Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusions

Ein adaptives, paralleles Lattice-Boltzmann Verfahren zur Simulation komplexen Wirbelschleppentransports hinter bewegten Geometrien

Ralf Deiterding

Deutsches Zentrum für Luft- und Raumfahrt Bunsenstr. 10, Göttingen, Germany E-mail: ralf.deiterding@dlr.de

September 18, 2014

Realistic computations

Meshing techniques for FSI



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Realistic computations

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Realistic computations

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Unstructured:



Structured:



Realistic computations

Meshing techniques for FSI

Cartesian:



- Methods that represent the boundary sharply
- Methods that diffuse the boundary

Unstructured:



Structured:



Realistic computations

Outline

Lattice Boltzmann methods

Construction principles Implementation

Dynamic mesh adaptation

Structured adaptive mesh refinement for LBM Verification

Realistic computations

Static geometries Simulation of wind turbine wakes

Conclusions

Things to address

Lattice Boltzmann methods
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Realistic computations

Approximation of Boltzmann equation

Is based on solving the Boltzmann equation $\partial_t f + \mathbf{u} \cdot \nabla f = \omega (f^{eq} - f)$ with a simplified collision operator. Assumption: $\operatorname{Kn} = l_f / L \ll 1$, where l_f is replaced with Δx

Lattice	Boltzmann	methods
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Constru	uction princi	nles

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Equation is approximated with a splitting approach.

1.) Transport step solves $\partial_t f_{\alpha} + \mathbf{e}_{\alpha} \cdot \nabla f_{\alpha} = 0$

Operator: \mathcal{T} : $\tilde{f}_{\alpha}(\mathbf{x} + \mathbf{e}_{\alpha}\Delta t, t + \Delta t) = f_{\alpha}(\mathbf{x}, t)$

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: $\tilde{f}_{\alpha}(\mathbf{x} + \mathbf{e}_{\alpha}\Delta t, t + \Delta t) = f_{\alpha}(\mathbf{x}, t)$
 $\rho(\mathbf{x}, t) = \sum_{\alpha=0}^{8} f_{\alpha}(\mathbf{x}, t), \quad \rho(\mathbf{x}, t)u_{i}(\mathbf{x}, t) = \sum_{\alpha=0}^{8} \mathbf{e}_{\alpha i}f_{\alpha}(\mathbf{x}, t)$

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Discrete velocities:

 $\mathbf{e}_0=(0,0), \mathbf{e}_1=(1,0)c, \mathbf{e}_2=(-1,0)c, \mathbf{e}_3=(0,1)c, \mathbf{e}_4=(1,1)c, ...$

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Discrete velocities:

$$\begin{split} \mathbf{e}_0 &= (0,0), \mathbf{e}_1 = (1,0)c, \mathbf{e}_2 = (-1,0)c, \mathbf{e}_3 = (0,1)c, \mathbf{e}_4 = (1,1)c, ... \\ c &= \frac{\Delta x}{\Delta t}, \text{ Physical speed of sound: } c_s = \frac{c}{\sqrt{3}} \end{split}$$

Lattice	Boltzmann	methods
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$$\begin{split} f_{\alpha}^{eq}(\rho,\mathbf{u}) &= \rho t_{\alpha} \left[1 + \frac{3\mathbf{e}_{\alpha}\mathbf{u}}{c^{2}} + \frac{9(\mathbf{e}_{\alpha}\mathbf{u})^{2}}{2c^{4}} - \frac{3\mathbf{u}^{2}}{2c^{2}} \right] \\ t_{\alpha} &= \frac{1}{9} \left\{ 4, 1, 1, 1, \frac{1}{4}, \frac{1}{4}, 1, \frac{1}{4}, \frac{1}{4} \right\}. \text{ Pressure } \delta p = \sum_{\alpha} f_{\alpha}^{eq} c_{s}^{2} = (\rho - \rho_{0}) c_{s}^{2} \end{split}$$

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Realistic computations

Construction principles

Relation to Navier-Stokes equations

Inserting a Chapman-Enskog expansion, that is,

$$f_{lpha}=f_{lpha}(0)+\epsilon f_{lpha}(1)+\epsilon^2 f_{lpha}(2)+...$$

and using

$$\frac{\partial}{\partial t} = \epsilon \frac{\partial}{\partial t_1} + \epsilon^2 \frac{\partial}{\partial t_2} + ..., \qquad \nabla = \epsilon \nabla_1 + \epsilon^2 \nabla_2 + ...$$

into the LBM and summing over α one can show that the continuity and moment equations are recoverd to $O(\epsilon^2)$ [Hou et al., 1996]

$$\partial_t \rho + \nabla \cdot (\rho \mathbf{u}) = \mathbf{0}$$

 $\partial_t \mathbf{u} + \mathbf{u} \cdot \nabla \mathbf{u} = -\nabla \rho + \nu \nabla^2 \mathbf{u}$

