

Higher-Order Finite Difference Scheme With Tvd Filter Algorithm Part 1: Simulations Of Scalar Advective Dominant Problems

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Abstract

Engquist et al. (1989) proposed non-linear TVD filters. When combined with a traditional higher-order finite difference scheme, these filters can simulate shock or high concentration gradient problems with no spurious oscillations. Among the filter proposed is the filter algorithm 2.2. However, this algorithm flattens extrema that are not the results of overshooting and consequently the scheme reduces to a low order of accuracy locally around smooth extrema. Modification of the TVD filter algorithm 2.2 has been applied in this paper to overcome this problem. Several conservative finite difference schemes are considered for testing the TVD filter. Non-conservative schemes consisting of 4th and 6th -order Runge-Kutta method are also evaluated. The modified filter has been tested to simulate seven test cases, including a pure advection of scalar profiles, a pure advection with variable velocity, two inviscid burger equations, an advection-diffusion equation with variable velocity and dispersion, advection of three solid bodies in rotating fluid around a square of a side length of 2, and a two-dimensional advection-diffusion equation. The numerical experiments showed that applying the modified TVD filter, combined with the higher-order non-TVD finite difference schemes for solving the advection equation, can produce accurate solutions with no oscillations and no clipping effect extrema.

Keywords : Non-Oscillatory schemes, TVD filter, advection, higher-order accurate

Abstrak

Engquist dkk. (1989) mengusulkan filter TVD non-linear. Ketika dikombinasikan dengan skema beda hingga orde tinggi tradisional, filter ini dapat mensimulasikan kejutan atau masalah gradien konsentrasi tinggi tanpa osilasi palsu. Di antara filter yang diusulkan adalah algoritma filter 2.2. Namun, algoritma ini meratakan ekstrem yang bukan merupakan hasil dari "overshooting" dan konsekuensinya skema tersebut direduksi ke tingkat akurasi yang rendah secara lokal di sekitar ekstrem halus. Modifikasi algoritma filter TVD 2.2 telah digunakan dalam makalah ini untuk mengatasi masalah ini. Beberapa skema konservatif dipertimbangkan untuk menguji filter TVD. Skema non-konservatif metode Runge-Kutta orde ke-4 dan ke-6 juga dievaluasi. Filter yang dimodifikasi diuji untuk mensimulasikan tujuh kasus, termasuk adveksi murni profil skalar, adveksi murni dengan kecepatan bervariasi, dua persamaan burger inviscid, persamaan adveksi-difusi dengan kecepatan bervariasi dan dispersi, adveksi tiga benda padat berputar oleh aliran di bidang persegi dengan panjang sisi 2, dan persamaan adveksi-difusi dua dimensi. Eksperimen numerik menunjukkan bahwa penerapan filter TVD yang dimodifikasi, dikombinasikan dengan skema beda hingga non-TVD orde tinggi untuk menyelesaikan persamaan adveksi, dapat menghasilkan solusi yang akurat tanpa osilasi dan tanpa efek kliping.

Kata Kunci : Skema tanpa osilasi, Filter TVD, advection, orde-akurasi tinggi

1. Introduction

This paper proposes an application of a TVD filter algorithm to approximate equations of advective dominant problem. Firstly, we consider a one-dimensional advection problem defined by the hyperbolic conservative of **Equation (1)**.

$$\frac{\partial \phi}{\partial t} = \frac{\partial F(\phi)}{\partial x} \quad (1)$$

$$\phi(x, 0) = u_0(x)$$

The hyperbolic conservation **Equation (1)** models a wide range of physically exciting phenomena such as advection of contaminants and sediments, shallow water flow, gas dynamics, etc. Obtaining an accurate

approximation of the advection **Equation (1)** is challenging. Two of the issues that arise are the problems of oscillations or overshoots and undershoots and artificial diffusions. The application of traditional schemes such as second-order central, third-order QUICKEST (Leonard, 1979), and other higher-order schemes to approximate the advection **Equation (1)** has significant difficulties when discontinuities or sharp gradients are present in the solution (Deng et al., 2019). The schemes will generally produce spurious oscillations near these discontinuities or sharp gradients (Deng et al., 2019). The sharp numerical discontinuities can be reproduced without oscillations by applying high-resolution schemes such as the Total Variation Diminishing (TVD)-type schemes (Shu, 1988; Deng, et al., 2019), essentially non-oscillatory

(ENO) types of schemes (Su and Kim, 2018; Ha, et al., 2019), weighted essentially non-oscillatory (WENO) schemes (Liu and Qiu, 2016; Christlieb et al., 2019; Rajput and Singh, 2022), a series of hybrid WENO/central difference methods (Kim and Kwon, 2005), Limiter numerical fluxes schemes using the normalized variable formulation (Leonard, 1988; Leonard and Mohktari, 1990; Gao et al., 2012; Zhang et al., 2021), the Godunov-type schemes with artificial viscosity—(Rodionov, 2017) and so on. The methods attempt to capture the discontinuity, generally known as the shock capture schemes. The shock capture schemes attempt to avoid spurious oscillations across sharp gradients and discontinuities while maintaining high-order accuracy in smooth extrema (Deng et al., 2019). These schemes are based on concepts like upwinding, local Reiman solvers, field by field decomposition using polynomial interpolating for cell interface reconstruction, and flux limiting (Engquist et al., 1989). However, the algorithm proposed for these high-resolution schemes is quite complicated for higher-order numerical accuracy (Engquist et al., 1989).

To overcome these difficulties, more than three decades ago, Engquist et al. (1989) proposed an algorithm with non-linear filters, which, when combined with traditional schemes, can treat shocks and contact discontinuities similarly to the modern high-resolution schemes. The filter was developed based on field-by-field decomposition similar to the non-oscillatory schemes and limiter to have good capturing high gradient or discontinuities. It is only activated at a few grid points where oscillations are detected. The filter maintains the order of accuracy and computationally efficiency close to the traditional methods (Engquist et al., (1989) . The filter has other advantages, they can be applied to the non-conservative schemes, and its time step is essentially independent of the step of the basic different scheme.

Engquist et al. (1989) proposed several TVD filters ranging from relatively simple algorithms 2.1 and 2.2 for one-dimensional hyperbolic equations to somewhat more complex algorithms, algorithm 4.1, to be applied to systems of hyperbolic equations. The filter evaluated in this study is the TVD filter algorithm 2.2. This filtering algorithm, combined with the higher-order finite difference scheme, has been used for solving the advection equation problems. The original algorithm 2.2 was modified to more accurately capture the true extrema and produce accurate solutions for long-term simulations. We consider several finite difference schemes for testing the TVD filter, including conservative based schemes such as second-order Lax-Wendroff, third-order QUICKEST (Leonard, 1979), 4th and 6th -order conservative schemes (Leonard, 1988; 1991; Leonard and Mokhtari, 1990), and non-conservative schemes consisting of 5th and 6th -order accurate in space and using the 4th-order Runge-Kutta method for time integration. Only the last two schemes are described in this paper, while the other schemes for interested readers can look at the reference cited. Seven test cases were considered to gain insight into the merit of the TVD filter algorithm.

