

### **III. Kinetic-Hydrodynamics Coupling**

# Kinetic Equations (of monatomic gases)

$$f_t + k \nabla_x f - \nabla_x V \nabla_k f = 1/\varepsilon B(f)$$

$f(t,x,k)$ : probability density distribution

$t$ : time       $x$ : position       $k$ : particle velocity

$V(x)$ : potential       $Q(f)$ : collision operator

$\varepsilon$ : dimensionless mean free path or Knudsen number

**Properties (for elastic collisions):**

conservations of mass, moment and total energy;

H-theorem (entropy condition)

# Kinetic and hydrodynamics equations

- Solving kinetic equations are much more expensive than solving hydrodynamic equations
- Defined in **phase space** (six dimension + time)
- More expensive when **mean free path** (**Knudsen number=mfp/typical domain length**) is small

# Scales in Kinetic (Boltzmann) Equations

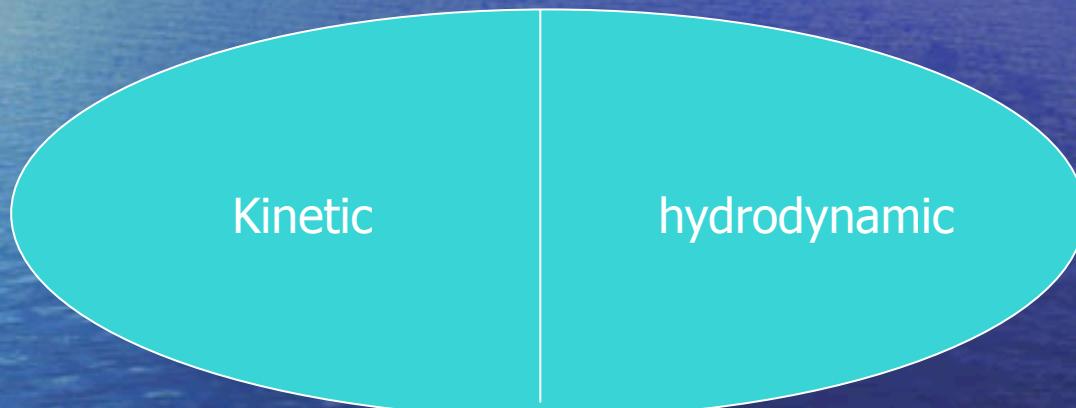
- When  $\varepsilon$  is small ( $kn \geq 0.01$ ), the moments of  $f$  solve the compressive Euler (to leading order) or Navier-Stokes equations ( to  $O(\varepsilon)$  ) of fluid dynamics, except at initial, boundary or shock layers
- When  $\varepsilon$  is not small the fluid equations are not valid, so one has to use the kinetic equations

# Multiscale Problems

- Very often one needs to deal with **multiscale** phenomena:
  - ² Space shuttle reentry
    - $\varepsilon : 10^{-8} \gg 1$  meters
    - ² fluid equations not accurate in boundary layers, shock layers, high Mach numbers (hypersonic flights)
    - ² Different property of materials need different physical laws at different scales

# Domain decomposition method

- Domain decomposition methods are useful in **multiscale** computation:  
coupling of microscopic and macroscopic models: multiphysics simulation



The difficulty is the **interface condition**: how to transfer data between different scales—often no unique solution; where to put the interface?

# Asymptotic preserving methods

- Work in **both kinetic and fluid regimes** by solving only the kinetic equation
- When  $\varepsilon$  is small, and  $\Delta x, \Delta t \gg \varepsilon$  they automatically become a fluid dynamic solver

# features

- No coupling with macroscopic equations, thus avoid the difficulty of interface condition/treatment as in other multiscale methods
- AP schemes take **macroscopic** time steps and mesh sizes in the fluid regimes, thus are very efficient even for small Knudsen number

# Fluid approximations of kinetic equations

- The Euler scaling

moments:

$$\rho = \int f dk \quad \text{mass}$$

$$\rho u = \int kf dk \quad \text{momentum}$$

$$E = \frac{1}{2} \int |k|^2 f dk \quad \text{total energy}$$

- when  $\varepsilon \rightarrow 0$ ,  $Q(f) \rightarrow 0$ , then  
$$f = \rho / (2\pi T)^{d/2} e^{-(|k-u|^2)/2T} = M \quad \text{local Maxwellian}$$
- The moments  $\rho$ ,  $\rho u$ ,  $E$  solve the compressible Euler equations
- Chapman-Enskog expansion gives the compressible Navier-Stokes equations for  $0 < \varepsilon < < 1$

