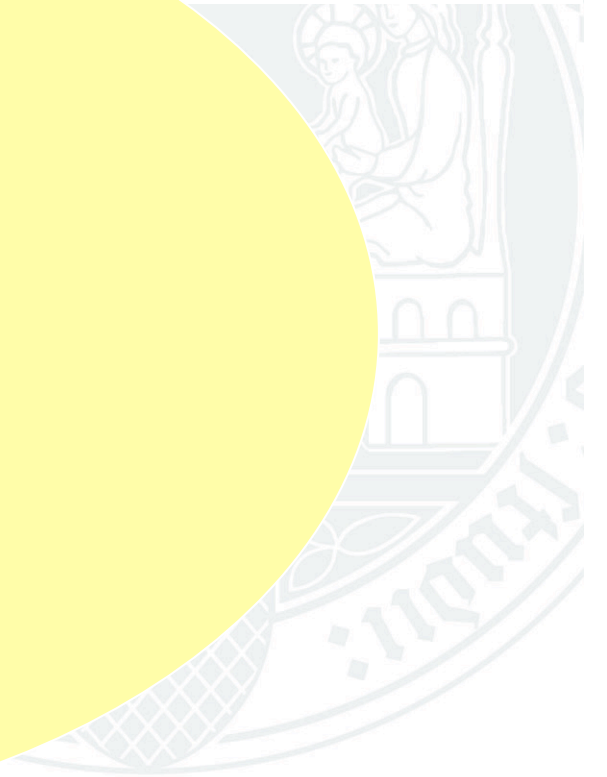


# ***Pedestrian Dynamics***



# Introduction

Pedestrian dynamics more complex than vehicular traffic:

- motion is **2-dimensional**
- **counterflow**
- interactions “**longer-ranged**”

