



Grid refinement in LBM based on continuous distribution functions

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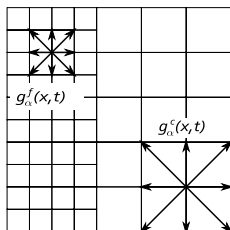
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Grid refinement problem

- For simulating complex engineering flows, mesh refinement technique is necessary
- LB distribution functions g_α are not conserved through a refinement interface [Filippova & Hanel, 1998]
- Spatial and time interpolation methods can not be used directly on the distribution functions to evaluate the unknown data



Grid refinement schemes

- Vertex centered approach
 - ▶ with ([Yu et al., 2002][Dupuis & Chopard, 2003]) or without rescaling ([Lin & Lai, 2000])
 - ▶ rescaling and interpolations applied on the post-collision distribution functions ([Yu et al., 2002][Filippova & Hanel, 1998])
 - ▶ spatial interpolation performed before time interpolation [Yu et al., 2002][Dupuis & Chopard, 2003]
- Volumetric approach (cell centered) [Rohde, 2004][Chen et al., 2005 (PowerFLOW)]
 - ▶ Explode ($c \rightarrow f$) and coalesce ($f \rightarrow c$) distribution functions : mass conservative scheme
 - ▶ No rescaling of distribution functions

Presentation outline

Continuous distribution functions ?

- Grid refinement problem
- DVBE and LBE
- Numerical verification

Grid refinement algorithm

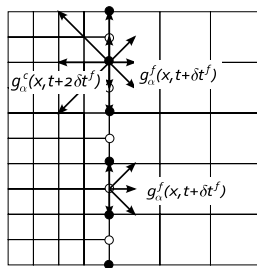
- Rescaling procedure
- Overlapping nodes
- Algorithm description

Validations

- Grid parameters
- Pulse propagation in uniform flow
- Convected vortex

Grid refinement problem

- After one standard LB timestep, some distribution functions are missing
- Distribution functions are *known* to be discontinuous through an interface between meshes with different grid size :
 $g_{\alpha}^c(\bullet, \circ, t) \neq g_{\alpha}^f(\bullet, \circ, t)$



Base ideas of Filippova & Hanel (1998)

- Macroscopic properties of the fluid must be conserved (ν , c_s)
 - ▶ $\delta x^c / \delta t^c = \delta x^f / \delta t^f$
 - ▶ $\tau_g^c = \frac{1}{2}\tau_g^f + \frac{1}{4}$ (the relaxation time is not continuous)
- Macroscopic variables of the flow must be conserved (ρ , \mathbf{u})
 - ▶ $g_\alpha^{eq,c} = g_\alpha^{eq,f}$
- The shear stress must be continuous
 - ▶ $g_\alpha^{neq,c} = m \frac{\tau_g^c}{\tau_g^f} g_\alpha^{neq,f}$ ($m = \frac{\delta x^c}{\delta x^f} = 2$)

Why the distribution functions of LBM are not continuous ?

- Boltzmann equation

$$\frac{\partial f}{\partial t} + c_i \frac{\partial f}{\partial x_i} = -\frac{f - f^{eq}}{\epsilon \lambda} \quad (BE)$$

- Quadrature formulae to calculate moments of distribution functions using a discrete velocity set

$$\frac{\partial f_\alpha}{\partial t} + c_{\alpha,i} \frac{\partial f_\alpha}{\partial x_i} = -\frac{1}{\tau} (f_\alpha - f_\alpha^{eq}) \quad (DVBE)$$

- By definition the distribution functions of DVBE f_α are continuous in space and time (and also $\nu = \tau \theta_0$, $c_s = \sqrt{\theta_0}$, $\rho = \sum f_\alpha$, $\rho \mathbf{u} = \sum \mathbf{c}_\alpha f_\alpha$)

