

# A stochastic scheme for front tracking on unstructured meshes.

Olivier Hurisse<sup>†</sup>

<sup>†</sup>EDF R&D MFEE, 6 quai Watier, 78400 Chatou, France.  
olivier.hurisse@edf.fr

*“Interfaces and Mixing in Fluids, Plasmas, Materials”,  
Turbulent Mixing and Beyond, TMB-2023B,  
23 - 26 October 2023, Kavli institute - Santa-Barbara - USA.*



# Plan

- 1 Introduction
- 2 Description of the scheme
- 3 Numerical results for a canonical test
- 4 Simulation of a single-mode Richtmeyer-Meshkov instability
- 5 Final remarks

# Plan

- 1 Introduction
- 2 Description of the scheme
- 3 Numerical results for a canonical test
- 4 Simulation of a single-mode Richtmeyer-Meshkov instability
- 5 Final remarks

Many physical problems involve physical fronts, which are thin interface between two physical domains with different properties, for instance: multi-phase flows or reacting flows.

In a numerical point of view, dealing with these fronts is a challenging task because numerical diffusion tends to smear the sharp fronts and then to create “non-physical mixing layers”.

Many efficient and sophisticated methods have been proposed in order to deal with front propagation.

- Level set, VOF, front discretization/lagrangian;
- High-order methods;
- **Compressive/sharpening methods.**

In this talk, a new sharpening technique is presented. It involves a **fractional step approach** and a random choice.

Two references are on the basis of the present work:

“*Solutions in the large for nonlinear hyperbolic systems of equations*”, Glimm, 1965.

“*Probabilistic analysis of the upwind scheme for transport equations*”, Delarue&Lagoutière, 2011.

## **“Solutions in the large for nonlinear hyperbolic systems of equations”, James Glimm, Communications on pure and applied mathematics, 1965.**

- 1st order FV scheme without spatial average process  
→ Fronts remain perfectly sharp.
- Effective convergence rate of 1, even on the LD fields ! (1/2 for classical 1st order FV schemes)
- Restricted to 1D.

## **“Probabilistic analysis of the upwind scheme for transport equations”, Francois Delarue, Frédéric Lagoutière, Archive for rational mechanics and analysis, 2011.**

- Analysis of the Upwind scheme in terms of the expectation of a stochastic process, even for unstructured multi-D meshes.
- Proof of convergence with order 1/2 for the Upwind scheme.
- The latter arises from the statistical average.

We present here a scheme that is based on these ideas and which has been proposed in the three following references.

- “*On the use of Glimm-like schemes for transport equations on multi-dimensional domain*”, O. Hurisse, Int. Journal for Numerical Methods in Fluids, Vol 93(4), 2020, (<https://hal.archives-ouvertes.fr/hal-02462202>).  
⇒ Numerical studies: robustness, rate of convergence, accuracy, ...
- “*Convergence of a multidimensional Glimm-like scheme for the transport of fronts*”, T. Gallouët, O. Hurisse, IMA Journal of Numerical Analysis, Vol. 42(4), 2022, (<https://hal.archives-ouvertes.fr/hal-02940407>).  
⇒ Theoretical analysis: proof of convergence for a simple situation
- “*A random choice scheme for scalar advection*”, T. Gallouët, O. Hurisse, S. Kokh, Int. Journal for Numerical Methods in Fluids, 2023.  
⇒ Extension of the scheme to the advection of any scalar quantity.

## Outline of the talk:

- Description of the scheme
- Numerical examples

# Plan

- 1 Introduction
- 2 Description of the scheme
- 3 Numerical results for a canonical test
- 4 Simulation of a single-mode Richtmeyer-Meshkov instability
- 5 Final remarks

## Front propagation problem.

Let us consider the two-dimensional advection problem of the quantity  $\phi$ :

$$\begin{cases} \frac{\partial}{\partial t} \phi(t, x, y) + \mathcal{U}(t, x, y) \cdot \nabla \phi(t, x, y) = 0, \\ \phi(t = 0, x) \in \{0, 1\}, \end{cases} \quad (1)$$

where  $\mathcal{U}$  is a given smooth velocity field.

For the sake of simplicity, we restrict here to divergence-free velocity fields:

$$\nabla \cdot \mathcal{U} = 0.$$

But the scheme can be applied for more general compressible models.

System (1) then reads in conservative form:

$$\begin{cases} \frac{\partial}{\partial t} \phi(t, x, y) + \nabla \cdot (\mathcal{U}(t, x, y) \phi(t, x, y)) = 0, \\ \phi(t = 0, x) \in \{0, 1\}. \end{cases} \quad (2)$$



## Definition of the scheme

We assume that:  $\forall i \phi_i^n \in \{0,1\}$  at time  $t^n$ . We set  $t^{n+1} = t^n + \Delta t$ .