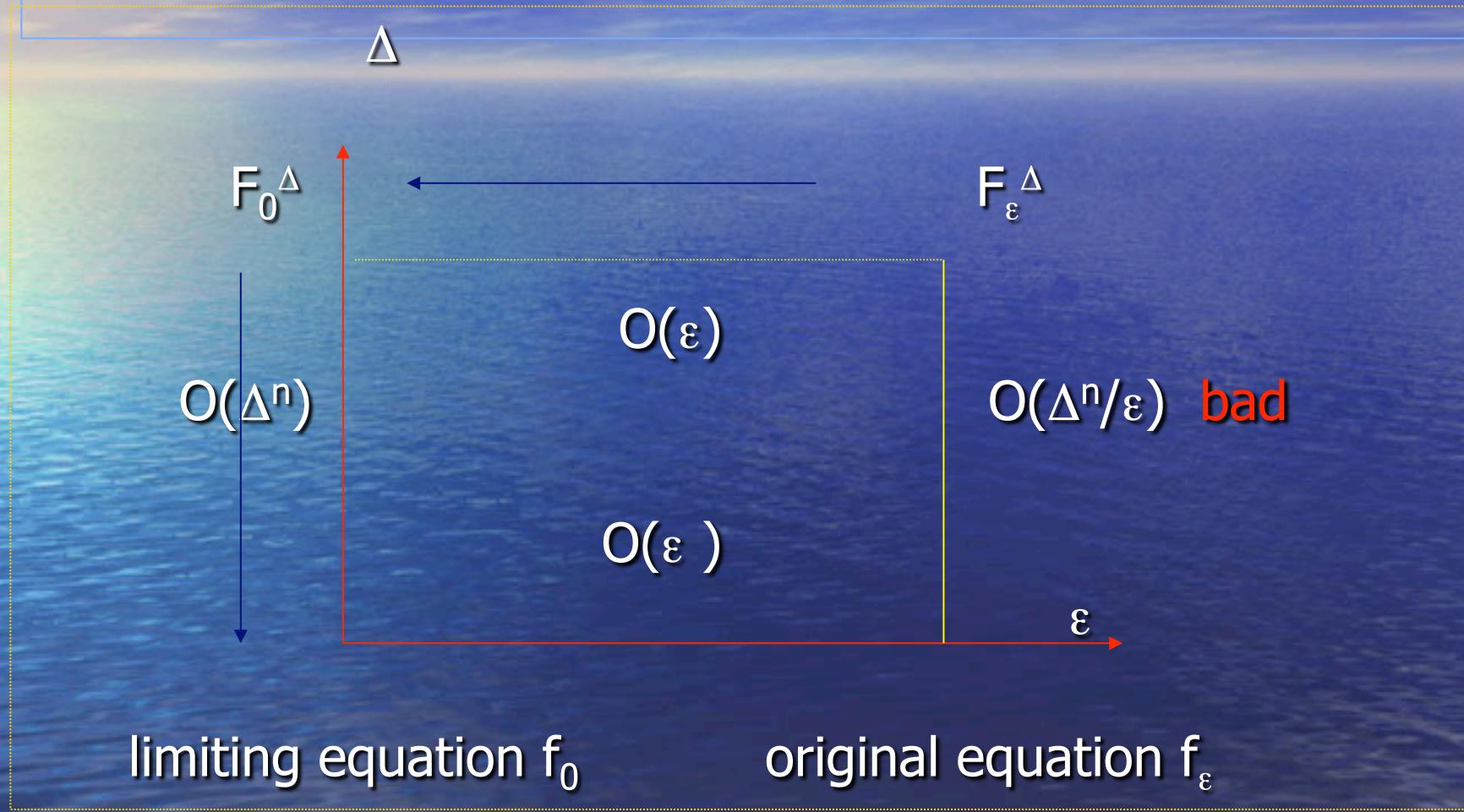
# Numerical issues when $\varepsilon$ is small

- Numerical stiffness: an explicit collision term would require  $\Delta t = O(\varepsilon)$
- Implicit collision allows  $\Delta t$  to be independent of  $\varepsilon$ , but inverting the **non-local collision** term is numerically difficult and expensive
- Does the **underresolved** computation gives the correct macroscopic solutions?