- Integrate DVBE along the characteristic \mathbf{c}_α for a time interval δt
- The integral of the BGK collision operator is approximated by the trapezium rule :

$$f_\alpha(\mathbf{x} + \mathbf{c}_\alpha \delta t, t + \delta t) - f_\alpha(\mathbf{x}, t) = -\frac{\delta t}{2\tau} \{f_\alpha(\mathbf{x} + \mathbf{c}_\alpha \delta t, t + \delta t) - f_\alpha^{\text{eq}}(\mathbf{x} + \mathbf{c}_\alpha \delta t, t + \delta t) + f_\alpha(\mathbf{x}, t) - f_\alpha^{\text{eq}}(\mathbf{x}, t)\} + O(\delta t^3)$$

- Change of variable ([He et al., 1998][Dellar, 2001])

$$g_\alpha(\mathbf{x}, t) = f_\alpha(\mathbf{x}, t) + \frac{\delta t}{2\tau} (f_\alpha(\mathbf{x}, t) - f_\alpha^{\text{eq}}(\mathbf{x}, t)) \quad (1)$$

- Final Lattice Boltzmann Equation

$$g_\alpha(\mathbf{x} + \mathbf{c}_\alpha \delta t, t + \delta t) = \left(1 - \frac{\delta t}{\tau_g}\right) g_\alpha(\mathbf{x}, t) + \frac{\delta t}{\tau_g} f_\alpha^{\text{eq}}(\mathbf{x}, t) \quad (2)$$

with $\tau_g = \tau + \delta t/2$.

Numerical verification of the link between f_α and g_α

- LBE and DVBE computations have been performed on the same uniform grid, for the same flow problems and fluid parameters
- LB model : standard D2Q9, BGK collision operator, equilibrium function truncated at second order
- DVBE model : D2Q9 velocity model, BGK collision operator, equilibrium function truncated at second order
 - ▶ 6th-order central finite difference scheme for space derivatives
 - ▶ 5th-order Runge-Kutta scheme for time integration
- Fluid is air, $\tau/\delta t = 0.93$, same δt and δx for LBE and DVBE
- For two simple flows, comparison of f_α , g_α and $d_\alpha = f_\alpha + \frac{\delta t}{2\tau} (f_\alpha - f_\alpha^{eq})$

Reference cases

- Acoustic pressure pulse in an uniform flow

$$\begin{cases} \rho = 1 + a_P \exp \left[-\frac{\ln 2}{b_P} \left((x_1 - x_1^0)^2 + (x_2 - x_2^0)^2 \right) \right] \\ u_1 = U_0 \\ u_2 = 0 \end{cases}$$

with $a_P = 0.03$ and $b_P = 5$

- Convected vortex

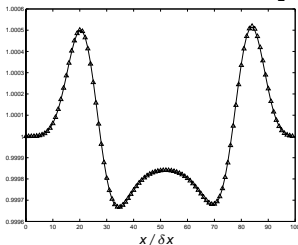
$$\begin{cases} \rho = 1 \\ u_1 = U_0 + a_T U_0 (x_2 - x_2^0) \exp \left[-\frac{\ln 2}{b_T} \left((x_1 - x_1^0)^2 + (x_2 - x_2^0)^2 \right) \right] \\ u_2 = -a_T U_0 (x_1 - x_1^0) \exp \left[-\frac{\ln 2}{b_T} \left((x_1 - x_1^0)^2 + (x_2 - x_2^0)^2 \right) \right] \end{cases}$$

with $a_T = 0.5$ et $b_T = 25$

Comparison of the macroscopic variables

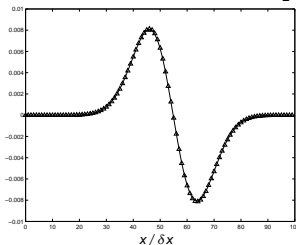
Density profile of the pressure pulse

at time $t = 50$ along the line $x_2 = x_2^0$



Velocity profile u_2 of the convected vortex

at time $t = 100$ along the line $x_2 = x_2^0$

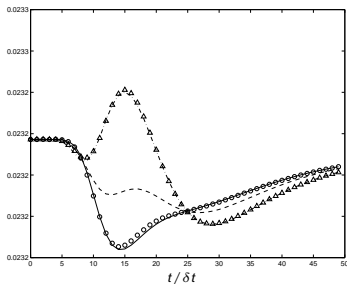


—— LBM; \triangle DVBE.

