

Detail-preserving Smoke Simulation Using an Efficient High-order Numerical Scheme

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01 | Introduction

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01 Introduction

- Eulerian grid based fluid simulation method can create realistic fluid animation results by solving the Navier–Stokes (NS) equations on Grid.

$$\begin{cases} \nabla \cdot u = 0 \\ \frac{\partial u}{\partial t} = -(u \cdot \nabla)u + \nu \nabla^2 u - \frac{\nabla p}{\rho} + f \end{cases}$$

- However, it suffers from numerous numerical dissipations, and one source of the numerical dissipations is from smooth operations of linear interpolation at the **advection** step.

$$\frac{\partial u}{\partial t} + (u \cdot \nabla)u = 0$$

01 Introduction

In this paper

We propose to alleviate the numerical dissipations **by utilizing a novel CIP(Constrained Interpolation Profile) based advection scheme of third-order accuracy.**

Features:

- ✓ Stable
- ✓ High accuracy
- ✓ Fast
- ✓ Low memory consumption
- ✓ Compact stencil

02 | Related Work

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02 Related Work: Reducing advection dissipations



O2Related Work: Reducing advection dissipations

High-order Interpolation Schemes

Cubic-spline[4], Essentially non-oscillatory (ENO) [5], Weighted ENO (WENO)[5], etc.

- ✓ Pros:
 - ◆ High order accuracy (3rd or higher order)
- ✓ Cons:
 - ◆ Computationally expensive, thus difficult to apply to high resolution simulations.
 - ◆ Wide Stencil, thus not applicable to non-uniform grids.

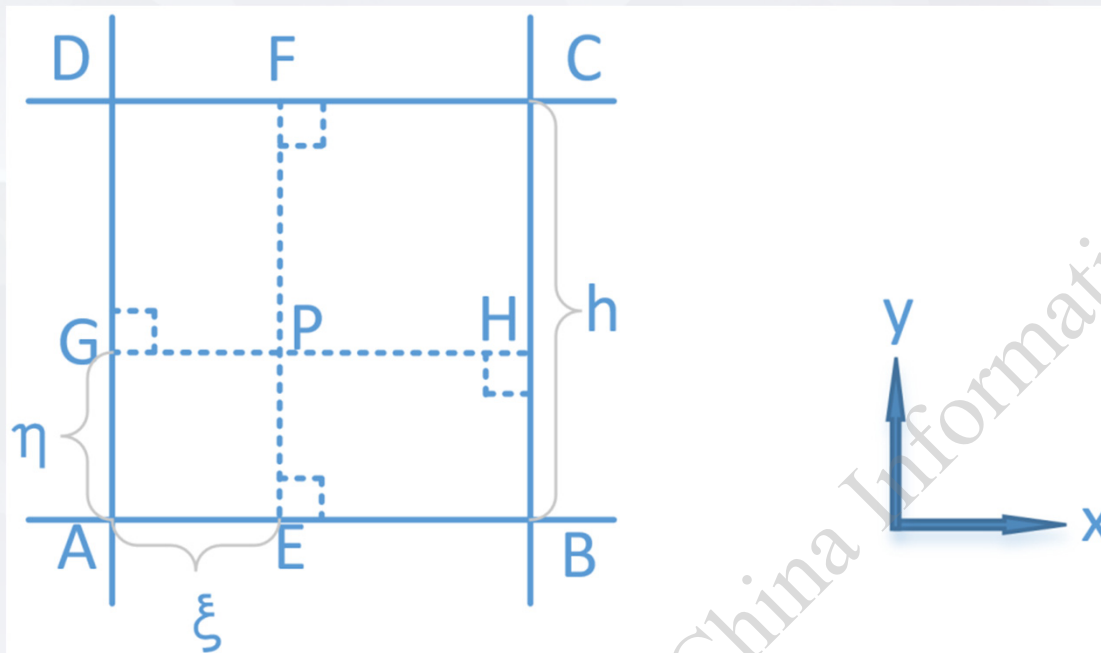
Constrained Interpolation Profile (CIP) [6] based methods: MCIP[7], USCIP[8], etc.

- ✓ Pros:
 - ◆ Compact Stencil, thus applicable to non-uniform grids
 - ◆ Third order accuracy (Higher than most of the advection schemes)
- ✓ Cons:
 - ◆ Problems exists when being extended to high-dimensional simulations:
 - Unstable
 - Computational expensive
 - High memory cost
 - etc.

