



**UNIVERSITY OF LEEDS**

This is a repository copy of *Lattice Boltzmann method for indoor and urban flow*.

White Rose Research Online URL for this paper:

<http://eprints.whiterose.ac.uk/141161/>

Version: Supplemental Material

---

**Conference or Workshop Item:**

Khan, A [orcid.org/0000-0002-7521-5458](https://orcid.org/0000-0002-7521-5458) Lattice Boltzmann method for indoor and urban flow. In: Indoor Air 2018 15th Conference of the International Society of Indoor Air Quality & Climate (ISIAQ), 22-27 Jul 2018, Philadelphia, USA.

---

**Reuse**

Items deposited in White Rose Research Online are protected by copyright, with all rights reserved unless indicated otherwise. They may be downloaded and/or printed for private study, or other acts as permitted by national copyright laws. The publisher or other rights holders may allow further reproduction and re-use of the full text version. This is indicated by the licence information on the White Rose Research Online record for the item.

**Takedown**

If you consider content in White Rose Research Online to be in breach of UK law, please notify us by emailing [eprints@whiterose.ac.uk](mailto:eprints@whiterose.ac.uk) including the URL of the record and the reason for the withdrawal request.



[eprints@whiterose.ac.uk](mailto:eprints@whiterose.ac.uk)  
<https://eprints.whiterose.ac.uk/>

# School of Civil Engineering

FACULTY OF ENGINEERING



UNIVERSITY OF LEEDS

## Lattice Boltzmann method for indoor and urban flow

Dr M A I Khan

A.Khan@leeds.ac.uk

**EPSRC**

Engineering and Physical Sciences  
Research Council



**nVIDIA**®

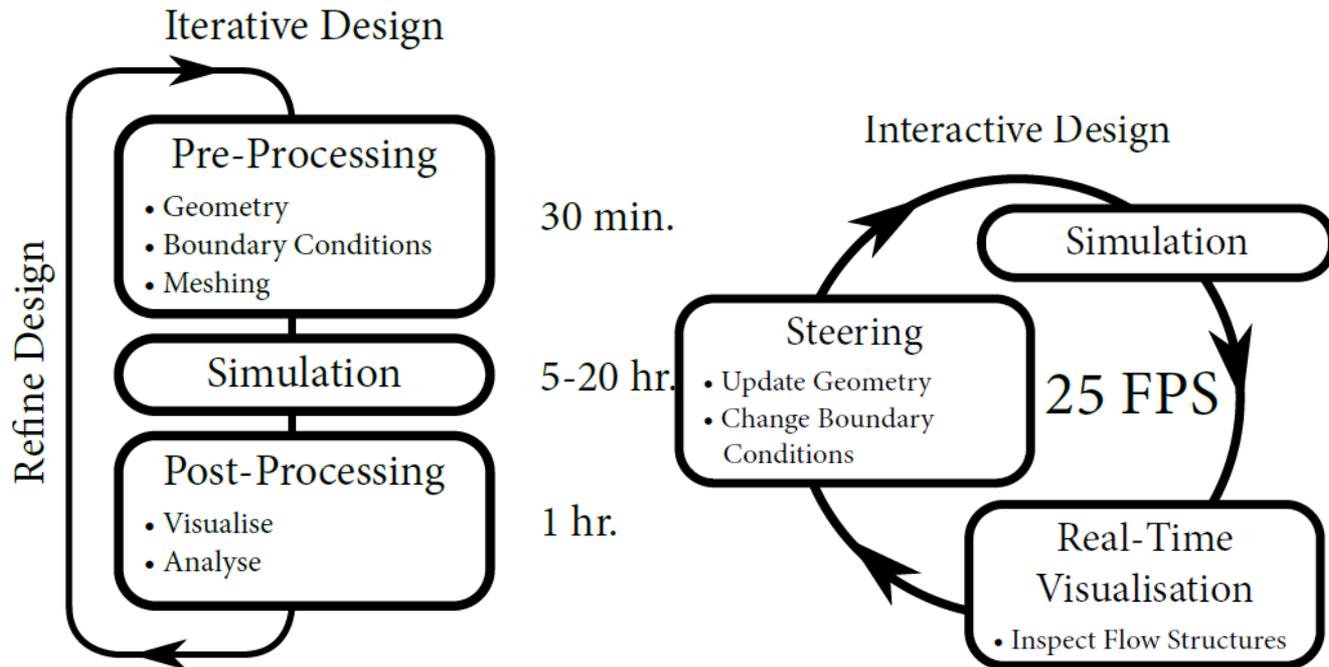


- Background and Motivation
- Theoretical Background of Lattice Boltzmann Method (LBM)
- Discrete formulation of LBM
- LBM algorithm with D3Q19
- Fluid simulation with video game cards; LBM with GPUs using CUDA
- Results & Live Demo

# Motivation for developing real-time or fast CFD



UNIVERSITY OF LEEDS



**Traditional Design  
optimisation using  
CFD**

**Interactive Design  
optimisation using  
CFD**



- Naturally ventilated buildings are common worldwide and are advocated as part of sustainable and resilient infrastructure development
- However the relationship between external airflow and indoor air quality is still an area of much debate and challenging research.
- Even for simple building geometries, naturally induced airflow patterns can be highly complex.
- Since modelling outdoor and indoor air is a problem of scale/time, where large eddies dominate external flow but smaller eddies dominate inside buildings,
- Care needs to be taken when modelling these phenomena together.

