Solving QFTs convection-diffusion equations with finite volume methods Kurganov and Tadmor (KT)  $O(x^2)$  central scheme - An appetizer

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FRG flow eqs. especially LPA flow eqs. of low-energy effective models can be written as Convection-diffusion equations<sup>1</sup>:

 $\partial_t u(t,x) + \partial_x F[t, u(t,x)] = \partial_x Q[t,x, u(t,x), \partial_x u(t,x)] + \partial_x S(t,x)$ 

- Very common class of PDEs in Physics, Engineering and Numerical Mathematics
- Well established numerical methods available (see talks of N. Wink and D. Rischke) ⇒ among them are **Finite volume (FV) methods**

<sup>&</sup>lt;sup>1</sup>E. Grossi and N. Wink (2019), arXiv: 1903.09503 [hep-th]



$$\partial_t u(t,x) + \partial_x F[t, u(t,x)] = \partial_x Q[t,x, u(t,x), \partial_x u(t,x)] + \partial_x S(t,x)$$
(1)

- u(t,x) vector of conserved quantities
- F[t, u(t, x)] nonlinear convection flux
- $Q[t, x, u(t, x), \partial_x u(t, x)]$  dissipation flux
- S(t, x) source term

#### Examples:

- Linear Advection and (inviscid/viscous) Burgers' eqs. with non-smooth ICs
- Euler Equations of Gas Dynamics (Shock tube problem)

#### FRG LPA flow equations

# A second-order central difference TVD MUSCL



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#### New High-Resolution Central Schemes for Nonlinear Conservation Laws and Convection–Diffusion Equations

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#### A. Kurganov and E. Tadmor, J. Comput. Phys. 160 (May 2000)

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Finite volume methods

Kurganov and Tadmor (KT)  $O(x^2)$  central scheme

#### Semi-discrete central scheme

Equidistant spatial finite volume grid with n cells

$$\{x_j\} = \{x_0, x_0 + \Delta x, \dots, x_1\}$$
(2)

$$\{u_j\} = \{u(t, x_0), u(t, x_0 + \Delta x), \dots, u(t, x_1)\}$$
(3)

with extrapolated ghost points e.g.  $u_{-1} = 2u_0 - u_1$ Conservation form:

$$\frac{\mathrm{d}u_{j}}{\mathrm{d}t} = -\frac{H_{j+1/2}(t) - H_{j-1/2}(t)}{\Delta x} + \frac{P_{j+1/2}(t) - P_{j-1/2}(t)}{\Delta x} + \frac{S_{j+1/2}(t) - S_{j-1/2}(t)}{\Delta x}$$
(4)

- $H_{j\pm 1/2}(t)$  Numerical convection flux on left/right cell boundary
- $P_{j\pm 1/2}(t)$  Numerical diffusion flux on left/right cell boundary
- $S_{j\pm 1/2}(t)$  Numerical source term on left/right cell boundary

A. Kurganov and E. Tadmor, J. Comput. Phys. 160 (May 2000)

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Finite volume methods

KT  $O(x^2)$  - Numerical convection flux  $H_{j+1/2}(t)$ 



$$H_{j+1/2}(t) = \frac{F[t, u_{j+1/2}^+] + F[t, u_{j+1/2}^-]}{2} - \frac{a_{j+1/2}}{2} \left( u_{j+1/2}^+ - u_{j+1/2}^- \right), \quad (5)$$

Maximal local speed

$$a_{j+1/2} = \max\left(\rho\left(\frac{\partial F}{\partial u}(u_{j+1/2}^{+})\right), \rho\left(\frac{\partial F}{\partial u}(u_{j+1/2}^{-})\right)\right)$$
(6)