# Numerical goal

- Implicit collision that can be solved explicitly (or easily—no iterative Newton solvers): underresolved time step
- Schemes capture the macroscopic behavior without resolving the small Knudsen number
- Asymptotic-preserving:  
numerical scheme should preserve the discrete analog of the Chapman-Enskog expansion

# Asymptotic preserving



# Error-estimates (*Golse-J-Levermore* SINUM '99) for linear transport in diffusive regime

- Classical error analysis

$$\| F_\varepsilon^\Delta - f_\varepsilon \| \asymp C \Delta^n / \varepsilon$$

- if Asymptotic-preserving

$$\| F_\varepsilon^\Delta - f_\varepsilon \| \asymp C (\Delta^n + \varepsilon)$$

- This yields a uniform error estimate:

$$\| F_\varepsilon^\Delta - f_\varepsilon \| \asymp C (\Delta)^{n/2}$$

# Development of AP schemes

- Transport and kinetic equations  
Larsen-Morel-Miller '89; Coron-Parthame '91; Jin-Levermore 93, Caflisch-Jin-Russo 95, Jin-Pareschi-Toscani '00, Klar 00, Lemou-Miusseun '08
- Hyperbolic systems with stiff relaxation  
Jin-Levermore '95
- Vlasov-type equations in plasmas and quasineutral limit  
Crispel-Degond-Vignal '05 etc
- Fluid equations for uniform Mach number  
Haack-Jin-Liu '09 Degond-Tang '09

# A simple example of AP scheme: hyperbolic system with relaxation (Jin-Xin '95)

$$u_t + v_x = 0 \quad (1)$$

$$v_t + au_x = \frac{1}{\tau}[v - f(u)] \quad (2)$$

As  $\tau^2 \rightarrow 0$ ,  $v \rightarrow f(u)$ , so the macroscopic equation is

$$u_t + f(u)_x = 0 \quad (3)$$

To solve (1) (2), use forward Euler for convection, fully implicit source term and upwind scheme for convection, then when  $\tau^2 \rightarrow 0$ , the limiting scheme is the Lax-Friedrichs scheme for (3)

This is an AP scheme for (3)

# A typical numerical approach for the BGK model (Coron-Perthame SINUM '91)

$$f_t + k \notin \nabla_x f = 1/\varepsilon (M - f)$$

Time splitting separates the two scales

- explicit scheme for (non-stiff) convection:

$$f_t + k \notin \nabla_x f = 0$$

- implicit scheme for stiff collision

$$f_t = 1/\varepsilon (M-f)$$

# Numerical approach

- use (non-oscillatory) shock capturing methods for convection
- **Implicit collision treated explicitly**  
$$(f^{n+1} - f^n) / \Delta t = 1/\varepsilon (M^{n+1} - f^{n+1})$$

note  $M^{n+1} = M^n$

due to **conservation of mass, momentum and total energy**

- Can be even solved **exactly**  
$$f^{n+1} = (1 - e^{-\Delta t / \varepsilon}) M^n + e^{-\Delta t / \varepsilon} f^n$$

# Asymptotic-preserving?

- For the implicit time discretization when  $\varepsilon \rightarrow 0$ , with  $\Delta t$  fixed, the collision leads to the **correct local Maxwellian**  
 $f^{n+1} = M^{n+1}$
- also true for the exact solver

now plug into the convection step, and take moments  
one gets the compressible Euler equation!

thus **AP to the Euler limit** (in time)

- In space, if one uses upwind for linear convection, then when  $\varepsilon \rightarrow 0$ , with  $\Delta x$  fixed, one gets the "**kinetic scheme**" for the Compressible Euler equations

thus **AP in space**

# General collision operator

- <sup>2</sup> can't be explicitly solved !
- using the **Wild sum**  
*(Gabetta, Pareschi, Toscani, '97)*  
what if the collision is not quadratic (quantum Boltzmann equation)?

Our aim is to find a **simple way** to integrate the nonlinear collision operator such that

1. Uniform stability in terms of  $\varepsilon$
2. implicit collision can be handled as easily as the BGK operator
3. Asymptotic-preserving

# A new idea:

- Penalize the nonlinear collision operator by the BGK operator

$$B(f, f) = [B(f, f) - \beta (M-f)] + \beta (M-f)$$

↑  
explicit

↑  
implicit

For a suitably chosen constant  $\beta$ , this scheme will be uniformly stable in  $\varepsilon$

# Uniform and L-stability: an ODE example

Consider

$$f_t = [-\nu f + \beta \nu f] - \beta \nu f$$

Discretization:

$$(f^{n+1} - f^n) / \Delta t = [-\nu f^n + \beta \nu f^n] - \beta \nu f^{n+1}$$

For  $\beta > 1/2$  the scheme is

- 1) Unconditionally stable
- 2) Converge to equilibrium:  $\| f^{n+1} \| \gg |1-1/\beta| \| f^n \|$

