

Spectral deferred corrections with fast-wave slow-wave splitting

ECMWF Workshop on numerical and computational methods for
simulation of all-scale geophysical flows

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Physically insignificant fast waves

<https://www.youtube.com/watch?v=ielLUnkdD90>

Image: NOAA

Figure: "Ten years of weather in 3 minutes".

- ▶ Acoustic waves have essentially no impact on larger scale atmospheric dynamics but severely restrict the time step:

e.g. 2000 m grid resolution divided by $300 \text{ m s}^{-1} \approx \Delta t \leq 6.7 \text{ s}$

How to cope?

- ▶ Change the model: anelastic or pseudo-incompressible equations: remove acoustic waves from the system
- ▶ Use explicit integration with sub-stepping, e.g. RK-3 for advection and forward-backward Euler for acoustic terms
- ▶ Or: go IMEX. Integrate fast terms implicitly and slow terms explicitly.
 - Higher order methods can be difficult to derive, many order conditions!
 - Increasing order can reduce stability

...wouldn't it be nice to have an *easy* way to construct an IMEX integrator?

Collocation

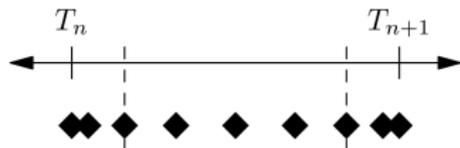


Figure: A time-step $[T_n, T_{n+1}]$ with $M = 9$ Gauss-Lobatto collocation nodes t_j .

- ▶ Consider Picard formulation of IVP

$$u(T_{n+1}) = u(T_n) + \int_{T_n}^{T_{n+1}} f(\tau, u(\tau)) d\tau$$

- ▶ Approximation of integral by quadrature leads to collocation problem

$$\mathbf{U} = \mathbf{U}_0 + \Delta t \mathbf{QF}(\mathbf{U}), \quad \mathbf{U} = (u_1, \dots, u_M)^T \in \mathbb{R}^{NM \times NM}$$

with $u_j \approx u(t_j)$ approximations at the quadrature nodes

- ▶ Collocation methods are a subclass of implicit Runge Kutta methods¹

¹Hairer, Nørsett, and Wanner 1993, Theorem 7.7.

Spectral deferred corrections (SDC)²

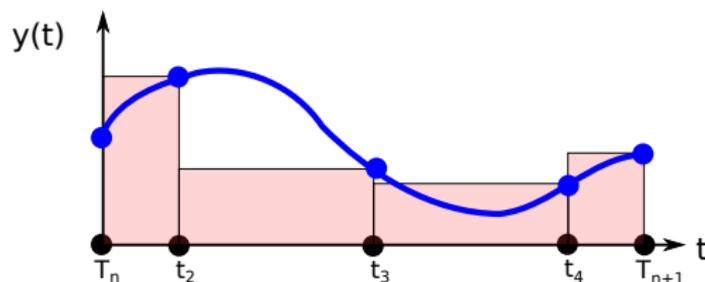


Figure: Composite rectangular rule \mathbf{Q}_Δ (red) as "preconditioner" for collocation rule \mathbf{Q} (blue)

- ▶ SDC can be considered as a preconditioned Richardson iteration

$$\mathbf{U}^{k+1} = \mathbf{U}^k + (\mathbf{I} - \Delta t \mathbf{Q}_\Delta \mathbf{F})^{-1} [\mathbf{U}_0 - (\mathbf{I} - \Delta t \mathbf{Q} \mathbf{F}) \mathbf{U}^k], \quad \mathbf{Q}_\Delta \approx \mathbf{Q}, \quad \mathbf{U} \in \mathbb{R}^{NM}$$

with $\mathbf{U}^k = (\mathbf{u}_1, \dots, \mathbf{u}_M)^t$.

- ▶ Or, in "node-to-node" form,

$$u_{m+1}^{k+1} = u_m^{k+1} + \Delta t_m f(u_{m+1}^{k+1}) - \Delta t_m f(u_{m+1}^k) + \sum_{j=1}^M s_{m,j} f(u_j^k)$$

so that one iteration step $k \rightarrow k+1 \Leftrightarrow$ one "sweep" with implicit Euler

²Dutt, Greengard, and Rokhlin 2000, *BIT Numerical Mathematics*.