- Approximate derivatives (TVD reconstruction) with limiter  $\phi$ 

$$u_{j+1/2}^{+} = u_{j+1} - \frac{\Delta x}{2} \partial_x u_{j+1} = u_{j+1} - \frac{1}{2} \phi \left( \frac{u_{j+1} - u_j}{u_{j+2} - u_{j+1}} \right) (u_{j+2} - u_{j+1})$$
(7)  
$$u_{j+1/2}^{-} = u_j + \frac{\Delta x}{2} \partial_x u_j = u_j + \frac{1}{2} \phi \left( \frac{u_j - u_{j-1}}{u_{j+1} - u_j} \right) (u_{j+1} - u_j)$$
(8)

A. Kurganov and E. Tadmor, J. Comput. Phys. 160 (May 2000)

#### Flux limiters





expressions from: en.wikipedia.org/wiki/Flux\_limiter - 2019.07.10 - 16:30

Finite volume methods



Central difference approximation of diffusion flux:

$$P_{j+1/2}(t) = \frac{1}{2}Q[t, x_j, u_j, (u_{j+1} - u_j)/\Delta x] + \frac{1}{2}Q[t, x_{j+1}, u_{j+1}, (u_{j+1} - u_j)/\Delta x]$$
(9)

Diffusion flux for *u*<sub>j</sub> is based on the 3-point stencil {*u*<sub>j-1</sub>, *u*<sub>j</sub>, *u*<sub>j+1</sub>}
 Analogous central difference approximation of source flux:

$$S_{j+1/2}(t) = \frac{1}{2}S(t, x_j) + \frac{1}{2}S(t, x_{j+1})$$
(10)

A. Kurganov and E. Tadmor, J. Comput. Phys. 160 (May 2000)



- ▶ Method of Lines (MoL) finite volume PDE discretization ⇒ sparse (banded) ODE system
- ► Total RHS flux for  $\dot{u}_j$  is based on the 5-point stencil { $u_{j-2}, u_{j-1}, u_j, u_{j+1}, u_{j+2}$ }
- Approximate derivatives are reconstructed from the computed cell averages using *\phi*-Limiter
- Only additional information (apart from PDE and grid): spectral radius of jacobian ρ = max |λ<sub>i</sub>(∂F/∂u)| to approximate local speeds



$$\frac{\mathrm{d}u_{j}}{\mathrm{d}t} = -\frac{F[t, u_{j+1}] - F[t, u_{j}]}{\Delta x} + \frac{Q[t, x_{j+1}, u_{j+1}, (u_{j+1} - u_{j})/\Delta x] - Q[t, x_{j}, u_{j}, (u_{j} - u_{j-1})/\Delta x]}{\Delta x} + \frac{S[t, x_{j+1}] - S[t, x_{j}]}{\Delta x}$$
(11)

- ▶ Applicable only to convection-diffusion eqs. with ∂F/∂u < 0 ∀ t, u</li>
   Linear Advection eq. with negative velocity
   FRG LPA flow eqs.
  - • •



Linear Advection eq.:

$$\partial_t u(t,x) - \partial_x u(t,x) = 0, \qquad u(0,x) = \begin{cases} 1 & 3 \le x \le 4 \\ 0 & \text{otherwise} \end{cases}$$
 (LA)

Burgers' eq.:

$$\partial_t u(t,x) + \partial_x \frac{u(t,x)^2}{2} = \nu \partial_x^2 u(t,x)$$
 (B)

$$u(0,x) = 0.5 + \sin(x)$$
 and inviscid:  $\nu = 0$  (B.1)

$$u(0,x) = 0.5 + \sin(x) \text{ and viscous: } \nu = 0.1$$
(B.2)  
$$u(0,x) = \begin{cases} 1 & x \le 2 \\ 0 & \text{otherwise} \end{cases} \text{ and viscous: } \nu = 0.01$$
(B.3)





























































































































































































































































One-dimensional Euler System:

$$\partial_t \begin{pmatrix} \rho \\ \mu \\ \epsilon \end{pmatrix} + \partial_x \begin{pmatrix} \mu \\ \rho v^2 + p \\ (\epsilon + p)v \end{pmatrix} \equiv \partial_t u + \partial_x F[u] = 0, \quad (E)$$
  
with  $u = (\rho, \mu, \epsilon)^{\mathrm{T}}$ .