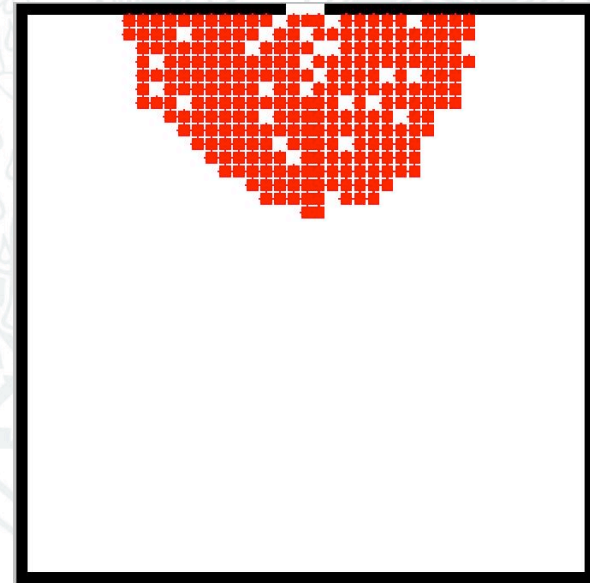


# Empirics



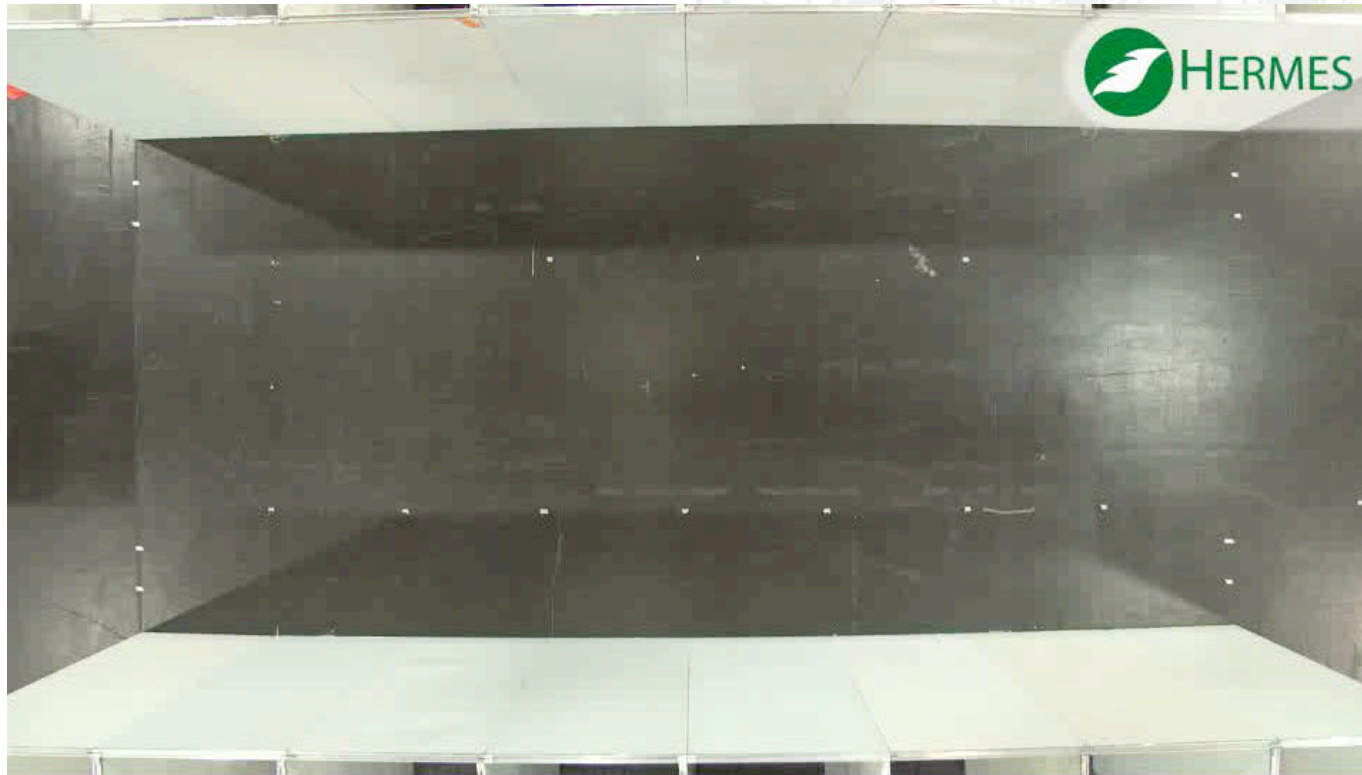
# Collective phenomena

jamming or clogging  
(e.g. at exits)

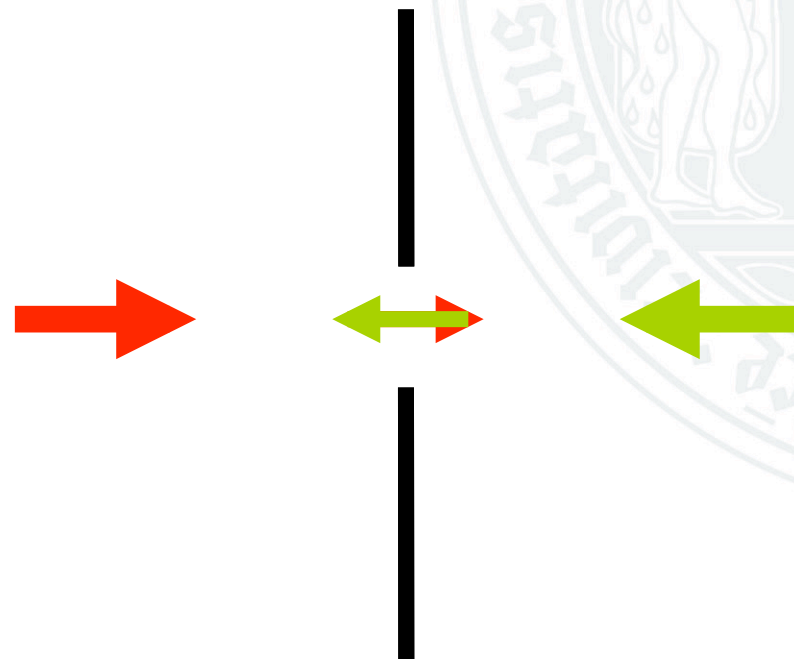


no real challenge for modelling!