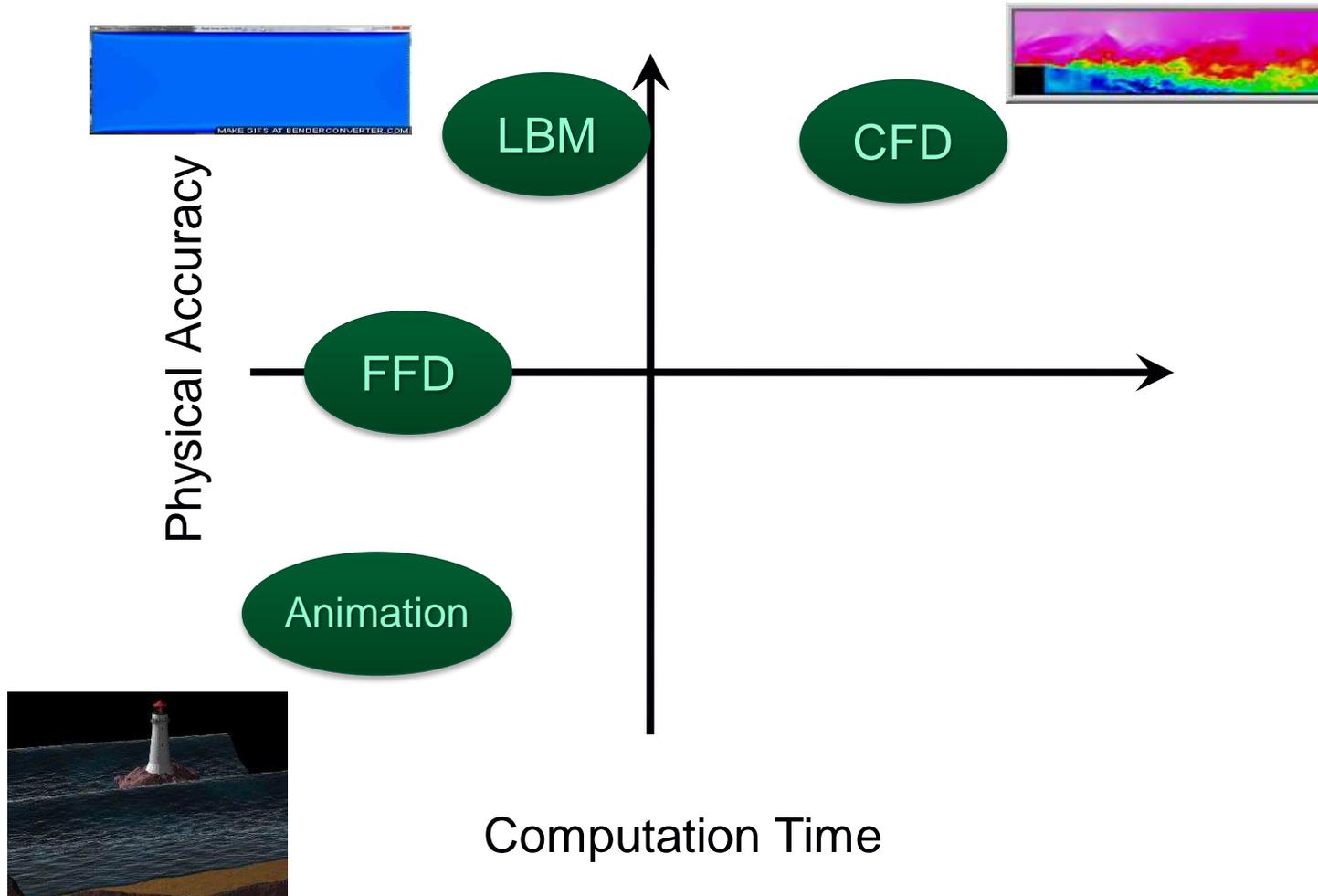
- Whilst the use of CFD-based simulation tools has led to significant insights into the role of spatio-temporal flow structures and its capability to transport or disperse heat, moisture and pollutants in general
- CFD has never been able to enter the realm of **forecasting in the field of indoor environment**.
- The main reason for this is that CFD-based tools which are currently available or in use require a substantial amount of computational resources and user time to get reasonably accurate results.
- The traditional CFD approach using finite-volume method (FVM) to capture the detail of urban flows and transient behaviour requires increasingly substantial computing resources.
- However, graphical processing units (GPUs) are becoming increasingly powerful with massively parallel capabilities, and therefore lend themselves to the airflow simulation process using a novel lattice Boltzmann method (LBM)