- Conserved quantities/densities: mass  $\rho$ , momentum  $\mu = \rho v$  and energy  $\epsilon$
- Equation of state:  $p = (\gamma 1)(\epsilon \rho v^2/2)$  with  $\gamma = 1.4$
- Shock tube ICs:

$$u(0, x) = \begin{cases} (\rho_L, \mu_L, \epsilon_L)^{\mathrm{T}} & x \leq x_0 \\ (\rho_R, \mu_R, \epsilon_R)^{\mathrm{T}} & \text{otherwise} \end{cases}$$
(ES

## Shock tube initial conditions

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All initial conditions are given in SI units and have  $x_0 = 0.5 \text{ m}$ :

Sod's classical initial condition<sup>2</sup>:

$$u_L = (1.0, 0.0, 2.5)^{\mathrm{T}}$$
  $u_R = (0.125, 0.0, 0.25)^{\mathrm{T}}$  (EST.Sod)

Very strong shock<sup>3</sup>:

 $u_L = (0.445, 0.311, 8.928)^{\mathrm{T}}$   $u_R = (0.5, 0.0, 1.4275)^{\mathrm{T}}$  (EST.Lax)

Strong double rarefaction wave and vacuum limit<sup>4</sup>:

 $u_L = (1.0, -2.0, 3.0)^{\mathrm{T}}$   $u_R = (1.0, 2.0, 3.0)^{\mathrm{T}}$  (EST.Toro2)

Exact solutions of the respective Riemann problems were computed with<sup>5</sup>

<sup>2</sup>G. A. Sod, J. Comput. Phys. **27**.1 (1978)

<sup>3</sup>P. D. Lax, Comm. Pure Appl. Math. 7.1 (1954)

<sup>4</sup>E. Toro, *Riemann Solvers and Numerical Methods for Fluid Dynamics*, Berlin: Springer, 1999

<sup>5</sup>D. I. Ketcheson and et al., Riemann Problems and Jupyter Solutions, github.com/clawpack/riemann\_book - 2019.07.09 - 20:30

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## Euler shock tube (EST.Toro2) - KT O(2) n=201



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$$\partial_t u(t,x) + c_d \partial_x \frac{\mathrm{e}^{-dt}}{1 + \mathrm{e}^{2t} u(t,x)} = -\frac{c_d}{N-1} \partial_x \frac{\mathrm{e}^{-dt}}{1 + \mathrm{e}^{2t} (u(t,x) + 2x \partial_x u(t,x))}$$
(12)

LPA flow equation of the O(N) model in d > 0 dimensions using d-dim. Litim regulator with

$$t \equiv -\log k / \Lambda \tag{13}$$

$$x \equiv \frac{\rho}{(N-1)\Lambda^{d-2}} \tag{14}$$

$$u(t,x) \equiv \frac{\partial U(t,\rho)}{\Lambda^2 \partial \rho}$$
(15)

$$c_d \equiv \frac{2^{-d} \pi^{-d/2}}{\Gamma(1+d/2)}$$
(16)



## $O(\infty)$ model - d = 3 initial conditions

• Riemann problem (restored phase for O( $\infty$ ), d=3)

$$u(t = 0, x) = \begin{cases} 0.0 & 0.02 < x < 0.05 \\ 0.1 & \text{otherwise} \end{cases}$$
(GW.2a)

• Quartic potential (restored phase for  $O(\infty)$ , d=3)

$$u(t = 0, x) = 1.0x - 0.1$$
 (GW.3a)

Sextic potential (restored phase for  $O(\infty)$ , d=3)

$$u(t = 0, x) = 1.0x^2 - 0.103x + 0.0024$$
 (GW.8c)