These test cases include a pure advection of scalar profiles, a pure advection with variable velocity, two inviscid burger equations, an advection-diffusion equation with variable velocity and dispersion, advection of three solid bodies in rotating fluid around a square of a side length of 2, and a two-dimensional advection-diffusion equation. The resulting tests show that the modified TVD filter algorithm combined with the higher-order scheme can produce highly accurate results for solving the advection dominates problem with no oscillations. The following section describes the TVD algorithm, Runge-Kutta schemes, numerical testings, and conclusions.

2. Higher-Order Runge-Kutta Method

Time integration of Eq. (1) over time from $t = t$ to $t + \Delta t$ gives the following Equation (2)

$$\phi_j^{n+1} = \phi_j^n + \int_{t^n}^{t^{n+1}} \frac{\partial F(\phi)_i}{\partial x} dt \quad (2)$$

Gradient $\partial F(\phi)_i / \partial x$ can be approximated by using the 4th and 6th -order finite difference central scheme defined by Equations (3) and (4).

$$\frac{\partial F(\phi)}{\partial x} = \frac{F_{i-2} - 8F_{i-1} + 8F_{i+1} - F_{i+2}}{12 \Delta x} \quad (3)$$

$$\frac{\partial F(\phi)}{\partial x} = \frac{-F_{i-3} + 9F_{i-2} - 45F_{i-1} + 45F_{i+1} - 9F_{i+2} + F_{i+3}}{60 \Delta x} \quad (4)$$

Integrating Equation (2) using 4th-order Runge-Kutta gives Equations (5. a) to (5. e).

$$\phi_j^{n+1} = \phi_j^n + \frac{1}{6}(k_1 + 2k_2 + 2k_3 + k_4) \quad (5.a)$$

where

$$k_1 = \frac{\partial F(t^n, \phi_i^n)}{\partial x} = G(t^n, \phi^n) \quad (5.b)$$

$$k_2 = G(t^n + \Delta t/2, \phi^n + k_1 \Delta t/2) \quad (5.c)$$

$$k_3 = G(t^n + \Delta t/2, \phi^n + k_2 \Delta t/2) \quad (5.d)$$

$$k_4 = G(t^n + \Delta t, \phi^n + k_3 \Delta t) \quad (5.e)$$

3. TVD Filter Algorithm

3.1 Original TVD algorithm

Assuming that $\phi_i^{n+1} = \phi_i^{n+1}$ are the results after taking one step with a difference scheme which produces oscillations solutions, where ϕ_i^n = value of ϕ at a grid point i at time level $t = n\Delta t$ with Δt = time step. We denote two finite difference operators, namely $\Delta^+ v_j = v_{j+1} - v_j$ and $\Delta^- v_j = v_j - v_{j-1}$. Engquist et al. (1989) proposed the following algorithm 2.1 (using the exact name of an algorithm used in the original paper) to eliminate oscillations.

Algorithm 2.1 (Engquist et al., 1989)

For $j := 2$ to $N-1$ **do**

If $(\Delta^+ v_j^{n+1})(\Delta^- v_j^{n+1}) < 0$ **then**

If $|\Delta^+ v_j^{n+1}| > |\Delta^- v_j^{n+1}|$ **then**

```

 $\delta^+ := |\Delta^- v_j^{n+1}|$ 
 $\delta^- := |\Delta^- v_j^{n+1}|$ 
jcoor := j + 1
else
 $\delta^+ := |\Delta^- v_j^{n+1}|$ 
 $\delta^- := |\Delta^+ v_j^{n+1}|$ 
jcoor := j - 1
endif
 $\delta := \min(\delta^-, \delta^+ / 2)$ 
 $s := \text{sgn}(\Delta^+ v_j^{n+1})$ 
 $v_j^{n+1} := v_j^{n+1} + s\delta$ 
 $v_{j\text{corr}}^{n+1} := v_{j\text{corr}}^{n+1} - s\delta$ 
endif
endfor

```

Algorithm 2.1 is not entirely satisfactory due to:

1. Extrema consisting of more than one point cannot be detected,
2. TVD properties cannot be guaranteed, thus allowing oscillations present in the solution.
3. It flattens true extrema, the value that is not the result of overshooting, and thus produces a low order of accuracy locally around smooth extrema.

To overcome these disadvantages the algorithm 2.1 is modified using the algorithm 2.2 as follows.

Algorithm 2.2 (Engquist et al., 1989)

J := 2

While **j** < **N** **do**

If $(\Delta^+ v_j^{n+1})(\Delta^- v_j^{n+1}) < 0$ and not admissible1
 $(j, v_j^{n+1}, v^n) < 0$ **then**
 Correct v_j^{n+1} in the same way as in Algorithm 2.1.

else if $(\Delta^+ v_j^{n+1})(\Delta^- v_j^{n+1}) < 0$ and
 $(\Delta^+ v_{j-1}^{n+1})(\Delta^- v_{j-1}^{n+1}) < 0$ **then**

comment: this removes a zig-zag situation

```

 $\delta := \min(|\Delta^- v_{j-1}^{n+1}|, |\Delta^+ v_{j-1}^{n+1}|/2, |\Delta^+ v_j^{n+1}|)$ 
 $s := \text{sgn}(\Delta^+ v_j^{n+1})$ 
 $v_{j-1}^{n+1} := v_{j-1}^{n+1} - s\delta$ 
 $v_j^{n+1} := v_j^{n+1} + s\delta$ 
j := j - 1
else

```

comment: if v_j^{n+1} does not need any correction go on to **j** + 1

endwhile

The admissible1 (j, v_j^{n+1}, v^n) function returns true if
 $\min(v_{j-1}^n, v_j^n, v_{j+1}^n) < v_j^{n+1} < \max(v_{j-1}^n, v_j^n, v_{j+1}^n)$

otherwise, the value false is returned. When we allow the case where there is a minimum at **j**-1 and a maximum at **j**, an additional function, admissible2 $(j, j-1, v^n, v^{n+1})$ must be introduced into the “else if” text in Algorithm 2.2, resulting in the new conditions:

elseif $(\Delta^+ v_j^{n+1})(\Delta^- v_j^{n+1}) < 0$ and $(\Delta^+ v_{j-1}^{n+1})(\Delta^- v_{j-1}^{n+1}) < 0$
 and not admissible2 $(j, j-1, v^n, v^{n+1})$ **then**.

The admissible2 $(j, j-1, v^n, v^{n+1})$ function returns true if the following condition

```

 $\min(v_j^n, v_j^n) < v_j^{n+1} < \max(v_j^n, v_{j+1}^n)$  and
 $\min(v_{j-2}^n, v_{j-1}^n, v_j^n) < v_{j-1}^{n+1} < \max(v_{j-2}^n, v_{j-1}^n, v_j^n)$  or
 $\min(v_{j-1}^n, v_j^n, v_{j+1}^n) < v_j^{n+1} < \max(v_{j-1}^n, v_j^n, v_{j+1}^n)$  and
 $\min(v_{j-2}^n, v_{j-1}^n) < v_{j-1}^{n+1} < \max(v_{j-2}^n, v_{j-1}^n)$  hold.