03 Main Idea

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03: Problem Description



A, B, C, D are grid points, P is the backtracked point, and E, F, G and H are projections of P to the four cell sides AB, DC, AD and BC , respectively. The cell length is h .

- ◆ *Question:* How to obtain physical quantities at P from its neighboring four grid points with low dissipations ?
- ◆ CIP advects not only the physical quantity but also its derivatives, and constructs high order polynomials for interpolations with 3rd order accuracy.
- ◆ To solve the aforementioned problems of previous CIP-based methods, we propose an efficient CIP-based method by using local Taylor expansions.

03 Main Idea

Key idea

- Only store the physical quantity and its first-order derivatives on grid.
- Approximate the high-order derivatives on demand by using local Taylor expansions.

Traditional CIP

1. Store the physical quantity ϕ to be advected and its derivatives $[\partial_x \phi, \partial_y \phi, \partial_{xy} \phi]$ on grid.
2. Interpolations with high order polynomials.

VS

Our method

1. Store the physical quantity ϕ to be advected and its first-order derivatives $[\partial_x \phi, \partial_y \phi]$ on grid.
2. Approximation of the cross derivatives $\partial_{xy} \phi$ with third-order accuracy.
3. Iterative interpolations with 1D CIP.

04

Part-1: Approximation of The Cross Derivatives

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Approximation of The Cross Derivatives



- ◆ As proved in [9], for a bivariate function $f(x, y)$ that has continuous derivatives on the neighborhood of (x, y) , we can approximate $\partial_{xy}f$ with the following equation based on Taylor expansion.

$$\partial_{xy}f(x, y) = (\partial_y f(x + \Delta x, y) - \partial_y f(x, y)) / \Delta x + (\partial_x f(x, y + \Delta y) - \partial_x f(x, y)) / \Delta y - (f(x + \Delta x, y + \Delta y) + f(x, y) - f(x + \Delta x, y) - f(x, y + \Delta y)) / \Delta x \Delta y \quad (1)$$



- ◆ $\partial_{xy}\phi$ at grid point A can be computed as below using Eq. (1) by setting $\Delta x = \Delta y = h$.

$$\partial_{xy}\phi_A = (\partial_y\phi_B - \partial_y\phi_A) / h + (\partial_x\phi_D - \partial_x\phi_A) / h - (\phi_C + \phi_A - \phi_B - \phi_D) / h^2 \quad (2)$$

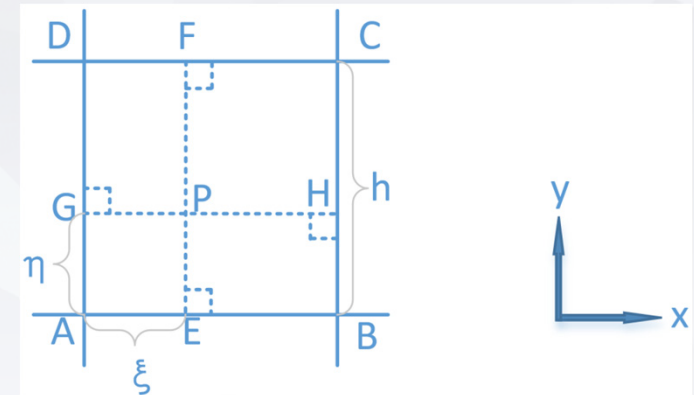


- ◆ Similarly, $\partial_{xy}\phi$ at grid point B, C and D can be computed as

$$\partial_{xy}\phi_B = (\partial_y\phi_B - \partial_y\phi_A) / h + (\partial_x\phi_C - \partial_x\phi_B) / h - (\phi_C + \phi_A - \phi_B - \phi_D) / h^2 \quad (3)$$

$$\partial_{xy}\phi_C = (\partial_y\phi_C - \partial_y\phi_D) / h + (\partial_x\phi_C - \partial_x\phi_B) / h - (\phi_C + \phi_A - \phi_B - \phi_D) / h^2 \quad (4)$$

$$\partial_{xy}\phi_D = (\partial_y\phi_C - \partial_y\phi_D) / h + (\partial_x\phi_D - \partial_x\phi_A) / h - (\phi_C + \phi_A - \phi_B - \phi_D) / h^2 \quad (5)$$