SDC with fast-wave slow-wave splitting

- ▶ For $f(y) = f_f(y) + f_s(y)$, instead of backward Euler

$$u_{m+1}^{k+1} = u_m^{k+1} + \Delta t_m f(u_{m+1}^{k+1}) - \Delta t_m f(u_{m+1}^k) + \sum_{j=1}^M s_{m,j} f(u_j^k),$$

can use IMEX as base method ("preconditioner") in SDC³

$$u_{m+1}^{k+1} = u_m^{k+1} + \Delta t_m \left[f_f(u_{m+1}^{k+1}) + f_s(u_m^{k+1}) + f_f(u_{m+1}^k) + f_s(u_m^k) \right] + \sum_{j=1}^M s_{m,j} f(u_j^k)$$

- ▶ In previous works, stiff/fast term from diffusion or chemical reaction⁴
- ▶ But: what about a fast waves, e.g. acoustic waves?
→ SDC with *fast-wave slow-wave splitting* ("fsw-sdc")⁵

³Minion 2003, *Communications in Mathematical Sciences*.

⁴Layton and Minion 2004, *Journal of Computational Physics*.

⁵Ruprecht and Speck 2016, *SIAM Journal on Scientific Computing*.

Two views on convergence of SDC

Theorem: SDC as iterative solver

For $y' = f(y) = \lambda y$ and $|\lambda| \Delta t < 1$, the *error propagation matrix* \mathbf{E}_{sdc} of the SDC iteration satisfies

$$\|\mathbf{E}_{\text{sdc}}\|_{\infty} \leq \frac{(1 + \Lambda_n) \Delta t |\lambda|}{1 - \Delta t |\lambda|} = \mathcal{O}(\Delta t) \text{ as } \Delta t \rightarrow 0$$

where Λ_n is the Lebesgue constant for the collocation nodes $(\tau_m)_{m=1, \dots, M}$.

Theorem: SDC to generate methods of fixed high order

The *local truncation error* of SDC based on a quadrature rule with order p with a fixed number of K iterations is

$$\left| u(T_{n+1}) - u_{n+1}^K \right| = \mathcal{O}(\Delta t^{\min\{K+1, p+1\}}) \text{ as } \Delta t \rightarrow 0.$$

Order of convergence

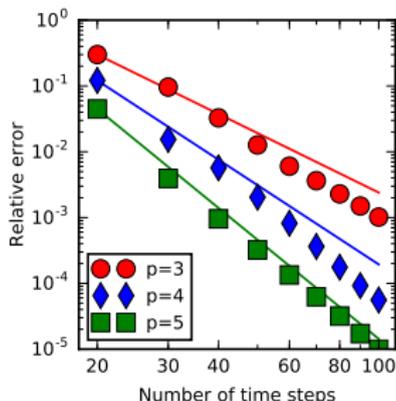


Figure: Convergence of SDC order $p = 3$, $p = 4$, $p = 5$.

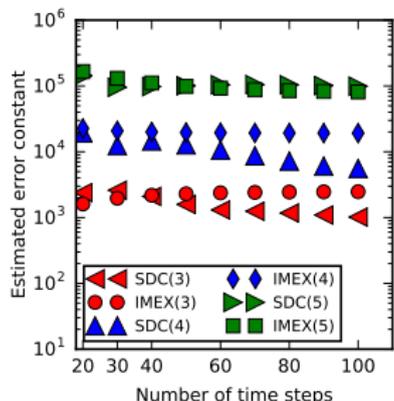


Figure: Estimated error constants of SDC and IMEX Runge-Kutta.

