

(4.12) Theorem (convergence of the TS(1) method).

Let t_0 be a real number, F be a function defined in $\mathbb{R} \times \mathbb{R}^n$ with values in \mathbb{R}^n and let $x_0 \in \mathbb{R}^n$, and consider the Cauchy Problem:

$$(\S) \quad x'(t) = F(t, x(t)) \quad , \quad x(t_0) = x_0 \quad , \quad t \in [t_0, t_f]$$

If all first partial derivatives of $F(t, x)$ are continuous functions of t and x and Problem (\S) has only one solution, then for every $\lambda > 0$ the TS(1) method applied to Problem (\S) is *convergent* as $E \rightarrow 0$ and:

- $N \rightarrow \infty$ as $1/\sqrt{E}$;
- For every k : $ET(k) \rightarrow 0$ as \sqrt{E} .

(4.13) Realization in Scilab (TS_1_pv).

```
function [T, X, PASSO] = TS_1_pv(x0, t0, tf, F, G2, E, LAMBDA, HMIN)
//
// Numerically integrates, on [t0,tf], the Cauchy Problem
// in R(n):
//
// x' = F(t,x)
// x(t0) = x0
//
// using the TS(1)cmethod - explicit Euler - with variable step.
//
// x0: initial condition (column of n elements)
// t0: initial time (real number)
// tf: final time (real number)
// F: function which defines the differential equation; F(t,x) should
//     be a column of n real numbers
// G2: function whose values are the second derivative in t of the solution of the
//     differential equation whose value at time t is x; G2(t,x) should be
//     a column of n real numbers
// E: maximum value of the estimate of the local error (real number)
// LAMBDA: real number that sets the maximum value of the step
//         (OPTIONAL - predefined value: 1d-5)
// HMIN: minimal allowed value of the step
//         (OPTIONAL - predefined value: (tf - t0) / 1d6)
//
// T = [t(0),...,t(N)]: row whose elements are the integration instants
// X = [x(0),...,x(N)]: matrix n x (N+1) whose columns are the approximations
// PASSO = [h(0),...,h(N-1)]: row whose elements are the integration step
//
// Values for the optional input parameters
//
if ~exists('LAMBDA','l') then LAMBDA = 1d-5; end;
```

```

if ~exists('HMIN','1') then HMIN = (tf - t0) / 1d6; end;
//
// Initialization of the output variables
//
T(1,1) = t0;
X(:,1) = x0;
PASSO = [];
//
// main loop
//
while (T(1,$) < tf), // halt the construction if tf has been reached
    //
    // choice of the step
    //
    Nd2x = norm(G2(T(1,$),X(:,$)));
    d = max(LAMBDA, Nd2x);
    PASSO(1,$+1) = min(sqrt(2*E/d), tf - T(1,$));
    //
    // computation of the approximation and of the new integration instant
    //
    X(:, $+1) = X(:, $) + F(T(1,$),X(:, $)) * PASSO(1,$);
    T(1,$+1) = T(1,$) + PASSO(1,$);
    //
    // halt the construction if the computed step is too small and tf has not been reached
    //
    if (PASSO(1,$) < HMIN) & (T(1,$) < tf) then break; end;
    //
end;
//
// Verify if the integration reached tf
//
if T(1,$) < tf then
    printf("\n\nIntegrazione interrotta a T = %3.2e", T(1,$));
end;
//
endfunction

```

(4.14) Example (explained to the class on December 4th).

Consider a pendulum consisting of a heavy point of mass m connected to a fixed point by an inextensible string of length L . Assuming the motion of the point to be planar and adopting the angle x between the downward-sloping vertical and the string, measured counterclockwise, as the Lagrangian coordinate, the equation of motion is:

$$(ED) \quad x''(t) = -\frac{g}{L} \sin x(t)$$

To approximate on the interval $[t_0, t_f] = [0, 3]$ s the solution of the Cauchy problem which is obtained by considering the initial conditions:

$$(CI) \quad x(0) = x_0 = \pi/4 \text{ rad} \quad , \quad x'(0) = 0$$

with *Scilab*, the `TS_1_pv` procedure is used. Using the procedure requires:

- To determine a system of two first-order differential equations equivalent to equation (ED). By introducing the variables $u_1(t) = x(t)$ and $u_2(t) = x'(t)$, we obtain:

$$(ED') \quad u_1'(t) = u_2(t) \quad , \quad u_2'(t) = -\frac{g}{L} \sin u_1(t)$$

which is completed with the initial conditions:

$$(CI') \quad u_1(0) = x_0 \quad , \quad u_2(0) = 0$$

- To write the function that defines the system (ED'):

```
function y = F(t,u)
```

```
    y = [          u(2)  ;  
          - (g/L) * sin( u(1) ) ];
```

```
endfunction
```