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Kinematic viscosity and collision time are connected by

$$\nu = \frac{1}{3} \left(\tau - \frac{1}{2} \right) c \Delta x$$

from which one gets with $\sqrt{3}c_{s}=\frac{\Delta x}{\Delta t}$ [Hähnel, 2004]

$$\omega = \tau^{-1} = \frac{c_s^2 \Delta t}{\nu + \Delta t c_s^2 / 2}$$

Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusions
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Implementation			

High Reynolds numbers

Pursue a large-eddy simulation approach with \bar{f}_{α} and \bar{f}_{α}^{eq} , i.e.

1.)
$$\overline{f}_{\alpha}(\mathbf{x} + \mathbf{e}_{\alpha}\Delta t, t + \Delta t) = \overline{f}_{\alpha}(\mathbf{x}, t)$$

2.) $\overline{f}_{\alpha}(\cdot, t + \Delta t) = \tilde{\overline{f}}_{\alpha}(\cdot, t + \Delta t) + \frac{1}{\tau^{*}}\Delta t \left(\tilde{\overline{f}}_{\alpha}^{eq}(\cdot, t + \Delta t) - \tilde{\overline{f}}_{\alpha}(\cdot, t + \Delta t) \right)$

Lattice Boltzmann	methods
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Implementation	

High Reynolds numbers

Pursue a large-eddy simulation approach with \overline{f}_{α} and $\overline{f}_{\alpha}^{eq}$, i.e. 1.) $\tilde{f}_{\alpha}(\mathbf{x} + \mathbf{e}_{\alpha}\Delta t, t + \Delta t) = \overline{f}_{\alpha}(\mathbf{x}, t)$ 2.) $\overline{f}_{\alpha}(\cdot, t + \Delta t) = \tilde{f}_{\alpha}(\cdot, t + \Delta t) + \frac{1}{\tau^{\star}}\Delta t \left(\tilde{f}_{\alpha}^{eq}(\cdot, t + \Delta t) - \tilde{f}_{\alpha}(\cdot, t + \Delta t) \right)$ Effective viscosity: $\nu^{\star} = \nu + \nu_{t} = \frac{1}{3} \left(\tau^{\star} - \frac{1}{2} \right) c\Delta x$ with $\tau^{\star} = \tau + \tau_{t}$ Lattice Boltzmann methods 00000 Implementation Dynamic mesh adaptation 0000000 Realistic computations

Conclusions O

High Reynolds numbers

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$$ar{m{S}} = \sqrt{2\sum_{i,j}m{m{S}}_{ij}m{m{S}}_{ij}}, \qquad m{m{m{S}}_{ij} = -rac{1}{2
ho_0c_s^2 au}\sum_{a}m{m{e}}_{lpha i}m{m{e}}_{lpha j}(m{m{f}}_{lpha} - m{m{f}}^{eq}_{lpha})$$

Lattice Boltzmann methods 00000 Implementation Realistic computations

High Reynolds numbers

Pursue a large-eddy simulation approach with \overline{f}_{α} and $\overline{f}_{\alpha}^{eq}$, i.e. 1.) $\overline{\tilde{f}}_{\alpha}(\mathbf{x} + \mathbf{e}_{\alpha}\Delta t, t + \Delta t) = \overline{f}_{\alpha}(\mathbf{x}, t)$ 2.) $\overline{f}_{\alpha}(\cdot, t + \Delta t) = \overline{\tilde{f}}_{\alpha}(\cdot, t + \Delta t) + \frac{1}{\tau^{*}}\Delta t \left(\overline{\tilde{f}}_{\alpha}^{eq}(\cdot, t + \Delta t) - \overline{\tilde{f}}_{\alpha}(\cdot, t + \Delta t)\right)$ Effective viscosity: $\nu^{*} = \nu + \nu_{t} = \frac{1}{3}\left(\tau^{*} - \frac{1}{2}\right)c\Delta x$ with $\tau^{*} = \tau + \tau_{t}$ Use Smagorinsky model to evaluate $\nu_{t} = (C_{sm}\Delta x)^{2}\overline{S}$. Filtered strain rate tensor $\overline{\mathbf{S}}_{ij} = (\partial_{j}\overline{u}_{i} + \partial_{i}\overline{u}_{j})/2$ can also be computed as a second moment [Yu, 2004]

