## **Section 3**

Computational studies including new techniques, parallel processing, GPUs. Effects of model resolution.

## Compact finite-difference schemes for quasilinear conservation laws

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Many physical phenomena (e.g., gas dynamics) are described by systems of quasi-linear PDE such as conservation laws. Since Richardson's famous attempt a century ago, they have been used for weather forecasting. Of course, modern models include descriptions of a huge number of additional physical processes, starting with turbulent viscosity and phase transitions. But the most important block of numerical hydrodynamic weather forecast is still an effective solver for systems of conservation laws. In the simplest case, this is the Euler – Hopf equation:  $\partial_t u + \partial_x (u^2/2) = 0$ .

In solutions of such equations, a so-called "gradient catastrophe" is possible — a discontinuous solution is obtained from a smooth initial condition in a finite time [1, 2].

The famous Godunov scheme [3] provides convergence of the difference scheme's solution to the exact weak solution, but this convergence is slow, and such a scheme is not very effective on

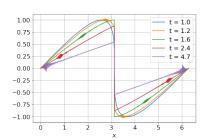


Figure 1: The solution without smoothing

smooth solutions. We need a difference scheme that provides a high order of accuracy on smooth solutions, and also converges to a weak solution after a gradient catastrophe. Typical computational artifacts are: the appearance of short—wave oscillations with a period of 2h ("saw-tooth" type) and/or "smoothing" of discontinuities — instead of a true strong discontinuous solution. Such TVD (total variation diminishing) schemes were described in [4]–[6] and in many others. Here  $h, \tau$ — steps with respect to x and t, correspondingly.

Let's approximate (see [7]) the relation  $\partial_t u = \partial_x f$  where  $f = -(u^2/2)$ , by a compact implicit difference scheme on 6-knot stencils for u and f:

$$a_1 u_{j-1}^{n+1} + b_1 u_j^{n+1} + c_1 u_{j+1}^{n+1} + a_0 u_{j-1}^n + b_0 u_j^n + c_0 u_{j+1}^n =$$

$$= p_1 f_{j-1}^{n+1} + q_1 f_j^{n+1} + r_1 f_{j+1}^{n+1} + p_0 f_{j-1}^n + q_0 f_j^n + r_0 f_{j+1}^n,$$
where  $n$  and  $j$  are the indices with respect to  $t$  and

x, respectively, and the coefficients that provide high accuracy order:

$$a_0 = -1$$
,  $a_1 = 1$ ,  $b_0 = -4$ ,  $b_1 = 4$ ,  $c_0 = -1$ ,  $c_1 = 1$ ,  $p_0 = p_1 = \frac{-3\kappa}{2}$ ,  $q_0 = q_1 = 0$ ,  $r_0 = r_1 = \frac{3\kappa}{2}$ ,  $\kappa = \frac{\tau}{h}$ .

tain a system of quadratic algebraic equations  $\{u_j^{n+1}\}_{j=1}^M,$ where Mis the number of knots with spect to To x. avoid this

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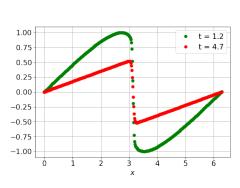


Figure 2: The smoothing of the solution, where the discontinuity is not accounted while smoothing

cult computational problems we first use the explicit Euler scheme to get the first guess  $\{\hat{u}_j^{n+1}\}_{j=1}^M$  and then introduce the representation  $u_j^{n+1} = \hat{u}_j^{n+1} + \varepsilon_j^{n+1}$ , where the values  $\varepsilon_j^{n+1}$  are small.

Let's neglect the squares of these small quantities. turns out a tridiagonal SLAE for  $\operatorname{small}$ perturbations  $\{\varepsilon_j^{n+1}\}_{j=1}^M$ of order M,

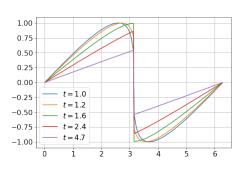


Figure 3: The solution for the full compact scheme

which is convenient to solve by the double-sweep method. If the values  $\{|\varepsilon_j^{n+1}|\}_{j=1}^M$  are not very small, we repeat the iteration.

The zone with a large gradient of the solution u(t, x) emits a wave packet of short waves of the "sawtooth" type, Fig. 1. To dampen these artificial computational waves, we use special grid smoothing operators that are close to the identical operator on long waves and suppress "saw-tooth" type waves. Explicit or implicit (compact) grid smoothing operators are

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used. This ensures the correct behavior of the total variation  $(TV(n) = \sum_j |u_{j+1}^n - u_j^n|)$  and the first integrals of the finite difference solution. Fig.2–5.

It is possible to smooth the solution on the entire periodic grid to suppress the "saw-tooth" type oscillation. However, the jump itself will be smoothed too (it is smeared and its amplitude decreases), see Fig.2. It is better to smooth the solution separatly for each interval between jumps (in our example, this is one interval); see Fig.3 for the more exact solution.

We have choiced experimentally the parameters of these smoothing operators obtain to scheme a with effective damping of artificial short waves and

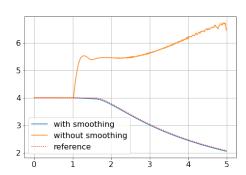


Figure 4: The total variation of the solutions of the compact difference scheme with/without smoothing operator and for the reference weak solution

also does not allow smoothing of the discontinuity, Fig.3. The solution with initial data  $u(0, x) = \sin(x)$ ,  $x \in [0, 2\pi)$  was used for these experiments.

The integral functionals of the form  $I_g[u] = \int_0^{2\pi} g(u(t,x)) dx$ , are constant as long as the solution u(t,x) of the Euler – Hopf equation with the periodic boundary conditions is smooth. Here g is an arbitrary smooth function.

After gradithe ent catastrophe, only the first integral for g(u)u is preserved, and other the ones decrease. For the compact scheme with suit-

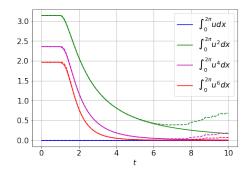


Figure 5: The dynamics of the functionals  $I_k[u] = \int_0^{2\pi} u^k(t,x) dx$  for the compact scheme (dotted line — the compact scheme without smoothing)

able choice of the smoothing operators, the evolution of the first integrals is exactly the same, Fig.5.

Conclusion. The compact implicit finite-difference "predictor – corrector" scheme demonstrated high accuracy not only for smooth solutions, but for non-smooth and discontinuous ones, too. We apply on every temporal step first explicit Euler scheme and second effective double-sweep method to determine perturbations according to the compact high order scheme. Then the smoothing maps damp artificial short waves in the solution. The approach can be applied for systems of conservation laws as well as for such equations together with linear diffusion.

## References

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