# Why LBM



UNIVERSITY OF LEEDS





# Theoretical Background of Lattice Boltzmann Method (LBM)

# Model classification for fluid flows



UNIVERSITY OF LEEDS

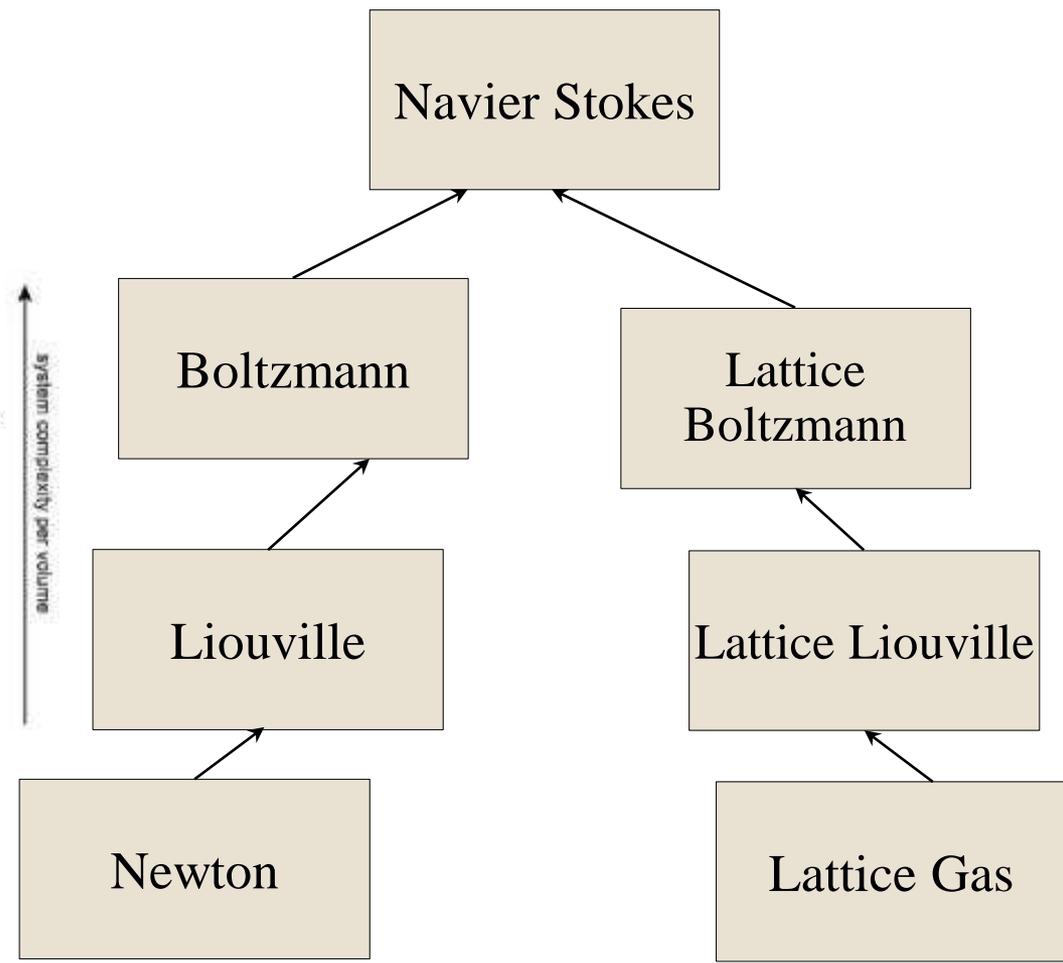
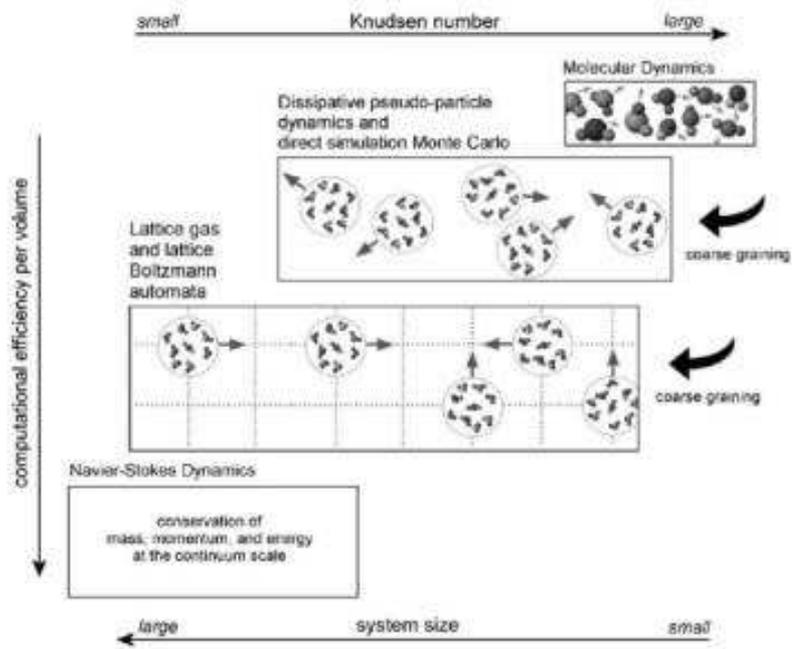
| Model type                      | Macroscopic   | Mesoscopic   | Microscopic   |
|---------------------------------|---|--|---|
| Characteristic model assumption | Interaction of molecules in the fluid neglected                     | Distribution of molecules in the fluid considered                        | Interaction of single molecules in the fluid considered |
| Examples: Models                | Navier-Stokes, Euler, Stokes, Heat Equation                         | Liouville, Boltzmann, BGK-Boltzmann Eqn                                  | Molecular dynamics (Newton's laws)                      |
| Examples: Observed quantities   | Fluid velocity, pressure, density, temperature                      | Mean free path, mean molecular velocity, density                         | Molecular mass, velocity, extent and form               |
| Examples: Numerical methods     | Spectral, finite difference (FDM), volumes (FVM) and elements (FEM) | Monte Carlo, lattice Boltzmann, finite differences, volumes and elements | Molecular dynamics (MD)                                 |

$Kn \ll 1$

$Kn \approx 1$



- Boltzmann equation
- $\frac{\partial f}{\partial t} + \xi \cdot \frac{\partial f}{\partial \mathbf{x}} = C(f, f)$
- $f(\mathbf{x}, \xi, t)$
- Here  $\xi$ 's are the microscopic velocities
- Navier-Stokes equation
- $\frac{\partial \mathbf{u}}{\partial t} + \mathbf{u} \cdot \nabla \mathbf{u} = -\nabla p + \frac{1}{Re} (\Delta \mathbf{u})$
- $\nabla \cdot \mathbf{u} = 0$
- Here,  $\mathbf{u}$  is the macroscopic or hydrodynamic velocity



Ref.: Raabe; Modelling Simul. Mater. Sci. Eng. 12 (2004) R13–R46)

Hierarchy of models (Succi 2001)

# Computational procedure of LBGK scheme



UNIVERSITY OF LEEDS

$$f_i = f_i^{(eq)} = \rho w_i \left[ 1 + 3 \frac{\mathbf{e}_i \cdot \mathbf{u}}{c} + \frac{9}{2} \frac{(\mathbf{e}_i \cdot \mathbf{u})^2}{c^2} - \frac{3}{2} \frac{\mathbf{u}^2}{c^2} \right]$$

Collide

$$f_i(\mathbf{x}, t + \delta_t) = f_i(\mathbf{x}, t) + \frac{1}{\tau} (f_i^{(eq)} - f_i)$$

Stream

$$f_i(\mathbf{x} + c\mathbf{e}_i\delta_t, t + \delta_t) = f_i(\mathbf{x}, t + \delta_t)$$

$$\rho = \sum_{i=0}^q f_i(\mathbf{x}, t) \quad \rho \mathbf{u} = \sum_{i=0}^q c\mathbf{e}_i f_i(\mathbf{x}, t)$$

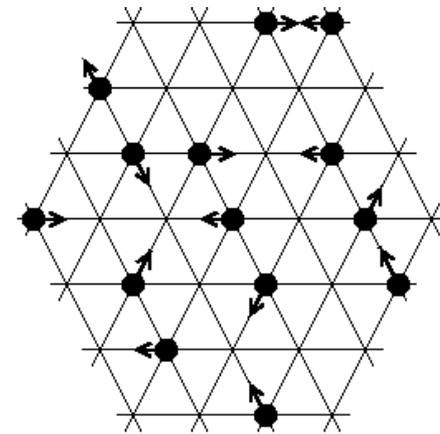
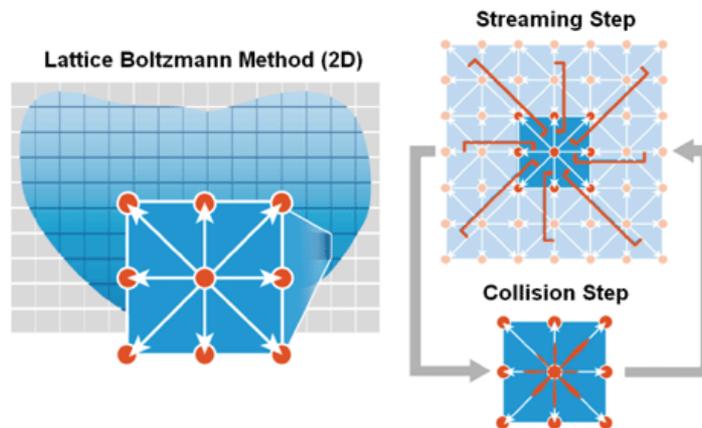
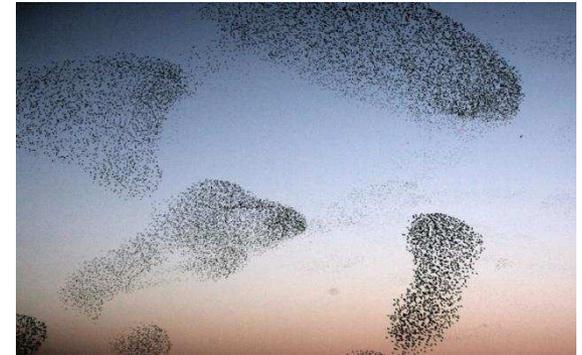
2<sup>nd</sup> order space and 1<sup>st</sup> order time accurate method