Sextic potential (broken phase for  $O(\infty)$ , d=3)

$$u(t = 0, x) = 1.0x^2 - 0.105x + 0.0024$$
 (GW.8d)

ICs for various figures in E. Grossi and N. Wink (2019), arXiv: 1903.09503 [hep-th]




























































































































# O( $\infty$ ), d=3, (GW.2a)





# O(50), d=3, (GW.2a)





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#### O( $\infty$ ), d=3, (GW.3a) ICs





#### O( $\infty$ ), d=3, (GW.8c) ICs





# O( $\infty$ ), d=3, (GW.8d) ICs





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#### $O(\infty)$ , d=3 - ODE flow time steps





#### $O(\infty)$ , d=3 - ODE flow time steps











































► A zero dimensional field-theory of N scalars  $\phi_a$ :

$$S = U(\phi_a \phi^a/2) = \frac{\lambda_1}{2} \phi_a \phi^a + \frac{\lambda_2}{8} (\phi_a \phi^a)^2 + \frac{\lambda_3}{24} (\phi_a \phi^a)^3 + \dots \quad (17)$$
$$= U(\rho), \qquad \rho \equiv \phi_a \phi^a/2 \tag{18}$$

- $\blacksquare$  The physical minimum is always at  $<\phi_{a}\phi^{a}>=0$
- All *n*-Point functions can be computed by solving one-dimensional integrals: e.g.:

$$\Gamma^{(2)} = \frac{NR_{N-1}}{R_{N+1}}, \quad R_N = \int_0^\infty dy \, y^N \exp\left[-U(y^2/2)\right]$$
(19)

for further details see e.g.: J. Keitel and L. Bartosch, J. Phys. A45 (2012), arXiv: 1109.3013 [cond-mat.stat-mech]

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• The Wetterich eq. in d = 0 is a partial differential equation:

$$\frac{\mathrm{d}U_t(\rho)}{\mathrm{d}t} = \frac{N-1}{R_t + U_t'(\rho)} \frac{\mathrm{d}R_t}{\mathrm{d}t} + \frac{1}{R_t + U_t'(\rho) + 2\rho U_t''(\rho)} \frac{\mathrm{d}R_t}{\mathrm{d}t} \qquad (20)$$

with t = 0 and  $R_0 = \infty$  in the UV and t = 1 and  $R_1 = 0$  in the IR. • Various regulators can be constructed e.g.:

$$R_t^{\exp,m} = \exp[1/t^m - 1] - 1$$
 with  $m > 0$  (21)

$$R_t^{\text{pow},m} = 1/t^m - 1$$
, with  $m > 0$  (22)

• The exact flow eqs. for  $\partial_{\rho} U_t$  can be solved numerically and results can be confronted with *n*-point functions form exact integration

#### O(N) model in d=0 - Regulator trajectories





#### O(N) model in d=0 - Regulator trajectories
















































































### O(N) model in d=0 - $\lambda_1(t)$ and $\lambda_2(t)$







### O(4) model in d=0 - Discontinuous IC



# O(4) model in d=0 - Upwind O( $x^1$ ) vs KT O( $x^2$ )



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# O(4) model in d=0 - Upwind O( $x^1$ ) vs KT O( $x^2$ )



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# O(4) model in d=0 - Upwind O( $x^1$ ) vs KT O( $x^2$ )



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The second order KT-scheme in its semi-discrete form (4)

- Robust and competitive spatial discretisation scheme
- Easy to implement/extend
- First applications to FRG LPA flow eqs. look very promising
- O(N) model in zero dimensions
  - Well suited for numerical test (exact solutions, non-trivial flow eqs.)
  - Very instructive toy model for various aspects of FRG and QFTs in general

#### TODO:

- Finite volume/KT scheme beyond LPA
- $\blacksquare$  Finite volume/KT scheme at finite T and  $\mu$

...