

# Exponential methods for solving hyperbolic problems with application to kinetic equations

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  - Lawson methods
  - Exponential Runge-Kutta methods
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# Vlasov-Poisson equations 1D×1D

Our model: a non-linear transport in  $(x, v) \in \Omega \times \mathbb{R}$  of an electron density distribution  $f = f(t, x, v)$ :

$$\begin{cases} \partial_t f + v \partial_x f + E \partial_v f = 0 \\ \partial_x E = \int_{\mathbb{R}} f \, dv - 1 \end{cases}$$

## Motivation:

We want high order methods in  $(x, v)$

We want high order methods in time  $t$ :

Splitting methods: could have a lot of steps

Runge-Kutta methods: stability constraints (CFL condition)

The most restrictive CFL condition is associated with the linear part ( $\partial_t f + v \partial_x f = 0$ )

→ We want to propose a compromise: exponential integrators.

# Vlasov-Poisson equations 1D×1D

Fourier transform in  $x$  direction of Vlasov, amenable to exponential integrators:

$$\partial_t \hat{f} + ikv\hat{f} + \widehat{E\partial_v f} = 0$$

Vlasov is of the form:

$$\dot{u} = iau + F(u)$$

Variation of constant:  $\partial_t(e^{-iat}u) = e^{-iat}F(u)$ . No more CFL in  $x$  of the form  $\Delta t \leq \sigma \frac{\Delta x}{v_{\max}}$  with  $[-v_{\max}, v_{\max}] \equiv \mathbb{R}$ .

Time integration:

$$u(t_n + \Delta t) = \exp(ia\Delta t)u(t_n) + \int_0^{\Delta t} \exp(ia(\Delta t - s))F(u(t_n + s)) ds$$

with  $\Delta t > 0$ ,  $t_n = n\Delta t$  with  $n \in \mathbb{N}$

Linear part is exact! ✓

# Idea of exponential integrators

## 2 classes of methods:

**exponential Runge-Kutta:** solve exactly what we can, and interpolate the rest. For example first order exponential Euler method:

$$u(t_n + \Delta t) \approx u^{n+1} = e^{-ia\Delta t} u^n + \Delta t \varphi_1(ia\Delta t) F(u^n)$$

where  $\varphi_1(z) = \frac{e^z - 1}{z}$



Hochbruck and Ostermann 2010, *Acta Numerica*

**Lawson:** Change of variable:  $v(t) = e^{-iat} u(t)$ , we solve with a RK method:  $\dot{v} = \tilde{F}(t, v) = e^{-iat} F(e^{iat} v(t))$

For example, Lawson Euler method:

$$v(t_n + \Delta t) \approx v^{n+1} = v^n + \Delta t e^{-iat_n} F(e^{iat_n} v^n)$$

or as an expression of  $u$ :

$$u^{n+1} = e^{-ia\Delta t} u^n + \Delta t e^{ia\Delta t} F(u^n)$$



Isherwood, Grant, and Gottlieb 2018, *Journal on Numerical Analysis*

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# Reminder of stability tools

If we want to study stability of:

$$\partial_t u + \partial_x u = 0$$

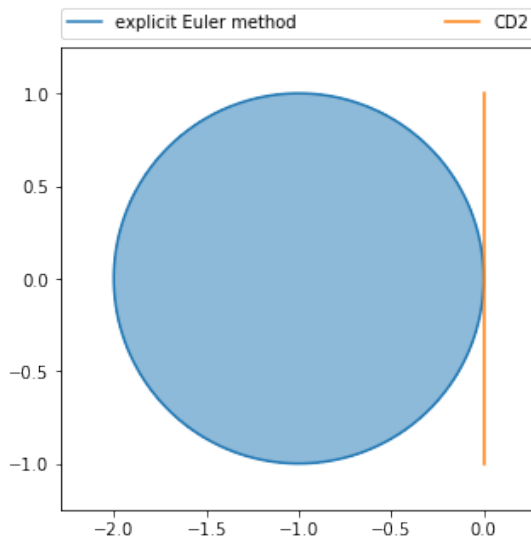
with centered scheme (CD2)  $(\partial_x u)_j \approx \frac{1}{2\Delta x}(u_{j+1} - u_{j-1})$ . After a Fourier transform (*von Neumann analysis*):

$$\dot{u} + i \frac{\sin(k\Delta x)}{\Delta x} u = 0$$

Explicit Euler method in time: we have to stretch **eigenvalues** (or **Fourier symbol**) of CD2 into explicit Euler **stability domain**.