05

Part-2: Taylor Expansion based CIP

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Algorithm Details

- I. $\partial_{xy}\phi$ at the grid points A, B, C and D are computed with Eq. (2) to (5), respectively.
- II. $[\phi, \partial_x\phi]$ and $[\partial_y\phi, \partial_{xy}\phi]$ at point E are computed by 1D CIP interpolations between A and B .
- III. $[\phi, \partial_x\phi]$ and $[\partial_y\phi, \partial_{xy}\phi]$ at point F are computed by 1D CIP interpolations between D and C .
- IV. $[\phi, \partial_y\phi]$ and $[\partial_x\phi, \partial_{xy}\phi]$ at point P are computed by 1D CIP interpolations between E and F .

Algorithm 1 Taylor expansion based CIP in 2D

Input: $[\phi, \partial_x\phi, \partial_y\phi]$ at A, B, C, D ;

Output: $[\phi, \partial_x\phi, \partial_y\phi]$ at P ;

- 1: Compute $\partial_{xy}\phi$ at A, B, C, D with Eq. (2) to (5);
 - 2: Compute $[\phi, \partial_x\phi]_E$ from $[\phi, \partial_x\phi]_A$ and $[\phi, \partial_x\phi]_B$ by 1D CIP interpolation;
 - 3: Compute $[\partial_y\phi, \partial_{xy}\phi]_E$ from $[\partial_y\phi, \partial_{xy}\phi]_A$ and $[\partial_y\phi, \partial_{xy}\phi]_B$ by 1D CIP interpolation;
 - 4: Compute $[\phi, \partial_x\phi]_F$ from $[\phi, \partial_x\phi]_D$ and $[\phi, \partial_x\phi]_C$ by 1D CIP interpolation;
 - 5: Compute $[\partial_y\phi, \partial_{xy}\phi]_F$ from $[\partial_y\phi, \partial_{xy}\phi]_D$ and $[\partial_y\phi, \partial_{xy}\phi]_C$ by 1D CIP interpolation;
 - 6: Compute $[\phi, \partial_y\phi]_P$ from $[\phi, \partial_y\phi]_E$ and $[\phi, \partial_y\phi]_F$ by 1D CIP interpolation;
 - 7: Compute $[\partial_x\phi, \partial_{xy}\phi]_P$ from $[\partial_x\phi, \partial_{xy}\phi]_E$ and $[\partial_x\phi, \partial_{xy}\phi]_F$ by 1D CIP interpolation;
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06 | Experimental Results

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06 Experimental Results

➤ Platform:

- Intel i5 3.30 GHz CPU and 12.0 GB RAM

➤ Configuration:

- Resolution: 256×512
- Uniform Grid
- No Vorticity Confinement

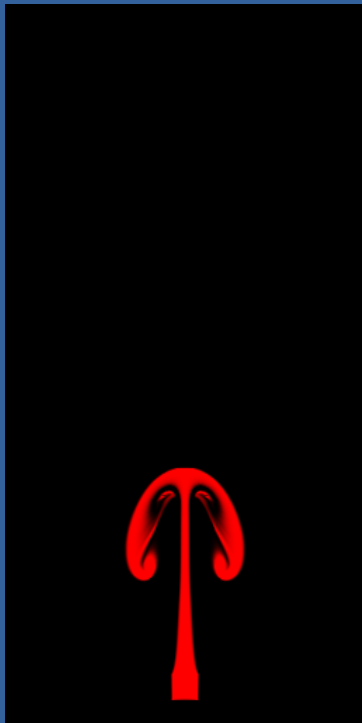
➤ Comparisons:

- linear semi-Lagrangian [4]
- BFECC [2]
- MCIP [7]
- USCIP [8]

06 Rising Smoke: Case I

Case I: The **density** field is advected with different schemes, and the velocity field is advected with BFECC