- To find the function that, given t and u , returns the value of the second derivative, calculated at t , of the solution of the system (ED') that evaluates to u at time t :

$$u''(t) = \begin{bmatrix} u_2'(t) \\ -(g/L) u_1'(t) \cos(u_1(t)) \end{bmatrix} = \begin{bmatrix} -(g/L) \sin(u_1(t)) \\ -(g/L) u_2(t) \cos(u_1(t)) \end{bmatrix}$$

and to write the relative function:

```
function y = G2(t,u)
```

```
    y = [          - (g/L) * sin( u(1) ) ;  
          - (g/L) * u(2) * cos( u(1) ) ];
```

```
endfunction
```

- To assign the final instant t_f (s):

```
tf = 3;
```

- To assign the column of the initial conditions (CI'):

```
u0 = [x0;0];
```

- To assign values to the parameters:

```
g = 9.82; // m/s^2  
L = 1; // m  
m = 1; // kg
```

- To choose the maximum allowed value for the estimate of the local error, E .

To obtain an adequate value of E , we need a criterion to judge the accuracy of the approximation obtained by the procedure. For the physical system under consideration, we can proceed as follows.

(A) Since the *mechanical energy*:

$$EN(x(t)) = mgL(1 - \cos x_1(t)) + \frac{1}{2}mL^2(\dot{x}_2(t))^2$$

assumes along the motion the constant value $EN(t_0)$, as a *relative* measure of the accuracy of the approximation, we can choose *the relative change in energy during the approximate motion*:

$$\text{Var_EN} = \frac{\max_k EN(u(t_k)) - \min_k EN(u(t_k))}{EN(u(t_0))}$$

(B) Since the motion of the pendulum is periodic and:

$$\min x_1(t) = -\max x_1(t) \quad \Rightarrow \quad \max x_1(t) + \min x_1(t) = 0$$

as a *relative* measure of the accuracy of the approximation, we can choose *the relative change of the amplitude of the oscillation during the approximate motion*:

$$\text{Var_A} = \frac{\max_k u_1(t_k) + \min_k u_1(t_k)}{u_1(t_0)}$$

This choice is reasonable if the interval $[t_0, t_f]$ includes at least one oscillation of the function $u_1(t_k)$.

(C) We get the following table:

E	N	$\text{Var_EN} (\%)$	$\text{Var_A} (\%)$
10^{-3}	267	35.89	6.3
10^{-5}	2587	3.25	$5.99 \cdot 10^{-1}$
10^{-7}	25779	0.32	$5.97 \cdot 10^{-2}$

What an appropriate value of E is depends on what the user wants to achieve. The table suggests that as E decreases, the accuracy of the approximation increases.

(4.15) Remark (variation of N and ET with E).

Let N and M , respectively, be the number of integration instants and the maximum value of $ET(k)$ obtained using the `TS_1_pv` procedure with $E = \underline{E}$ and N' and M' be the corresponding values obtained with $E = \alpha \underline{E}$. By Theorem (4.12) we expect that:

$$N'/N \approx 1/\alpha^{1/2} \quad \text{and} \quad M'/M \approx \alpha^{1/2}$$

In the final table of the previous Example we have $\alpha = 10^{-2}$, so we expect:

$$N'/N \approx 10 \quad \text{and} \quad M'/M \approx 1/10$$

The relationship regarding the increase in the number of integration instants is evidently verified:

$$2587/267 = 9.69 \quad \text{and} \quad 25779/2587 = 9.96$$

Since we cannot access the total error, we simply note that for the relative variation of the energy we have:

$$\text{Var_EN}'/\text{Var_EN} = 3.25/35.89 \approx 0.90 \cdot 10^{-1} \quad \text{and} \quad 0.32/3.25 \approx 0.98 \cdot 10^{-1}$$

and for the relative variation of the amplitude:

$$\text{Var_A}'/\text{Var_A} = 5.99 \cdot 10^{-1}/6.3 \approx 0.95 \cdot 10^{-1} \quad \text{and} \quad 5.97 \cdot 10^{-2}/5.99 \cdot 10^{-1} \approx 0.99 \cdot 10^{-1}$$

(4.B) TS(2) METHOD

(4.16) Hypothesis (regularity of the solutions).

Suppose that *all* solutions of the differential equation $x'(t) = F(t, x(t))$ have *continuous third derivatives*.

The condition is certainly satisfied if *all second* partial derivatives of the function $F(t, x)$ *exist* and are *continuous* functions of t and x .