```

Otherwise, the result is false. The algorithm 2.2 requires that the solution v^n from previous time level has been saved.

3.2 Modification of TVD filter algorithm

As can be seen in the following numerical tests, the use of the TVD filter algorithm 2.2 (i.e., a modified form of the TVD filter algorithm 2.1) still gives results with the true extremum flattened and thus produce un-accurate results for a long terms simulation. It indicates that the admissible1 function fails to detect the actual extremum point properly. However, the filter is relatively simple and promising for application. The filter can achieve improvement by modifying the admissible1 function (Cahyono, 2000). The following section describes changing the admissible1 routine to capture the true extremum correctly (Cahyono, 2000). Therefore, the TVD filter algorithm 2.2 can be exactly relaxed at this point. Consequently, the true extremum was allowed to accentuate occasionally without the necessity to damp it out.

The modified admissible1 function, later called the admissible1_m function, assumes that the data have no sudden gradient change at or near the true extremum. The admissible1_m function detects the true extremum by the following algorithm.

```

Function admissible1_m (j,  $v_j^{n+1}$ ,  $v^n$ )
 $(\Delta^+ v_j^{n+1} \cdot \Delta^- v_j^{n+1}) < 0$ 
If  $(\Delta^+ v_{j-1}^{n+1} \cdot \Delta^- v_{j-1}^{n+1}) > 0$  then  $(\Delta^+ v_{j+1}^{n+1} \cdot \Delta^- v_{j+1}^{n+1}) > 0$ 
If  $(|\Delta^+ v_j^{n+1}| < |\Delta^+ v_{j+1}^{n+1}|)$  and  $(|\Delta^- v_j^{n+1}| < |\Delta^- v_{j-1}^{n+1}|)$  then
If and then
  admissible1_m = 1
else
  admissible1_m = 0
endif
else
  admissible1_m = 0
endif
else

```

```
admissible1_m = 1
endif
return (admissible1_m)
```

The `admissible1_m` function is true (i.e., it detects the true extremum) when it returns unity; otherwise, it is false if it returns zero. The `admissible1_m` expressed in the above algorithm is similar to the Leonard-Niknafs discriminator (see Leonard and Niknafs, 1991), used for the same purpose. However, the former is more easily applied than the latter since the `admissible1_m` function needs only five cell stencils compared to the Leonard-Niknafs discriminator, which requires seven.

4. Numerical Test

4.1 Test 1. advection complex profiles

The first test considered is the advection of scalar profiles (i.e., solute concentration profiles) by the flow with a constant velocity, $a_0 = 1$ defined by Eq. (6).

$$\frac{\partial \phi}{\partial t} + \frac{\partial (u_0 \phi)}{\partial x} = 0 \quad (6)$$

The initial condition is given by Eq. (7). The initial condition consists of four scalar profiles: narrow Gaussian distribution, a square wave, a triangle wave, and a semi-ellipse profile. These four profiles have several essential features. For example, the square wave profile shows the effect of spurious oscillations near discontinuities. The semi-ellipse profile shows the effect of terracing due to changes in the gradient involving a combination of sudden and gradual and. The narrow Gaussian and the triangle profiles show the effect of clipping at the extrema. The exact solution at time t is the initial profile translated by a distance $a_0 t$ without shape change.

This sample test is usually employed to verify non-oscillatory type and shock-capturing schemes to evaluate their non-oscillatory property and numerical dissipation (Deng et al., 2019; Zhang et al., 2021). This test case was also considered in previous studies by Su and Kim (2018), Huang and Chen (2018), and Liu et al. (2018), Christlieb et al., (2019), Deng et al., (2019), and Ha and Lee (2020). However, they generally considered the problem for short-term simulations, i.e., $T \leq 1000$ periods. In the present work, the study focuses on evaluating the performance of the TVD filter on several finite difference schemes in simulations starting from short periods $T = 2$ and 10, medium periods $t = 100$, to long periods $t = 1000, 2000$

$$\phi_0(x) = \begin{cases} \frac{1}{6} \{g(x, \omega, z - \delta) + g(x, \omega, z + \delta) + 4g(x, \omega, z)\} & \text{if } -0.8 < x \leq -0.6, \\ 1 & \text{if } -0.4 < x \leq -0.2, \\ 1 - |10(x - 0.1)| & \text{if } 0 < x \leq 0.2, \\ \frac{1}{6} \{h(x, \vartheta, \alpha - \delta) + h(x, \vartheta, \alpha + \delta) + 4h(x, \vartheta, \alpha)\} & \text{if } 0.4 < x \leq 0.6, \\ 0 & \text{otherwise.} \end{cases} \quad (7)$$

Where $h(x, \vartheta, \alpha) = \sqrt{\max[1 - \vartheta^2 (x - \alpha)^2, 0]}$

$$\alpha = 0.5, \quad z = -0.7, \quad \delta = 0.005, \vartheta = 10, \quad \omega = \frac{\log 2}{36 \delta^2}, \text{ and } g(x, \omega, z - \delta) = e^{-\omega(x-z)^2}$$

5000. We use a periodic boundary condition (Christlieb et al., 2019). The calculation is performed using $N = 400$ cells with $C_r = U_0 \Delta t / \Delta x = 0.4$. Simulations are carried out using the original filter algorithm 2.2 and its modified version. We use the abbreviation of schemes simulated using original filter algorithm 2.2 by LWO2, QOF2, FLO2, SLO2, RK4OF2, and RK6OF2 schemes for Lax-Wendroff, Quickest (Leonard, 1979), the 5th, and 6th-order conservative schemes (Leonard, 1991), and the 4th and 6th-order Runge-Kutta schemes defined by Eq. (2) to (5), respectively. The corresponding names for the methods simulated using the modified filter are LWMF2, QMF2, FLMF2, SLMF2, RK4MF2, and RK6MF2. We also consider bound verse of the 6th-order (ULTIMATE) conservative schemes (Leonard, 1991), USL, for comparisons.

All simulation results are shown in Figure 1 to 4. The simulation results for $t = 2, 10, 100$, and 1000 using the original filter algorithm 2.2 are given in Figure 1, and those using the modified algorithm 2.2 are shown in Figure 2. It is seen that the simulation uses the original algorithms 2.2. produce reasonably accurate results at $t = 2$ and 10, but there is an initial profiles distortion and continuously worsens the solution quality for the period $t = 100$ and 1000. These show that the original filter algorithm 2.2 fails to produce accurate results for long-term simulations for t greater than 100. On the contrary, except for LWMF2, the use of the modified algorithm 2.2 can provide reasonably accurate results for long-term simulation at $t = 1000$, particularly for higher-order schemes such as FLMF2, SLMF2, RK4MF2, and RK6MF2 schemes. The clipping effect of Gaussian peaks and triangles is reduced in these higher-order schemes

The second-order LWMF2 produced inaccurate results for all periods considered. The TVD filter algorithm 2.2 failed to work at the Lax-Wendroff scheme. Figure 3 shows the simulation results at $t = 2000$ and 5000 for FLMF2, SLMF2, RK4MF2, and RK6MF2. The FLMF2, SLMF2, and RK4MF2 failed to capture the peak of the initial profile, while the RK6MF2 was still able to capture the Gaussian and triangular profile shapes but failed to capture the rectangle and semi-ellipse profiles. Figure 4.a shows the comparison between FLMF2 and RK4MF2, and Figure 4.b between RK6MF2 and the USL. The RK4MF2 produces a more accurate solution than FLMF2 (see Figure 4.a), and The RK6MF2 can still capture Gaussian and triangular profiles. In contrast, the USL can capture rectangle and semi-ellipse profiles.