**The overall scheme is based on a fractional step approach:**

- Prediction step = an Upwind scheme (convection step),  $(\phi_i^n)_i \rightarrow (\phi_i^{n+1,*})_i$

$$\frac{|\Omega_i|}{\Delta t} \left( \phi_i^{n+1,*} - \phi_i^n \right) + \sum_{\Omega_j \text{ neigh. } \Omega_i} \phi_{ij}^n \mathcal{U}(t^n, \bar{x}_{ij}) \cdot n_{ij} S_{ij} = 0,$$

where:

$$\phi_{ij}^n = \phi_i^n, \text{ if } \mathcal{U}(t^n, \bar{x}_{ij}) \cdot n_{ij} > 0, \phi_{ij}^n = \phi_j^n \text{ otherwise.}$$

Explicit scheme  $\rightarrow$  a classical CFL constraint on  $\Delta t$  has to be fulfilled.

- Projection step = Glimm Random Update / GRU,  $\phi_i^{n+1,*} \rightarrow \phi_i^{n+1}$

$$\phi_i^{n+1} = \begin{cases} 1, & \text{if } \omega^n \in [0, \phi_i^{n+1,*}), \\ 0, & \text{otherwise,} \end{cases} \quad (3)$$

where  $\omega^n$  follows a uniform dist. on  $(0,1)$ . *This is a cell-wise update.*

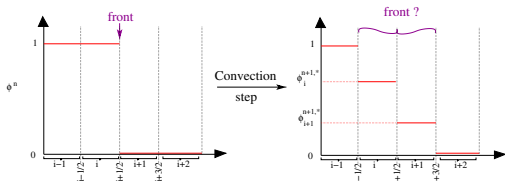
**In the following, Upwind step + GRU step  $\rightarrow$  Upwind-GRU.**

# Illustration for a 1st order FV scheme with 2-point flux and MP

## Prediction step:

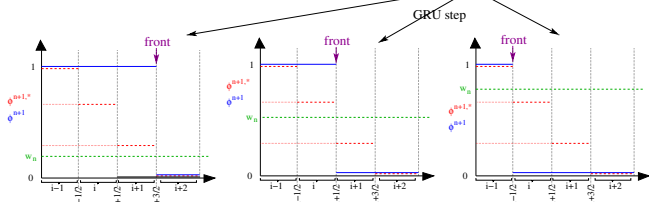
After the convection step, the *front is smeared*. If the convection step is consistent, the front is located somewhere inside this "smeared region".

Where could the new front be located ?

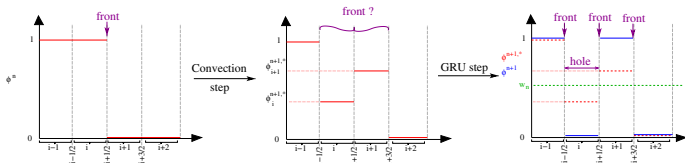


## Projection step/GRU:

Several positions are possible depending on the value of  $\omega^n$  which is the same for all cells. There are three possible locations on this example.



- Choosing the **same**  $\omega^n$  for all the cells with a **monotonicity preserving (MP) convection scheme**  $\Rightarrow$  **no hole is introduced**.
- Counterexample with a non-MP scheme:



- Convection step  $\Rightarrow \phi_i^{n+1,*}$  may be  $\neq$  from  $\{0,1\}$  in the cells near the front.
- But if the convection scheme is consistent, the exact front is somewhere in the domain where  $\phi_i^{n+1,*} \in ]0,1[$ .
- Projection step/GRU  $\Rightarrow \phi_i^{n+1}$  belongs to  $\{0,1\}$  for all the cells.
- Hence, the approximated front is perfectly sharp...**
- ... but not exactly at the location of the exact front. This is true but only statistically (thanks to the statistical consistency).**
- On regular cartesian meshes, the approximated front is simply translated (with MP convection scheme).