(so  $f$  is driven **quickly** toward the local equilibrium  $f=0$  for **any initial data**)

$\beta \gg 1$  is the best choice

# An Explicit-Implicit scheme for Boltzmann

$$\begin{aligned} & (f^{n+1} - f^n) / \Delta t + k \cdot \nabla_x f^n \\ &= 1/\varepsilon [B(f^n, f^n) + \beta (M^n - f^n) - \beta/\varepsilon (M^{n+1} - f^{n+1})] \end{aligned}$$

Let  $\beta_A = [B(f^n, f^n) - B(M^n, M^n)] / (f^n - M^n)$

stability requires:  $\beta > 1/2 \sup |\beta_A|$ ; best choice:  $\beta \gg \sup |\beta_A|$ ;

can be made **time-dependent**

## Explicit Implementation:

Taking the moments:

$$\langle f^{n+1} - f^n \rangle / \Delta t + \nabla_x \cdot \langle k \cdot f^n \rangle = 0$$

This defines  $M^{n+1}$ . The rest is explicit!

# properties

- 1) Stable if  $\Delta t \gg \Delta x/c$  (no dependence on  $\varepsilon$  !)
- 2) If  $\varepsilon \rightarrow 0$ , then  $f^{n+1} \rightarrow M^{n+1}$ ?  
classical AP scheme requires that

For any  $f^0, f^n \in M^n = O(2)$  for any  $n \geq 1$

namely any data will be projected to the local Maxwellian  
in one time step.

This scheme does NOT have this property

# A related problem: Hyperbolic systems with Relaxation

$$\begin{cases} \frac{\partial u}{\partial t} + f_1(u, v)_x = 0, \\ \frac{\partial v}{\partial t} + f_2(u, v)_x = \frac{1}{\varepsilon} R(u, v). \end{cases}$$

The relaxation term  $R : \mathbb{R}^2 \mapsto \mathbb{R}$  is dissipative in the sense of [12]:

$$(1.12) \quad \partial_v R \leq 0.$$

It possesses a unique local equilibrium, namely,  $R(u, v) = 0$  implies  $v = g(u)$ . At the local equilibrium, one has the macroscopic system

$$u_t + f_1(u, g(u))_x = 0.$$

This system can be derived by sending  $\varepsilon \rightarrow 0$  in (1.11), the so-called zero relaxation limit ([12]).

# An AP approximation

$$(3.1) \quad \frac{U^{n+1} - U^n}{\Delta t} + f_1(U^n, V^n)_x = 0,$$

$$(3.2) \quad \frac{V^{n+1} - V^n}{\Delta t} + f_2(U^n, V^n)_x = \frac{1}{\varepsilon} [R(U^n, V^n) + \beta(V^n - g(U^n))] - \frac{\beta}{\varepsilon} [V^{n+1} - g(U^{n+1})].$$

thus if

$$\beta > \frac{1}{2} \sup |\partial_v R|,$$

there exists a constant  $C$ , and  $0 < r < 1$  such that

$$|V^{n+1} - g(U^{n+1})| \leq C \frac{\varepsilon \Delta t}{\varepsilon + \beta \Delta t} + r |V^n - g(U^n)|.$$

From here it is easy to see that

$$|V^n - g(U^n)| \leq \frac{C}{1-r} \frac{\varepsilon \Delta t}{\varepsilon + \beta \Delta t} + r^n |V^0 - g(U^0)|$$

This clearly gives

$$(3.4) \quad |V^n - g(U^n)| \leq \frac{C}{(1-r)\beta} \varepsilon + r^n |V^0 - g(U^0)|$$

If  $t \gg \varepsilon^{-2}$ , then for any  $V^0$ , there exists an  $N(2)$  such that  
 $V^n \rightarrow g(U^n) = O(2)$  for any  $n$ ,  $N$

# Some classical methods

- Linear penalty

$$[\mathcal{Q}(\mathbf{f}^n) - \mu f^n] + \mu f^{n+1}.$$

- Explicit Jacobian

$$\mathcal{Q}(\mathbf{f}^{n+1}) \approx \mathcal{Q}(\mathbf{f}^n) + \nabla \mathcal{Q}(\mathbf{f}^n)(\mathbf{f}^{n+1} - \mathbf{f}^n).$$

If  $\epsilon t >> 2$ , then for any  $V^0$ , there exists an  $N(2)$  such that  
 $V^n \in g(U^n) = O(\epsilon t)$  for any  $n \leq N$

# No similar proof for Boltzmann

- But numerical results demonstrate a similar AP property

# Spatial discretization

- If a high resolution upwind discretization is used for convection, then as  $\varepsilon \rightarrow 0$ , one gets a high resolution **kinetic scheme** for Euler.