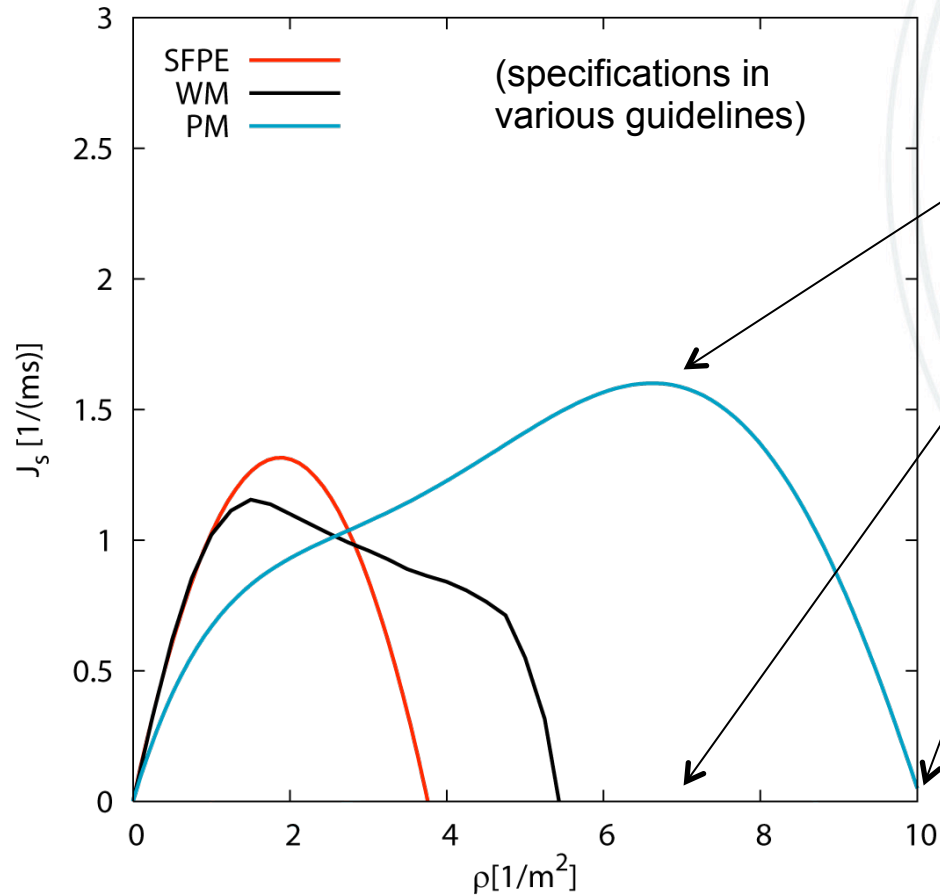
# Lane Formation in Counterflow



# Oscillations of flow direction



# Fundamental diagram: Guidelines



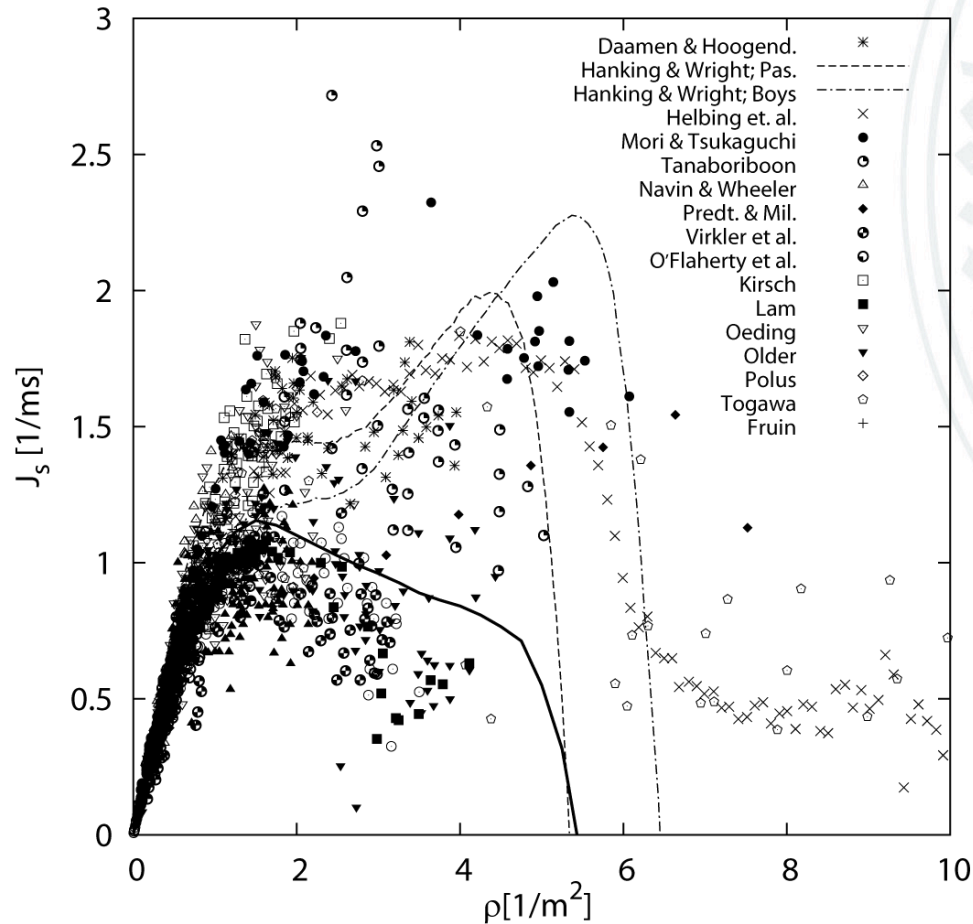
(specifications in various guidelines)

- Different shapes
- Capacity value  $C_s$   
 $C_s = 1.2 - 1.6 (ms)^{-1}$
- Location of the maximum  
 $\rho_c = 1.8 - 7 m^{-2}$
- Density of flow breakdown  
 $\rho_0 = 3.8 - 10 m^{-2}$

→ large discrepancies!