- The simulated results are exactly the same in term of macroscopic variables $\rightarrow g_\alpha^{eq} = f_\alpha^{eq}$

Distribution functions at a given point as a function of time

Pressure pulse, $\alpha = 6$

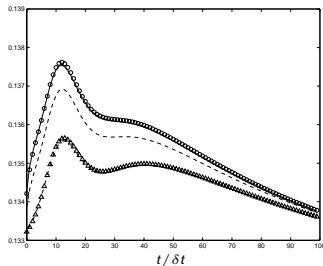


(———) : g_α

(- - -) : f_α

(o o o) : $d_\alpha = f_\alpha + \delta t(f_\alpha - f_\alpha^{eq})/2\tau$

Convected vortex, $\alpha = 1$



(- - -) : g_α^{eq}

($\Delta \Delta \Delta$) : f_α^{eq}

- This numerical test confirms that $g_\alpha = f_\alpha + \frac{\delta t}{2\tau}(f_\alpha - f_\alpha^{eq})$

- Conversion $g_\alpha \leftrightarrow f_\alpha$ for a given \mathbf{x} and t

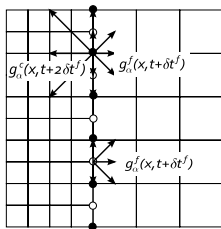
$$g_\alpha = f_\alpha + \frac{\delta t}{2\tau} (f_\alpha - f_\alpha^{eq}) \Leftrightarrow f_\alpha = \frac{2\tau}{2\tau + \delta t} \left(g_\alpha + \frac{\delta t}{2\tau} f_\alpha^{eq} \right)$$

- By definition $f_\alpha, \tau, \rho = \sum f_\alpha, \rho \mathbf{u} = \sum \mathbf{c}_\alpha f_\alpha (\rightarrow f_\alpha^{eq})$ are continuous

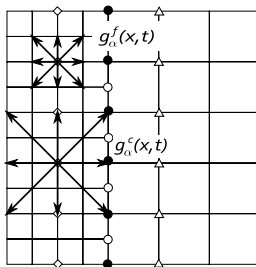
$$\left\{ \begin{array}{l} f_\alpha^c = \frac{2\tau}{2\tau + \delta t^c} \left(g_\alpha^c + \frac{\delta t^c}{2\tau} f_\alpha^{eq} \right) \\ f_\alpha^f = \frac{2\tau}{2\tau + \delta t^f} \left(g_\alpha^f + \frac{\delta t^f}{2\tau} f_\alpha^{eq} \right) \\ f_\alpha^f = f_\alpha^c \\ \tau = \tau_g^f - \frac{\delta t^f}{2} = \tau_g^c - \frac{\delta t^c}{2} \\ m = 2 \end{array} \right. \Rightarrow \begin{array}{l} g_\alpha^f = \frac{1}{2\tilde{\tau}_g^f + 1} \left((2\tilde{\tau}_g^f) g_\alpha^c + f_\alpha^{eq} \right) \\ g_\alpha^c = \frac{1}{2\tilde{\tau}_g^f} \left((2\tilde{\tau}_g^f + 1) g_\alpha^f - f_\alpha^{eq} \right) \end{array}$$

- Remark: these expressions immediately imply that $g_\alpha^{neq,c} = 2 \frac{\tilde{\tau}_g^c}{\tilde{\tau}_g^f} g_\alpha^{neq,f}$

- First approach (implemented with success in our 3D LB code (L-BEAM))
 - ▶ Conversion $g_\alpha^c \leftrightarrow f_\alpha$ for needed interface points
 - ▶ Spatial and temporal interpolations on f_α
 - ▶ Conversion $f_\alpha \leftrightarrow g_\alpha^f$
- Second approach (preferred in this work)
 - ▶ Conversion $g_\alpha^c \leftrightarrow g_\alpha^f$ for needed interface points
 - ▶ Spatial and temporal interpolations on g_α^f
- In both cases
 - ▶ Conversion step needs the equilibrium functions to be known