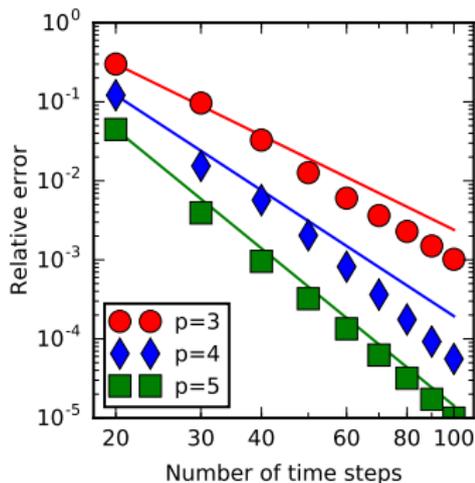
Acoustic-advection equations:

$$u_t + Uu_x + c_s p_x = 0$$

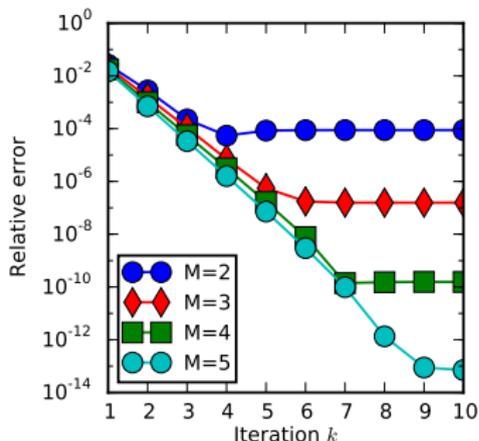
$$p_t + Up_x + c_s u_x = 0$$

with $u(x, 0) = \sin(2\pi x) + \sin(10\pi x)$.

Two views on SDC



(a) Relative error versus time step Δt



(b) Relative error versus iteration k

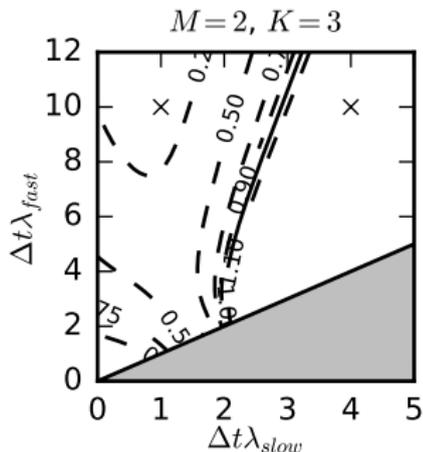
Figure: Convergence of SDC in Δt (left) and k (right) for $u'(t) = i\lambda_{fast}u(t) + i\lambda_{slow}u(t)$.

Can view SDC as...¹

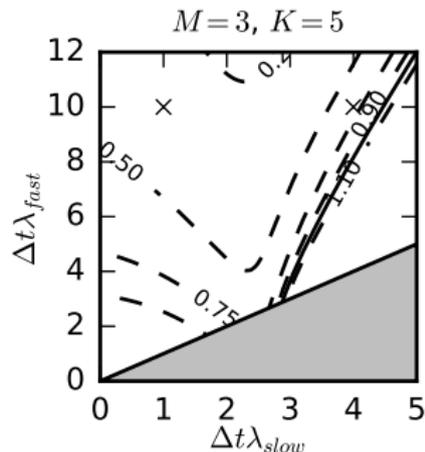
- ▶ framework to generate method of fixed order
- ▶ iterative solver for collocation problem

¹Code available from <https://github.com/Parallel-in-Time/pySDC>

Stability of FWSW-SDC



(a) Third-order



(b) Fifth-order

- ▶ Stability of SDC with fast-wave slow-wave splitting for test problem

$$u'(t) = \underbrace{i\lambda_{\text{fast}} u(t)}_{\text{implicit}} + \underbrace{i\lambda_{\text{slow}} u(t)}_{\text{explicit}}, \quad u(0) = 1, \quad \lambda_{\text{fast}}, \lambda_{\text{slow}} \in \mathbb{R}.$$

- ▶ Choice of nodes critical to get stability for $\Delta t \lambda_{\text{fast}} \gg 1$.