# Fundamental diagram: Empirical results



## Possible explanation for the large discrepancies:

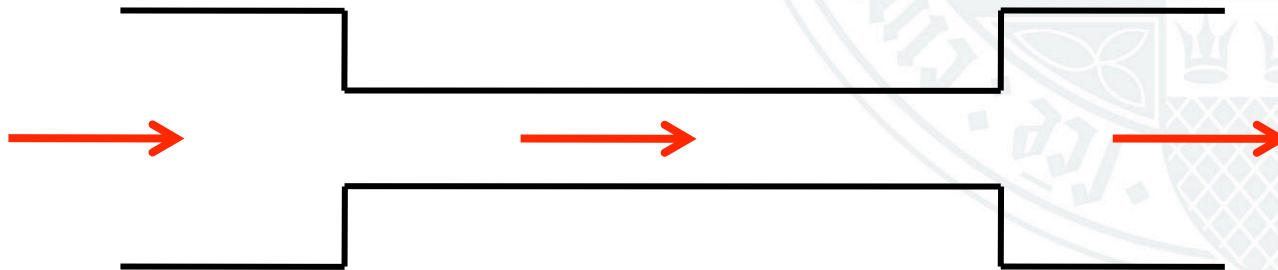
- uni- vs. bidirectional flow
- measurement techniques, density definition
- fluctuations
- cultural influence
- demographics of test group
- psychological factors



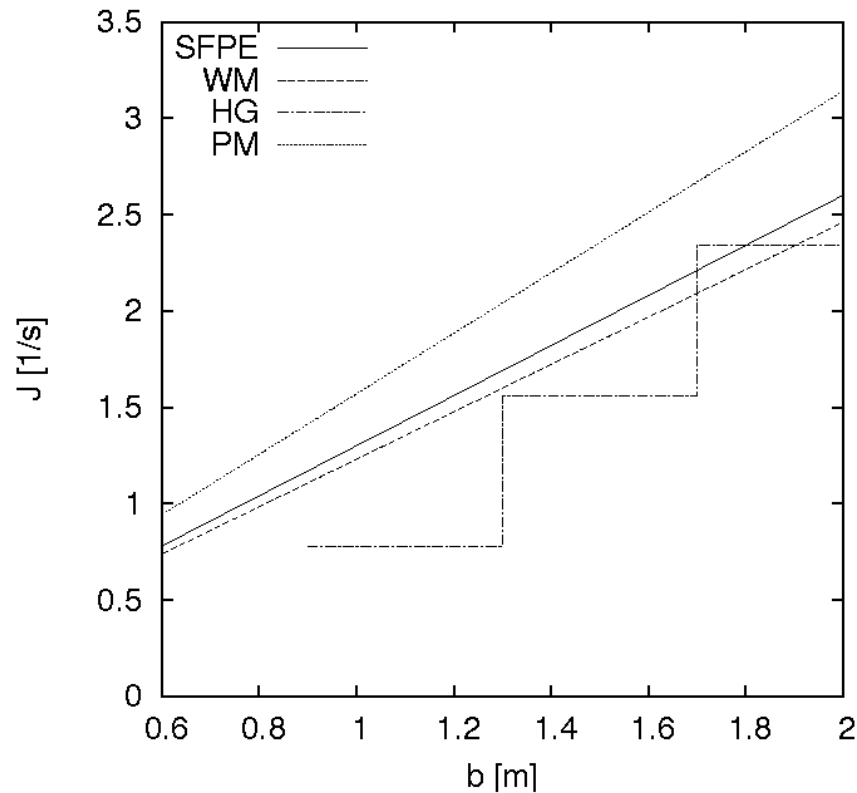


# Bottleneck scenario

**bottlenecks = flow limitations**  
**(e.g. doors, narrow corridors, stairs)**



# Bottleneck flow



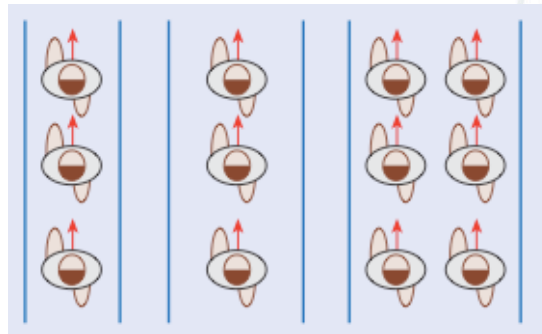
dependence of bottleneck capacity on width:

linear or stepwise??

