# Numerical stroboscopic averaging for ODEs and DAEs

# M. P. Calvo Universidad de Valladolid, Spain

Joint work with Ph. Chartier, A. Murua, J. M. Sanz-Serna

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• Consider the oscillatory IVP

 $\frac{dy}{dt} = f(y, \frac{t}{\epsilon})$  $\frac{1}{\epsilon}$ ;  $\epsilon$ ),  $t_0 \le t \le t_0 + L$ ,  $y(t_0) = y_0 \in \mathbb{R}^d$ ,

where  $f(y, \tau; \epsilon)$  is  $2\pi$ -periodic in  $\tau = t/\epsilon$ . (ie f is  $2\pi\epsilon$ -prdc in t).

• We are interested in the case  $\epsilon \ll 1$ ,  $L = \mathcal{O}(1)$  (solution computed over many periods). Direct numerical solution may be very costly.

• In some applications and for the analysis, system may appear in re-scaled format:

dy  $\frac{dy}{d\tau} = \epsilon f(y, \tau; \epsilon)$ 

with integration interval of length  $L/\epsilon$ .

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• Denote by  $\varphi_{t_0,t}$  the solution operator  $y_0 \mapsto y(t)$ . Note dependence on  $t_0$  and t (system is not autonomous). It satisfies the property

$$
\varphi_{t_1,t_2}\circ\varphi_{t_0,t_1}=\varphi_{t_0,t_2}.
$$

•  $\Psi_{t_0} = \varphi_{t_0,t_0+2\pi\epsilon}$  is the one-period or Poincaré map. Its *n*-th power satisfies  $\Psi_{t_0}^n = \varphi_{t_0,t_0+2\pi n\epsilon}$ , ie advances the solution over  $n$ periods starting from  $t = t_0$ .

 $\bullet$  Attention restricted to cases where  $f = \mathcal{O}(1/\epsilon)$  and  $\Psi_{t_0}$  is an  $\mathcal{O}(\epsilon)$  perturbation of the identity as  $\epsilon \downarrow 0$ .

• Next slide shows two situations covered by our approach.

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• Left:  $f = \mathcal{O}(1)$ . Solution undergoes  $\mathcal{O}(\epsilon)$  changes along one period of length  $\mathcal{O}(\epsilon)$ . Right:  $f = \mathcal{O}(1/\epsilon)$ . Solution changes along one period are  $\mathcal{O}(1)$  but  $\Psi_{t_0} = Id + \mathcal{O}(\epsilon)$ 

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• Changes in solution when t is increased by  $2\pi\epsilon$ 

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- Method of (analytic) averaging. Directly applicable only to situations as in left picture. Try to describe 'smooth' evolution of the system without tracking the fast, period  $\mathcal{O}(\epsilon)$ , oscillations of true solution  $y(t)$ .
- $y(t)$  approximated by a 'smooth'  $Y(t)$ . Usually Y is understood as *average* of  $\gamma$  over one period of the fast oscillations.
- Here we look at true solution  $\nu$  with a stroboscopic light that flashes every  $2\pi\epsilon$  units of time. Both 'left' and 'right' situations covered:

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• Stroboscopic samples  $y(t_0)$ ,  $y(t_0 + 2\pi\epsilon)$ ,  $y(t_0 + 4\pi\epsilon)$ ,... of y (circles) appear to come from 'smooth' function  $Y(t)$ . Which  $Y(t)$ ? a miller - ④ 伊 ト ④ ヨ ト ④ ヨ ト

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• Since  $\Psi_{t_0} = Id + \mathcal{O}(\epsilon)$ , there exist an autonomous modified eqn.  $(d/dt)Y = F_{\epsilon}(Y)$ , with t-flow  $\Phi_t^{(\epsilon)}$  $t_t^{(e)}$ , sch tht  $\Psi_{t_0} = \varphi_{t_0,t_0+2\pi\epsilon}$ coincides (formally) with  $\Phi_{2\pi\epsilon}^{(\epsilon)}$ .

