

# pseudospectral methods for delay equations in population dynamics

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9th workshop

dynamical systems applied to biology and natural sciences

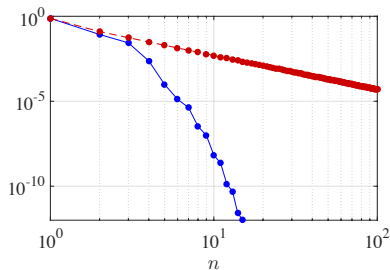
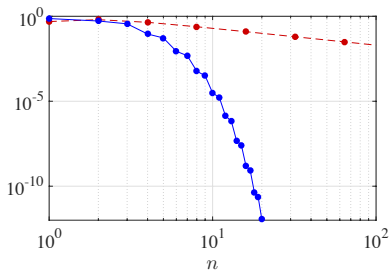
February 7 – 9, 2018 @ Torino (I)

# who

- A. Andò @ Udine (I)
- O. Diekmann @ Utrecht (NL)
- P. Getto @ Dresden (D)
- M. Gyllenberg @ Helsinki (FIN)
- D. Liessi @ Udine (I)
- S. Maset @ Trieste (I)
- A. de Roos @ Amsterdam (NL)
- J. Sánchez Sanz @ Bilbao (E)
- F. Scarabel @ Helsinki (FIN)
- R. Vermiglio @ Udine (I)

# pseudospectral methods and spectral accuracy

- substitute functions on intervals with interpolating polynomials on given nodes
- fine for smooth functions and good nodes (e.g., Chebyshev)
- example for  $f(t) = e^{-t^2}$ ,  $t \in [-1, 1]$ :
  - left: approximation of  $f'(0)$  via  $n$ -degree interpolation (blue) and finite differences with step  $2/n$  (red)
  - right: quadrature on  $[-1, 1]$  via  $n$ -degree interpolation (blue) and trapezoidal rule with step  $2/n$  (red)



- error:  $O(n^{-n})$  vs  $O(n^{-p})$  for some fixed  $p$

# daphnia

- a better way to model population dynamics, but lack of tools hinders diffusion
- size-structured consumer  $b$  competing for unstructured resource  $S$

$$\begin{cases} b(t) = \int_{a_A(S_t)}^h \beta(X(a, S_t), S(t)) \mathcal{F}(a, S_t) b(t-a) da, & b_t \in L^1([-h, 0], \mathbb{R}) \\ S'(t) = f(S(t)) - \int_0^h \gamma(X(a, S_t), S(t)) \mathcal{F}(a, S_t) b(t-a) da, & S_t \in C([-h, 0], \mathbb{R}) \\ x'(\alpha) = g(x(\alpha), S_t(\alpha-a)), & \alpha \in [0, a], \quad x(0) = x_b, \quad X(a, S_t) := x(a) \\ \bar{\mathcal{F}}'(\alpha) = -m(x(\alpha), S_t(\alpha-a)) \bar{\mathcal{F}}(\alpha), & \alpha \in [0, a], \quad \bar{\mathcal{F}}(0) = 1, \quad \mathcal{F}(a, S_t) := \bar{\mathcal{F}}(a) \end{cases}$$

- difficulties:
  - functional integro-differential
  - $\infty$  dimension
  - distributed delays
  - juveniles/adults discontinuities
  - state-dependent:  $X(a_A, S_t) = x_A$
  - nonlinear
  - outer ODEs



[Diekmann, Gyllenberg, Metz, Nakaoka, de Roos – JMB 2010]

# equilibria

- existence:

- trivial equilibria  $(0, \bar{S})$  satisfy  $f(\bar{S}) = 0$ , while nontrivial equilibria  $(\bar{b}, \bar{S})$  satisfy

$$\left\{ \begin{array}{l} 1 = \int_{\bar{a}}^h \beta(X(a, \bar{S}), \bar{S}) \mathcal{F}(a, \bar{S}) da \\ 0 = f(\bar{S}) - \int_0^h \gamma(X(a, \bar{S}), \bar{S}) \mathcal{F}(a, \bar{S}) \bar{b} da \\ X(\bar{a}, \bar{S}) = x_A \\ x'(\alpha) = g(x(\alpha), \bar{S}), \quad \alpha \in [0, a], \quad x(0) = x_b, \quad X(a, \bar{S}) := x(a) \\ \bar{\mathcal{F}}'(\alpha) = -m(x(\alpha), \bar{S}) \bar{\mathcal{F}}(\alpha), \quad \alpha \in [0, a], \quad \bar{\mathcal{F}}(0) = 1, \quad \mathcal{F}(a, \bar{S}) := \bar{\mathcal{F}}(a) \end{array} \right.$$

- computation:

- Newton or Broyden methods for nonlinear equations
- Runge-Kutta methods for ODEs (automatic step and event detection for  $\bar{a}$ )
- continuation for parameter variation

- stability and bifurcation:

- infinitesimal generator approach via pseudospectral methods

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[B., Getto, Sánchez Sanz, Vermiglio – SISC 2015]

[Sánchez Sanz, Getto – BMB 2016]

# linearization

- leads to

$$\begin{bmatrix} \mathbf{b}(t) \\ \mathbf{S}'(t) \end{bmatrix} = \mathbf{A} \begin{bmatrix} \mathbf{b}(t) \\ \mathbf{S}(t) \end{bmatrix} + \int_{-\bar{a}_A}^0 \mathbf{B}^{(J)}(\theta) \begin{bmatrix} \mathbf{b}(t+\theta) \\ \mathbf{S}(t+\theta) \end{bmatrix} d\theta + \int_{-h}^{-\bar{a}_A} \mathbf{B}^{(A)}(\theta) \begin{bmatrix} \mathbf{b}(t+\theta) \\ \mathbf{S}(t+\theta) \end{bmatrix} d\theta$$

- difficult and complicated:

$$\begin{aligned} B_{22}^{(J)}(\theta) = & -\frac{\bar{b}(\gamma^+ - \gamma^-)}{g^-} \mathcal{F}(\bar{a}_A, \bar{S}) \mathcal{K}(\bar{a}_A, \bar{a}_A + \theta) \\ & - \bar{b} \int_{\bar{a}_A}^{\min\{-\theta + \bar{a}_A, h\}} \mathcal{F}(\sigma, \bar{S}) \left[ \frac{\mu^- - \mu^+}{g^-} \gamma(\sigma) \mathcal{K}(\bar{a}_A, \sigma + \theta) \right. \\ & \left. + \left( \frac{g^+}{g^-} - 1 \right) \left( \gamma_1(\sigma) \mathcal{K}(\sigma, \sigma + \theta) - \gamma(\sigma) \int_{\bar{a}_A}^{\sigma} \mu_1(\rho) \mathcal{K}(\rho, \sigma + \theta) d\rho \right) \right] d\sigma \\ & - \bar{b} \int_{-\theta}^h [\gamma_1(\sigma) \mathcal{F}(\sigma, \bar{S}) \mathcal{K}(\sigma, \sigma + \theta) + \gamma(\sigma) \mathcal{H}(\sigma, \sigma + \theta)] d\sigma \\ \mathcal{K}(\alpha_1, \alpha_2) = & e^{\int_{\alpha_2}^{\alpha_1} g_1(\theta) d\theta} g_2(\alpha_2) \\ \mathcal{H}(\alpha_1, \alpha_2) = & -\mathcal{F}(\alpha_1, \bar{S}) \left( \int_{\alpha_2}^{\alpha_1} \mu_1(\theta) \mathcal{K}(\theta, \alpha_2) d\theta + \mu_2(\alpha_2) \right) \end{aligned}$$

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[B., Getto, Sánchez Sanz, Vermiglio – SISC 2015]  
[de Roos, Diekmann, Getto, Kirkilionis – BMB 2016]