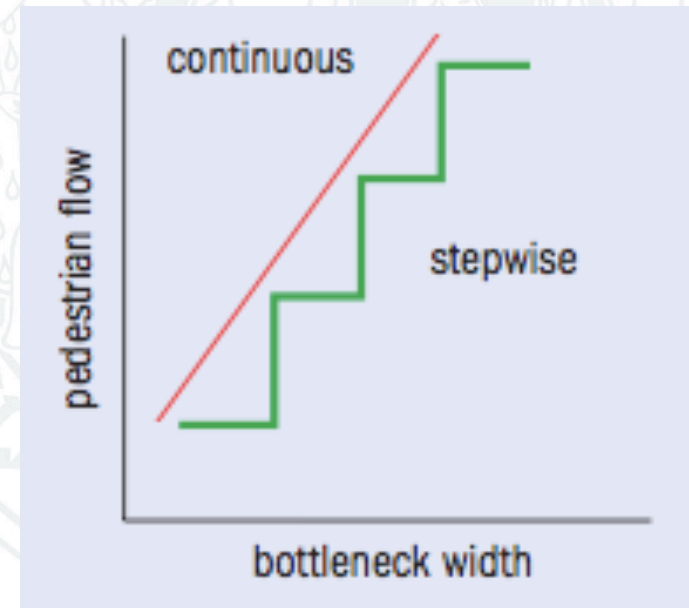
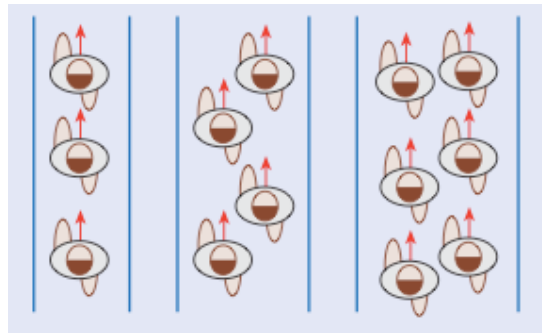


# Bottleneck flow

stepwise:



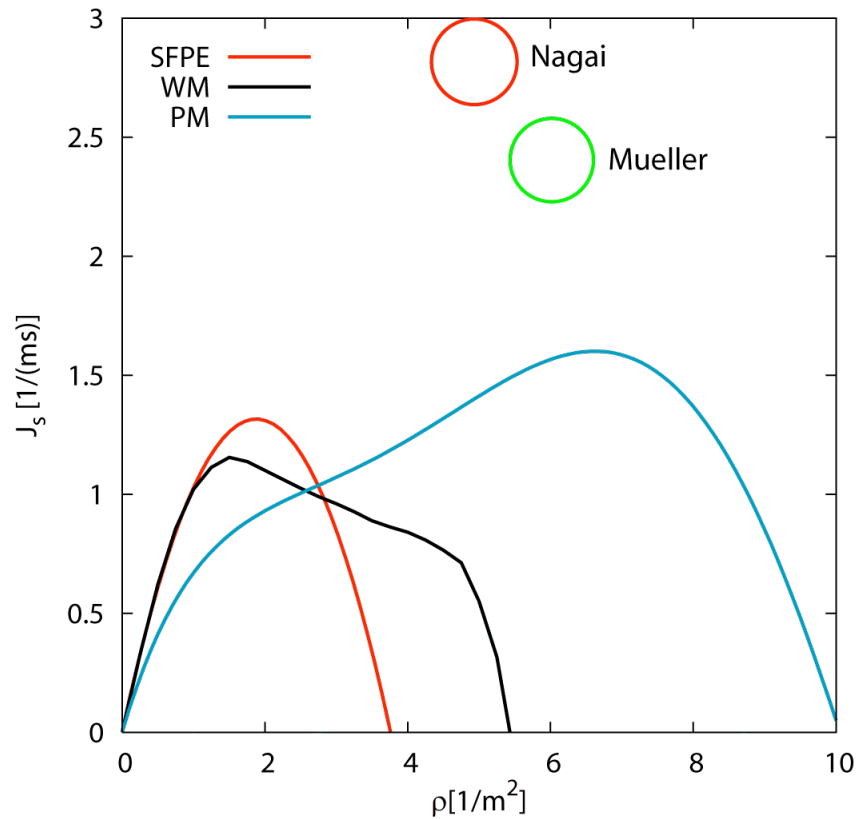
linear:



„zipper effect“



# Bottleneck flow



**Bottleneck flows significantly larger than maximum of fundamental diagram !!**

**→ “contradiction” with physics !!**

**Origin of this surprising result?**

- **finite-size effects**
- **fluctuations**
- **non-stationary flow**
- **psychology**



# Evacuation and motivation



(K. Nishinari)

- evacuation times for different
- motivation levels (cooperative vs. competitive)
  - exit widths

surprising result:  
for narrow exits  
cooperation is better!!!