# Playing Billiards with fictitious particles



UNIVERSITY OF LEEDS

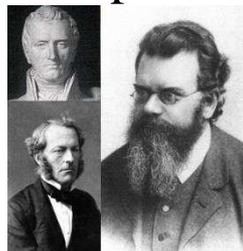
- Playing billiards on a discrete space-time lattice to simulate continuum fluid flow (bottom up approach)
- $f_i$ 's are the pseudo particles in LBM



## Conventional CFD

- CFD solves the conservation equations of macroscopic properties (i.e., mass, momentum, and energy) numerically
- Nonlinear advection
- Non-local parallel limited
- Boundary conditions difficult
- Geometry setup slow
- 3D time dependent flow expensive to solve
- Complex physics require complex models

Claude-Louis Navier (1785-1836)  
George Stokes (1819-1903)



## Lattice Boltzmann

- LBM treats fluids as a fictitious collection of interacting mesoscopic (between micro and macro) particles
- Linear advection
- Local and parallel & SIMD
- BC easy for arbitrary geometry
- Geometry setup fast
- 3D time-dependent flow straightforward and fast
- Complex physics involve simple models

Ludwig Boltzmann (1844-1906)



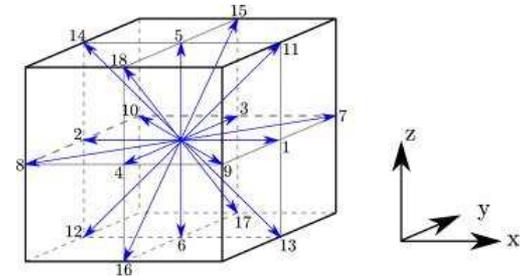
- LBM for 3D Turbulent and Thermal Flow

# The D3Q19 Model



UNIVERSITY OF LEEDS

- It has a minimum number of velocities while maintaining good isotropy of the lattice
- The simulation of the velocity field is carried out on such a D3Q19 lattice;
- The complex collision operator is approximated by using the standard BGK scheme
- The distribution functions  $\mathbf{f}$ , is close to a local equilibrium  $\mathbf{f}^{(eq)}$  and relaxes toward this equilibrium with some characteristic time  $\tau$



- To simulate thermal flows we use the coupled mode
- Here the velocity is simulated using D3Q19 lattice using BGK and the temperature is computed on a smaller D3Q6 lattice
- Boussinesq approximation is used to couple temperature and velocity via buoyancy force
- The evolution of temperature distribution function  $T_i$  on the lattice is given by

$$T_i(\mathbf{x} + \mathbf{c}_i \delta_t, t + \delta_t) = T_i(\mathbf{x}, t + \delta_t)$$

$$T_i(\mathbf{x}, t + \delta_t) = T_i(\mathbf{x}, t) + \underbrace{\frac{1}{\tau_T} (T_i^{(eq)} - T_i)}_{\text{BGK Collision}} \text{ with } i \in \{1, \dots, 6\}$$



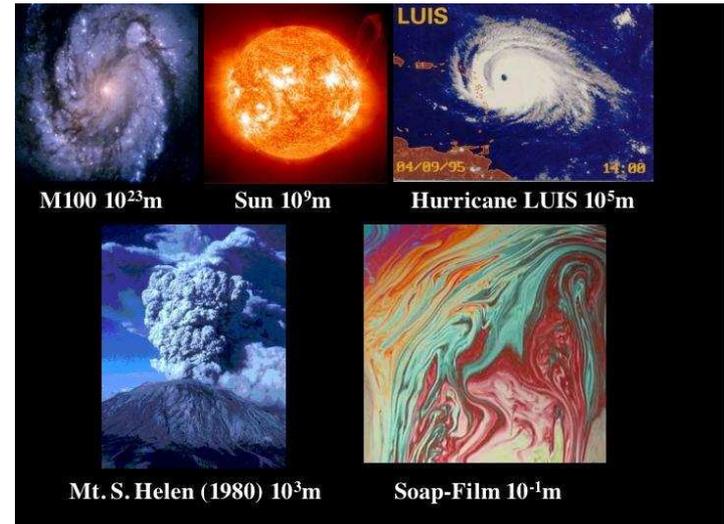
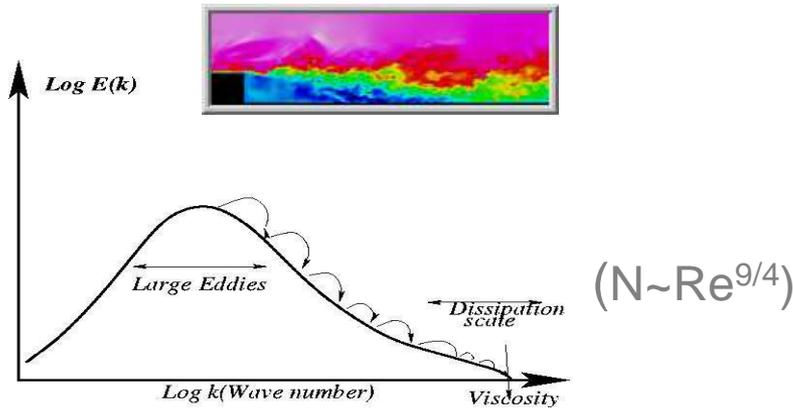
# Extending LBM to turbulent flows

# Turbulent flow modelling



UNIVERSITY OF LEEDS

**Big whorls have little whorls  
That feed on their velocity,  
And little whorls have lesser whorls  
And so on to viscosity--- L F Richardson**

