_j) + b_1f(x_{j+1}, t_{j+1}) + \cdots + b_mf(x_{j+m}, t_{j+m})]$$

$$\Rightarrow x_{j+m} \quad \text{unde } a_m = 1$$

Familia Adams-Moulton:

- $a_{m-1} = -1$
- $a_i = 0, \forall i < m-1$ item $b_m \neq 0$ (metodă implicită)

$$x_{j+m} = x_{j+m-1} + h[b_0f(x_j, t_j) + b_1f(x_{j+1}, t_{j+1}) + \cdots + b_mf(x_{j+m}, t_{j+m})]$$

$$x_{j+m} = x_{j+m-1} + \sum_{i=0}^m b_i f(x_{j+i}, t_{j+i})$$

Adams-Moulton

Prin eliminarea restricției $b_m = 0$ de la AB, metodele devin implice, și o metodă cu m pași poate ajunge la ordinul $m + 1$.

Metodă, ordin	b_0	b_1	b_2	b_3
AM cu 1 pas, ordin 1	0	1		
AM cu 1 pas, ordin 2	1/2	1/2		
AM cu 2 pași, ordin 3	15/12	8/12	-1/12	
AM cu 3 pași, ordin 4	9/24	19/24	-5/24	1/24

AM cu un pas este Euler implicit (ordinul 1) sau metoda trapezelor (ordinul 2).

BDF (Gear)

Formula generală a metodelor liniare multipas:

$$a_0x_j + a_1x_{j+1} + \cdots + a_mx_{j+m} = h[b_0f(x_j, t_j) + b_1f(x_{j+1}, t_{j+1}) + \cdots + b_mf(x_{j+m}, t_{j+m})]$$

$$\Rightarrow x_{j+m}$$

Dacă $b_i = 0 \quad \forall i < m$ și notând $b_m = \beta$ - metodele se numesc
BDF²

$$\sum_{i=0}^{m-1} a_i x_{j+i} + x_{j+m} = h\beta f(x_{j+m}, t_{j+m}) \quad \Rightarrow x_{j+m}$$

unde $h = t_{j+m} - t_{j+m-1}$

²Backward Differentiation Formula

BDF

Coeficienții undei metode BDF de ordin m se determină pornind de la polinomul Lagrange de ordin m , notat $p_{i,m}(t)$ care trece prin punctele $(t_i, x_i), \dots, (t_{i+m}, x_{i+m})$.

$$x'(t_{i+m}) \approx p'(t_{i+m})$$

și

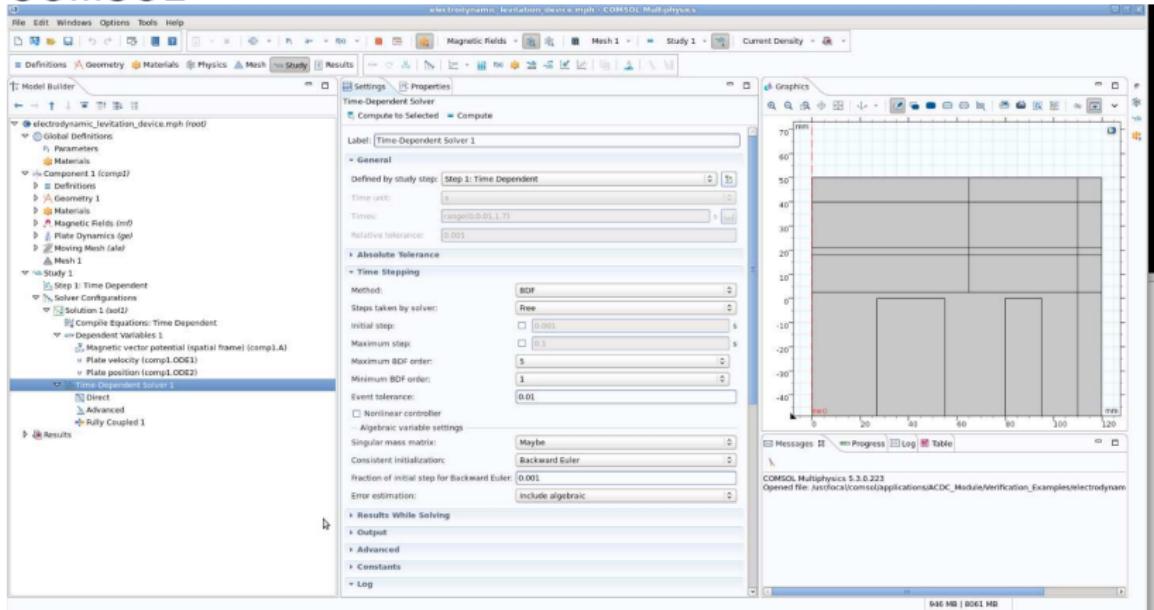
$$x'(t_{i+m}) = f(x(t_{i+m}), t_{i+m})$$

BDF

Metodă, ordin	β	a_0	a_1	a_2	a_3
BDF cu 1 pas, ordin 1	1	-1	1		
BDF cu 2 pași, ordin 2	2/3	1/3	-4/3	1	
BDF cu 3 pași, ordin 3	6/11	-2/11	9/11	-18/11	1

BDF cu un pas este Euler implicit (ordinul 1).