Dispersion relation

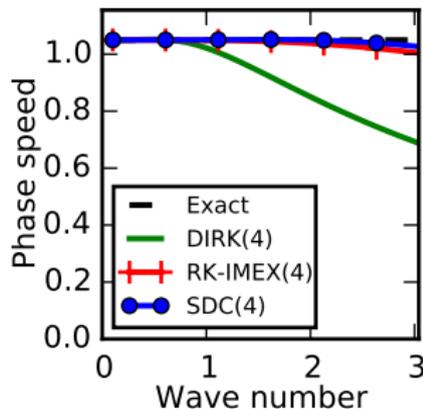
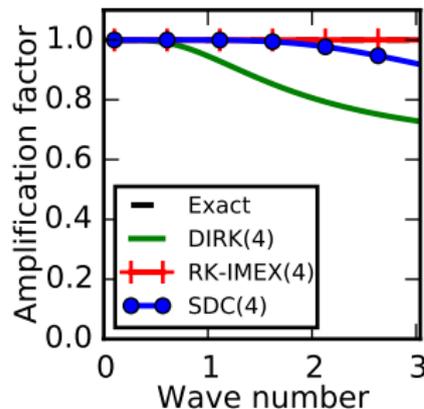
(a) Phase speed $\text{Real}(\omega)/\kappa$.(b) Amplification factor $\exp(\text{Imag}(\omega))$.

Figure: Discrete dispersion relation for SDC, DIRK-RK and IMEX-RK.

- ▶ Connection between frequency ω and wave number κ in semi-discrete acoustic-advection problem

$$u_t + Uu_x + c_s p_x = 0$$

$$p_t + Up_x + c_s u_x = 0$$

- ▶ Continuous dispersion relation $\omega = (U \pm c_s) \kappa$.

Multi-scale initial data⁶

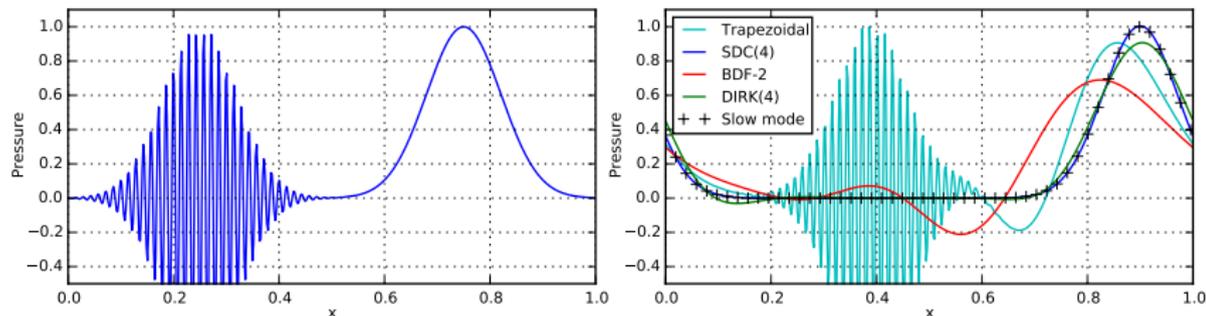


Figure: Multi-scale initial data (left). Pressure at $T = 3$ for four different methods (right).

Acoustic-advection equations:

$$u_t + Uu_x + c_s p_x = 0$$

$$p_t + Up_x + c_s u_x = 0$$

with multi-scale initial data.

⁶Vater, Klein, and Knio 2011, *Acta Geophysica*.

Compressible two-dimensional linear Boussinesq equations

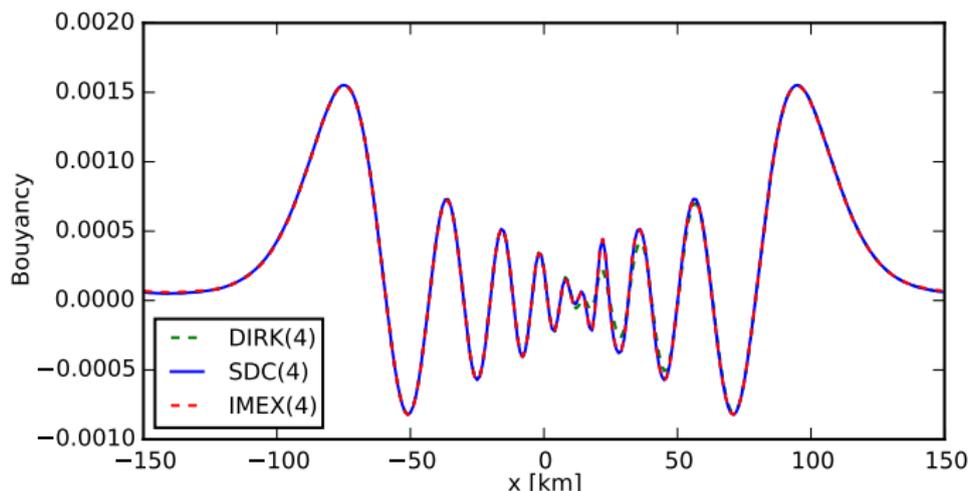


Figure: Gravity wave propagating in a channel.