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Special note: LBM is normally implemented on the unit lattice with $\Delta \tilde{x} = \Delta \tilde{t} = 1$ and normalization

$$rac{\Delta x}{l_0}=1, \quad rac{\Delta t}{t_0}=1 \longrightarrow c=1$$

giving a lattice viscosity $\tilde{\nu} = \frac{1}{3} \left(\tau - \frac{1}{2} \right)$ and lattice sound speed $\tilde{c}_s = \frac{1}{\sqrt{3}}$. This requires special attention when implementing turbulence models, etc.

Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusions
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Implementation			

• Initial conditions are constructed as $f_{\alpha}^{eq}(\rho(t=0), \mathbf{u}(t=0))$



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- Outlet basically copies all distributions (zero gradient)
- Inlet and pressure boundary conditions use f^{eq}_α

Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusion
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Implementation			



- Implicit boundary representation via distance function φ , normal $\mathbf{n} = \nabla \varphi / |\nabla \varphi|$.
- Complex boundary moving with local velocity w, treat interface as moving rigid wall.
- Construction of macro-values in embedded boundary cells by interpolation / extrapolation.

Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusions
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Implementation			



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Interpolate / constant value extrapolate values at

$$\tilde{\mathbf{x}} = \mathbf{x} + 2\varphi \mathbf{n}$$



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Macro-velocity in ghost cells: No-slip: $\mathbf{u}' = 2\mathbf{w} - \mathbf{u}$ Slip:

$$\begin{aligned} \mathbf{u}' &= (2\mathbf{w}\cdot\mathbf{n} - \mathbf{u}\cdot\mathbf{n})\mathbf{n} + (\mathbf{u}\cdot\mathbf{t})\mathbf{t} \\ &= 2\left((\mathbf{w} - \mathbf{u})\cdot\mathbf{n}\right)\mathbf{n} + \mathbf{u} \end{aligned}$$



Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusio
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- Complex boundary moving with local velocity w, treat interface as moving rigid wall.
- Construction of macro-values in embedded boundary cells by interpolation / extrapolation.
- Then use f^{αq}_c(ρ', u') to construct distributions in embedded ghost cells.
- 2nd order improvements possible, cf. [Peng and Luo, 2008].



Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusio
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Structured adaptive mesh refinement for LBM			

Block-structured adaptive mesh refinement (SAMR)

Refined blocks overlay coarser ones



Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusion
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Structured adaptive mesh refinement for	r LBM		
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Block-structured adaptive mesh refinement (SAMR)

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Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusions
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Structured adaptive mesh refinement for	or LBM		

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- Recursive refinement in space and time by factor r_l [Berger and Colella, 1988] ideal for LBM



Block-structured adaptive mesh refinement (SAMR)

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- Recursive refinement in space and time by factor r_l [Berger and Colella, 1988] ideal for LBM
- Block (aka patch) based data structures
- + Numerical scheme only for single patch necessary
- + Most efficient LBM implementation with patch-wise for-loops



Lattice Boltzmann methods Dynamic mesh adaptation 00000 ●000000 Realistic computations

Structured adaptive mesh refinement for LBM

Block-structured adaptive mesh refinement (SAMR)

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- Block (aka patch) based data structures
- + Numerical scheme only for single patch necessary
- + Most efficient LBM implementation with patch-wise for-loops
- + Cache efficient
- Spatial interpolation and averaging can be used unaltered
- Cluster-algorithm necessary



Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusions
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Structured adaptive mesh refinement for LBM			

- Adaptive mesh refinement in object-oriented C++ tailored for explicit block-based finite volume methods
- Many shock-capturing methods (MUSCL, (hybrid) WENO, etc.) implemented for complex flux functions.

Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusions
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- Adaptive mesh refinement in object-oriented C++ tailored for explicit block-based finite volume methods
- Many shock-capturing methods (MUSCL, (hybrid) WENO, etc.) implemented for complex flux functions.
- Drives Virtual Test Facility (VTF) FSI software.
- Targets strongly driven problems (shocks, blast, detonations)
- Geometry embedding via ghost fluid techniques and level set functions. Distance computation with CPT algorithm [Mauch, 2000].