(Indeed:

$$G_2(t, x) = \frac{\partial}{\partial t} F(t, x) + \frac{\partial}{\partial x} F(t, x) \cdot F(t, x)$$

has continuous first partial derivatives and therefore:

$$G_3(t, x) = \frac{\partial}{\partial t} G_2(t, x) + \frac{\partial}{\partial x} G_2(t, x) \cdot F(t, x)$$

is continuous. Then, if $y(t)$ is a solution of the differential equation:

$$y^{(3)}(t) = ((y'(t))')' = ((F(t, y(t)))')' = (G_2(t, y(t)))' = G_3(t, y(t))$$

is continuous because $G_3(t, x)$ and $y(t)$ are.)

(4.17) Definition (TS(2) method).

The TS(2) *method* is defined by the following procedures.

- CHOICE of $h(k)$. Given $E > 0$ and $\lambda > 0$, for each k we set:

$$d(k) = \max \{ \lambda, \|y^{(3)}(t(k); x(k), t(k))\| \}$$

then:

$$h(k) = \min \left\{ \sqrt[3]{\frac{6E}{d(k)}}, t_f - t(k) \right\}$$

- CALCULATION of $x(k+1)$. After choosing $h(k)$ we set:

$$x(k+1) = x(k) + F(t(k), x(k)) h(k) + \frac{1}{2} G_2(t(k), x(k)) h(k)^2$$

The name of the method is a consequence of the fact that the function used to calculate $x(k+1)$ is obtained by truncating the *Taylor series* of $y(t(k) + h; x(k), t(k))$ at the *second* term in $h = 0$.

(4.18) Remark (on the choice of $h(k)$).

Let $y(t)$ be the solution $y(t; x(k), t(k))$ of the differential equation. The deviation $s(h)$ between $y(t(k) + h)$ and the approximation calculated by the method with a step of length h starting from $(t(k), x(k))$ is, using the Taylor Formula in $h = 0$ with Lagrange remainder:

$$s(h) = -\frac{1}{6} y^{(3)}(t(k)) h^3 + z(h) h^3 \quad \text{where: } z(h) \rightarrow 0 \text{ as } h \rightarrow 0$$

If $y^{(3)}(t(k)) \neq 0$ then:

- When h is small: $-\frac{1}{6} y^{(3)}(t(k)) h^3$ is a good estimate of $s(h)$
- It is:

$$\left\| -\frac{1}{6} y^{(3)}(t(k)) h^3 \right\| = E \quad \Leftrightarrow \quad h = \sqrt[3]{\frac{6E}{\|y^{(3)}(t(k))\|}}$$

The parameter λ is intended to prevent $d(k) = 0$ and also ensures that:

$$\text{for every } k: \quad d(k) \geq \lambda \quad \text{hence} \quad h(k) \leq \sqrt[3]{\frac{6E}{\lambda}}$$

(4.19) Theorem (convergence of the TS(2) method).

Let t_0 and $t_f > t_0$ be real numbers, let F be a function defined in $\mathbb{R} \times \mathbb{R}^n$ with values in \mathbb{R}^n , let $x_0 \in \mathbb{R}^n$ and consider the Cauchy Problem:

$$(\S) \quad x'(t) = F(t, x(t)) \quad , \quad x(t_0) = x_0 \quad , \quad t \in [t_0, t_f]$$

If all second partial derivatives of $F(t, x)$ are continuous functions of t and x and Problem (\S) has only one solution, then for every $\lambda > 0$ the TS(2) method applied to Problem (\S) is *convergent* as $E \rightarrow 0$ and:

- $N \rightarrow \infty$ as $1/\sqrt[3]{E}$;
- For every k : $ET(k) \rightarrow 0$ as $\sqrt[3]{E^2} = E^{2/3}$

(4.20) Remark.

Consider the Cauchy Problem (§). For each $E > 0$, let $N_1(E)$ and $ET_1(E)$ be the number of integration instants and the maximum total error generated by the TS(1) method, and let $N_2(E)$ and $ET_2(E)$ be the number of integration instants and the maximum total error generated by the TS(2) method. By Theorem (4.12) and Theorem (4.19), as $E \rightarrow 0$ we have:

- $N_1(E) / N_2(E) \rightarrow +\infty$ as $1/\sqrt[6]{E}$, hence $N_1(E) \rightarrow \infty$ *faster than* $N_2(E)$
- $ET_1(E) / ET_2(E) \rightarrow +\infty$ come $1/\sqrt[6]{E}$, dunque $ET_2(E) \rightarrow 0$ *faster than* $ET_1(E)$

We then expect that, with the same value of E :

- TS(2) generates a *smaller maximum total error* than that generated by TS(1)
- TS(2) reaches t_f with *fewer steps* than TS(1)