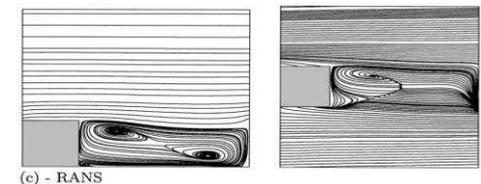
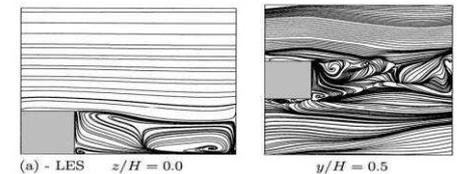
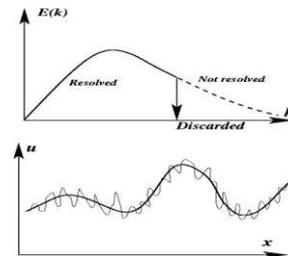
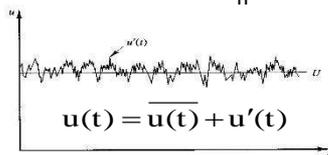


$$\frac{\partial \bar{u}_i}{\partial t} + \frac{\partial}{\partial x_j} (\bar{u}_i \bar{u}_j) = -\frac{1}{\rho} \frac{\partial \bar{p}}{\partial x_i} + \frac{\partial}{\partial x_j} \left[ \nu \left( \frac{\partial \bar{u}_i}{\partial x_j} + \frac{\partial \bar{u}_j}{\partial x_i} \right) + T_{ij} \right]$$

where  $i = 1, 2, 3$

$$T_{ij} = \overline{u_i u_j} - \bar{u}_i \bar{u}_j$$

$$T_{ii} = 2\nu_T \bar{S}_{ij} \text{ where } \nu_T = C\bar{\Delta}^2 |\bar{S}|$$



$$\bar{u}(x) = \int_{\Omega} u(x') G(x, x') dx'$$

# Inclusion of Turbulence, LBM sub-grid model



UNIVERSITY OF LEEDS

- To include the effect of turbulence without excessive increase of computational expense
- We use the simple Smagorinsky sub-grid model to include large Re flows
- With the current model of single relaxation time  $\tau$ , simulations becomes unstable at high Re hence the use of sub-grid modelling

$$\nu_t = C\Delta^2 |\bar{S}|$$

$$\nu_{\text{tot}} = \nu + \nu_t$$

$$\tau_S = 3\nu_{\text{tot}} + \frac{1}{2} = 3\left(\nu + C\Delta^2 |\bar{S}|\right) + \frac{1}{2}$$

- Stress tensor from LBM

$$|\bar{S}| = \frac{1}{6C\Delta^2} \left( \sqrt{\nu^2 + 18C\Delta^2 \sqrt{\Pi_{\alpha\beta} \Pi_{\alpha\beta}}} - \nu \right)$$

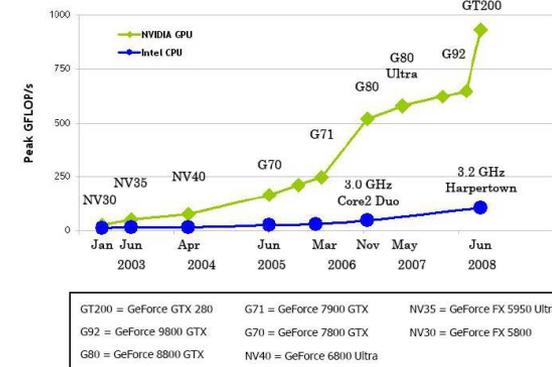
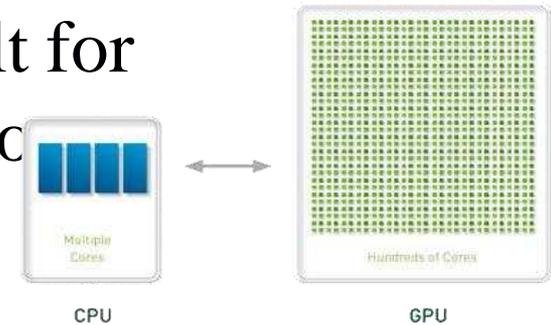
$$\text{where } \Pi_{\alpha\beta} = \sum \mathbf{e}_{i\alpha} \mathbf{e}_{i\beta} \left( f_i - f_i^{(\text{eq})} \right)$$

# Graphics Processing Unit (GPU)



UNIVERSITY OF LEEDS

- The GPU is a computer component built for parallel computation originally for video games.
- GPU and CPU architectures are completely different.
- Thus GPU requires special programming (CUDA) techniques.
- GPUs are much faster than CPUs.
- GPU acceleration for LBM: 100x