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- $\blacktriangleright~\sim$ 430,000 LOC in C++, C, Fortran-77, Fortran-90.
- Version V2.0 at http://www.cacr.caltech.edu/asc. V1.1 (no complex boundaries) still at http://amroc.sourceforge.net.
- Version used here V3.0 with significantly enhanced parallelization (V2.1 not released).
- Papers: [Deiterding, 2011, Deiterding and Wood, 2013, Deiterding et al., 2009, Deiterding et al., 2007, Deiterding et al., 2006]

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- Papers: [Deiterding, 2011, Deiterding and Wood, 2013, Deiterding et al., 2009, Deiterding et al., 2007, Deiterding et al., 2006]
- Lattice Boltzmann update is implemented like any other finite volume method but without returning numerical fluxes.

Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusions
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Structured adaptive mesh refinement for LBM			

1. Complete update on coarse grid: $f_{\alpha}^{\mathcal{C},n+1} := \mathcal{CT}(f_{\alpha}^{\mathcal{C},n})$



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Structured adaptive mesh refinement for LBM			

- 1. Complete update on coarse grid: $f_{\alpha}^{\mathcal{C},n+1} := \mathcal{CT}(f_{\alpha}^{\mathcal{C},n})$
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$$f_{\alpha,in}^{f,n}$$

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- 3. $\tilde{f}^{f,n}_{\alpha} := \mathcal{T}(f^{f,n}_{\alpha})$ on whole fine mesh. $f^{f,n+1/2}_{\alpha} := \mathcal{C}(\tilde{f}^{f,n}_{\alpha})$ in interior.



$$\tilde{f}^{f,n}_{\alpha,in}$$

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$$\tilde{f}^{f,n+1/2}_{\alpha,in}$$

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- 2. Interpolate $f_{\alpha,in}^{C,n}$ onto $f_{\alpha,in}^{f,n}$ to fill fine halos. Set physical boundary conditions.
- 3. $\tilde{f}_{\alpha}^{f,n} := \mathcal{T}(f_{\alpha}^{f,n})$ on whole fine mesh. $f_{\alpha}^{f,n+1/2} := \mathcal{C}(\tilde{f}_{\alpha}^{f,n})$ in interior.
- 4. $\tilde{f}^{f,n+1/2}_{\alpha} := \mathcal{T}(f^{f,n+1/2}_{\alpha})$ on whole fine mesh. $f^{f,n+1}_{\alpha} := \mathcal{C}(\tilde{f}^{f,n+1/2}_{\alpha})$ in interior.



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 $\tilde{f}^{f,n+1/2}_{\alpha,in}$

 $f^{f,n}_{\alpha,out}$

Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusions
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Structured adaptive mesh refinement for LBM			

- 1. Complete update on coarse grid: $f_{\alpha}^{C,n+1} := CT(f_{\alpha}^{C,n})$
- 2. Interpolate $f_{\alpha,in}^{C,n}$ onto $f_{\alpha,in}^{f,n}$ to fill fine halos. Set physical boundary conditions.
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 $\tilde{f}^{f,n}_{\alpha,out}$

Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusions
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Structured adaptive mesh refinement for LBM			

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- 2. Interpolate $f_{\alpha,in}^{C,n}$ onto $f_{\alpha,in}^{f,n}$ to fill fine halos. Set physical boundary conditions.
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 $\tilde{f}^{f,n+1/2}_{\alpha,out}$

Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusions
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$$\tilde{f}^{f,n+1/2}_{lpha,out}, \tilde{f}^{f,n+1/2}_{lpha,in}$$

Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusions
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Structured adaptive mesh refinement for LBM			

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5. Average $\tilde{f}_{\alpha,out}^{f,n+1/2}$ (inner halo layer), $\tilde{f}_{\alpha,out}^{f,n}$ (outer halo layer) to obtain $\tilde{f}_{\alpha,out}^{C,n}$.

Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusions
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Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusions
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- 5. Average $\tilde{f}_{\alpha,out}^{f,n+1/2}$ (inner halo layer), $\tilde{f}_{\alpha,out}^{f,n}$ (outer halo layer) to obtain $\tilde{f}_{\alpha,out}^{C,n}$.
- 6. Revert transport into halos: $\bar{f}_{\alpha,out}^{C,n} := \mathcal{T}^{-1}(\tilde{f}_{\alpha,out}^{C,n})$

Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusions
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Structured adaptive mesh refinement for LBM			

- 1. Complete update on coarse grid: $f_{\alpha}^{C,n+1} := CT(f_{\alpha}^{C,n})$
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- 5. Average $\tilde{f}_{\alpha,out}^{f,n+1/2}$ (inner halo layer), $\tilde{f}_{\alpha,out}^{f,n}$ (outer halo layer) to obtain $\tilde{f}_{\alpha,out}^{C,n}$.
- 6. Revert transport into halos: $\bar{f}_{\alpha,out}^{C,n} := \mathcal{T}^{-1}(\tilde{f}_{\alpha,out}^{C,n})$
- 7. Parallel synchronization of $f_{\alpha}^{C,n}, \overline{f}_{\alpha,out}^{C,n}$

Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusions
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Structured adaptive mesh refinement for LBM			

- 1. Complete update on coarse grid: $f_{\alpha}^{C,n+1} := CT(f_{\alpha}^{C,n})$
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- 6. Revert transport into halos: $\bar{f}_{\alpha,out}^{C,n} := \mathcal{T}^{-1}(\tilde{f}_{\alpha,out}^{C,n})$
- 7. Parallel synchronization of $f_{\alpha}^{C,n}, \bar{f}_{\alpha,out}^{C,n}$
- 8. Cell-wise update where correction is needed: $f_{\alpha}^{C,n+1} := CT(f_{\alpha}^{C,n}, \bar{f}_{\alpha,out}^{C,n})$

Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusions
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Structured adaptive mesh refinement for LBM			

- 1. Complete update on coarse grid: $f_{\alpha}^{C,n+1} := CT(f_{\alpha}^{C,n})$
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- 7. Parallel synchronization of $f_{\alpha}^{C,n}, \bar{f}_{\alpha,out}^{C,n}$
- 8. Cell-wise update where correction is needed: $f_{\alpha}^{C,n+1} := CT(f_{\alpha}^{C,n}, \bar{f}_{\alpha,out}^{C,n})$

Algorithm equivalent to [Chen et al., 2006].

Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusions
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Verification			

Driven cavity

- Re = 1500 in air, $\nu = 1.5 \cdot 10^{-5} \,\mathrm{m^2/s}$, $u = 22.5 \,\mathrm{m/s}$.
- **b** Domain size $1 \text{ mm} \times 1 \text{ mm}$.
- Reference computation uses 800 × 800 lattice.
- ▶ 588,898 time steps to $t_e = 5 \cdot 10^{-3} \, \text{s}$, ~ 35 h CPU.
- Statically adaptive computation uses 100×100 lattice with $r_{1,2} = 2$.
- > 294,452 time steps to $t_e = 5 \cdot 10^{-3}$ s on finest level.



Isolines of density. Left: reference, right on refinement at t_e .

Dynamic mesh adaptation

Realistic computations

Flow over 2D cylinder, $d = 2 \,\mathrm{cm}$

- Air with $\nu = 1.61 \cdot 10^{-5} \,\mathrm{m}^2/\mathrm{s},$ $\rho = 1.205 \,\mathrm{kg/m}^3$
- ▶ Domain size [-8d, 24d] × [-8d, 8d]
- Dynamic refinement based on velocity. Last level to refine structure further.
- Inflow from left. Characteristic boundary conditions [Schlaffer, 2013] elsewhere.



- Base lattice 320×160 , 3 additional levels with factors $r_l = 2, 4, 4$.
- Resolution: \sim 320 points in diameter d
- Computation of C_D on 400 equidistant points along circle and averaged over time. Comparison above with [Henderson, 1995].

Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusions
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Verification			

Flow over cylinder in 2d - Re = 50, $u = 0.04025 \,\text{m/s}$

Isolines on refinement



Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusions
	0000000		
Verification			

Flow over cylinder in 2d - Re = 50, $u = 0.04025 \,\text{m/s}$

Isolines on refinement



Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusions
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Verification			

Flow over cylinder in 2d - Re = 50, $u = 0.04025 \,\text{m/s}$

Isolines on refinement



 Lattice Boltzmann methods
 Dynamic mesh adaptation
 Realistic computations
 Conclusions

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 Verification
 Verification
 Verification
 Verification

Flow over cylinder in 2d - Re = 300, u = 0.2415 m/s



Dynamic mesh adaptation

Realistic computation

Flow over cylinder in 2d - Re = 300, $u = 0.2415 \,\text{m/s}$



Dynamic mesh adaptation

Realistic computation

Flow over cylinder in 2d - Re = 300, $u = 0.2415 \,\text{m/s}$



Dynamic mesh adaptation

Realistic computation

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Flow over cylinder in 2d - Re = 300, $u = 0.2415 \,\text{m/s}$