# Reminder of stability tools



# From linear Vlasov equation to toy model

Linear Vlasov equation:

$$\partial_t f + a \partial_x f + b \partial_v f = 0$$

Fourier transform in  $x$ , CD2 in  $v$  plus a Fourier transform in  $v$ , formally:

$$\frac{df}{dt} + iakf + b \frac{i \sin(\varphi)}{\Delta x} f = 0$$

**Toy model:**

$$\dot{u} + iau + \lambda u = 0$$

with  $a \in \mathbb{R}$ ,  $\lambda \in \mathbb{C}$  (diffusive scheme for example).

$\lambda$  is the Fourier symbol (or eigenvalues) of FD method to approximate  $\partial_v f$ .

# Phase space discretization

In  $v$  direction we use a FD method:

CD2 (centered difference of order 2):  $(\partial_v f)(v_j) \approx \frac{f_{j+1} - f_{j-1}}{2\Delta v}$

WENO5 (weighted essentially non-oscillatory of order 5):

WENO5: non linear scheme: ~~Von Neumann analysis~~

LW5 (linearized WENO5): linear scheme (this is Lagrange interpolation of order 5)

$$(\partial_v f)(v_j) \approx \frac{1}{\Delta v} \left( -\frac{1}{30}f_{j-3} + \frac{1}{4}f_{j-2} - f_{j-1} + \frac{1}{3}f_j + \frac{1}{2}f_{j+1} - \frac{1}{20}f_{j+2} \right)$$

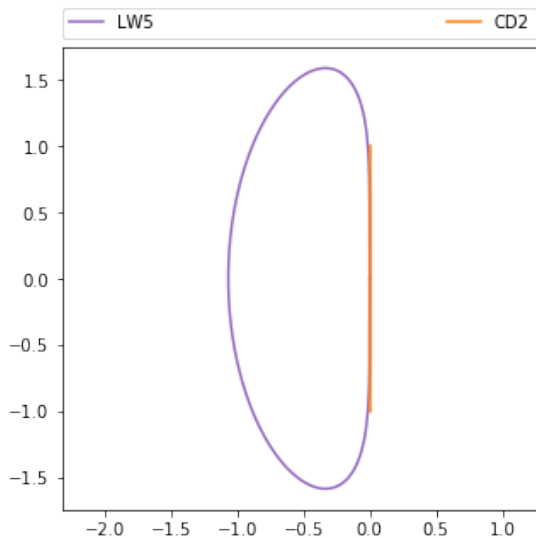


Wang and Spiteri 2007, *Journal on Numerical Analysis*



Motamed, Macdonald, and Ruuth 2010, *Journal of Scientific Computing*

# Fourier symbols



# Lawson methods stability domain

For our toy model:

$$\dot{u} = iau + \lambda u$$

Change of variable:  $v(t) = e^{-iat}u(t)$

$$\dot{v} = e^{-iat}\lambda e^{iat}v$$

Apply a Runge-Kutta method to compute stability function of Lawson method:

$$v^{n+1} = \underbrace{p(\lambda\Delta t)}_{\text{stability function of RK}} v^n$$

i.e.:

$$u^{n+1} = \underbrace{p(\lambda\Delta t)e^{-ia\Delta t}}_{\text{stability function of Lawson}} u^n$$

Stability domain:  $\mathcal{D} = \{z \in \mathbb{C}, |p(z)| \leq 1\}$  of Lawson method is **the same** as the underlying Runge-Kutta method **because**  $ia \in i\mathbb{R}$