AP is space discretization!

# Consistency to the Navier-Stokes equations

Chapman-Enskog expansion (fix  $\Delta t$ ) →  
compressible Navier-Stokes equations  
 $+O(\Delta t)$

Remarks:

to capture the N-S solution one needs  $\Delta t \ll \varepsilon$   
(similar for  $\Delta x$ )

Consistency error to Boltzmann:  $O(\Delta t / \varepsilon)$

# Higher order IMEX time descretization

- Second order Implicit-Explicit scheme

$$\begin{cases} 2\frac{f^* - f^n}{\Delta t} = \frac{Q(f^n) - P(f^n)}{\varepsilon} + \frac{P(f^*)}{\varepsilon}, \\ \frac{f^{n+1} - f^n}{\Delta t} = \frac{Q(f^*) - P(f^*)}{\varepsilon} + \frac{P(f^n) + P(f^{n+1})}{2\varepsilon}. \end{cases}$$

same AP property can be proved

# Numerical examples: Sod shock tube, $\varepsilon=10^{-2}$

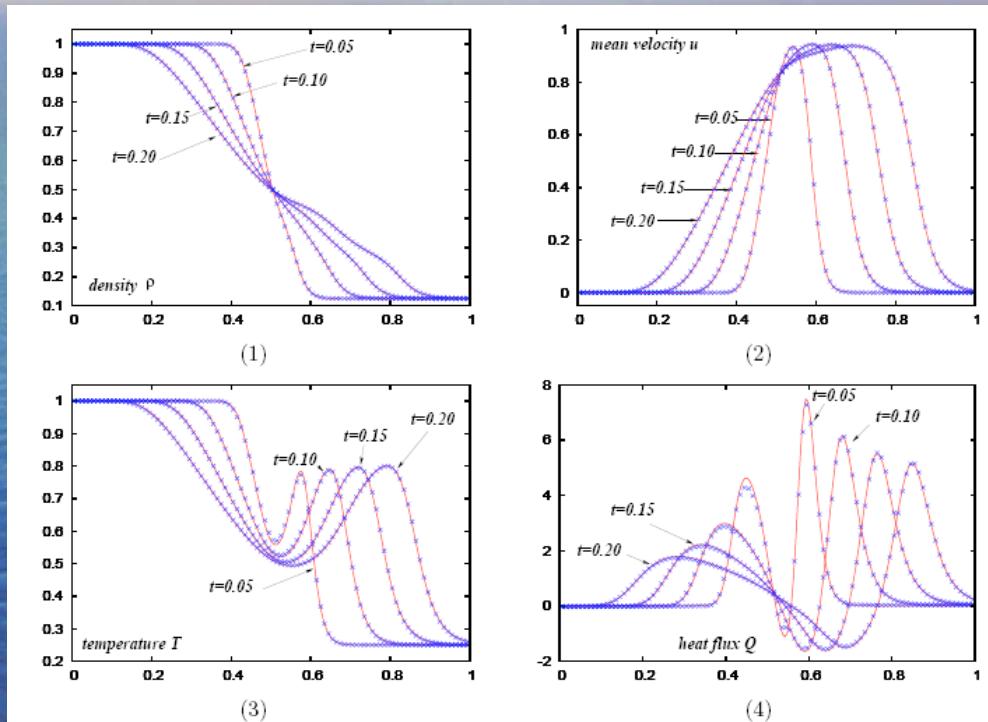


FIGURE 3. Sod tube problem ( $\varepsilon = 10^{-2}$ ), dots (x) represent the numerical solution obtained with our second order method (2.3) and lines with the Runge-Kutta method: evolution of (1) the density  $\rho$ , (2) mean velocity  $u$ , (3) temperature  $T$  and (4) heat flux  $Q$  at time  $t = 0.05, 0.1, 0.15$  and  $0.2$ .