• Hence the *n*-th power  $\Psi_{t_0}^n$  (map that advances y over *n* periods) coincides with the *n*-th power of  $\Phi_{2\pi\epsilon}^{(\epsilon)}$  ie with  $\Phi_{2\pi}^{(\epsilon)}$ ι<sup>τ</sup>)<br>2πnε

• Conclusion: the values

 $y(t_0), y(t_0 + 2\pi\epsilon), \ldots y(t_0 + 2\pi n\epsilon), \ldots$ 

of the highly oscillatory solution of  $(d/dt)y = f(y, t/\epsilon; \epsilon)$  coincide with the values

<span id="page-10-0"></span> $Y(t_0), \quad Y(t_0 + 2\pi\epsilon), \quad \dots \quad Y(t_0 + 2\pi n\epsilon), \quad \dots$ 

ofthe solution of  $(d/dt)Y = F_{\epsilon}(Y)$  such th[at](#page-9-0)  $Y(t_0) = y(t_0)$  $Y(t_0) = y(t_0)$ [.](#page-13-0)

#### Two remarks:

• Coincidence is as formal power series in  $\epsilon$ . Truncating the formal series of the 'exact'  $F_{\epsilon}$ , one obtains averaged systems with  $O(\epsilon)$ ,  $O(\epsilon^2)$ , ... errors. These issues are ignored in presentation.

• If the initial condition were prescribed at a different value of  $t_0$ , then the Poincaré operator  $y_0 \mapsto y(t_0 + 2\pi\epsilon)$  changes and one obtains a *different*  $F_{\epsilon}$ . (Broken lines in next figure.)

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Red wiggly lines: solutions of ivp's corresponding to two initial conditions,  $y_0$  and  $y*$  imposed at  $t = t_0$ . Solid blue lines: solutions of  $(d/dt)Y = F_{\epsilon}(Y)$  with same initial data.

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## Chartier, Murua, SS, FoCM 2010 show:

• Possible to find systematically the explicit analytic expression for  $F_{\epsilon}$  in terms of f by using ideas from the modern analysis of numerical methods —trees, B-series, ...—.

• Such an explicit expression is useful on its own right to obtain analytically averaged system of high order of accuracy and to systematized the method of averaging.

• Furthermore, may be used to analyze numerical methods . . . (idea not pursued here).

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• We shall compute the smooth interpolant  $Y(t)$  by integrating the averaged equation  $dY/dt = F_{\epsilon}(Y)$  with a numerical method (macro-solver) with macro-step size  $H$  (much) larger than the fast period  $2\pi\epsilon$ .

• In the spirit of the Heterogeneous Multiscale Methods of E and Engquist, our algorithm does not require the explicit knowledge of the analytic form of  $F_{\epsilon}$ . Info. on  $F_{\epsilon}$  is gathered on the fly by integrating with micro-step size h the original system  $dy/dt = f$ in small time-windows of length  $\mathcal{O}(\epsilon)$ .

• There is much freedom in the choice of the macro-solver and micro-solver, including standard variable-step/order codes.

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- How to compute  $F_{\epsilon}$  at a given value  $Y^*$  of its argument?
- $\bullet$  Recall that the  $t$ -flow of the vector field  $F_{\epsilon}$  is  $\Phi_t^{(\epsilon)}$  $t$ <sup>t</sub></sup>

$$
F_{\epsilon}(Y^*) = \left. \frac{d}{dt} \Phi_t^{(\epsilon)}(Y^*) \right|_{t=0}.
$$

• In algorithm, derivative approximated by differences, such as

$$
F_{\epsilon}(Y^*) = \frac{1}{2\delta} [\Phi_{\delta}^{(\epsilon)}(Y^*) - \Phi_{-\delta}^{(\epsilon)}(Y^*)] + O(\delta^2).
$$

 $\bullet$  Choosing  $\delta=2\pi\epsilon$ , results in  $\Phi_{\pm\delta}^{(\epsilon)}=\varphi_{t_0,t_0\pm\delta}$  (stroboscopic effect) and

$$
F_{\epsilon}(Y^*) \approx (1/(4\pi\epsilon))[\varphi_{t_0,t_0+2\pi\epsilon}(Y^*) - \varphi_{t_0,t_0-2\pi\epsilon}(Y^*)].
$$

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•  $\varphi_{t_0,t_0\pm 2\pi\epsilon}(Y^*)$  computed by solving the originally given  $dy/dt = f(y, t/\epsilon; \epsilon)$ , over  $t_0 - 2\pi\epsilon \le t \le t_0 + 2\pi\epsilon$ , with initial condition  $y(t_0) = Y^*$ .