## Additional remarks

- The overall scheme is not conservative (only statistically conservative).
- The method can be applied to compressible flows,  $\nabla \cdot \mathcal{U} = 0$  is not mandatory. This choice just renders the first part of the talk more easy, but numerical tests for compressible flows are presented in the next sections.
- The velocity field can also be an approximated solution (for instance when coupling  $\phi$  with the velocity field arising from the Euler system).
- Many other schemes may be used instead of the Upwind scheme, for instance high order schemes (MUSCL/RK2/Minmod has been tested).
- In fact, it seems that the main requirement for the convection scheme is to be “monotonicity preserving” (see next point).
- No hole is created when using the same  $\omega^n$  for all the cells at a given iteration  $n$  (with a “monotonicity preserving” scheme).
- In a practical point of view, uniform distribution is replaced by low-discrepancy sequences (see below).
- Implementation of the GRU step is (very) easy on multi-D unstructured meshes and for multi-processor computers.
- CPU-time: GRU-step is almost free (can be restricted to the cells near the front).
- **Pathological cases for “thin shapes”/fronts collapse** (see example in the section presenting some numerical results).

# Plan

- 1 Introduction
- 2 Description of the scheme
- 3 Numerical results for a canonical test**
- 4 Simulation of a single-mode Richtmeyer-Meshkov instability
- 5 Final remarks

## Quasi-random generator/Low-discrepancy sequences

The random number  $\omega^n$  is generated thanks to a uniform distribution  $\mathcal{U}(0,1)$ .

But from a practical point of view,  $\omega^n$  is chosen in quasi-random low-discrepancy sequences.

In the following, results are obtained using two families of sequences.

- **The Halton-Van der Corput low-discrepancy family of sequences.**

It is parametrized by two integers  $K_1$  and  $K_2$ , relatively prime and such that  $K_1 > K_2 > 0$ . It is the most classical family of sequences used for this kind of algorithm.

- **The Linear Congruential Generator.**

It is defined by a seed  $\omega^0$ , and then by  $\omega^{n+1} = \text{modulo} \left( \omega^n + \frac{\sqrt{5}-1}{2}, 1 \right)$ . It is very simple to implement.

**Other possible sequences:** Hammersley sequences, Sobol Sequences, ...

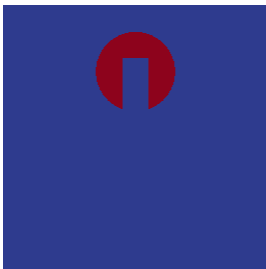
## Non-solid rotation of a Zalesak shape.

- Velocity field:  $U_x = a r (0.5 - y)$  and  $U_y = a r (x - 0.5)$

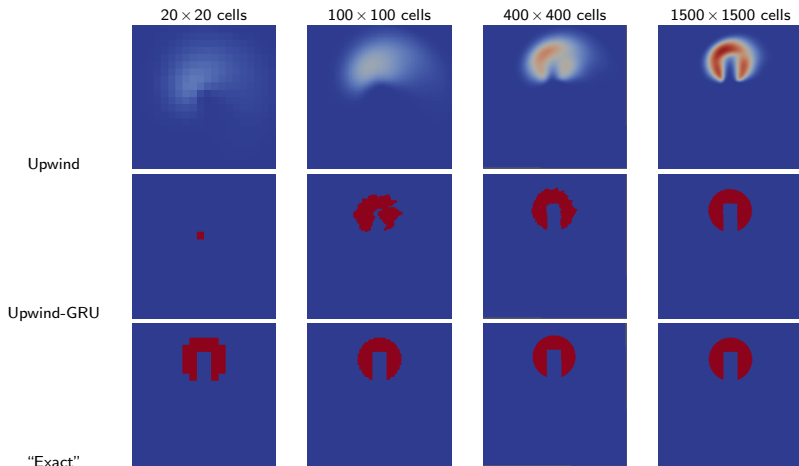
$$\text{with } r^2 = (0.5 - y)^2 + (x - 0.5)^2,$$

$$a = \begin{cases} 1, & \text{if } 0 < t \leq t_{end}/2, \\ -1, & \text{if } t_{end}/2 < t \leq t_{end}. \end{cases}$$

- Initial condition: Zalesak shape.
- Final exact solution at  $t_{end} = 6\pi s \rightarrow$  approx. one half rotation and back.