# Sod shock tube: $\varepsilon=10^{-3}$

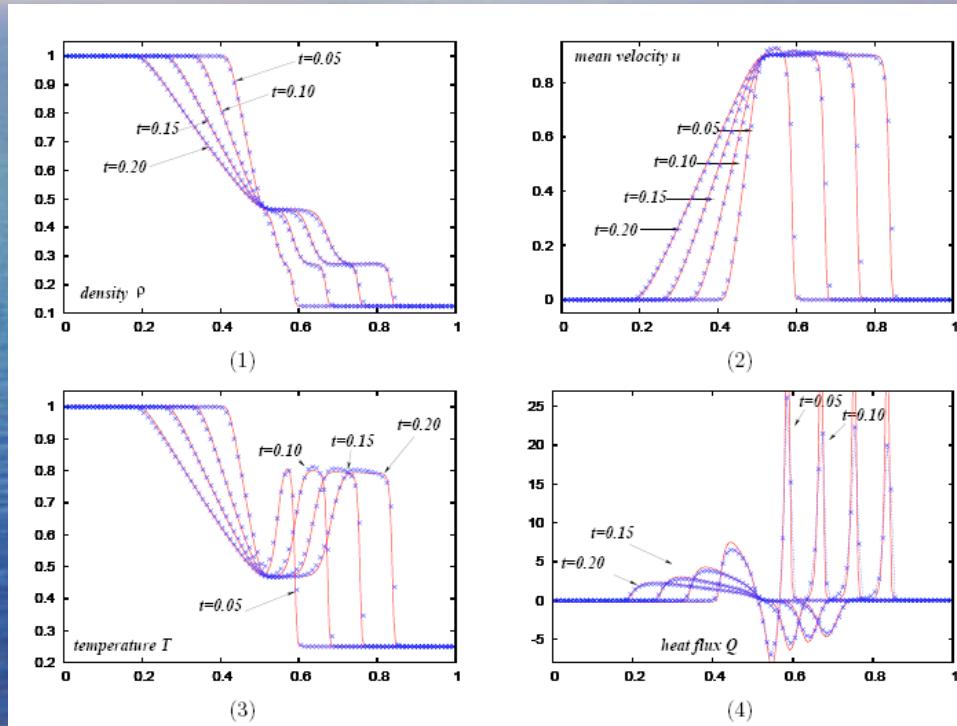
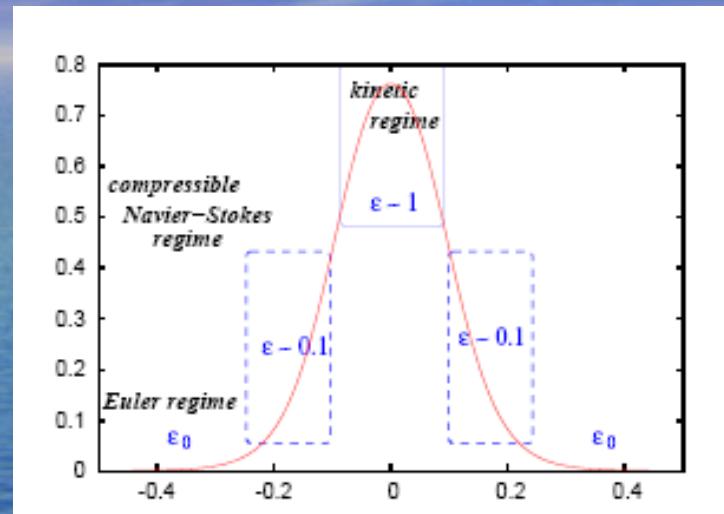


FIGURE 4. Sod tube problem ( $\varepsilon = 10^{-3}$ ), dots (x) represent the numerical solution obtained with our second order method (2.3) and lines with the Runge-Kutta method: evolution of (1) the density  $\rho$ , (2) mean velocity  $u$ , (3) temperature  $T$  and (4) heat flux  $Q$  at time  $t = 0.05, 0.1, 0.15$  and  $0.2$ .

# Variable $\varepsilon$ : $\varepsilon \in [10^{-4}, 1]$



- Initial data not in local Maxwellian:

$$f_0(x, v) = \frac{\rho_0}{2} \left[ \exp\left(-\frac{|v - u_0|^2}{T}\right) + \exp\left(-\frac{|v + u_0|^2}{T_0}\right) \right]$$