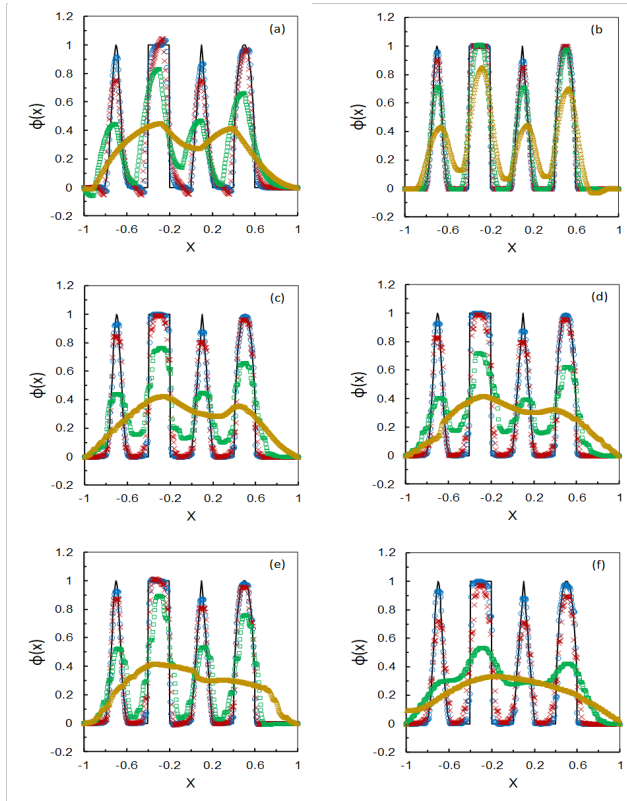


Figure 1. Comparison of exact solutions with numerical solutions of Eq. (6) using original TVD algorithm 2.2 at $t = 2$ (blue circle O), 10 (red cross x), 100 (green rectangle \square), and 1000 (orange triangle Δ) for (a). LWO2, (b). QO2, (c). FLO2, (d). SLO2, (e). RK4O2 and (f). RK6O2 schemes, respectively.

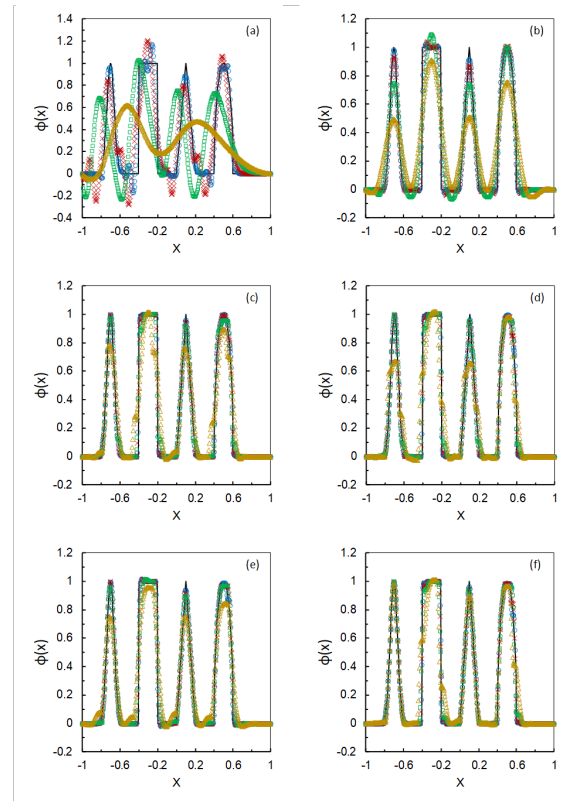


Figure 2. Comparison of exact solutions with numerical solutions of Eq. (6) using modified TVD algorithm 2.2 at $t = 2$ (blue circle O), 10 (red cross x), 100 (green rectangle \square), and 1000 (orange triangle Δ) for (a). LWM2, (b). QM2, (c). FLM2, (d). SLM2, (e). RK4M2 and (f). RK6M2 schemes, respectively.

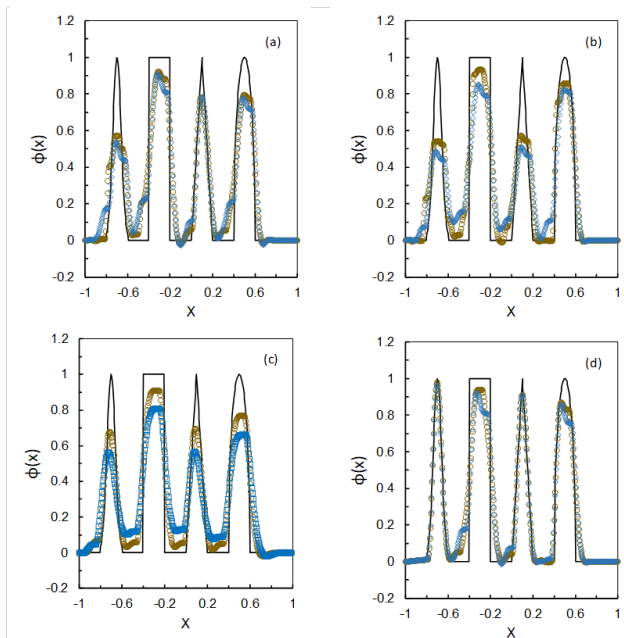


Figure 3. Comparison of exact solution with numerical solution of Eq. (6) using modified TVD algorithm 2.2 at $t = 2000$ (brown circle O) and 5000 (blue diamond \diamond) for (a). FLM2, (b). SLM2, (c). RK4M2, and (d). RK6M2 schemes, respectively.

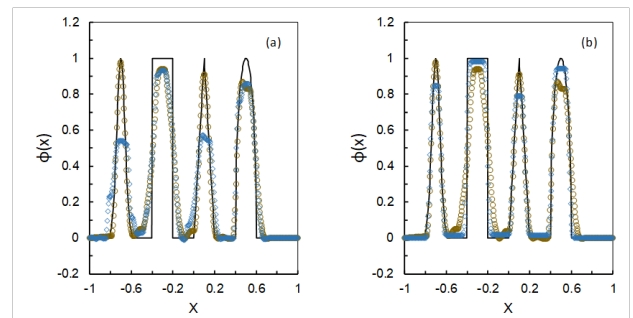


Figure 4. Comparison of exact solution with numerical solution of Eq. (6) using modified TVD algorithm 2.2 at $t = 5000$ for (a). RK4M2 (brown circle O) and FLM2 (blue diamond \diamond) and (b). RK6M2 (orange circle O) and Ultimate Sixth order (blue diamond \diamond).