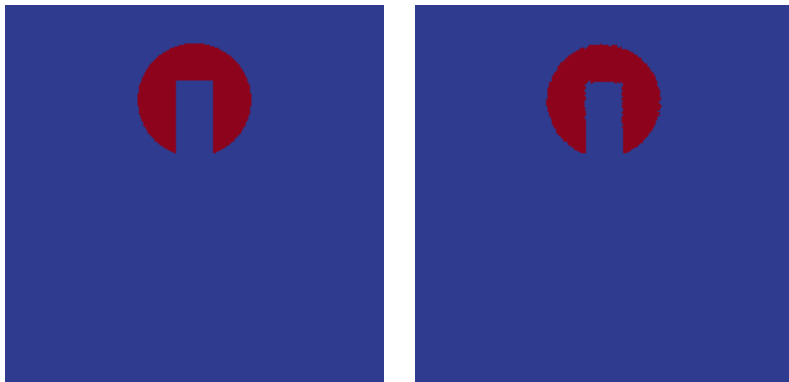


# Non-solid rotation of a Zalesak shape. Cartesian mesh. Van der Corput $K_1 = 5$ and $K_2 = 3$ .



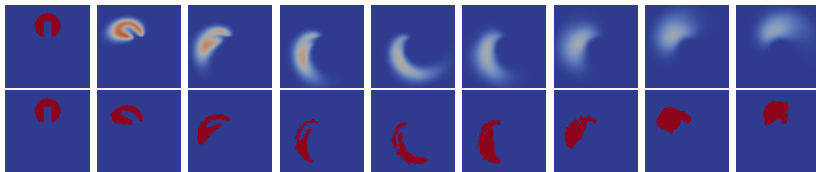


## Non-solid rotation of a Zalesak shape. Cartesian mesh. Van der Corput $K_1 = 5$ and $K_2 = 3$ .

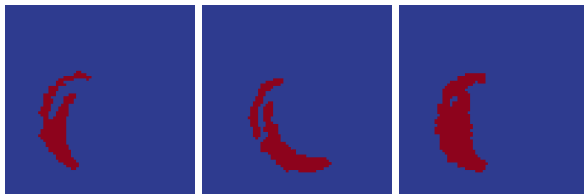


**Figure:** Non-solid rotation of a Zalesak shape. Cartesian mesh  $1500 \times 1500$  cells.  
Exact (Left) and Upwind-GRU (Right).

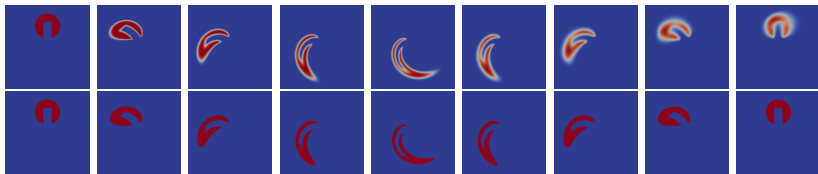
## Non-solid rotation of a Zalesak shape. Cartesian mesh. Van der Corput $K_1 = 23$ and $K_2 = 5$ .



**Figure:** Non-solid rotation of the Zalesak's "C" shape for the structured mesh containing  $75 \times 75$  cells at different times,  $K_1 = 23$  and  $K_2 = 5$ . First row: Upwind scheme, second row: Upwind-GRU scheme.



## Non-solid rotation of a Zalesak shape. Cartesian mesh. Van der Corput $K_1 = 23$ and $K_2 = 5$ .



**Figure:** Non-solid rotation of the Zalesak's "C" shape for the structured mesh containing  $1500 \times 1500$  cells at different times,  $K_1 = 23$  and  $K_2 = 5$ . First row: Upwind scheme, second row: Upwind-GRU scheme.

# Plan

- 1 Introduction
- 2 Description of the scheme
- 3 Numerical results for a canonical test
- 4 Simulation of a single-mode Richtmeyer-Meshkov instability
- 5 Final remarks

# Model

- Model: the single-material Euler system,

$$\left\{ \begin{array}{l} \frac{\partial}{\partial t} (\rho \alpha) + \nabla_x \cdot (\rho U \alpha) = 0, \\ \frac{\partial}{\partial t} \rho + \nabla_x \cdot (\rho U) = 0, \\ \frac{\partial}{\partial t} (\rho U) + \nabla_x \cdot (\rho U^2) + \nabla_x P(\rho, e) = 0, \\ \frac{\partial}{\partial t} (\rho E) + \nabla_x \cdot (U(\rho E + P(\rho, e))) = 0, \end{array} \right. \quad (4)$$

with the specific total energy  $E = e + U^2/2$  and the specific internal energy  $e$ .

- **Important: The pressure law does not depend on  $\alpha \rightarrow P = P(\rho, e)$  !**
- **We have a single material and only one EOS. The difference of density is reproduced through the temperature.**
- **$\Rightarrow$  The setting is different than for classical RMI simulations.**

## Numerical aspects

- Numerical scheme for prediction step:
  - First order Finite Volumes scheme is used (second order scheme available).
  - Interfacial fluxes are computed using the relaxation scheme proposed in <sup>1</sup>.
  - This prediction step is conservative and it preserves monotonicity.
  - The CFL constraint is associated with the pressure waves  $\Rightarrow$  contact waves are not accurately approximated for low Mach flows.
- Projection step: GRU is applied to the fraction  $\alpha$ .
- Code: PATAPON, which is a GPU based solver developed by P. Helluy (IRMA, University of Strasbourg) using OpenCL/python libraries.
- Meshes: 2D Cartesian meshes are used (GPU efficiency).