Dynamic mesh adaptation

Realistic computations

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Conclusions O

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Dynamic mesh adaptation

Realistic computations

Conclusions O

Flow over cylinder in 2d - Re = 300, $u = 0.2415 \,\text{m/s}$


Lattice Boltzmann methods 00000 Verification Dynamic mesh adaptation

Realistic computations

Conclusions O

Flow over cylinder in 2d - Re = 300, $u = 0.2415 \,\text{m/s}$

Isolines on refinement and distribution to processors



Flow over cylinder in 2d - Re = 300, $u = 0.2415 \,\text{m/s}$

Isolines on refinement and distribution to processors



Lattice Boltzmann methods 00000 Verification Dynamic mesh adaptation

Realistic computation

Flow over cylinder in 2d - Re = 300, $u = 0.2415 \,\text{m/s}$

Isolines on refinement and distribution to processors





- Inflow 40 m/s. LES model active. Characteristic boundary conditions.
- To t = 0.5 s (~ 4 characteristic lengths) with 31,416 time steps on finest level in ~ 37 h on 200 cores (7389 h CPU). Channel: 15 m × 5 m × 3.3 m

Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusions
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Static geometries			

Mesh adaptation



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$Mesh \ adaptation_{Used}$	d refinement blocks and level	s (indicated by color)	

- SAMR base grid $600 \times 200 \times 132$ cells, $r_{1,2,3} = 2$ yielding finest resolution of $\Delta x = 3.125$ mm
- Adaptation based on level set and scaled gradient of magnitude of vorticity vector
- 236M cells vs. 8.1 billion (uniform) at t = 0.4075 s

Refinement at $t = 0.4075 \, \mathrm{s}$

Level	Grids	Cells
0	11,605	15,840,000
1	11,513	23,646,984
2	31,382	144,447,872
3	21,221	52,388,336

Static geometries			
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Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusions



Static geometries			
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Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusions



Static geometries			
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Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusions



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Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusions	



Static geometries			
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Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusions



Lattice Boltzmann methods 00000 Static geometries Dynamic mesh adaptation 0000000 Realistic computations

Strong scalability test (1:25 train)

- Computation is restarted from disk checkpoint at t = 0.526408 s from 96 core run.
- Time for initial re-partitioning removed from benchmark.
- 200 coarse level time steps computed.
- Regridding and re-partitioning every 2nd level-0 step.
- Computation starts with 51.8M cells (I3: 10.2M, I2: 15.3M, I1: 21.5M, I0= 4.8M) vs. 19.66 billion (uniform).



Lattice Boltzmann methods 00000 Static geometries Realistic computations

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Cores	48	96	192	288	384	576	768
Time per step	132.43s	69.79s	37.47s	27.12s	21.91s	17.45s	15.15s
Par. Efficiency	100.0	94.88	88.36	81.40	75.56	63.24	54.63
LBM Update	5.91	5.61	5.38	4.92	4.50	3.73	3.19
Regridding	15.44	12.02	11.38	10.92	10.02	8.94	8.24
Partitioning	4.16	2.43	1.16	1.02	1.04	1.16	1.34
Interpolation	3.76	3.53	3.33	3.05	2.83	2.37	2.06
Sync Boundaries	54.71	59.35	59.73	56.95	54.54	52.01	51.19
Sync Fixup	9.10	10.41	12.25	16.62	20.77	26.17	28.87
Level set	0.78	0.93	1.21	1.37	1.45	1.48	1.47
Interp./Extrap.	3.87	3.81	3.76	3.49	3.26	2.75	2.39
Misc	2.27	1.91	1.79	1.67	1.58	1.38	1.25

Time in % spent in main operations

Lattice Boltzmann methods 00000 Static geometries Dynamic mesh adaptation 0000000 Realistic computations

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- Portions for parallel communication quite considerable (4 ghost cells still used).



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Time in % spent in main operations

- Geometry from realistic Vestas V27 turbine. Rotor diameter 27 m, tower height ~ 35 m. Ground considered. Structural model built by S. Wood (University of Tennessee, Knoxville).
- Prescribed motion of rotor with 15 rpm. Inflow velocity 7 m/s.
- Simulation domain $200 \text{ m} \times 100 \text{ m} \times 100 \text{ m}$.
- Base mesh 400 \times 200 \times 200 cells with refinement factors 2,2,4. Resolution of rotor and tower $\Delta x = 3.125$ cm.
- 141,344 highest level iterations to $t_e = 30 \text{ s}$ computed.