I-A: Our result



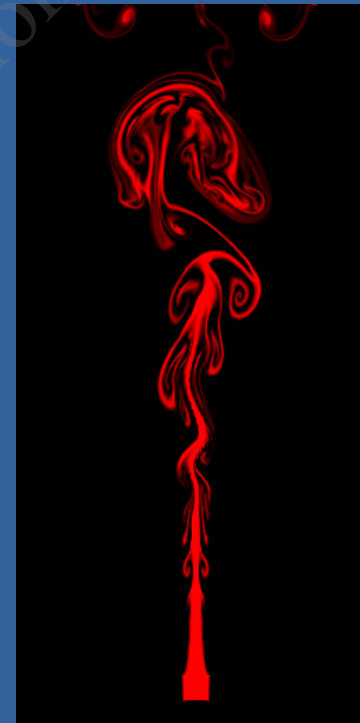
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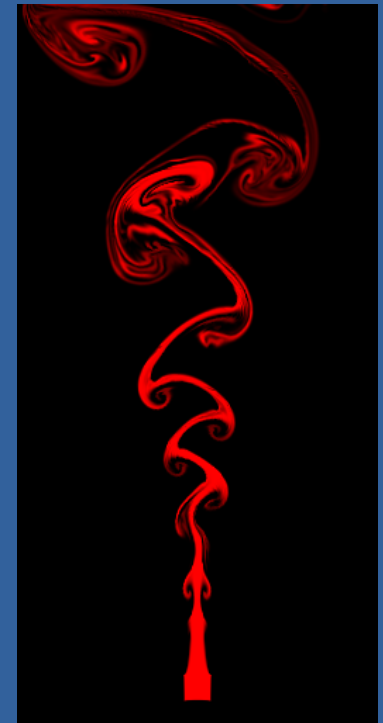
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180th frame



230th frame

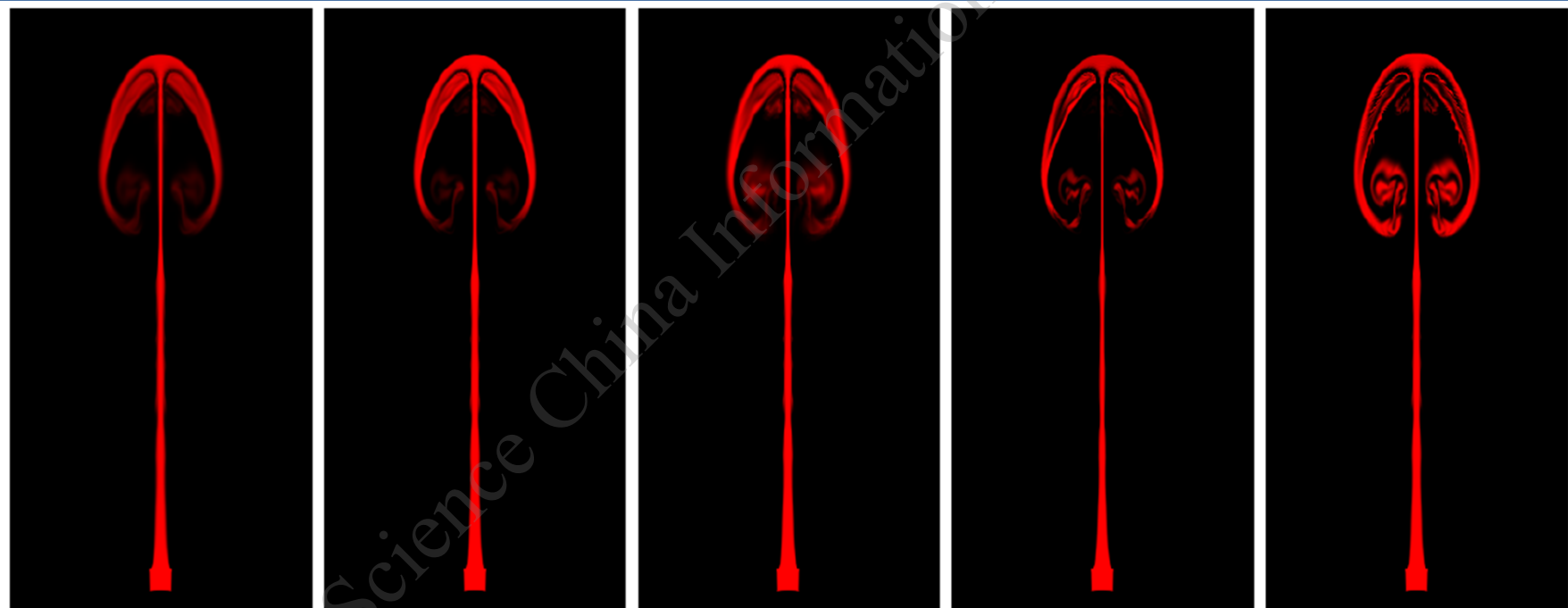


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06 Rising Smoke: Case I

Case I: The **density** field is advected with different schemes, and the velocity field is advected with BFECC