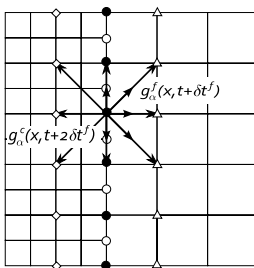


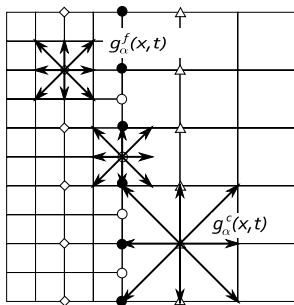
- Fine grid points \diamond must also be calculated as coarse grid points



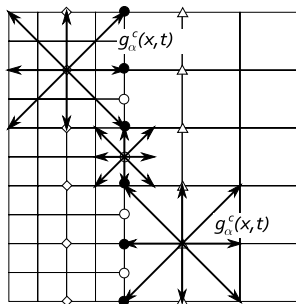
- Conversion $g_{\alpha_{out}}^f(\diamond, t) \rightarrow g_{\alpha_{out}}^c(\diamond, t)$

- Conversion $g_{\alpha_{in}}^c(\bullet, t + 2\delta t^f) \rightarrow g_{\alpha_{in}}^f(\bullet, t + 2\delta t^f)$ can be done because macroscopic variables can be now calculated at points •

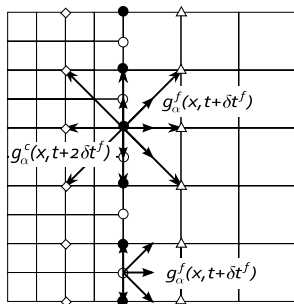




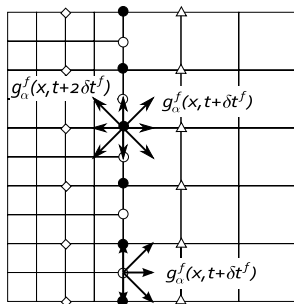
- **Timestep t** : all functions g_{α}^c and g_{α}^f are known everywhere



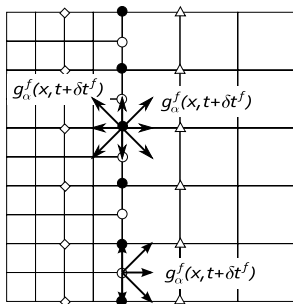
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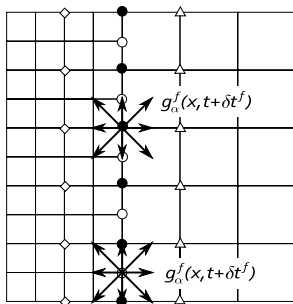
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- Stage 4 : time interpolation of $g_{\alpha_{in}}^f(\bullet, t + \delta t^f)$

- ▶ Injection scheme :

$$g_{\alpha_{in}}^f(\bullet, t + \delta t^f) = g_{\alpha_{in}}^f(\bullet, t + 2\delta t^f)$$

- ▶ Linear interpolation using

$g_{\alpha_{in}}^f(\bullet, t + 2\delta t^f)$ and $g_{\alpha_{in}}^f(\bullet, t)$ (that must be stored)



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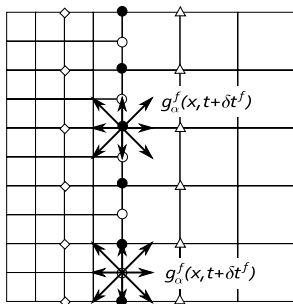
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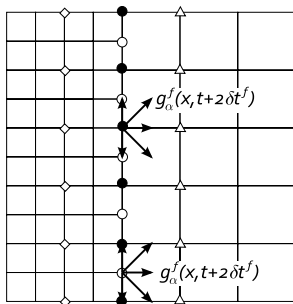
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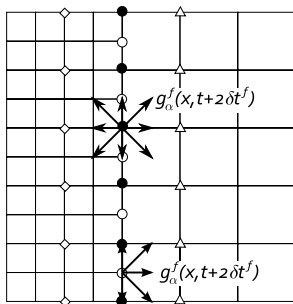
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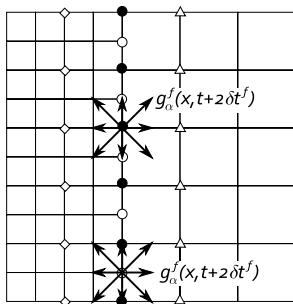
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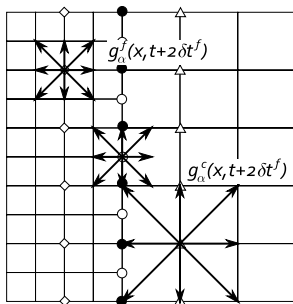
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- ▶ Injection scheme :