# Modeling



# Modeling approaches

## Classification of models:

- **description:** microscopic  $\leftrightarrow$  macroscopic
- **dynamics:** stochastic  $\leftrightarrow$  deterministic
- **variables:** discrete  $\leftrightarrow$  continuous
- **interactions:** rule-based  $\leftrightarrow$  force-based
- **fidelity:** high  $\leftrightarrow$  low
- **concept:** heuristic  $\leftrightarrow$  first principles



# Rule-based vs. force-based

## rule-based dynamics:

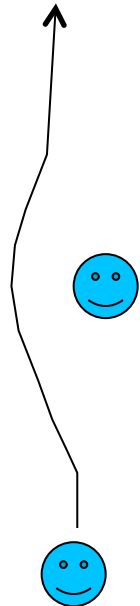
- pedestrians make decisions on basis of current state (in some neighbourhood)
- intuitive consideration of psychological effects
- often stochastic





# Rule-based vs. force-based

presence of other persons leads to changes in direction of motion (acceleration) → forces



- **social forces**  $f_{jk}^{(soc)}$ 
  - repulsive (“private sphere”)
  - violate Newton’s 3. law (“actio = reactio”)
- **physical forces**  $f_{jk}^{(phys)}$ 
  - friction
  - elastic forces



# Rule-based vs. force-based

- **Social-force model: continuous** (Helbing/Molnar, 1995)
- **Newtonian equations of motion with**

$$\mathbf{f}_{jk} = \mathbf{f}_{jk}^{(\text{soc})} + \mathbf{f}_{jk}^{(\text{phys})}$$

- **social forces:  $\mathbf{f}_{jk}^{(\text{soc})} \propto \exp(-r_{jk}/\xi)$**
- **$O(N^2)$  interactions (“molecular dynamics”)**
- **forces often „cut off“**



# Hydrodynamic models



analogy with streamlines

“exotic fluid”

macroscopic model

Navier-Stokes-type equations with driving term

$$\frac{v_0 - v}{\tau}$$

relaxation towards “desired velocity”



# Cellular automata models

- **Cellular automata:** discrete in space, time, state variable
- generically: stochastic, rule-based dynamics
- Space divided into cells (40\*40 cm<sup>2</sup>)
- Exclusion principle: at most one pedestrian per cell
- **Discrete time:** parallel (synchronous) dynamics
  - natural timescale
  - calibration and quantitative predications possible!!

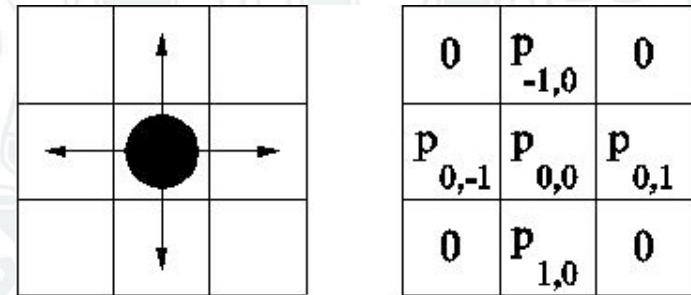


# Transition probabilities

stochastic dynamics:

transition probability  $p_{ij}$  in direction  $(i,j)$

depend on the occupation of  
neighbouring cells



# Types of interactions

Behaviour of pedestrians determined by

- route choice
- person – person interactions
- person – infrastructure interactions

incorporate all interactions in unified way ?



# Floor Field Cellular Automaton

- **Floor field CA**: stochastic model, defined by transition probabilities, only local interactions
- reproduces collective effects (e.g. lane formation)

Interaction: virtual chemotaxis (not measurable!)

dynamic + static floor fields

interaction with pedestrians and infrastructure



# Floor Field Model

Burstedde, Klauck, Schadschneider,  
Zittartz 2001; Schadschneider 2001

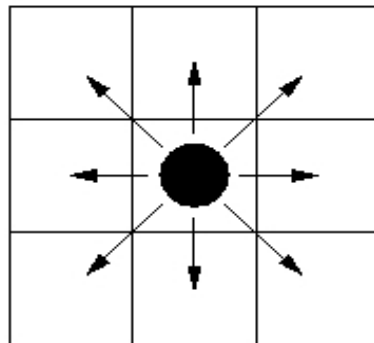
- **Free motion:** specified by average velocity  $v$
- **Floor field** = virtual field, modifies transition probabilities
- **2 types:**
  - **Dynamic floor field:** motion of pedestrians creates “pheromone trace“)
  - **Static floor field:** determined by infrastructure