The ability of the numerical model to capture the profile shape can be evaluated using the Nash-Sutcliffe efficiency coefficient, NSE, (Nash and Sutcliffe, 1970), defined by Eq. (8).

$$NSE = 1 - \frac{\sum_{t=1}^N (\phi_{est,n} - \phi_{a,n})^2}{\sum_{t=1}^N (\phi_{a,n} - \phi_{a,ave})^2} \quad (8)$$

Where ϕ_a and ϕ_{est} are the numerical and exact value at node n , respectively, $\phi_{a,ave}$ is the average of the exact value. The NSE value indicates whether the actual

Table 1. NSE values for several schemes considered for simulation results at $t = 1000$ and 2000 for profiles Gaussian (A), triangle (B), and semi-ellipse (C), respectively.

Profile	Scheme							
	QMF2	FLMF2	SLMF2	RK4MF2	RK6MF2	UQ	UFL	USL
Simulation results at $t = 1000$								
A	0.85	0.87	0.72	0.87	0.99	0.38	0.97	0.97
C	0.88	0.91	0.74	0.91	0.98	0.38	0.97	0.95
D	0.85	0.75	0.76	0.75	0.70	0.22	0.93	0.93
Simulation results at $t = 2000$								
A	0.23	0.53	0.56	0.75	0.99	0.12	0.97	0.96
C	0.15	0.92	0.60	0.82	0.98	0.02	0.96	0.93
D	-0.11	0.48	0.78	0.51	0.79	-0.32	0.93	0.92

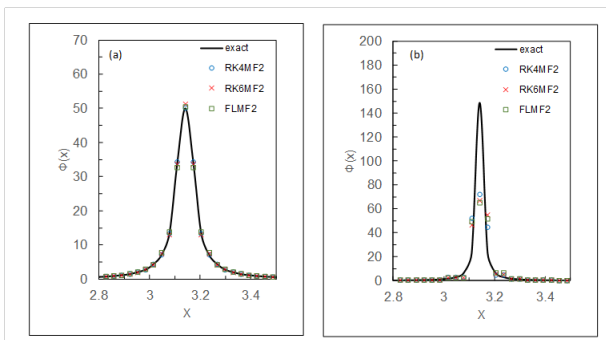


Figure 5. Simulation results for equation (4) using RK4MF2, RK6MF2 and FLMF2 with $\Delta x = 2\pi/200$ at $t = 4$ (a) and $t = 5$ (b).

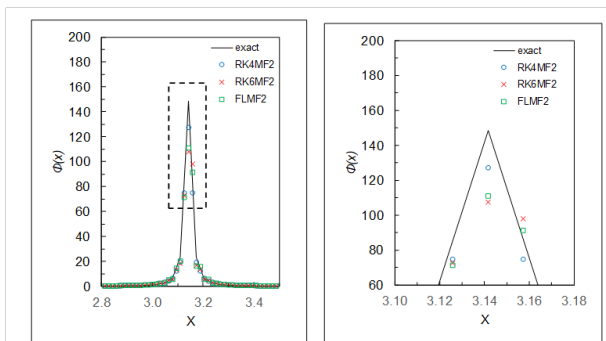


Figure 6. Simulation results of equation (9) using RK4MF2, RK6MF2 and FLMF2 with $\Delta x = 2\pi/400$ at $t = 5$.

pattern curve, i.e., initial profile, can be captured well by the numerical model. The NSE value close to 1 indicates that the simulation results are very satisfactory with the initial profile well captured. The NSE values from the simulation results for the schemes reviewed are given in Table 1. From Table 1, it is seen that the RK6MF2 produces reasonably good results to advection of Gaussian and triangle profiles, with a NSE value above 0.90. The simulation results show that using the modified TVD filter algorithm 2.2 can effectively reduce oscillations and reduce the peak clipping effect if combined with a high-order scheme.

4.2 Test 2. (one dimensional equation with variable coefficient). Consider transport equation defined by Eq. (9)

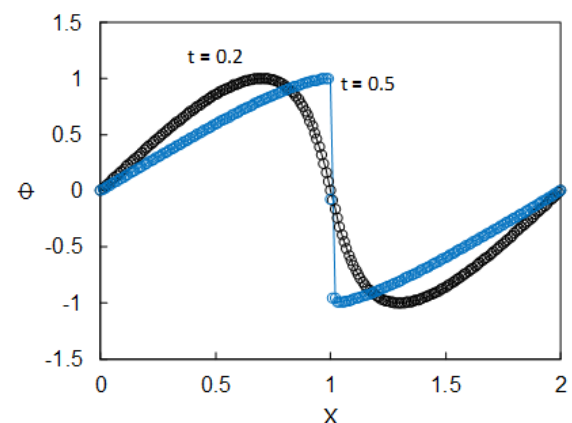


Figure 7. Solution of Burger Eq. (11) using RK4MF2 $\Delta x = 2/80$ at $t = 0.2$ and 0.5 , respectively.

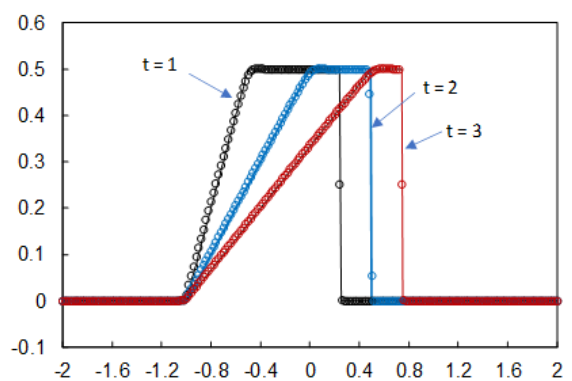


Figure 8. Solution of Burger equation (11) with initial condition Eq. (12) using RK4MF2 with $\Delta x = 2/100$ at $t = 1, 2$ and 3 , respectively

$$\frac{\partial \phi}{\partial t} + \frac{\partial}{\partial x}(\sin(x)\phi) = 0, 0 \leq x \leq 2\pi \quad (9)$$

The initial condition is $\phi(x, 0) = 1$ and the boundary condition is periodic. The exact solution is (Christlieb et al., 2019)

$$\phi(x, t) = \sin[2 \tan^{-1}(e^{-t} \tan(x/2))]/\sin(x) \quad (10)$$

In this test case, when time evolves, the mass moves towards the point $x = \pi$ and forms a profile with a sharp gradient. In this test, we only consider RK4MF2, RK6MF2 dan FLMF2 schemes. **Figure 5** shows simulation results at $t = 4$ and 5 with 200 spatial grid points. Simulations at $t = 4$ for the schemes considered produced accurate solutions with the same numerical profiles as the analytical ones. However, simulation results at $t = 5$ were not very satisfactory. The results will improve by reducing the grid spacing. It can be seen in **Figure 6**, showing the comparison between analytical and numerical solutions at $t = 5$ using a grid spacing of 400 for RK4MF2, RK5MF2, and FLMF2,

4.3 Test 3. (inviscid burger equation).

In this test case we consider a nonlinear scalar defined as **Equation (11)**.

$$\frac{\partial \phi}{\partial t} + \frac{\partial}{\partial x} \left(\frac{\phi^2}{2} \right) = 0 \quad (11)$$

with initial condition $\Phi(x,0) = \sin(2\pi x)$ for $0 \leq x \leq 1$ and boundary condition

$\Phi(0,t) = \Phi(1,t) = 0$. Exact solution is given by $\Phi(x,t) = \sin(x - \Phi t)$.