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Simulation of a single turbine

- Geometry from realistic Vestas V27 turbine. Rotor diameter 27 m, tower height ~ 35 m. Ground considered. Structural model built by S. Wood (University of Tennessee, Knoxville).
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- Base mesh 400 \times 200 \times 200 cells with refinement factors 2,2,4. Resolution of rotor and tower $\Delta x = 3.125$ cm.
- 141,344 highest level iterations to $t_e = 30 \text{ s}$ computed.





- > Simulation on 96 cores Intel Xeon-Westmere. \sim 10, 400 h CPU.
- Error estimation in $|\mathbf{u}|$ refines wake up to level 1 ($\Delta x = 25 \text{ cm}$).
- Rotation starts at t = 4 s.

	Boltzmann	
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Dynamic mesh adaptation

Realistic computations

Simulation of wind turbine wakes

Adaptive refinement



Dynamic evolution of refinement blocks (indicated by color).

Simulation of the SWIFT array

- \blacktriangleright Three Vestas V27 turbines. 225 $\rm kW$ power generation at wind speeds 14 to 25 $\rm m/s$ (then cut-off).
- \blacktriangleright Prescribed motion of rotor with 15 $\rm rpm$ and 43 $\rm rpm.$ Inflow velocity 7 $\rm m/s$ (power generation 52.5 $\rm kW)$ and 25 $\rm m/s.$
- Simulation domain $488 \text{ m} \times 240 \text{ m} \times 100 \text{ m}$.
- Base mesh 448 \times 240 \times 100 cells with refinement factors 2,2,4. Resolution of rotor and tower $\Delta x = 6.25$ cm.
- 94,224 highest level iterations to t_e = 40 s computed.







- On 288 cores Intel Ivybride 10 s in 38.5 h (11,090 h CPU)
- Only levels 0 and 1 used for iso-surface visualization



- At t_e approximately 140M cells used vs. 44 billion (factor 315)
- Only levels 0 and 1 used for iso-surface visualization

Level	Grids	Cells				
0	3,234	10,752,000				
1	11,921	21,020,256				
2	66,974	102,918,568				
3	896	5,116,992				

Boltzmann	

Dynamic mesh adaptation 0000000 Realistic computations

Simulation of wind turbine wakes

Vorticity generation – $25 \,\mathrm{m/s}$, $43 \,\mathrm{rpm}$



- Refinement of wake up to level 2 ($\Delta x = 25 \text{ cm}$).
- **•** Rotation starts at t = 4 s, full refinement at t = 8 s to avoid refining initial acoustic waves.

Simulation of wind turbine wakes Vorticity generation – $7 \mathrm{m/s}$, $15 \mathrm{rpm}$	
Vorticity generation – $7 \mathrm{m/s}$, $15 \mathrm{rpm}$	
Time® sec	

 \blacktriangleright Number of wakes between turbines increased from \sim 12 to \sim 15 but vorticity production visibly reduced

Lattice Boltzmann methods	Dynamic mesh adaptation	Realistic computations	Conclusions
			•
Things to address			

- Developed and demonstrated a first version of a block-based dynamically adaptive LBM for real-world CFD with moving boundaries.
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Lattice	Boltzmann	methods
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- Currently also implementing LBM in 3d with Boussinesq approximation for thermal convection and fully compressible LBM
- Performance for moderate core count is reasonable, some improvements for larger core count still desirable. Looking into GPU and Phi coprocessor versions.

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```
AdvanceLevel(/)
```

```
Repeat r_l times
Set ghost cells of \mathbf{Q}'(t)
```

```
UpdateLevel(/)
```

```
t := t + \Delta t_l
```

```
AdvanceLevel(/)
```

```
Repeat r_l times
Set ghost cells of \mathbf{Q}'(t)
```

```
UpdateLevel(/)
If level l + 1 exists?
Set ghost cells of \mathbf{Q}^l(t + \Delta t_l)
AdvanceLevel(l + 1)
```



 $t := t + \Delta t_l$

```
AdvanceLevel(/)
Repeat r<sub>l</sub> times
```

```
Set ghost cells of \mathbf{Q}'(t)
```

```
UpdateLevel(l)

If level l+1 exists?