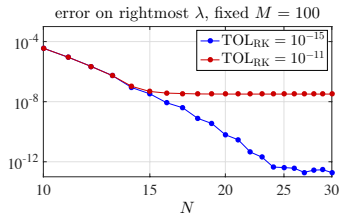
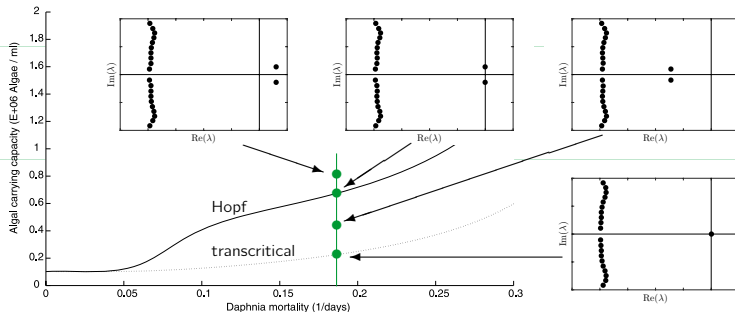
# eigenvalues

- ensure spectral convergence: small matrices, high accuracy, fast algorithms
- outer integrals: piecewise quadrature for J/A discontinuities
- piecewise discretization of generator: same quadrature and interpolation nodes
- inner integrals:
  - variable integration intervals
  - split according to J/A discontinuities again
  - about 40 integrals per node!
- evaluation of A and B's:
  - no relation between quadrature and RK nodes used for ODEs
  - dense output is mandatory
- possible since  $\bar{a}_A$  constant and known: state dependency disappears

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[B., Getto, Sánchez Sanz, Vermiglio – SISC 2015]

# results and open issues



- convergence w.r.t. tolerance of Newton or Broyden methods
- optimal tuning of discretization parameters
- conditioning of discretized generator
- instability barrier for  $\Re(\lambda) < (\log \varepsilon)/h$

curves from [de Roos, Diekmann, Getto, Kirkilionis – BMB 2010]  
eigenvalues from [B., Getto, Sánchez-Sanz, Vermiglio – SISC 2015]



# periodic solutions

- existence:
  - start from Hopf bifurcations
- computation:
  - as boundary value problem
  - orthogonal collocation
  - continuation
- stability and bifurcation:
  - Floquet theory (ongoing)
  - numerical linearization
  - pseudospectral discretization of monodromy operator

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[Engelborghs, Luzyanina, In 't Hout, Roose – SISC 2000]

[Maset – SINUM 2015 – NM 2016]

[B., Diekmann, Liessi, Scarabel – EJQTDE 2016]

[Liessi – PhD thesis 2018]

[B., Liessi – SINUM accepted]

# back to ODEs

- pros:

- complete and efficient bifurcation tools for ODEs (MATCONT, AUTO,...)
- spectral accuracy reasonably implies few (?) ODEs
- works well for given and explicit RHS

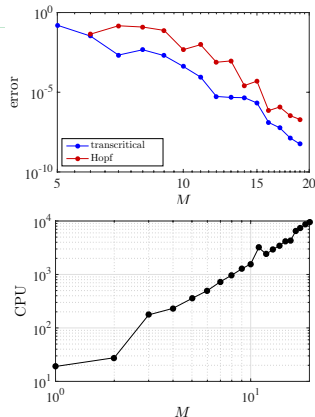
- daphnia requires black-box RHS for

- automatic dense RK solvers for ODEs
- automatic adaptive quadrature
- automatic detection of  $\bar{a}$

which asks to call external routines every time the bifurcation package evaluates the RHS

- high computational cost/time:

- efficient continuation
- HPC



[B., Diekmann, Gyllenberg, Scarabel, Vermiglio – SIADS 2016]  
Andò – ongoing PhD

## two directions

- pseudospectral reduction of nonlinear DEs to ODEs + ODEs tools
  - easy to derive
  - need to optimize computational efficiency
  - lack of convergence proofs
- principle of linearized stability + pseudospectral approximation of spectra:
  - equilibria, cycles,...,chaos
  - need for theoretical background
  - not easy to devise, implement and use
  - more efficient
- example: detect chaos via Lyapunov exponents
  - reduce to ODEs and apply QR methods? [B., Della Schiava – DCDS-B 2018]
  - develope theory and methods ad-hoc? [B. Van Vleck – NM 2014]

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thanks for your attention