# From Cellular Automata to the Lattice Boltzmann Method

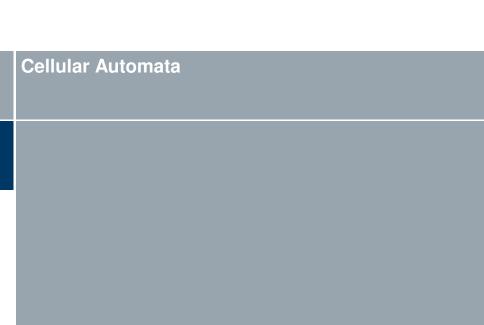
Theresa Pollinger, Marcial Gaißert Ferienakademie Sarntal 2017 September 8, 2017

# Outline

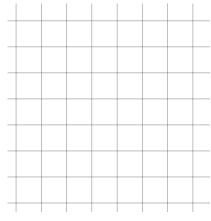
**Cellular Automata** 

**Lattice Gas Automata** 

The Lattice Boltzmann Method

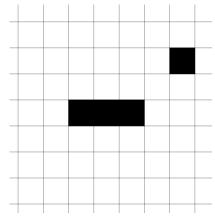


- · regular arrangement of cells



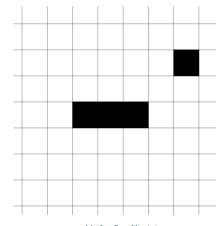
a grid of cells

- · regular arrangement of cells
- · each with discrete state



a grid of cells with state

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- updated simultaneously at each step



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- update rules:
  - same for each cell
  - only dependent on

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	2,3	
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Rules of Conway's Game of Life

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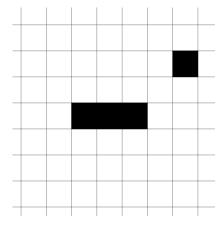
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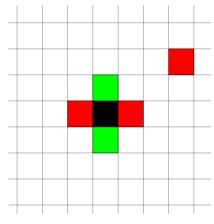
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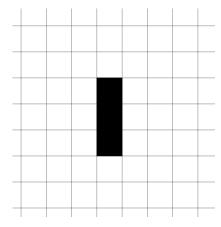
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changes in first step

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after first step

#### advantages

## disadvantages

- simple structure
- easy to implemen
- easy to parallelize

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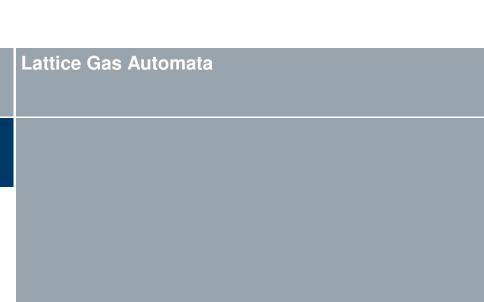
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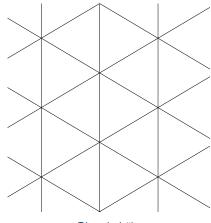
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- Regular arrangement of nodes
  - HPP: square lattice
  - FHP: triangular lattice
- 6 (7) cells per node
- for each step, do:

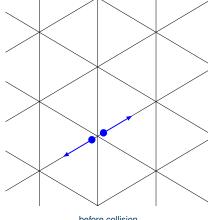
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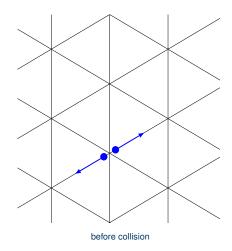


Triangular lattice

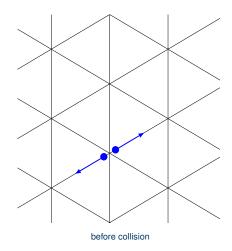
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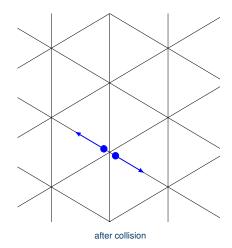
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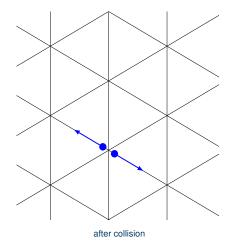
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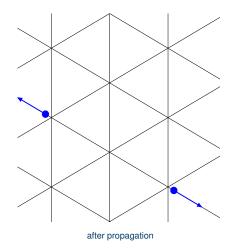
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- FHP yields Navier-Stokes

- statistical noise
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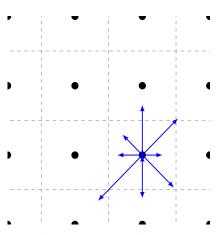


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Particle distribution function  $f_i$ : discrete in space and time, continuous in probability values

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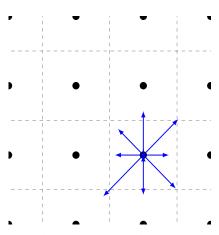
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One collide step for a D2Q9-stencil

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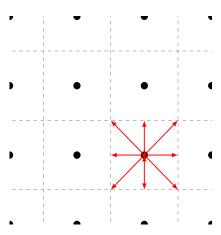
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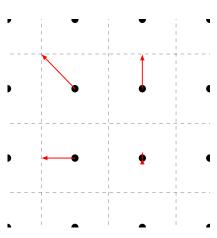
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One stream step for a D2Q9-stencil

# **Stream Step**

Particle distribution function  $f_i$ : discrete in space and time, continuous in probability values



One stream step for a D2Q9-stencil

...is what we get when we apply both steps:

$$f_i(\mathbf{x} + \mathbf{c}_i \Delta t, t + \Delta t) = f_i(\mathbf{x}, t) + \Omega_i(\mathbf{x}, t)$$

With collision operator  $\Omega_i(\mathbf{x},t)$ , e.g.:

• BGK: 
$$\Omega(t) = \frac{1}{\tau}(f_i^{\text{eq}} - f_i) = \omega(f_i^{\text{eq}} - f_i)$$

TRT:

$$\frac{\partial f}{\partial t} + \frac{\mathbf{p}}{m} \cdot \nabla f = \left(\frac{\partial f}{\partial t}\right)_{coll}$$

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Cf. Boltzmann Equation

$$\frac{\partial f}{\partial t} + \frac{\mathbf{p}}{m} \cdot \nabla f = \left(\frac{\partial f}{\partial t}\right)_{coll}$$

# **Moments - the Interesting Outputs in LBM**

Density and velocity are given locally

$$\rho(\mathbf{x},t) = \sum_{i} f_{i}(\mathbf{x},t)$$

$$\rho \mathbf{u}(\mathbf{x},t) = \sum_{i} \mathbf{c}_{i} f_{i}(\mathbf{x},t)$$

# Nondimensionalization – setting the step size

= Normalization in the three physical dimensions time, space, mass

$$\Delta x^* = 1 = C_x \cdot \Delta x$$
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The kinematic velocity in lattice units is directly linked to  $\omega/\tau$ :

Thanks for listening.

Any questions?



# References