# Stepsize Selection in the Rigorous Defect Control of Taylor Series Methods

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#### The initial-value problem (IVP)

#### Consider

$$x'(t) = f(t, x(t))$$
  $x(t_0) = x_0$   $x \in \mathbb{R}^d$   $t \in [t_0, t_{end}]$ 

Given any  $u \in C^1([t_0, t_{end}], \mathbb{R}^d)$ ,  $u(t) = (u_1(t), \dots, u_d(t))$ 

- ► the residual or defect at *u* is  $\Delta u(t) \stackrel{\text{def}}{=} u'(t) - f(t, u(t)) \quad \Delta u(t_0) \stackrel{\text{def}}{=} u(t_0) - x_0$ you have space, increase line spacing
- u(t) solves exactly  $u'(t) = f(t, u(t)) + \Delta u(t)$   $u(t_0) = x_0 + \Delta u(t_0)$

### Approximate solution and defect control

Approximate solution (AS)

consistency with caps smalls

- Piecewise differentiable function
- defined in a neighborhood of start time
- nearly satisfies the initial condition

#### Given tolerance TOL

- modern numerical IVP solvers provide polynomial AS
- ► a defect control method tries to achieve (Enright 1989)  $\|\Delta u\|_{[t_0, t_{end}], \infty} \leq \text{TOL}$ Is this definition needed for 10 min? Talk is more informal  $\|w\|_{\mathcal{J}, \infty} \stackrel{\text{def}}{=} \sup \{\|w(t)\|_{\infty} \mid t \in \mathcal{J}\} \text{ for } w \in C^0(\mathcal{J}, \mathbb{R}^d)$

### Residual-based backward-error and analysis

Suppose  $\Delta u(t)$  is smaller than the perturbations inherent in the modelling context of the IVP

Don't see what the colors emphasize Suppose  $\Delta u$  satisfies  $\|\Delta u\|_{[t_0, t_{end}], \infty} \leq \text{TOL}$ 

Then u can be considered a satisfactory solution to

 $x'(t) = f(t, x(t)) \quad x(t_0) = x_0$ 

#### Forward vs. backward error

Forward error

- Standard IVP ODE solvers control local error on each step Local error control can be deceived No guaranteed bounds for the global error
- Interval methods compute such bounds Hard to keep them tight

Backward error

- ► Defect control methods estimate  $\|\Delta u\|_{[t_0, t_{end}], \infty}$
- We bound rigorously  $\|\Delta u\|_{[t_0, t_{end}], \infty}$

#### Previous work

- Enright advocates asymptotic defect control for Runge-Kutta (RK) methods
   Enright with coworkers and students (1989–2012)
- Defect control and ODE boundary value problem Enright and Muir, Shampine and Muir (1993–2004)
- Corless and Corliss (1991) "Rationale for Guaranteed ODE Defect Control" outlined an algorithm, no implementation details

## Outline

Integration scheme

Examples

Results

Conclusion

Results

#### Scheme to integrate ODE by time stepping

Given initial condition  $y_n$  at  $t_n$  and tolerance TOL, solve sequence of local problems

 $y'(t) = f(t, y(t)) \quad y(t_n) = y_n \quad y_0 = x_0$ 

- Misleading: AD is for TCs, from which H is formed after
  Compute Hermite polynomial approximate solution H automatic differentiation in floating-point arithmetic FADBAD++ (Bendtsen and Stauning)
  - If validated, Bound the defect ||∆H||<sub>[t<sub>n</sub>, t<sub>n+1</sub>],∞ ≤ TOL rigorous Taylor model arithmetic and rigorous sup-norm SOLLYA (Joldes et. al.)</sub>
  - Stepsize controller provides h<sub>n</sub>, take step t<sub>n+1</sub> = t<sub>n</sub> + h<sub>n</sub> floating-point arithmetic, very challenging to get right