Set ghost cells of \mathbf{Q}^{l}(t + \Delta t_{l})

AdvanceLevel(l+1)

Average \mathbf{Q}^{l+1}(t + \Delta t_{l}) onto \mathbf{Q}^{l}(t + \Delta t_{l})

Correct \mathbf{Q}^{l}(t + \Delta t_{l}) with \delta \mathbf{F}^{l+1}

t := t + \Delta t_{l}
```

- Recursion
- Restriction and flux correction

```
AdvanceLevel(/)
```

```
Repeat r_l times

Set ghost cells of \mathbf{Q}^l(t)

If time to regrid?

Regrid(l)

UpdateLevel(l)

If level l+1 exists?

Set ghost cells of \mathbf{Q}^l(t + \Delta t_l)

AdvanceLevel(l+1)

Average \mathbf{Q}^{l+1}(t + \Delta t_l) onto \mathbf{Q}^l(t + \Delta t_l)

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- Re-organization of hierarchical data

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Start - Start integration on level 0

$$l = 0$$
, $r_0 = 1$
AdvanceLevel(l)

```
AdvanceLevel(/)
```

```
Repeat r_l times

Set ghost cells of \mathbf{Q}^l(t)

If time to regrid?

Regrid(l)

UpdateLevel(l)

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```
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```

```
l=0, r_0=1
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```

[Berger and Colella, 1988][Berger and Oliger, 1984]

Clustering by signatures

			х	х	х	х	х	х	6
			х	х	х	х	х	х	6
		х	х	х					3
х	х	х							3
х	х								2
х	х								2
х	х								2
									0
х	х								2
х	х								2
6	6	2	3	2	2	2	2	2	

 $\begin{array}{ll} \Upsilon & \mbox{Flagged cells per row/column} \\ \Delta & \mbox{Second derivative of } \Upsilon, \ \Delta = \Upsilon_{\nu+1} - 2\,\Upsilon_{\nu} + \Upsilon_{\nu-1} \\ \mbox{Technique from image detection: [Bell et al., 1994], see also} \\ \mbox{[Berger and Rigoutsos, 1991], [Berger, 1986]} \end{array}$

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			х	х	х	х	х	х	6
			х	х	х	х	х	х	6
		х	х	х					3
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Λ



- 1. 0 in Υ
- 2. Largest difference in Δ
- 3. Stop if ratio between flagged and unflagged cell $>\eta_{tol}$

Λ



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Space-filling curve algorithm









High Workload



Medium Workload



Low Workload












Closest point transform algorithm

The signed distance φ to a surface ${\mathcal I}$ satisfies the eikonal equation [Sethian, 1999]

$$|
abla arphi| = 1$$
 with $arphi \Big|_{\mathcal{T}} = 0$

Solution smooth but non-diferentiable across characteristics.

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 - O(m) to build the b-rep and the polyhedra.
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- 4. Problem reduction by evaluation only within specified max. distance

[Mauch, 2003], see also [Deiterding et al., 2006]





Driven cavity - 3d cavity

- Intel Xeon-2.67 GHz 6-core (Westmere) dual-processor nodes with Qlogics interconnect
- Unigrid with 1 ghost cell

Cores	6	12	24	48	96
Time per step	2.80s	1.46s	0.73s	0.37s	0.18s
Par. Efficiency	100.00%	96.09%	95.33%	95.21%	94.82%
LBM Update	78.05%	77.08%	75.85%	74.50%	71.38%
Synchronization	7.25%	8.67%	10.00%	11.32%	14.35%
Phys. Boundary	0.51%	0.46%	0.45%	0.44%	0.44%
Misc	14.19%	13.79%	13.70%	13.73%	13.83%

AMR with 4 ghost cells

Cores	6	12	24	48	96
Time per step	3.32s	1.90s	1.21s	0.54s	0.30s
Par. Efficiency	100.00%	87.42%	68.76%	77.02%	68.19%
LBM Update	43.44%	40.93%	31.33%	34.64%	30.11%
Synchronization	14.13%	18.26%	34.73%	25.76%	30.69%
Phys. Boundary	1.03%	0.98%	0.77%	0.86%	0.77%
Regridding	15.53%	16.02%	13.87%	18.72%	20.82%
Interpolation	16.74%	15.71%	11.95%	13.15%	11.51%
Fixup	2.89%	2.60%	2.02%	2.28%	2.03%
Misc	6.22%	5.50%	5.33%	4.59%	4.08%

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Expense for boundary is increased compared to FV methods because the algorithm uses few floating point operations but a large state vector!