In this case test, the initial profile will evolve and form a steep gradient with time marching around $x = 1$. The simulation results are only given for the RK4MF2 scheme. **Figure 7** shows the simulation results at $t = 0.2$ and 0.5 with grid spacing $\Delta x = 2/80$. It is seen that the RK4MF2 can give very accurate results and can capture discontinuities without any spurious oscillations, respectively.

$\Delta x = 2/100$ at $t = 0.2$ and 0.5, respectively.

4.4 Test 4. (inviscid burger equation.).

This test uses the **Equation (11)** with an initial value consisting of discontinuity defined as

$$\phi(x,0) = \begin{cases} 0, & x < -1; \\ \frac{1}{2}, & -1 \leq x < 0 \\ 0, & x \geq 0 \end{cases} \quad (12)$$

The exact solution of this problem is defined as (Gao et al., 2012)

$$\phi(x,t) = \begin{cases} 0, & x < -1; \\ \frac{x+1}{t}, & -1 \leq x < \frac{t}{2} - 1; \\ \frac{1}{2}, & \frac{t}{2} - 1 \leq x < \frac{t}{4}; \\ 0, & x \geq \frac{t}{4} \end{cases} \quad (13)$$

The solution can form expansion and shock for $t \leq 4$. Calculations were carried out for a grid of 100 cells. The simulation results at three selected times $t = 1, 2$, and 3 are very satisfactory, as shown in **Figure 8**. It indicates that the modified TVD filter works well for this test

4.5 Test 5: (Advection-diffusion equation with variable velocity and dispersion).

Consider advection-diffusion equation defined as

$$\frac{\partial \phi}{\partial t} = \frac{\partial}{\partial x} \left[D_o f_1(x,t) \frac{\partial \phi}{\partial x} - U_o f_2(x,t) \phi \right] \quad 0 \leq x \leq L \quad (14)$$

where

$$f_1(x,t) = (1 + ax)^2 \quad \text{and} \quad f_2(x,t) = (1 + ax)$$

Initial and boundary conditions are

$$\phi(x,0) = 0, \quad \phi(0,t) = 10$$

$$\text{and } \frac{\partial \phi}{\partial x} = 0 \text{ for } x \rightarrow \infty \text{ and } t > 0$$

Analytical solution to this problem was given by Kumar et al. (2010).i.e.

$$\phi(x,t) = \frac{\phi_o}{2} \left[(1 + ax)^{-1} \operatorname{erfc} \left\{ \frac{\ln(1 + ax)}{2a\sqrt{D_o t}} - \beta\sqrt{t} \right\} + (1 + ax)^\delta \operatorname{erfc} \left\{ \frac{\ln(1 + ax)}{2a\sqrt{D_o t}} + \beta\sqrt{t} \right\} \right] \quad (15)$$

Where

$$w_o = (au_o - a^2 D_o), \quad \beta = \sqrt{\frac{w_o^2}{4a^2 D_o} + au_o} = \frac{u_o + aD_o}{2\sqrt{D_o}}, \text{ and } \delta = \frac{u_o}{aD_o}$$

Consider the cases $L = 1$, $U_o = 1$, $D_o = 0.5$ and $a = -1$. The velocity decreases in the positive x -direction starting from 1 to 0 at $x = 1$. The mass will accumulate at the end of the channel. The concentration at the end part of the channel, at a reach around $x = 1$, increases sharply. Simulations were carried out for grid cells 100 and $C_r = u_o \Delta t / \Delta x = 0.4$ using the splitting method (Holly and Usseglio-Polatera, 1984) with the convection part solved by the RK4MF2. The comparison between the numerical and analytical solutions at $t = 2$ and 4 is given in **Figure 9**. It is seen that RK4MF2 produces accurate solutions where the analytical and numerical solution profiles coincide.

4.6 Test 6: Two-dimensional pure convection in rotating fluid

This test considered is pure advection of three solid bodies for a rotating fluid around a square of a side length of 1. This fluid flow field can be viewed as the rotation of a solid body about its center point at the position (0.5,0.5). This case was also studied by Christlieb et al. (2019) and Zhang et al. (2021), The three solid bodies consist of a slotted cylinder, a cone, and a sinusoidal hump. For given (x_o, y_o) let

$$r(x,y) = \sqrt{(x - x_o)^2 + (y - y_o)^2} / 0.15$$

The slotted cylinder is defined by

$$\phi(x,y,0) = \begin{cases} 1 & \text{if } r(x,y) \leq 1, \quad |x - x_o| \\ 0 & \\ \geq 0.0225 \text{ or } y \geq 0.85 \\ \text{otherwise} \end{cases} \quad (16)$$

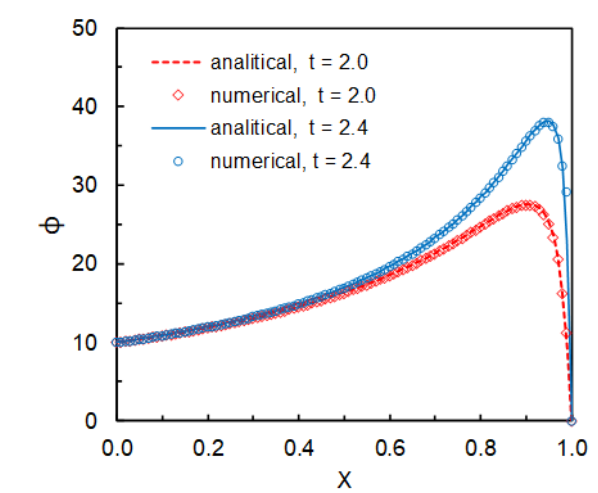


Figure 9. Simulation results of Advection -diffusion with variable velocity Eq. (14) using RK4MF2 at $t = 2$ (red diamond) and $t = 2.4$ (blue circle).

with its center at $(x_0, y_0) = (0.5, 0.75)$.

The center of hump is $(x_0, y_0) = (0.25, 0.5)$ and

$$\phi(x, y, 0) = \frac{1}{4} \{1 + \cos[\pi \min(r(x, y), 1)]\} \quad (17)$$

And the cone is described by $(x_0, y_0) = (0.5, 0.5)$ and

$$\phi(x, y, 0) = 1 - r(x, y) \quad (18)$$

The computational domain is divided into 100×100 grid squares of equal spacing in these simulations. The fluid rotates clockwise at an angular velocity of one

The computational domain is divided into 100×100 grid squares of equal spacing in these simulations. The fluid rotates clockwise at an angular velocity of one complete revolution in 800-time steps. When the diffusion terms are not considered, the solid body should ideally return to its starting point after one revolution without changing shape.