• Of course, one may use other finite-difference formulae such as the fourth-order based on  $t_0 + 2\pi k\epsilon$ ,  $k = 0, \pm 1, \pm 2$ .

• Note lack of synchrony between macro and micro integrations. Micro-integration always start from  $t_0$ . Starting micro-integratns from current value of  $t$  in macro-integration will not do: refer to preceding figure.

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• Algorithm presented evolved from our study of Heterogeneous Multiscale Method (E, Engquist, Tsai, Sharp, Ariel, ...)

• Basic underlying idea has appeared several times in the literature over the last fifty years (in particular, in astronomy and circuit theory): envelope-following methods, multirevolution methods, Taratynova, Mace/Thomas, Graff/Bettis, Gear/Petzold/Gallivan, Calvo/Jay/Montijano/Rández, ... (outer integrator has to be built on purpose).

• Kirchgraber 1982, 1988 uses high-order RKs. Recovery of macro-field not from numerical differentiation.

• For comparison refer to:

M.P. Calvo, Ph. Chartier, A. Murua and J.M. Sanz-Serna, Numerical stroboscopic averaging for ODEs and DAEs, Appl. Numer. Math. (2011), doi: 10.1016/j.apnum.2011.06.007

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#### Three sources of errors:

1. Approximate true values of  $F_{\epsilon}$  by a finite difference approximation  $\widetilde{F}_{\epsilon}$ . Error is  $\mathcal{O}(\epsilon^2)$  for 2nd order differencing.

2. Use in difference formula of  $\varphi_{t_0,t_0\pm 2\pi\epsilon}(Y^*)$  obtained via micro-integration. Error in  $\varphi_{t_0,t_0\pm 2\pi \epsilon}(Y^*)$  is  $\mathcal{O}((\Delta \tau)^p) = \mathcal{O}((h/\epsilon)^p)$ , where  $p$  is the order of the micro-integrator. Errors in  $F_{\epsilon}$  are then  $\mathcal{O}(\epsilon^{-1}(h/\epsilon)^p).$ 

3. Use of macro-integrator to solve averaged equation. Error  $\mathcal{O}(H^P)$ , where P is the order of the macro-integrator.

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• Summing up

$$
\mathcal{O}\left(\epsilon^2 + H^P + \frac{1}{\epsilon} \left(\frac{h}{\epsilon}\right)^p\right) = \mathcal{O}\left(\epsilon^2 + H^P + \frac{1}{\epsilon} (\Delta \tau)^p\right),\,
$$

• In some cases, the micro-integration error is  $\mathcal{O}(\epsilon^{\nu}(\Delta \tau)^{\rho})$  with  $\nu > 0$  (ie errors vanish if  $\epsilon \downarrow 0$  with h fixed). Then we have

$$
\mathcal{O}\left(\epsilon^2 + H^P + \epsilon^{\nu-1} \left(\frac{h}{\epsilon}\right)^p\right) = \mathcal{O}\left(\epsilon^2 + H^P + \epsilon^{\nu-1} (\Delta \tau)^p\right).
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(A) A perturbed Kepler problem in the plane (from Kirchgraber):

$$
\frac{d}{ds}x = v, \quad \frac{d}{ds}v = -\frac{1}{r^3}x + \epsilon G(x),
$$

where

$$
G(x) = -\nabla V(x), \quad V(x) = -\frac{1}{2r^3} + \frac{3x_1^2}{2r^5}, \quad r = \sqrt{x_1^2 + x_2^2}.
$$