I-B: Comparisons



(a) Linear

(b) BFECC

(c) MCIP

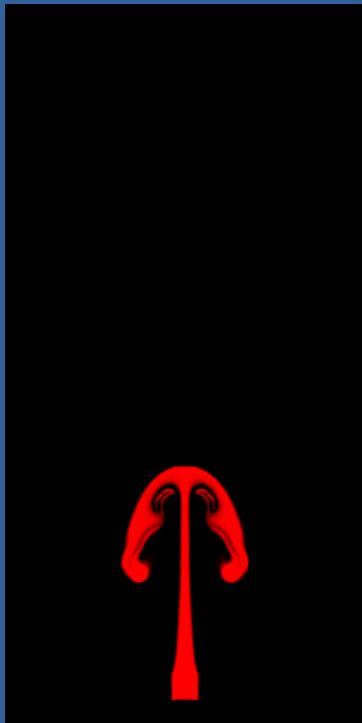
(d) USCIP

(e) Ours

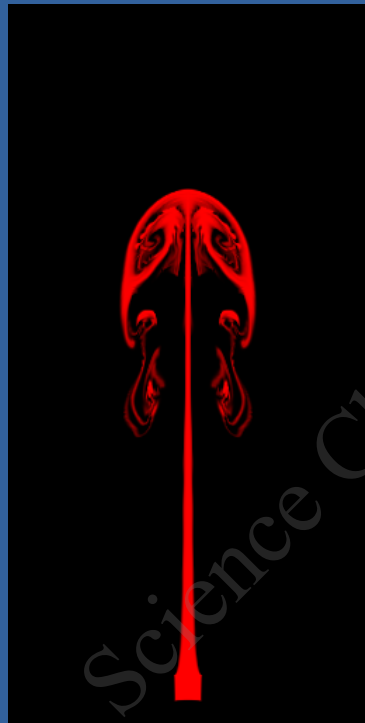
06 Rising Smoke: Case II

Case II: The density field is advected with BFECC, and the **velocity** field is advected with different schemes.