The five schemes, namely QMF2, FLMF2, SLMF2, RK4MF2, and RK6MF2, are reviewed. The plot results of simulation after one rotation are shown in Figure 10, with slides profiles of numerical solutions

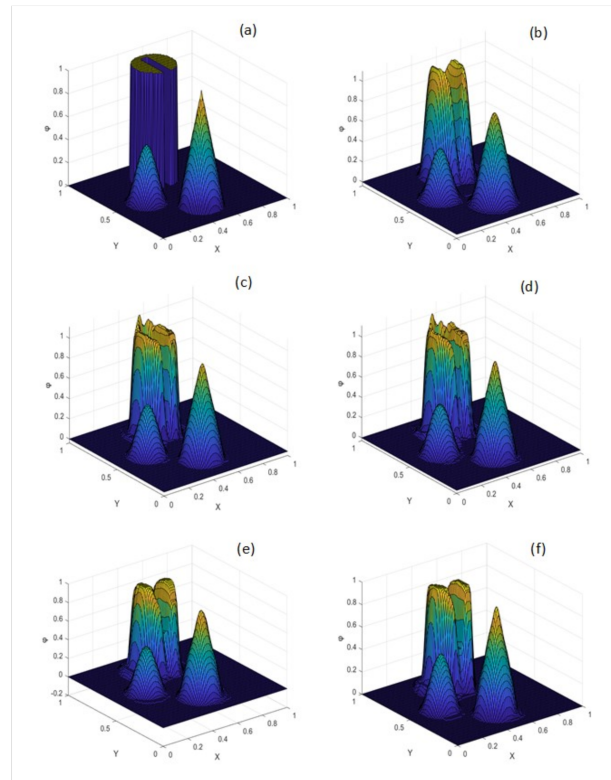


Figure 10. The plot of initial profile (a) and numerical solutions of rotating three solid bodies problem with 800-time step per rotation, grid mesh 100×100 after completing 1st rotation for (b). QMF2, (c). FLMF2, (d). SLMF2, (e). RK4MF2, and (f). RK6MF2, respectively

given in Figure 11. The corresponding results after ten cycles are also given in Figures 12 and 13. The simulation results show that applying the modified TVD filter algorithm 2.2 to the schemes considered produced no-oscillation solutions. The simulation results at ten rotations show that only the higher-order schemes, FLMF2, SLMF2, RK4MF2, and RK6MF2, can only produce reasonably accurate results for cone and hump profiles with a small clipping effect observed at the extremum. However, all schemes considered cannot capture the slotted cylinder profile adequately.

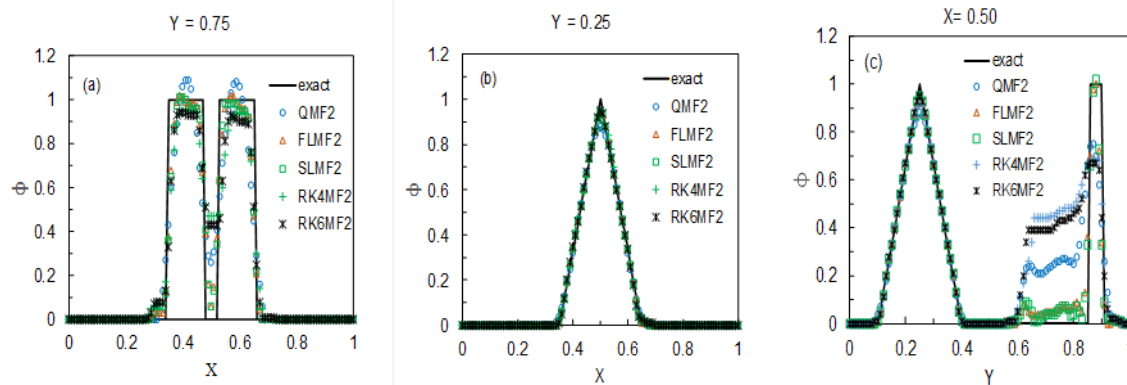


Figure 11. The plot of the 1-D slice of numerical solution of rotating three solid bodies problem at $y = 0.75$ (a), $x = 0.25$ (b) and $x = 0.50$ (c) with 800-time step per rotation, grid mesh 100×100 after completing 1st rotation.

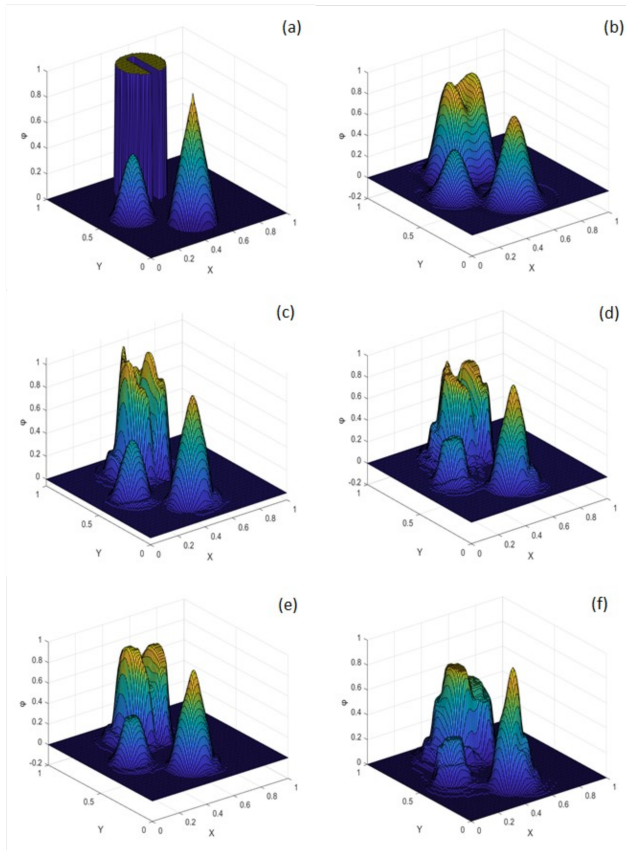


Figure 12. The plot of initial profile (a) and numerical solutions of rotating three solid bodies problem with 800-time step per rotation, grid mesh 100x100 after completing 10th rotation for (b). QMF2, (c). FLMF2, (d). SLMF2, (e). RK4MF2, and (f). RK6MF2, respectively.

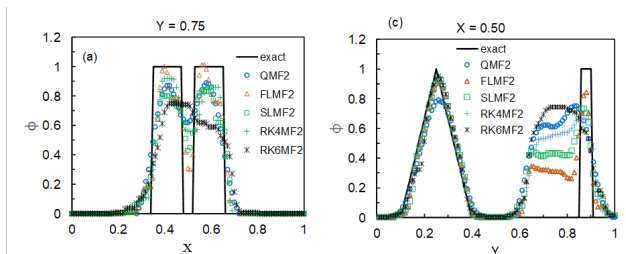


Figure 13. The plot of the 1-D slice of numerical solution of rotating three solid bodies problem at $y=0.75$ and $x=0.50$ with 800-time step per rotation, grid mesh 100x100 after completing 10th rotation.