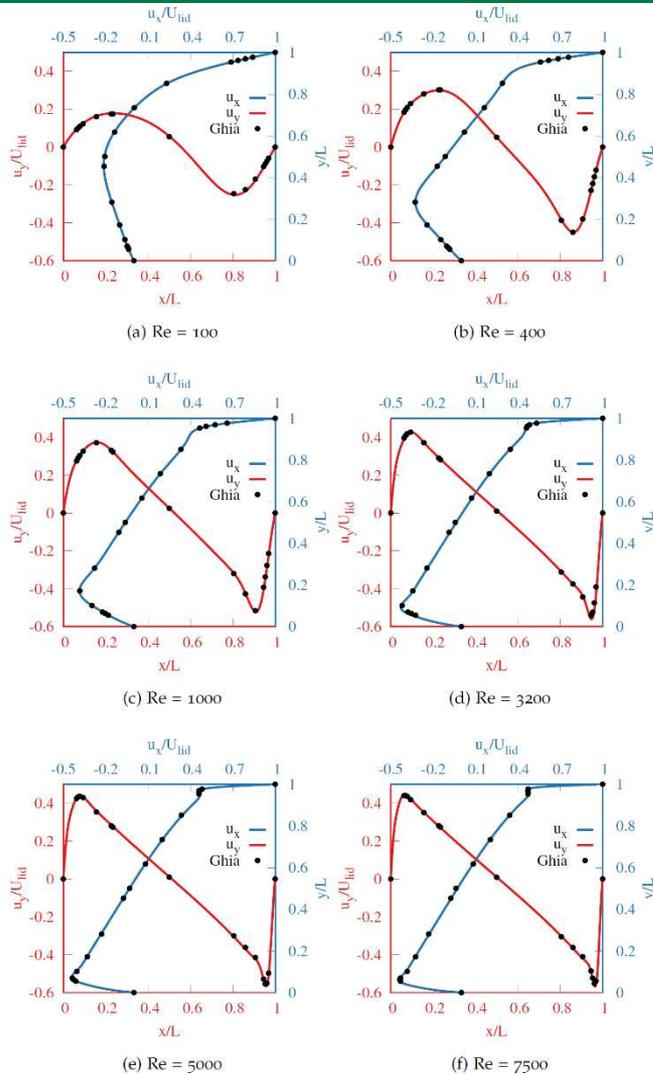


nVIDIA 6GB GDDR5 DVI PCIE 16x

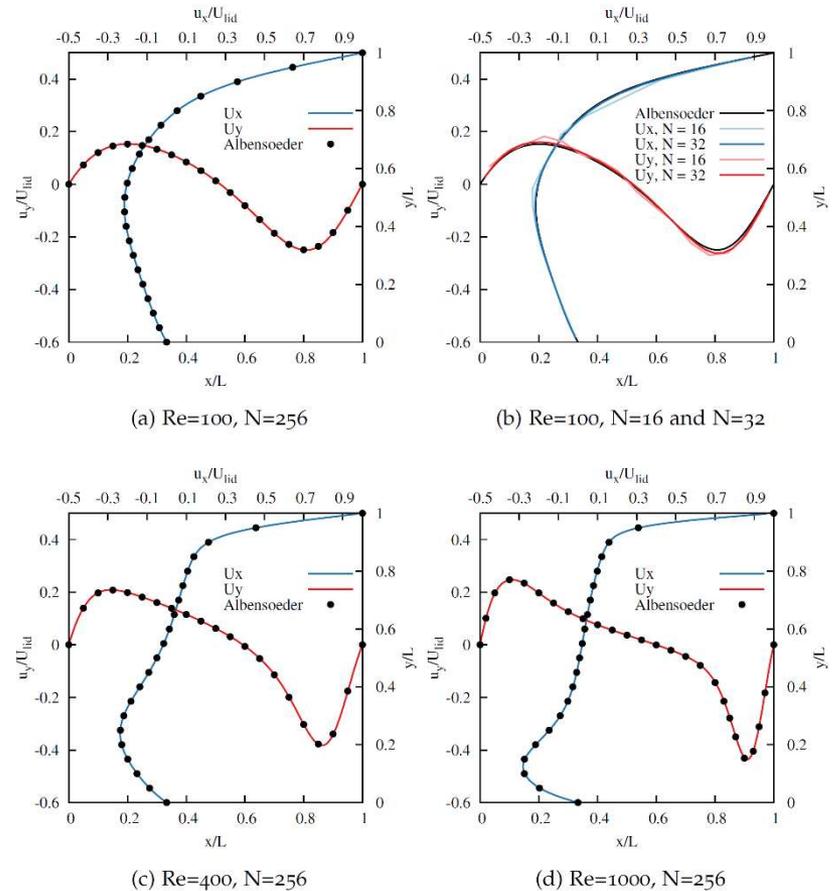
# LBM on a single GPU



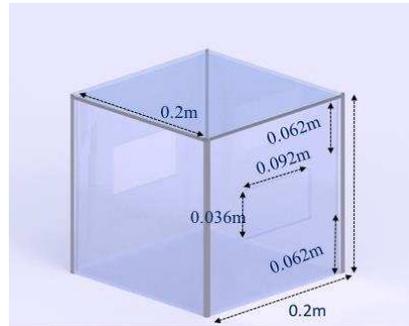
UNIVERSITY OF LEEDS



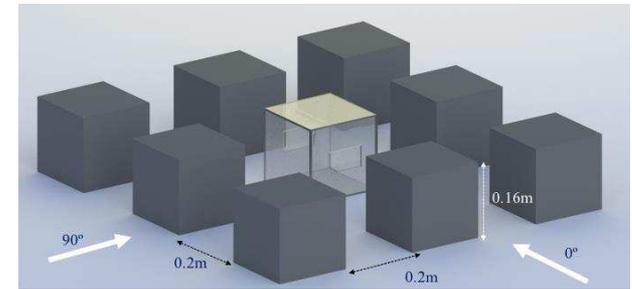
2D Cavity



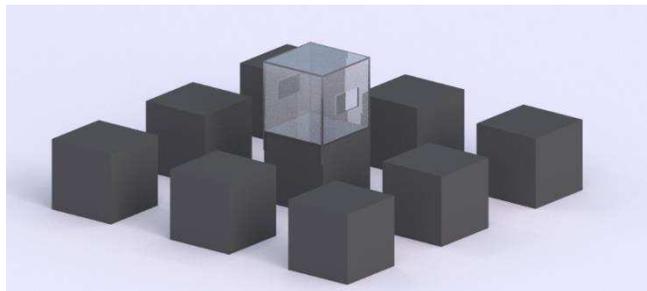
3D Cavity



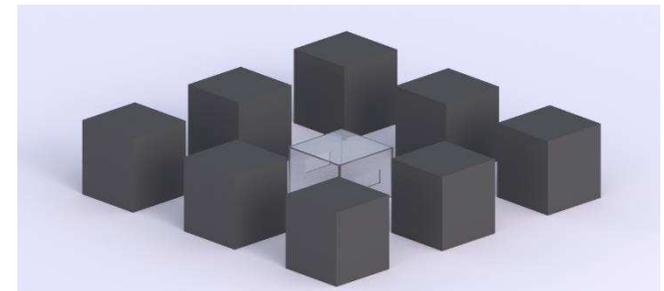
a) Isolated building



b) Array of equal sized buildings



c) Array with **tall** central building



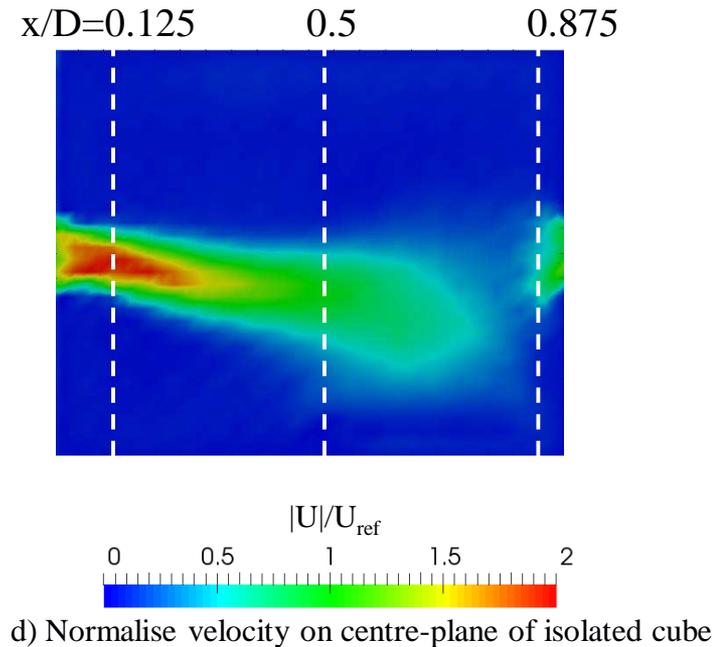