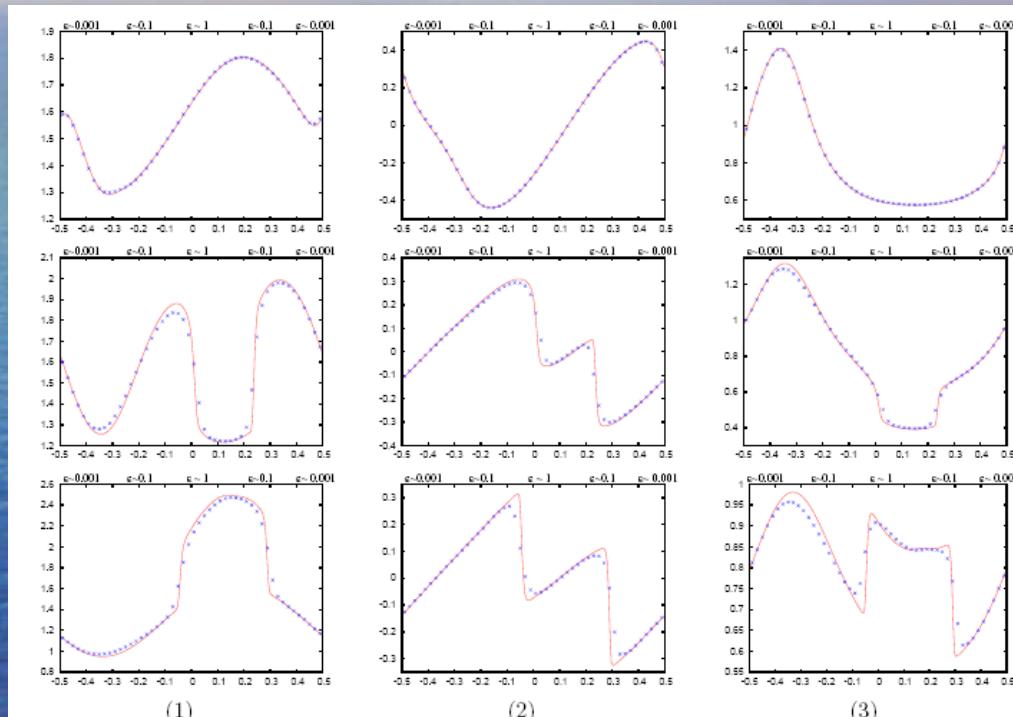


FIGURE 7. Mixing regime problem ( $\varepsilon_0 = 10^{-3}$ ), comparison of the numerical solution to the Boltzmann equation obtained with the AP scheme (2.3) using  $n_x = 50$  (dots x) and  $n_x = 200$  points (line): evolution of (1) the density  $\rho$ , (2) mean velocity  $u$ , (3) temperature  $T$  at time  $t = 0.25, 0.5$  and  $0.75$ .

# Other applications

- Stiff ODEs
- Hyperbolic systems with stiff relaxation  
$$U_t + \nabla \cdot F(U) = 1/\epsilon S(U)$$
- High order parabolic equations
- Any dynamic system with **one, stable** local equilibrium

# A nonlinear Fokker-Planck equation (*Carrillo-Toscani*)

- Describe a porous medium

$$\frac{\partial f}{\partial t} = \nabla_v \cdot (v f + \nabla_v f^m)$$

local Maxwellian:

$$\mathcal{M}(v) = \left( C - \frac{m-1}{2m} |v|^2 \right)_+^{1/(m-1)}$$

Entropy condition:

$$H(f) = \int_{\mathbb{R}^2} \left[ |v|^2 f(t, v) + \frac{m}{m-1} f^m(t, v) \right] dv,$$
$$\frac{dH(f)}{dt} = - \int_{\mathbb{R}^2} f(t, v) \left| v + \frac{m}{m-1} \nabla f^{m-1} \right|^2 dv \leq 0$$

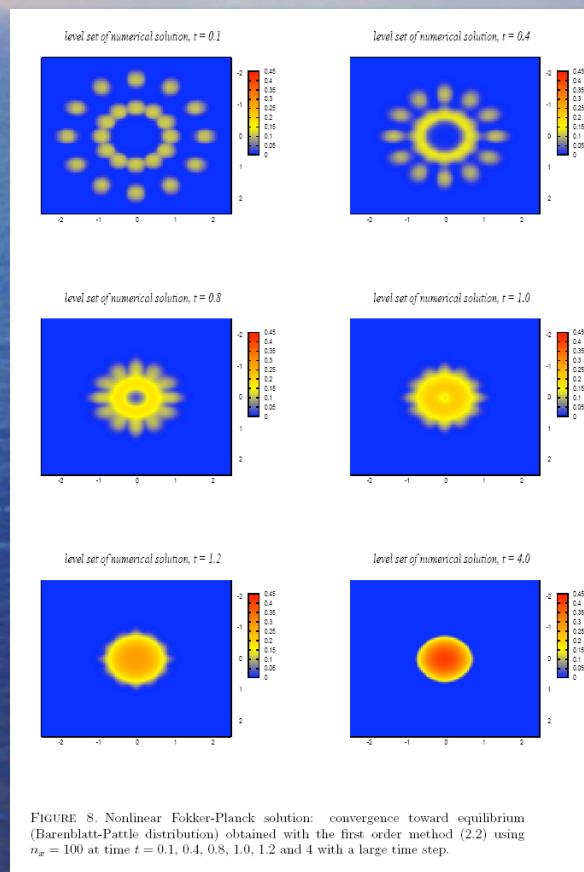
# Our Implicit-Explicit scheme

$$\frac{\partial f}{\partial t} = \underbrace{\Delta_v (f^m - m \mathcal{M}^{m-1} f)}_{\text{non stiff part}} + \underbrace{\nabla_v \cdot (v f + m \nabla_v (\mathcal{M}^{m-1} f))}_{\text{stiff linear part}}$$