# Considered $Lawson(RK(s, p))$ methods

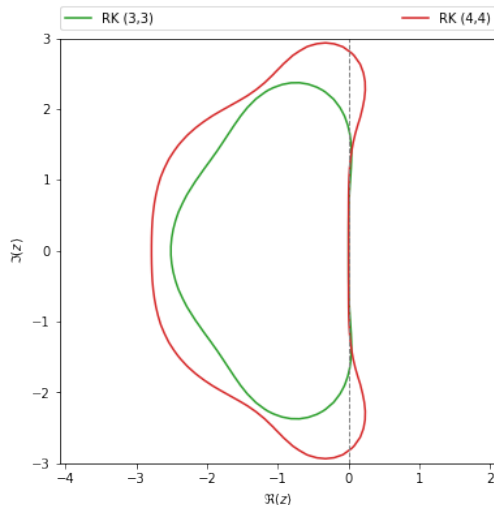
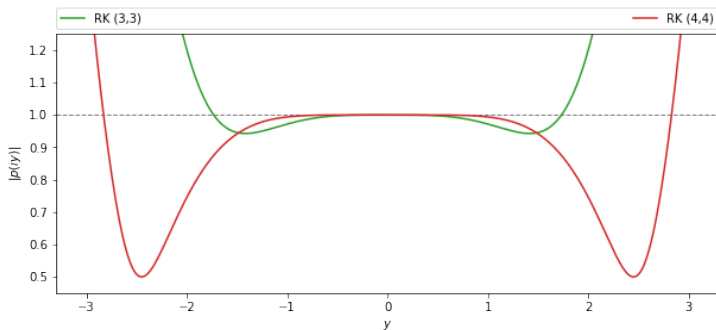


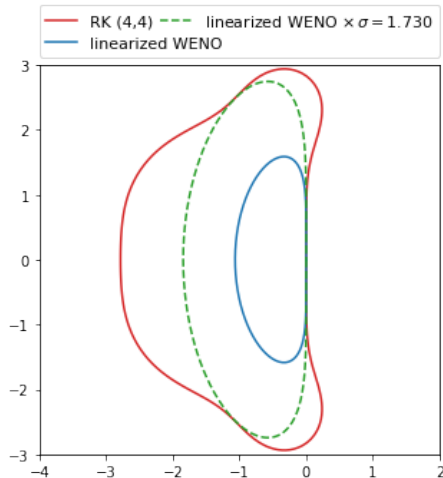
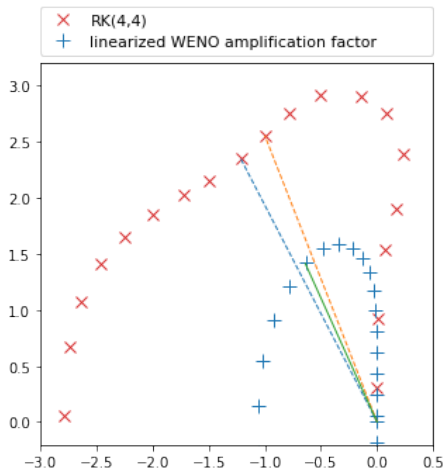
Figure:  $\{z \in \mathbb{C}, |p(z)| = 1\}$

For stability between a Lawson method and CD2, we solve:

$$|p(iy)| = 1, \quad y \in \mathbb{R}$$



# Lawson methods – LW5





# Lawson methods – CD2/LW5: CFL estimates

-	Lawson( $RK(3, 3)$ )	Lawson( $RK(4, 4)$ )
CD2 ( $y_{\max}$ )	$\sqrt{3}$	$2\sqrt{2}$
LW5 ( $\sigma$ )	1.433	1.73

Table: CFL number for some Lawson schemes.

Other RK–CD2 CFL estimates:

 Baldauf 2008, *Journal of Computational Physics*

Same results for RK–WENO CFL estimates:

 Motamed, Macdonald, and Ruuth 2010, *Journal of Scientific Computing*

 Lunet et al. 2017, *Monthly Weather Review*

# Exponential Runge-Kutta methods

$$\dot{u} = iau + F(u)$$

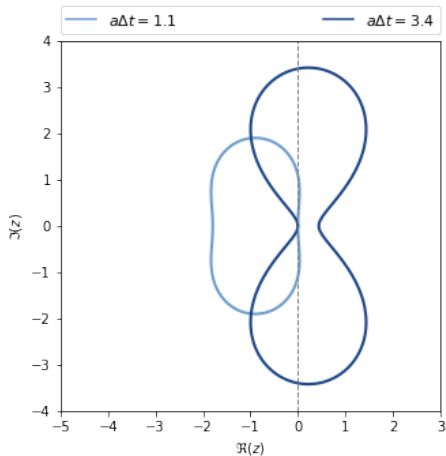
Example on ExpRK(2,2):

$$\begin{aligned}u^{(1)} &= e^{-ia\Delta t}u^n - \Delta t\varphi_1 F(u^n) \\u^{n+1} &= e^{-ia\Delta t}u^n - \Delta t \left[ (\varphi_1 - \varphi_2)F(u^n) + \varphi_2 F(u^{(1)}) \right]\end{aligned}$$