**General principle:** motion into direction of larger fields is preferred





# Matrix of Preferences

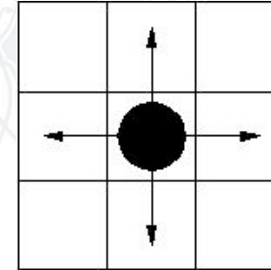


$M_{-1,-1}$	$M_{-1,0}$	$M_{-1,1}$
$M_{0,-1}$	$M_{0,0}$	$M_{0,1}$
$M_{1,-1}$	$M_{1,0}$	$M_{1,1}$

- $M_{ij}$  = probability for motion in direction (i,j)
- can be expressed by measurable quantities:
  - Average velocity:  $\langle \vec{v}_i \rangle$
  - Variance:  $\sigma^2 = \langle (\vec{v}_i)^2 \rangle - \langle \vec{v}_i \rangle^2$

# Transition probabilities

Transition probability  $p_{ij}$  in direction  $(i,j)$ :



0	$p_{-1,0}$	0
$p_{0,-1}$	$p_{0,0}$	$p_{0,1}$
0	$p_{1,0}$	0

$$p_{ij} = N \cdot M_{ij} \exp(k_D D_{ij}) \exp(k_S S_{ij}) (1 - n_{ij})$$

- $M_{ij}$  = matrix of preferences (route choice, desired velocity)
- $D_{ij}$  = dynamic floor field (interaction between pedestrians)
- $S_{ij}$  = static floor field (interaction with geometry)
- $k_D, k_S$  = coupling strength
- $N$  = normalization ( $\sum p_{ij} = 1$ )

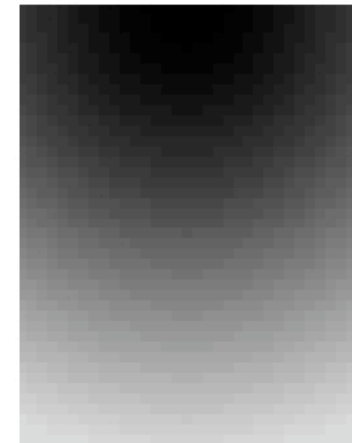
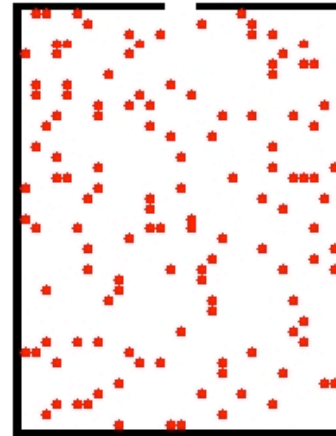
# Dynamic Floor Field

- Motion increases field strength in starting cell
- pedestrians change dynamic field
- motion creates a **trace**
- Dynamic floor field has dynamics:  
**diffusion** + **decay**
- → **broadening** and **dilution** of trace



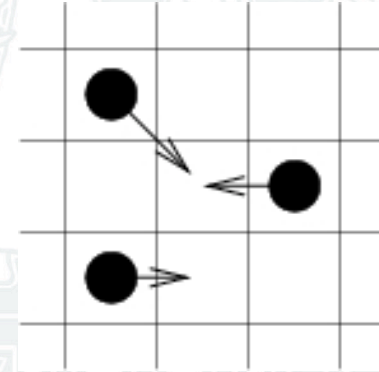
# Static Floor Field

- Not influenced by pedestrians
  - no dynamics (constant in time)
  - modelling of influence of infrastructure
- 
- Example: Ballroom with one exit