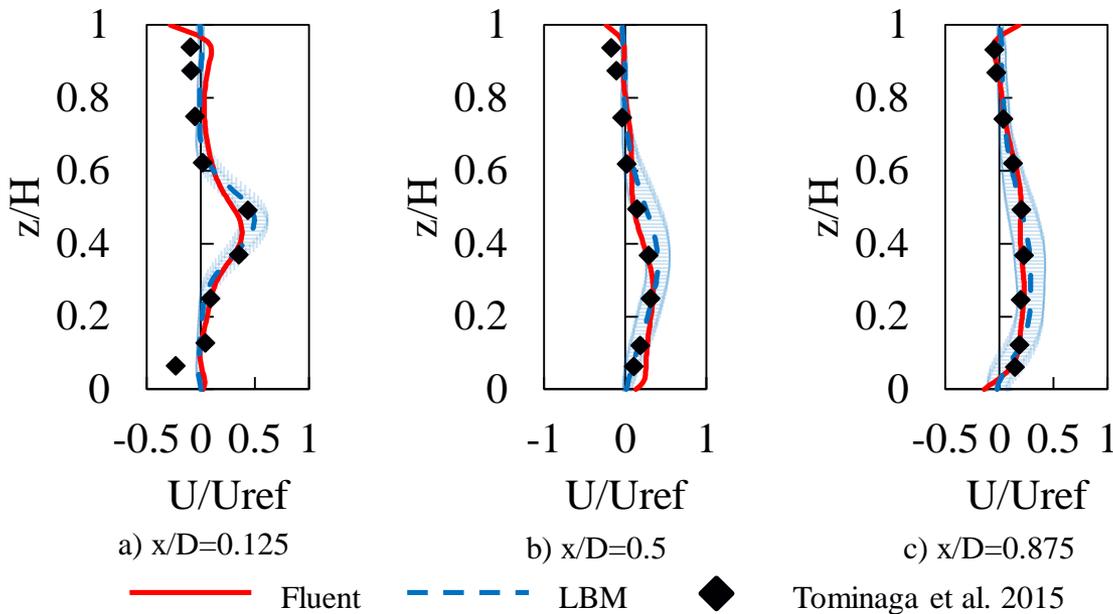
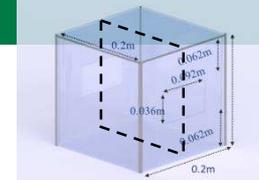
d) Array with **small** central building

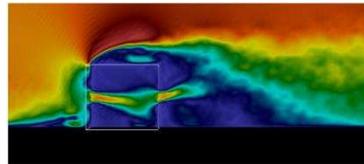
For use in the urban environment, we conducted a validation study against a wind tunnel model of a cubical building with cross-flow ventilation in isolated and in an array format. Then we ran a parametric study to investigate the effect of having either a tall central building or a small central building.