4.7 Two-dimensional advection-diffusion with steep inlet profile in rotating flow

This problem is also studied by Smith and Hutton (1982) and Thijs Boonkamp and Anthonissen, (2011) defined by Equation (19).

$$\frac{\partial \phi}{\partial t} + \frac{\partial(u\phi)}{\partial x} + \frac{\partial(v\phi)}{\partial y} = \frac{1}{P_e} \left(\frac{\partial^2 \phi}{\partial x^2} + \frac{\partial^2 \phi}{\partial y^2} \right) \quad (19)$$

in a rectangular region $-1 \leq x \leq 1, 0 \leq y \leq 1$,

where

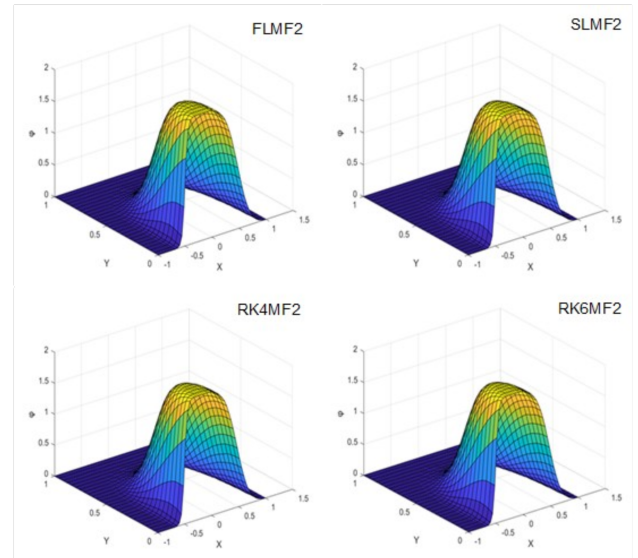


Figure 14. The plot of numerical solutions of Eq. (19) with grid mesh 25x50 for FLMF2, SLMF2, RK4MF2, and RK6MF2, respectively.

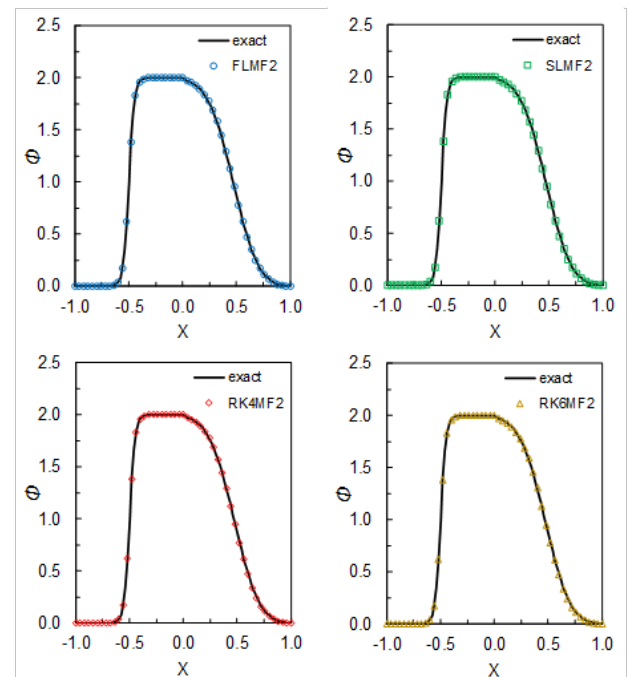


Figure 15. The plot of the 1-D profile of numerical solution Eq. (19) at $y=0$ for FLMF2, SLMF2, RK4MF2 and RK6MF2, respectively

$$u(x, y) = 2y(1 - x^2) \text{ and } v(x, y) = -2x(1 - y^2)$$

With initial and boundary conditions given by

$$\phi(x, 0) = 1 + \tanh(\alpha(2x + 1)), -1 \leq x \leq 0 \quad (\text{inlet}),$$

$$\phi(x, y) = 1 - \tanh(\alpha), (x = \pm 1, 0 \leq y \leq 1)$$

$$\text{and } (-1 \leq x \leq 1, y = 1)$$

$$\frac{\partial \phi}{\partial y}(x, 0) = 0, \quad 0 \leq x \leq 1 \quad (\text{outlet})$$

The problem is actually set as a steady-state one, but it is solved as an unsteady problem so that a steady-state is approached at $t \rightarrow \infty$. Using $\Delta x = \Delta y = 1/25$ and $P_e = 100$, simulations were carried out using an optimal operator splitting proposed by Abarbanel and Gottlieb (1981). The two-dimensional advection-diffusion problem **Eq. (19)** was solved in this splitting technique by consecutive one-dimensional convection and diffusion problems. Then, the advection parts and diffusion parts were computed using the most appropriate schemes. In this test, we consider FLMF2, SLFM2, RK4MF2, and RK6MF2 for solving the 1-D advection in the x and y-directions, respectively, and applying an implicit Crank-Nicholson method for solving the one-dimension diffusion problems in the x and y-directions, respectively. The exact solution was provided by simulation using the ULTIMATE QUICKEST scheme (Leonard, 1988, 1991) on a fine grid of $\Delta x = \Delta y = 1/50$. Comparisons of the exact and numerical results are shown in **Figures 14** and **15**. The results show that all schemes considered can provide very accurate results with no oscillation found in the solutions.

5. Conclusion

The following are some of the findings obtained from the results of this study.

1. Applying non-linear TVD filters algorithm 2.2 proposed by Engquist et al. (1989) to the higher-order finite difference scheme for solving the dominant advection equation can simulate shock or high concentration gradient problems without spurious oscillations. However, the filter has a disadvantage where it flattens true extrema and the scheme reduces to a low order of accuracy locally around true extrema. The numerical exercises show that using the filter for long-term simulation produces inaccurate results.
2. The TVD filter algorithm 2.2 (Cahyono, 2000) was applied in this study to overcome this problem by modifying the admissible function to detect the true extremum accurately.
3. Several finite difference schemes have been considered for testing the modified TVD filter algorithm 2.2: Lax-Wendroff, QUICKEST (Leonard, 1979), 5th and 6th -order conservative schemes (Leonard, 1988; 1991; Leonard and Mokhtari, 1990), and non-conservative schemes consisting of 5th and 6th -order Runge-Kutta method. The models have been tested to simulate seven test cases, including a pure advection of scalar profiles, a pure advection with variable velocity, two inviscid burger equations, an advection-diffusion equation with variable velocity and dispersion, advection of three solid bodies in rotating fluid around a square of a side length of 2, and a two-dimensional advection-diffusion equation. The numerical experiments showed that applying the modified TVD filter, combined with the higher-order non-TVD finite difference schemes for solving the advection equation, can

produce accurate solutions with no oscillations and no clipping effect extrema.

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