Use fictitious time  $\tau = \lambda(x, v)s$ , with  $\lambda(x, v) = (-2E(x, v))^{-3/2}$  $(E$  denotes energy), and system becomes

$$
\frac{d}{d\tau}x=\lambda(x,v)v,\quad \frac{d}{d\tau}v=\lambda(x,v)\left(-\frac{1}{r^3}x+\epsilon G(x)\right).
$$

If  $\epsilon = 0$  (un[per](#page-23-0)turbed) all solut[io](#page-25-0)ns are  $2\pi$ -perio[di](#page-23-0)[c](#page-24-0) [in](#page-25-0)  $\tau$ [.](#page-33-0)

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- $x_1(0) = 1$ ,  $x_2(0) = 0$ ,  $v_1(0) = 0$ ,  $v_2(0) = 1$ .
- $\epsilon = 2^{-12}, 2^{-13}, 2^{-14}$   $(2^{-12} \approx 2.4 \times 10^{-4}).$
- $\bullet$  Integration interval  $0 \leq \tau \leq (\pi/8)\epsilon^{-1}.$
- Constant-step classical RK4 as macro-integrator. Second-order differences.

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(A1) Error vs. number of micro-steps, stars: SAM with RK4 micro-integrator 8 macro-steps, circles: standard RK4. Halving  $\epsilon$ doubles the error

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(A2) Error vs. number of micro-steps, stars: SAM with (Strang like) splitting (Kepler+perturbation) micro-integrator 16 macro-steps, circles: standard splitting. Halving  $\epsilon$  halves the error  $(\nu = 2)$ . **A** The  $\sim$ 

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Summary: When  $\Delta \tau$  is kept fixed and  $\epsilon$  is halved:

- The standard RK integrator works twice as much and doubles the error.
- The standard splitting scheme works twice as much and halves the error.
- SAM with RK micro-integrations uses the same work and doubles the error.
- SAM with splitting micro-integration uses the same work and halves the error.

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(B) Van der Pol:

$$
\frac{d}{d\tau}q=p,\qquad \frac{d}{d\tau}p=-q+\epsilon(1-q^2)p.
$$

Perturbed harmonic oscillator. When the initial condition is away from limit cycle, solution needs  $\mathcal{O}(1/\epsilon)$  time-interval to reach the limit-cycle. In transient phase, solution changes by  $\mathcal{O}(\epsilon)$  between consecutive stroboscopic times. Near limit cycle by  $\mathcal{O}(\epsilon^2)$ .

 $\bullet$   $\;q(0)=p(0)=0.5,\;\epsilon=2^{-9},\;0\leq\tau\leq\tau_{\mathrm{end}}=32\pi\epsilon^{-1}\approx51,000$ 

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The following runs yield roughly the same errors:

- SAM with (variable step-size) ode45 macro-integrator (40 macro-steps); Strang splitting micro-integration  $\Delta \tau = \pi/16$
- SAM with the fifth-order formula of ode45, constant step-size (128 macro-steps); Strang splitting micro-integration  $\Delta \tau = \pi/16$
- Strang-splitting (260,000 steps),  $\Delta \tau = \pi/16$

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• SAM: macro-step-length in ode45 as a function of  $\tau$  and macro-step-length in constant step-size implementation. Note  $H$ may be 2, 000 or larger!

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# (C) DAEs:

- Approach easily extended to DAEs.
- Eg: vibrated inverted pendulum and vibrated double inverted pendulum formulated in cartesian coordinates. (Index 2 DAEs, if GGL approach used.)
- Half-explicit RK method of order 3 (Brasey/Hairer (1993)) as macro- and micro-integrator.

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• Error vs. number of micro-steps,  $\epsilon = 10^{-4}$ ,  $10^{-6}$ , stars: SAM with macro-step-size  $H = \pi/2500$ , circles: standard integration  $(h = 2\pi\epsilon/n, n = 2^j, j = 2, 3, ...).$  Dividing  $\epsilon$  by 100 does not change the error  $(\nu = 1)$ .

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