Integration scheme	Examples	Results	Conclusion

#### Example: Lorenz system

Enclosures of  $\Delta H(t)$  and computed bounds



Results

Conclusion

#### Rigorous numerical results: Lorenz system

Integrated for  $t \in [0, 20]$ 

An entry under *defect* is the largest defect bound over all the steps Under *error* is the largest global error over [0, 20]

		max		num. steps	
k	TOL	defect	error	accept	reject
	1.0e-06	6.7e-07	3.1e-01	358	0
15	1.0e-08	5.2e-09	3.3e-03	487	0
15	1.0e-10	4.9e-11	7.0e-05	662	0
	1.0e-12	4.9e-13	1.6e-04	900	0
	1.0e-06	9.1e-07	1.9e+00	251	0
20	1.0e-08	6.9e-09	6.2e-03	317	0
	1.0e-10	5.6e-11	1.2e-04	399	0
	1.0e-12	5.0e-13	1.8e-04	503	0

Results

Conclusion

#### Rigorous numerical results: van der Pol

$$egin{aligned} & x_1' = x_2 \ & x_2' = 2(1-x_1^2)x_2 - x_1 \end{aligned} \quad & x(0) = (2,0)^T, \quad t \in [0,20] \end{aligned}$$

New table more informative, but this one still OK

		max		num.	steps
k	TOL	defect	error	accept	reject
	1.0e-06	8.3e-07	2.8e-07	79	0
15	1.0e-08	9.4e-09	3.7e-09	105	5
10	1.0e-10	7.7e-11	1.5e-10	142	4
	1.0e-12	8.9e-13	3.3e-12	194	5
	1.0e-06	9.2e-07	5.8e-07	58	3
20	1.0e-08	9.6e-09	1.3e-08	74	6
20	1.0e-10	7.3e-11	8.6e-11	93	4
	1.0e-12	9.0e-13	8.2e-13	116	3
Stepsize control appears very effective!					

Examples
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#### Results

Conclusion

#### Non-rigorous results for 25 DETEST problems at p = 8

TOL	NSTP	DMAX	Frac-D	RMAX	Frac-G
$10^{-2}$	571	2.04	0.02	2.82	1.0
$10^{-4}$	919	3.82	0.02	1.66	1.0
$10^{-6}$	1549	3.13	0.01	0.63	1.0
$10^{-8}$	2675	4.73	0.0	1.85	1.0

▶ Defect at *H* by 100 equidistant point evaluation over  $[t_n, t_{n+1}]$ 

- ► NSTP total number of steps Consid
  - DMAX max defect/tol over all steps

Frac-D fraction of steps where DMAX > 1

Consider color (f)\_ph^p out of the blue max defect/error estimate

Look carefully at the numbers

▶ RMAX max defect/ $\|(f)_p h^p\|_{\infty}$  over all steps

Frac-G fraction of steps where  $RMAX \le 1.01$  don't seem compatible

(Enright and Yan, 2010)

Integration so	heme
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#### Non-rigorous results for 25 DETEST problems at p = 20

TOL	NSTP	DMAX	Frac-D	RMAX	Frac-G
$10^{-2}$	345	2.71	0.06	2.0	0.99
$10^{-4}$	413	5.83	0.04	2.0	0.99
$10^{-6}$	502	3.22	0.03	2.0	1.0
$10^{-8}$	616	4.62	0.02	2.0	1.0

▶ Add  $10^{-10}$ , can't do  $10^{-12}$ 

surely you can do -12

- How Enright and Yan paper relates, why order 8
- What we are trying to show
- What we have shown
- Conclusions

Results

# Conclusion

- We have a simple defect control method for Taylor series solutions with an effective stepsize control
- Method can be applied with or without the validation phase
- With validation, we have achieved rigorous defect control, an open problem for over 25 years
- ▶ Without validation, the stepsize controller computes stepsizes that satisfy  $\|\Delta u\|_{[t_n, t_{n+1}],\infty} \leq \text{TOL}$  for 25 DETEST problems
- Validation phase can be applied to any ODE polynomial approximate solution

Open problem is NP != P This is hardly an open problem. Remove