---

<sup>1</sup>Relaxation approximation of the Euler equations, C. Chalons and J.-F. Coulombel, J. of Math. Anal. and App., Vol 348(2), 2008.



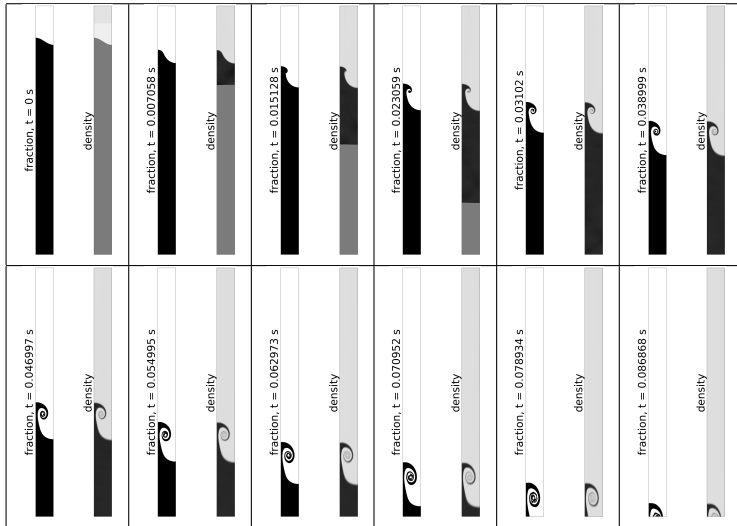


Figure: RMI, 2048x28672 cells, first order FV scheme + GRU.



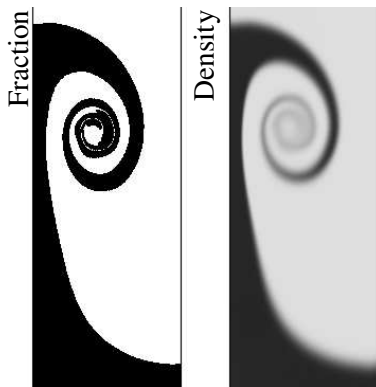


Figure: RMI, 2048 cells along  $x$ , first order FV scheme + GRU, zoom at time  $t = 0.062973$  s.

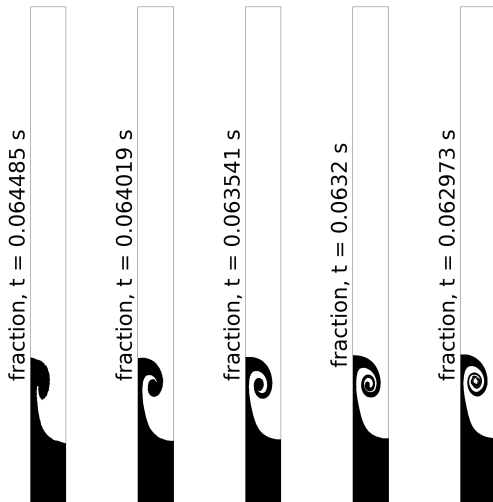


Figure: RMI,  $\{128, 256, 512, 1024, 2048\}$  cells along  $x$ , first order FV scheme + GRU.

# Plan

- 1 Introduction
- 2 Description of the scheme
- 3 Numerical results for a canonical test
- 4 Simulation of a single-mode Richtmeyer-Meshkov instability
- 5 Final remarks

## Conclusion

- The GRU step has been applied here to front propagation (it applies to compressible or incompressible flows)...
- ... but it has recently been extended to the transport of any scalar functions (joint work with T. Gallouët and S. Kokh).
- It can be applied with a lot of existing schemes (fractional step approach).
- It is efficient/accurate and remains very simple and robust.
- It performs as well on unstructured meshes (not shown here).
- A proof of convergence has been proposed for simple cases with the Upwind-GRU scheme (joint work with T. Gallouët).

## Perspectives: numerical aspects

- More tests should be performed → comparisons with other schemes (error/accuracy *versus* cpu-time).
- Proposition for handling the pathological behavior/front collapse.
- For RMI simulations : a two-phase flow model with a pressure law  $P(\alpha, \rho, e)$  with an EOS depending on  $\alpha$  + GRU step applied to  $\alpha$  (work in progress with P. Helluy).

Thank you.