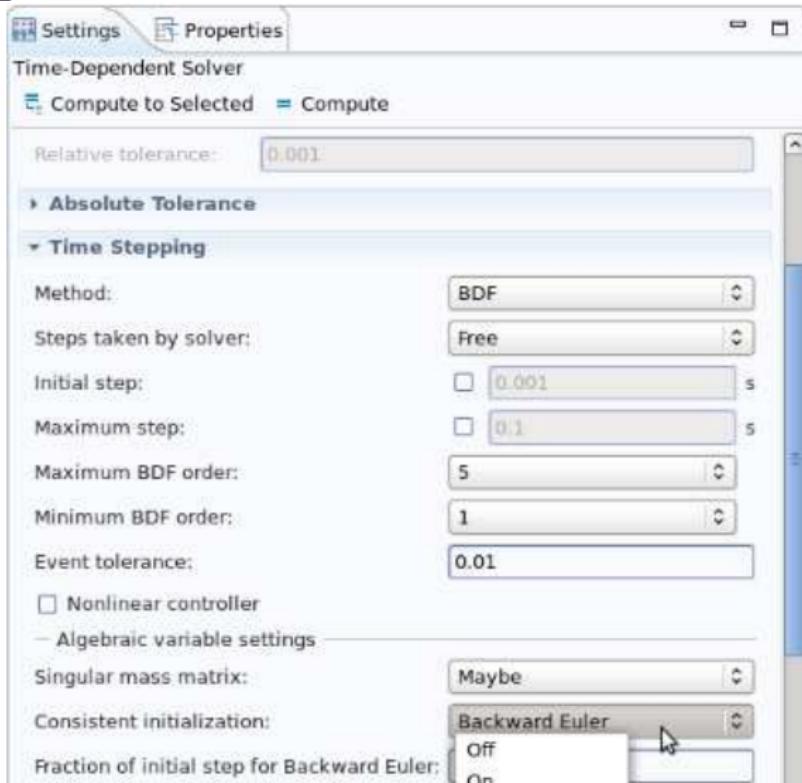
COMSOL



COMSOL

The screenshot shows the 'Time-Dependent Solver' settings window in COMSOL. The window has tabs for 'Settings' and 'Properties'. The 'Settings' tab is active. The 'Label' field contains 'Time-Dependent Solver 1'. The 'Defined by study step:' dropdown is set to 'Step 1: Time Dependent'. The 'Time unit:' dropdown is set to 's'. The 'Times:' dropdown shows 'range(0,0.01,1.7)'. The 'Relative tolerance:' field is set to '0.001'. A section titled 'Absolute Tolerance' is collapsed. A section titled 'Time Stepping' is expanded, showing a dropdown menu for 'Method' with options: BDF (selected), Free (highlighted with a cursor), Intermediate, Strict, and Manual. Other parameters shown include 'Steps taken by solver:', 'Initial step:', 'Maximum step:', 'Maximum BDF order:', and 'Minimum BDF order: 1'.

COMSOL



Matlab (non-stiff)

<https://ch.mathworks.com/help/matlab/math/choose-an-ode-solver.html>

Solver	Problem Type	Accuracy	When to Use
ode45	Nonstiff	Medium	Most of the time. ode45 should be the first solver you try.
ode23		Low	ode23 can be more efficient than ode45 at problems with crude tolerances, or in the presence of moderate stiffness.
ode113		Low to High	ode113 can be more efficient than ode45 at problems with stringent error tolerances, or when the ODE function is expensive to evaluate.

Matlab (non-stiff) <https://ch.mathworks.com/help/matlab/math/choose-an-ode-solver.html>

- Single-step

`ode45` is based on an explicit Runge-Kutta (4,5) formula, the Dormand-Prince pair.

`ode23` is an implementation of an explicit Runge-Kutta (2,3) pair of Bogacki and Shampine. It may be more efficient than `ode45` at crude tolerances and in the presence of moderate stiffness.