II-A: Our result



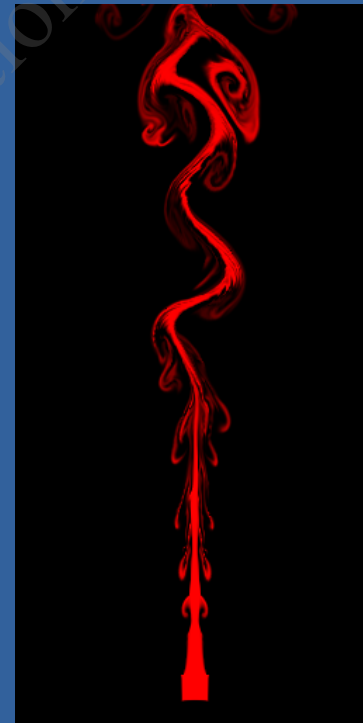
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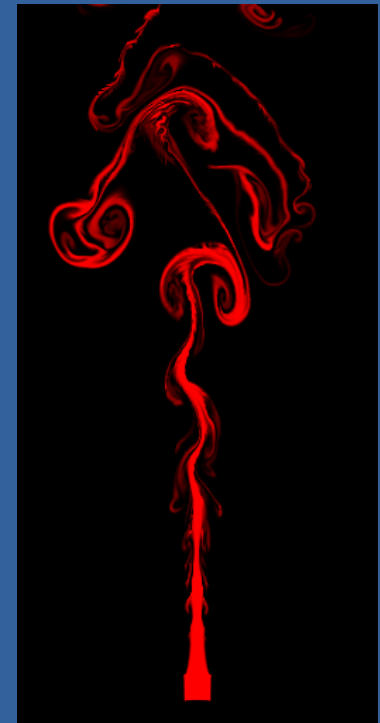
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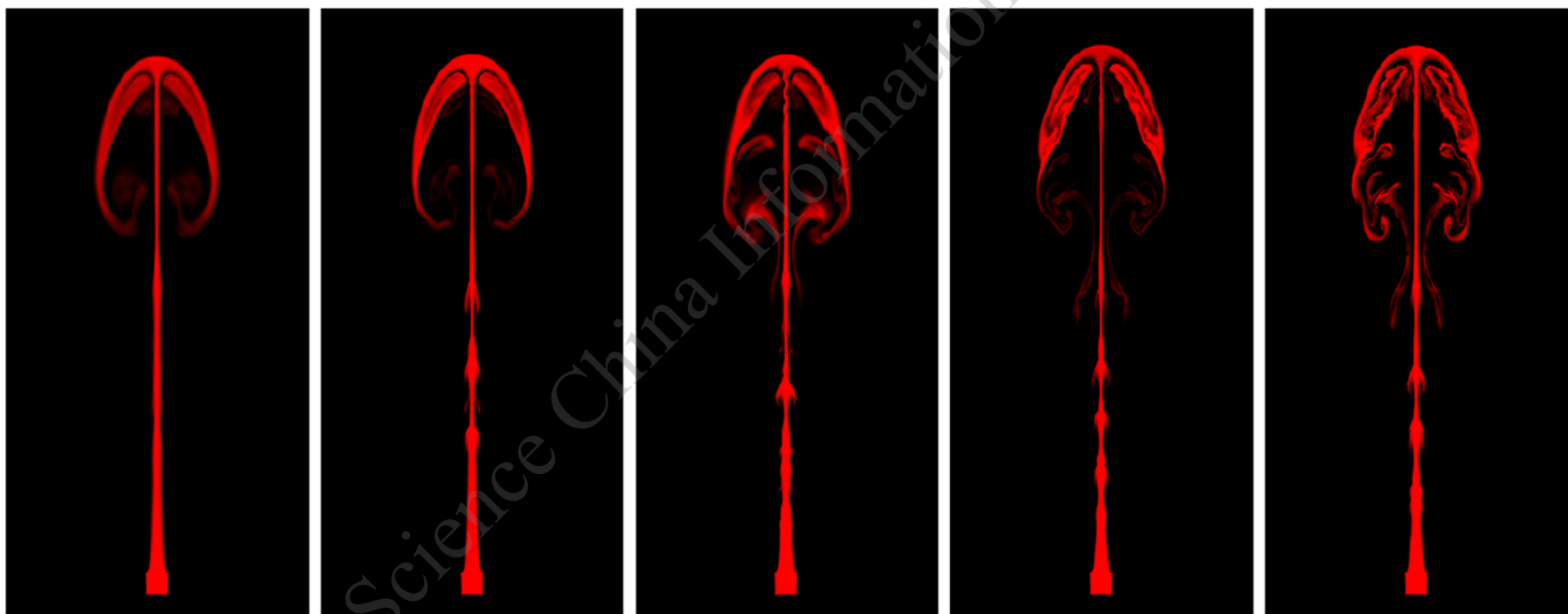


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06 Rising Smoke: Case II

Case II: The density field is advected with BFECC, and the **velocity** field is advected with different schemes.

II-B: Comparisons on the visual quality



(a) Linear

(b) BFECC

(c) MCIP

(d) USCIP

(e) Ours

06 Rising Smoke: Case II

Case II: The density field is advected with BFECC, and the **velocity** field is advected with different schemes.

II-C: Comparisons on the computation time and memory consumption

Table 1 Computation time and memory requirement for the smoke simulations in Case II-B

	Linear	BFECC	MCIP	USCIP	Ours
Time for advection only (sec/frame)	0.008	0.028	0.015	0.021	0.020
Time for whole simulation (sec/frame)	0.58	0.63	0.60	0.62	0.61
Number of advection	1	3	1	1	1
Number of variables on each grid point for each physical field	1	2	4	3	3

07 | Conclusion and Future Work

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In this paper:

- A novel CIP-based advection method of third-order accuracy is proposed to achieve better advection results for visually convincing smoke simulation.
- The method only stores the physical quantity and its first-order derivatives on the grid, and efficiently computes the high order derivatives on the fly based on Taylor expansions.
- Overall, it is stable, fast and accurate with low memory cost.

Future Work:

- Use the proposed method to accurately track free surfaces to simulate highly detailed water.
- Combine our method with adaptive techniques to achieve better simulation results on non-uniform grids.



Thank You