- Numerical example:  $m=3$ ,

$$f_0(v) = \sum_{l \in \{1, 2\}} \sum_{k \in \{0, \dots, n-1\}} \frac{1}{10} \mathbf{1}_{\mathcal{B}(0, r_0)}(v - v_{k,l})$$

# Convergence in time towards local Maxwellian



# Convergence in time towards local Maxwellian

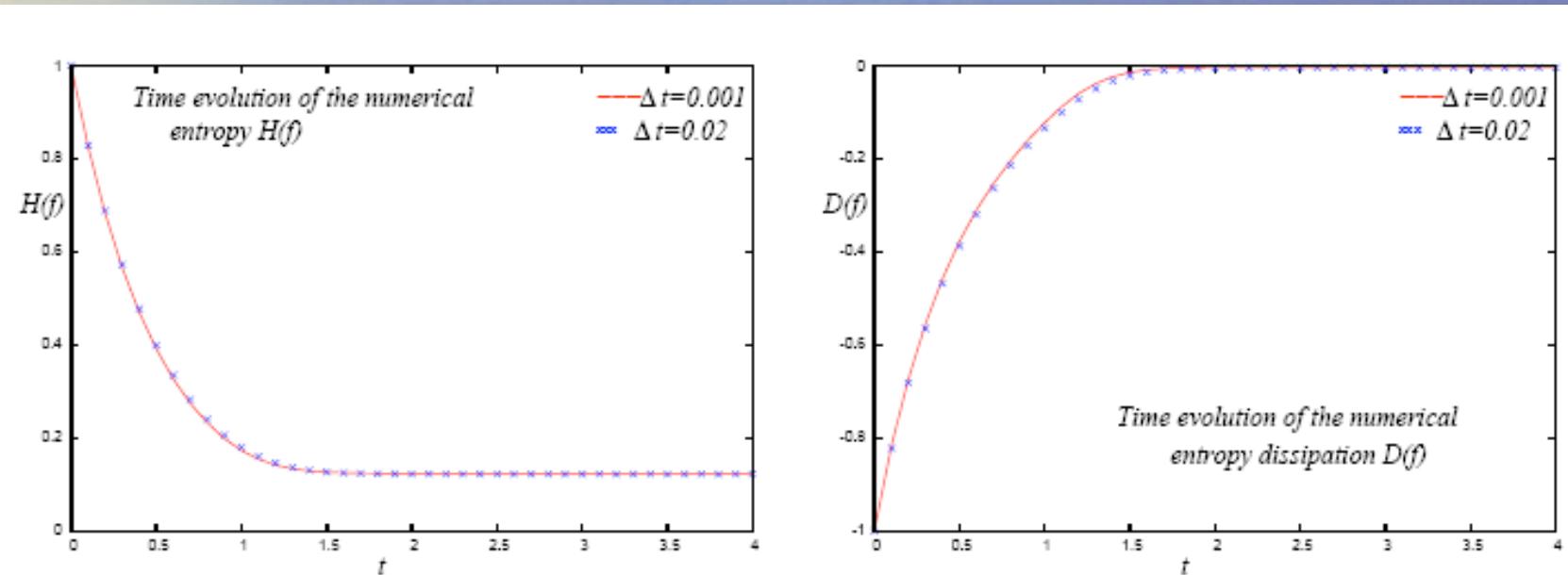


FIGURE 9. Nonlinear Fokker-Planck solution: convergence toward equilibrium (Barenblatt-Pattle distribution) obtained with the first order method (2.2) using  $n_w = 100$  with  $\Delta t = 0.02$  and  $0.001$ .

# Other applications and extensions

- 4th order nonlinear parabolic equation:  
Filbet-Shu
- Monte-Carlo implementation  
(operator splitting + exact BGK integrator):  
Pareschi
- quantum Boltzmann equation (Hu-J)
- Landau-Fokker-Planck (J-Yan)

# Conclusion

An **asymptotic-preserving** framework is presented for nonlinear kinetic equations and related problems with stiff sources:

In terms of implicit collisions, all one needs is to solve a BGK type collision operator (which can be implemented **explicitly**) : simple and general!