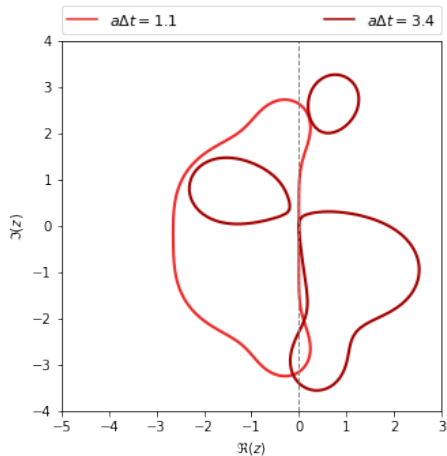
Stability function becomes:

$$p_{\text{ExpRK}(2,2)}(z) = \frac{1}{2}\varphi_1\varphi_{1,2}z^2 + \left(\varphi_1 + i\frac{\varphi_1\varphi_{1,2}}{2}a\right)z + 1 + i\varphi_1a$$

Stability domain depends of  $a\Delta t \dots$  ✗



**Figure:** Stability domain of ExpRK(2,2) for  $a\Delta t \in \{1.1, 3.4\}$



**Figure:** Stability domain of Cox-Matthews for  $a\Delta t \in \{1.1, 3.4\}$

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## Numerical tools:

FFT in  $x$  direction

CD2 or WENO5 in  $v$  direction

*Lawson*(*RK*( $s, p$ )) method in time  $t$

**CFL:**  $\Delta t_n \leq \frac{C \Delta v}{\|E^n\|_{\infty}} \leq \frac{C \Delta v}{\max_n \|E^n\|_{\infty}}$  where  $C = y_{\max}$  or  $\sigma$  from the linear theory.

We can choose:  $\Delta t = \min \left( 0.1, \frac{C \Delta v}{\max_n \|E^n\|_{\infty}} \right)$

$$f(t=0, x, v) = f_0(x, v) = \frac{1}{\sqrt{2\pi}} e^{-\frac{v^2}{2}} (1 + 0.001 \cos(0.5x))$$

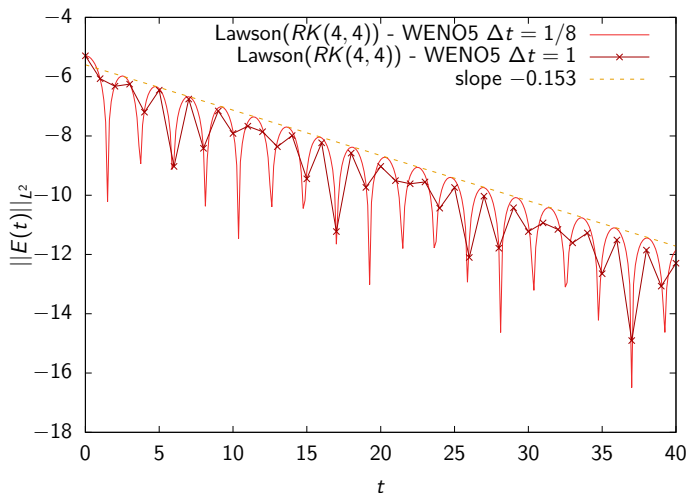
$$x \in [0, 4\pi], v \in [-8, 8], N_x = 81, N_v = 128$$

Because of damping:

$$\max_n \|E^n\|_\infty = \|E^0\|_\infty$$

So, we choose  $\Delta t = 0.1$  (with  $\Delta t = 100$  it is still stable!)

# Landau damping: numerical results



**Figure:** Landau damping test: time history of  $\|E(t)\|_{L^2}$  (semi-log scale) obtained with Lawson( $RK(4,4)$ ) and WENO5 with  $\Delta t = 1/8$  and  $\Delta t = 1$ .