# Results – Isolated building

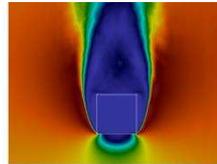


UNIVERSITY OF LEEDS

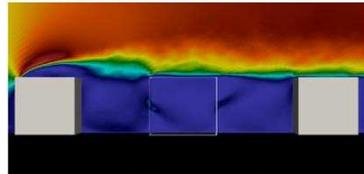




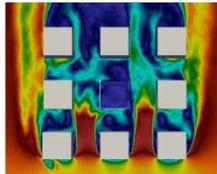
a) Iso  $0^\circ$



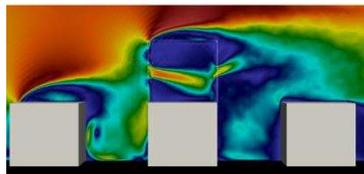
b) Iso  $90^\circ$



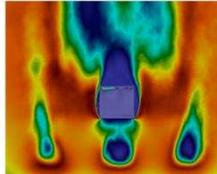
c) Array 1H  $0^\circ$



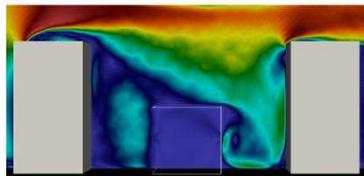
d) Array 1H  $90^\circ$



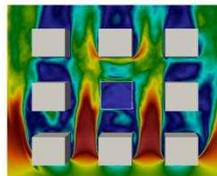
e) Array 2H  $0^\circ$



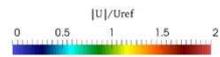
f) Array 2H  $90^\circ$



g) Array 2Ø  $0^\circ$



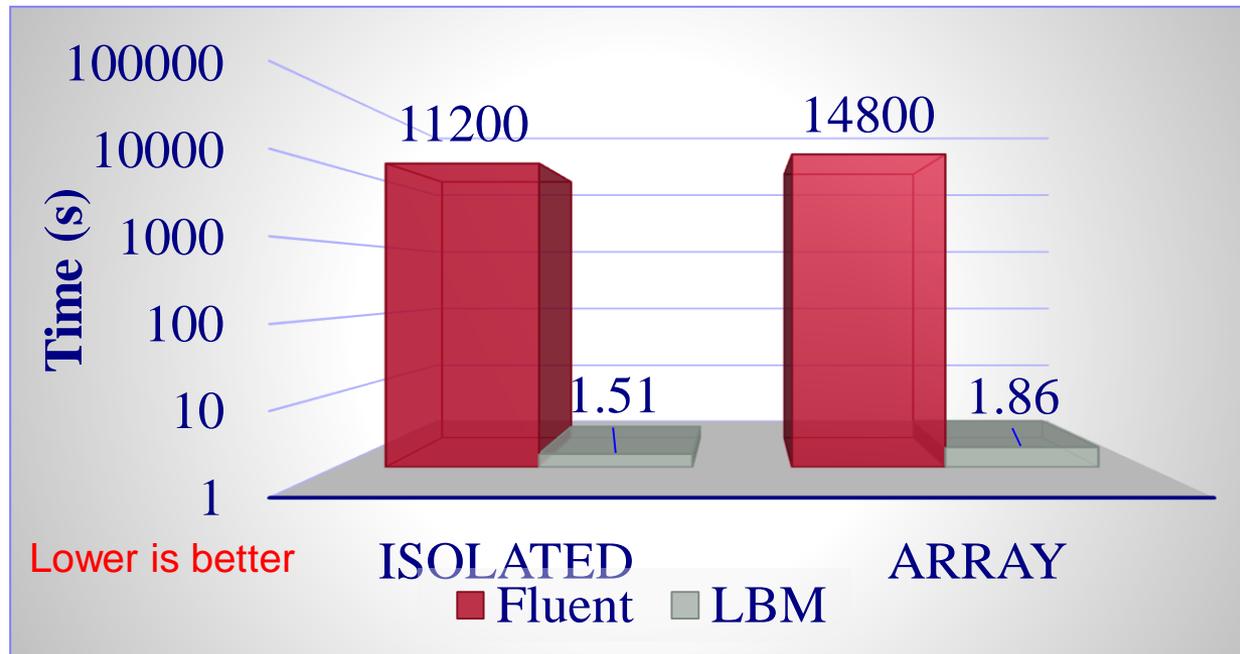
h) Array 2Ø  $90^\circ$



# Time to simulate 1 second of flow



UNIVERSITY OF LEEDS



Fluent took 11200 seconds to simulate one second of flow for the isolated case and 14800 seconds for the array case. How long did it take the LBM code? 1.5s. That's almost 7500 times faster. And that's only on 1 graphics card.

# Hospital Environment Control, Optimisation and Infection Risk Assessment (HECOIRA)



UNIVERSITY OF LEEDS

## Current EPSRC funded project

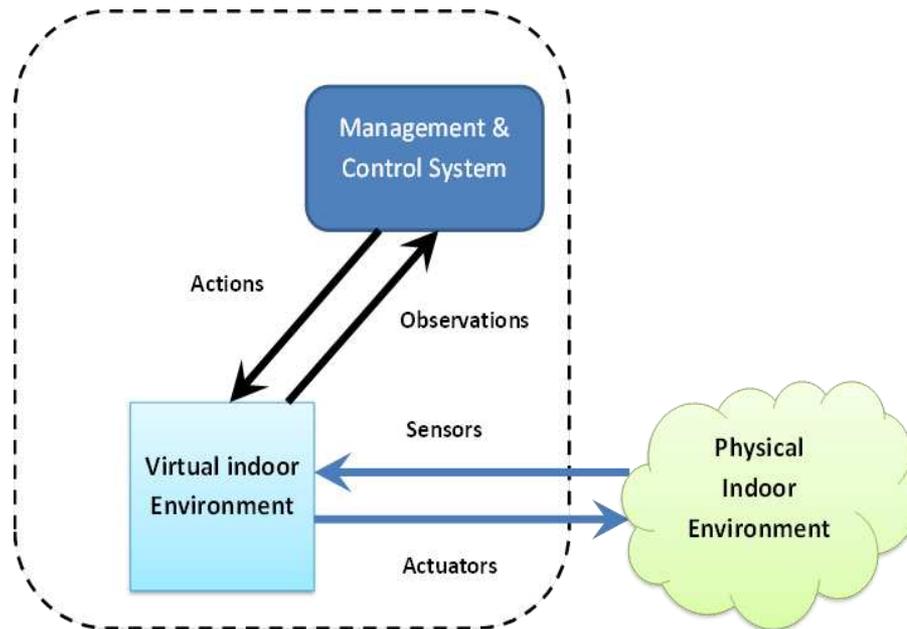


Figure Schematic diagram of symbiotic simulation –based control for indoor environment

## Simulation based decision support & Control



BUILD SIMUL (2015) 8: 405 – 414  
DOI 10.1007/s12273-015-0232-9

### Real-time flow simulation of indoor environments using lattice Boltzmann method

M. Amirul Islam Khan<sup>1</sup> (✉), Nicolas Delbosc<sup>2</sup>, Catherine J. Noakes<sup>1</sup>, Jonathan Summers<sup>2</sup>

1. School of Civil Engineering, University of Leeds, Woodhouse Lane, Leeds LS2 9JT, UK

2. School of Mechanical Engineering, University of Leeds, Woodhouse Lane, Leeds LS2 9JT, UK

Building and Environment 125 (2017) 273–284



Contents lists available at ScienceDirect

Building and Environment

journal homepage: [www.elsevier.com/locate/buildenv](http://www.elsevier.com/locate/buildenv)



Modelling urban airflow and natural ventilation using a GPU-based lattice-Boltzmann method

Marco-Felipe King<sup>a,\*</sup>, Amirul Khan<sup>a</sup>, Nicolas Delbosc<sup>b</sup>, Hannah L. Gough<sup>c</sup>, Christos Halios<sup>c</sup>, Janet F. Barlow<sup>c</sup>, Catherine J. Noakes<sup>a</sup>

<sup>a</sup> Institute for Public Health and Environmental Engineering, University of Leeds, Leeds, UK

<sup>b</sup> School of Mechanical Engineering, University of Leeds, Leeds, UK

<sup>c</sup> Department of Meteorology, University of Reading, Reading, UK



Computers & Mathematics with Applications

Volume 67, Issue 2, February 2014, Pages 462–475



Optimized implementation of the Lattice Boltzmann Method on a graphics processing unit towards real-time fluid simulation

N. Delbosc<sup>a</sup> (✉), J.L. Summers<sup>a</sup> (✉), A.I. Khan<sup>b</sup> (✉), N. Kapur<sup>a</sup> (✉), C.J. Noakes<sup>b</sup> (✉)



- Implement more accurate boundary conditions
- Implement Multiple relaxation model, hence more stable simulation even at higher  $Re$  with less lattice resolution
- Non-uniform lattice and curved boundaries
- Moving object with Immersed Boundary
- Multi-GPU implementation
- Coupling with DEM

# Acknowledgements



UNIVERSITY OF LEEDS



Dr N Delbosc, XFlow, Dassault, Madrid



Dr J Summers, Leeds



Prof C J Noakes, Leeds





UNIVERSITY OF LEEDS

Thank You