- Multi-step

`ode113` is a variable-step, variable-order Adams-Basforth-Moulton PECE solver of orders 1 to 13. The highest order used appears to be 12, however, a formula of order 13 is used to form the error estimate and the function does local extrapolation to advance the integration at order 13. It may be more efficient than `ode45` at stringent tolerances or if the ODE function is particularly expensive to evaluate.

Matlab (stiff) <https://ch.mathworks.com/help/matlab/math/choose-an-ode-solver.html>

ode15s	Stiff	Low to Medium	Try ode15s when ode45 fails or is inefficient and you suspect that the problem is stiff. Also use ode15s when solving differential algebraic equations (DAEs).
ode23s		Low	<p>ode23s can be more efficient than ode15s at problems with crude error tolerances. It can solve some stiff problems for which ode15s is not effective.</p> <p>ode23s computes the Jacobian in each step, so it is beneficial to provide the Jacobian via odeset to maximize efficiency and accuracy.</p> <p>If there is a mass matrix, it must be constant.</p>
ode23t		Low	<p>Use ode23t if the problem is only moderately stiff and you need a solution without numerical damping.</p> <p>ode23t can solve differential algebraic equations (DAEs).</p>
ode23tb		Low	Like ode23s, the ode23tb solver might be more efficient than ode15s at problems with crude

Matlab (stiff) <https://ch.mathworks.com/help/matlab/math/choose-an-ode-solver.html>

● Single-step

ode23s is based on a modified Rosenbrock formula of order 2. Because it is a single-step solver, it may be more efficient than **ode15s** at solving problems that permit crude tolerances or problems with solutions that change rapidly. It can solve some kinds of stiff problems for which **ode15s** is not effective. The **ode23s** solver evaluates the Jacobian during each step of the integration, so supplying it with the Jacobian matrix is critical to its reliability and efficiency.

ode23t is an implementation of the trapezoidal rule using a "free" interpolant. This solver is preferred over **ode15s** if the problem is only moderately stiff and you need a solution without numerical damping. **ode23t** also can solve differential algebraic equations (DAEs)

● Multi-step **ode15s**, **ode23tb**

Matlab (stiff) <https://ch.mathworks.com/help/matlab/math/choose-an-ode-solver.html>

- Single-step ode23s, ode23t
- Multi-step

`ode15s` is a variable-step, variable-order (VSVO) solver based on the numerical differentiation formulas (NDFs) of orders 1 to 5. Optionally, it can use the backward differentiation formulas (BDFs, also known as Gearş method) that are usually less efficient. Like `ode113`, `ode15s` is a multistep solver. Use `ode15s` if `ode45` fails or is very inefficient and you suspect that the problem is stiff, or when solving a differential-algebraic equation (DAE).

`ode23tb` is an implementation of TR-BDF2, an implicit Runge-Kutta formula with a trapezoidal rule step as its first stage and a backward differentiation formula of order two as its second stage. By construction, the same iteration matrix is used in evaluating both stages. Like `ode23s` and `ode23t`, this solver may be more efficient than `ode15s` for problems with crude tolerances.

Matlab (fully-implicit) <https://ch.mathworks.com/help/matlab/math/choose-an-ode-solver.html>

ode15i	Fully implicit	Low	Use <code>ode15i</code> for fully implicit problems $f(t,y,y') = 0$ and for differential algebraic equations (DAEs) of index 1.
--------	----------------	-----	---

● Multi-step

`ode15i` is a variable-step, variable-order (VSVO) solver based on the backward differentiation formulas (BDFs) of orders 1 to 5. `ode15i` is designed to be used with fully implicit differential equations and index-1 differential algebraic equations (DAEs). The helper function `decic` computes consistent initial conditions that are suitable to be used with `ode15i`.

Referințe

- [Cheney08] W.Cheney, D.Kincaid, *Numerical Mathematics and Computing*, Brooks/Cole publishing Company,2000. (Capitolele 10 și 11)

Disponibilă la <http://www.physics.brocku.ca/Courses/5P10/References/cheneykincaid.pdf>

- [Press02] W.H.Press, S.A.Teukolsky, W.T. etterling, B.P. Flannery, *Numerical Recipies in C*, 2002. (Capitolul 16)

Disponibilă la https://www2.units.it/pl/students_area/imm2/files/Numerical_Recipes.pdf

- [Strang&Moler15] *Introduction to Differential Equations and the MATLAB ODE Suite - Open Courseware at MIT*

Disponibil la <http://ocw.mit.edu/RES-18-009F15> sau <https://www.youtube.com/watch?v=ZvL88xqYSak>

- [Trefethen18] N.Trefethen, *Exploring ODEs*, SIAM 2018.

Disponibil la <https://people.maths.ox.ac.uk/trefethen/books.html>