# Landau damping: numerical results

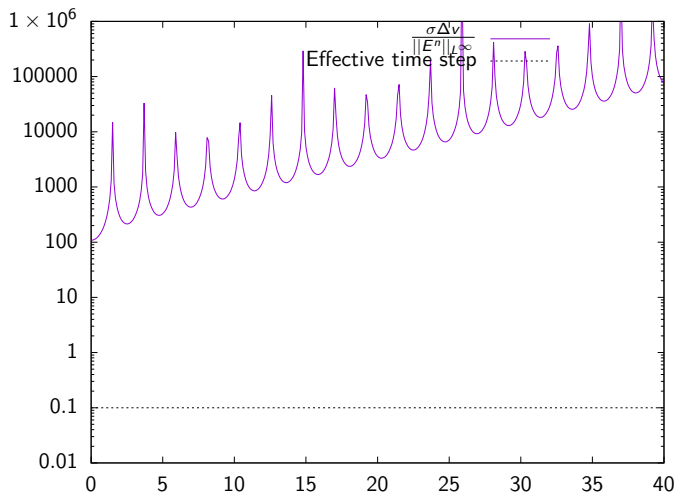


Figure: Landau damping test: time history of the CFL condition (semi-log scale).



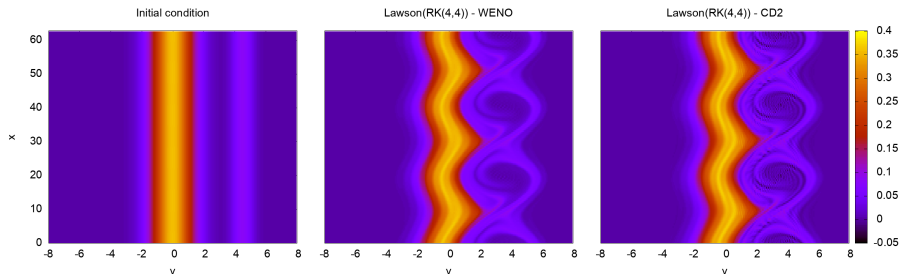
# Bump on Tail (BoT)

$$f(t=0, x, v) = \left[ \frac{0.9}{\sqrt{2\pi}} e^{-\frac{v^2}{2}} + \frac{0.2}{\sqrt{2\pi}} e^{-2(v-4.5)^2} \right] (1 + 0.001 \cos(0.5x))$$

$x \in [0, 20\pi]$ ,  $v \in [-8, 8]$ ,  $N_x = 135$ ,  $N_v = 256$

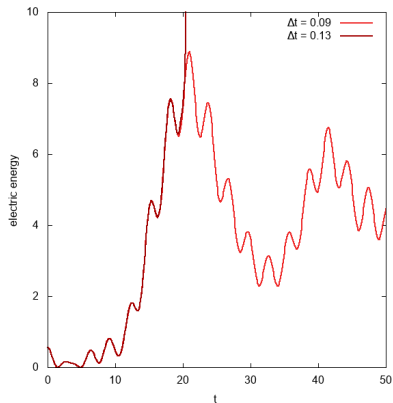
Numerical estimation of  $\max_n \|E^n\|_\infty \approx 0.6$ , we choose  $\Delta t = \frac{C\Delta v}{0.6}$

# BoT: numerical results

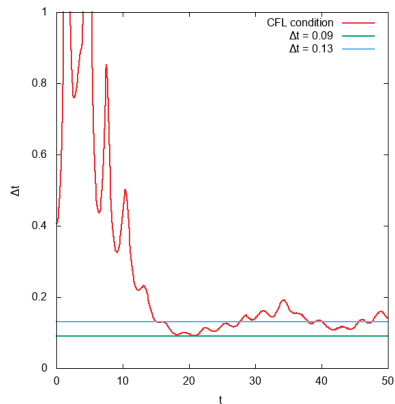


**Figure:** Distribution function at time  $t = 0$  as a function of  $x$  and  $v$  (left), at time  $t = 40$  for Lawson( $RK(4, 4)$ ) + WENO5 (center) and Lawson( $RK(4, 4)$ ) + centered scheme (right).

# BoT: numerical results



**Figure:** Illustration of the accuracy of the CFL estimate obtained from the linear theory. History of electric energy with Lawson( $RK(4,4)$ ) + WENO5



**Figure:** History of CFL condition for Lawson( $RK(4,4)$ ) + WENO5 case

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## Summary

Better understanding on stability of Lawson or ExpRK methods in transport equations

Python script with `sympy` to compute estimates of CFL of Lawson – CD2, Lawson – WENO (5 or 3)

## Future works

We can improve method with an embedded Runge-Kutta method (Dormand-Prince method, used in `ode45` of Matlab)

Compare performance between exponential integrators and splitting methods (same order)

Use semi-Lagrangian method to remove dependency on periodic space (Fourier transform)

Thank you for your attention