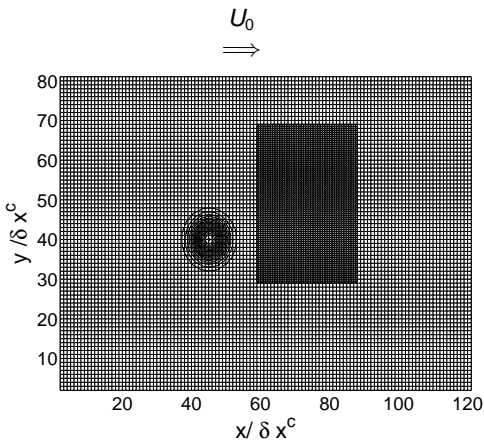
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- ▶ Linear interpolation using

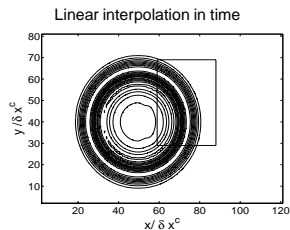
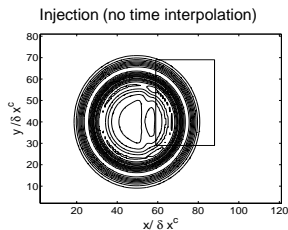
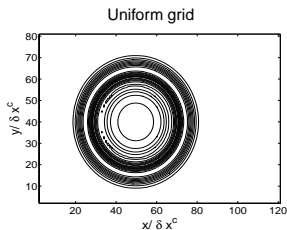
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- Coarse grid : 120×80 , fine grid : 60×80
- Acoustic pulse or vortex is initialized outside or inside the fine grid
- $M = 0.2$, $\nu = 1.5 \times 10^{-5} \text{ m}^2/\text{s}$, $c_s = 340 \text{ m/s}$, $\delta x^f = 10^{-2} \text{ m}$
- All computations are also done with a uniform coarse grid (reference)

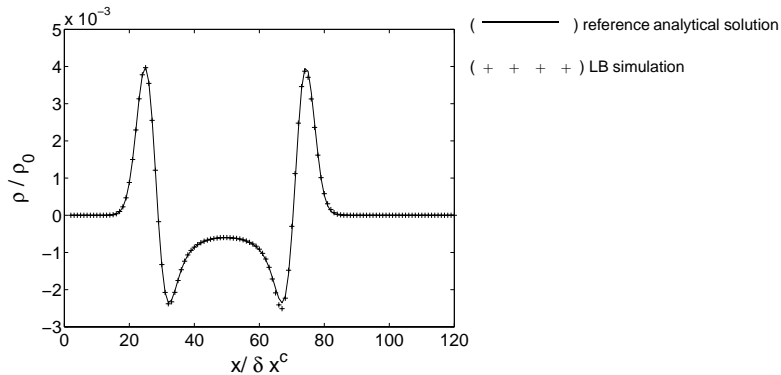


Iso-contours of the density fluctuation

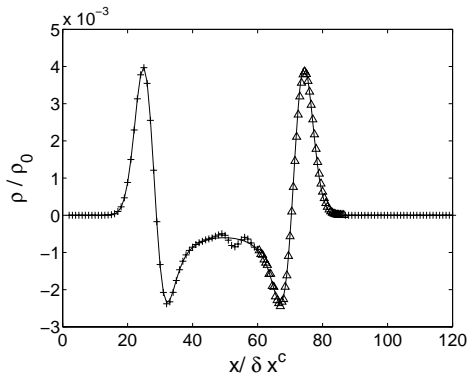


- Small pressure reflexion occurs at the grid interface. The error is reduced when linear time interpolation is used.
- There is an analytical solution for the propagation of the pulse in uniform flow \rightarrow precise error quantification is possible