Equations:

$$u_t + Uu_x + c_s p_x = 0$$

$$w_t + Uw_x + c_s p_z = b$$

$$b_t + Ub_x + N^2 w = 0$$

$$p_t + Up_x + c_s (u_x + w_z) = 0$$

- ▶ Count total number of GMRES iterations in implicit part
- ▶ IMEX-RK and FWSW-SDC solve red terms implicitly
- ▶ DIRK solves everything implicitly

GMRES iterations

| Third-order | $\Delta t = 30 \text{ s}$ | | | $\Delta t = 6 \text{ s}$ | | |
|--------------------|---------------------------|----------|--------|--------------------------|--------|--------|
| | DIRK | IMEX | SDC | DIRK | IMEX | SDC |
| # implicit solves | 200 | | 900 | 1000 | 2000 | 4500 |
| # GMRES iterations | 46,702 | | 25,819 | 28,863 | 13,782 | 25,051 |
| avg. it. per call | 233.5 | | 28.7 | 28.9 | 6.9 | 5.6 |
| est. error | 1.8e-1 | unstable | 1.1e-1 | 9.6e-2 | 1.7e-2 | 1.5e-2 |

| Fourth-order | $\Delta t = 30 \text{ s}$ | | | $\Delta t = 6 \text{ s}$ | | |
|--------------------|---------------------------|--------|--------|--------------------------|--------|--------|
| | DIRK | IMEX | SDC | DIRK | IMEX | SDC |
| # implicit solves | 300 | 500 | 1200 | 1500 | 2500 | 6000 |
| # GMRES iterations | 100,651 | 38,092 | 31,105 | 66,136 | 24,068 | 32,696 |
| avg. it. per call | 335.5 | 76.2 | 25.9 | 44.1 | 9.6 | 5.4 |
| est. error | 1.5e-1 | 1.3e-1 | 9.9e-2 | 9.4e-2 | 4.2e-3 | 2.9e-3 |

| Fifth-order | $\Delta t = 30 \text{ s}$ | | | $\Delta t = 6 \text{ s}$ | | |
|--------------------|---------------------------|----------|--------|--------------------------|--------|--------|
| | DIRK | IMEX | SDC | DIRK | IMEX | SDC |
| # implicit solves | 500 | | 1500 | 2500 | 3500 | 7500 |
| # GMRES iterations | 38,334 | | 34,732 | 24,592 | 24,649 | 32,724 |
| avg. it. per call | 76.7 | | 23.2 | 9.8 | 7.0 | 4.4 |
| est. error | 9.6e-2 | unstable | 9.7e-2 | 3.4e-3 | 2.7e-3 | 2.6e-3 |

FWSW-SDC – Summary

- ▶ Spectral deferred corrections are an easy way to generate high order time integration schemes
- ▶ Can use as framework with different integrators as base method: Boris, IMEX Euler, ...
- ▶ FWSW-SDC produces high order methods with fast-wave slow-wave splitting ... it has favourable properties and is less expensive than you might think!
- ▶ For more information please see [Daniel Ruprecht and Robert Speck \(2016\)](#). “Spectral Deferred Corrections with Fast-wave Slow-wave Splitting”. In: *SIAM Journal on Scientific Computing* 38.4, A2535–A2557. DOI: 10.1137/16M1060078. URL: <http://dx.doi.org/10.1137/16M1060078>

The PinT Community

To learn more about parallel-in-time integration, check the new website

www.parallelintime.org

and/or come to one of the PinT Workshops, e.g.

5th Workshop on Parallel-in-Time Integration

- ▶ Nov 27 - Dec 2, 2016
- ▶ Banff International Research Station (BIRS), Calgary (CA)
- ▶ by M. Emmett, M. Gander, R. Haynes, R. Krause, M. Minion

There is also a new mailing list, join by writing to

parallelintime+subscribe@googlegroups.com

No Google account required!