Simulation with the uniform grid



Two-grid simulation with injection (no time interpolation)

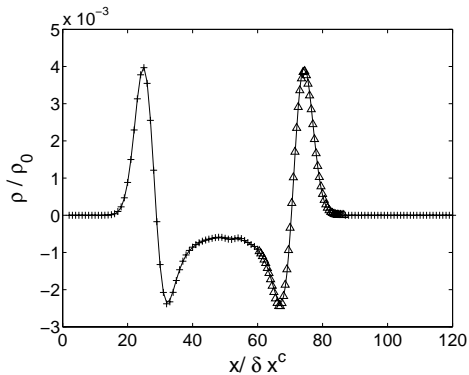


(—) reference analytical solution

(+ + + +) results on coarse points

(\triangle \triangle \triangle) results on fine points

Two-grid simulation with linear interpolation in time



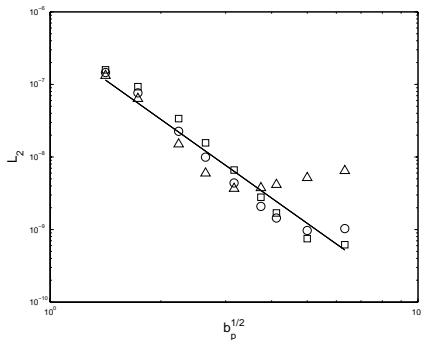
(—) reference analytical solution

(+ + + +) results on coarse points

(\triangle \triangle \triangle) results on fine points

Convergence rate

- Parameter b_p gives the initial width of the pressure pulse, i.e. the spatial resolution



(—) slope -3.5

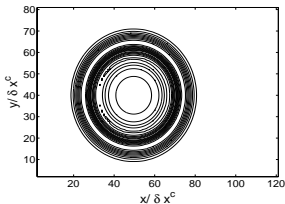
(□ □ □ □) Uniform grid

(△ △ △) Two-grid simulation without time interpolation (injection)

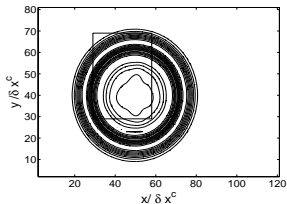
(○ ○ ○ ○) Two-grid simulation with linear interpolation in time

Initial pulse in the fine grid region

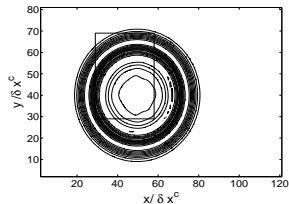
Uniform grid



Injection (no time interpolation)

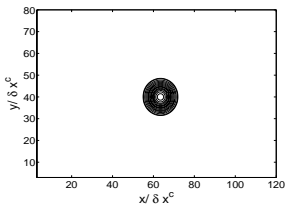


Linear interpolation in time

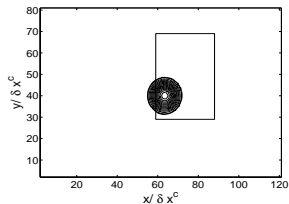


Convected vortex (linear interpolation in time)

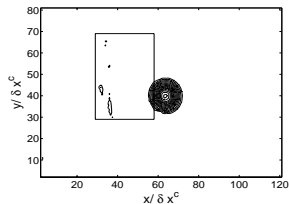
Uniform grid



Linear interpolation in time



Linear interpolation in time



- Fine to coarse grid convection : spurious vorticity appears inside the fine region due to non-physical reflexion at the grid interface

Conclusion

- New theoretical insight in the link between coarse and fine distribution functions
 - ▶ final rescaling expressions are fully equivalent to the previous approaches
 - ▶ this new theoretical approach can be useful for other LB models (other collision operator such as MRT models)
- The proposed grid refinement algorithm minimize the unknown functions that must be approximated with interpolations
 - ▶ use of overlapping coarse nodes
 - ▶ interpolations are done on the distribution functions
 - ▶ time interpolation is done before spatial interpolation
- Accuracy of the grid refinement scheme can be improved using higher order interpolation schemes