# Conflicts

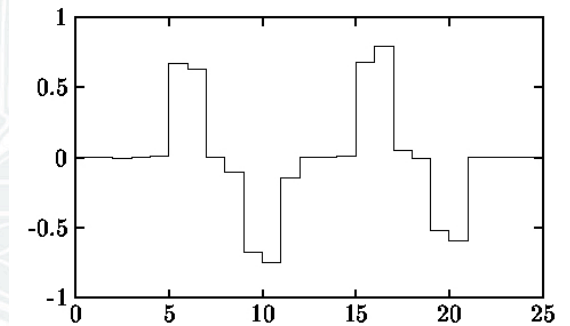
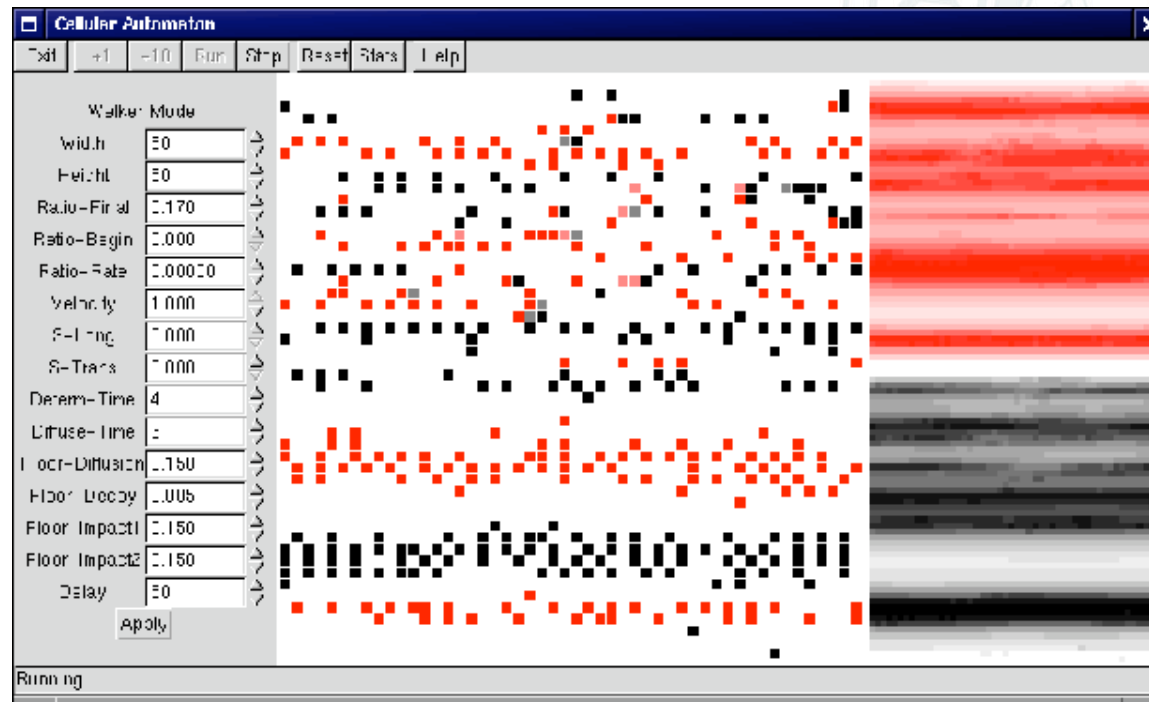
**Conflict:** 2 or more pedestrians choose the same target cell



- Consequence of discreteness in space and time!!
- Conflicts have to be **resolved** in some way



# Lane formation in FF model



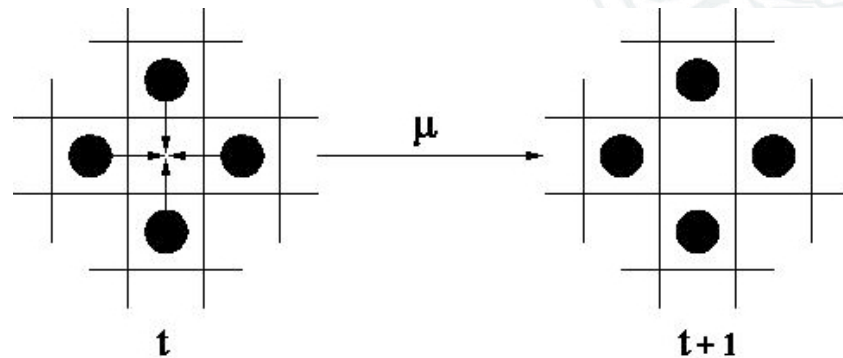
velocity profile



# Friction

**Conflict:** 2 or more pedestrians choose the same target cell

**Friction:** not all conflicts are resolved!



friction constant  $\mu$  = probability that no one moves

# Artefact or Real Effect ?

- conflicts reduce efficiency of simulations
- sometimes avoided by special update choice
- However: **Conflicts** and **friction** correspond to **real effects**, e.g. physical contact, moment of hesitation

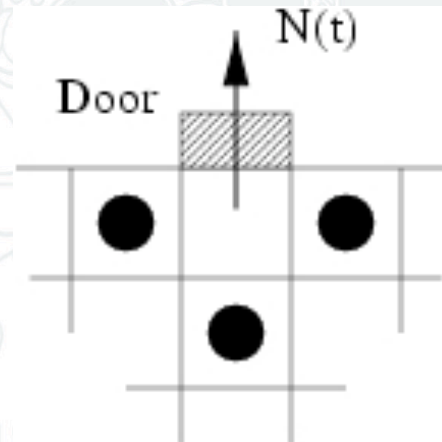
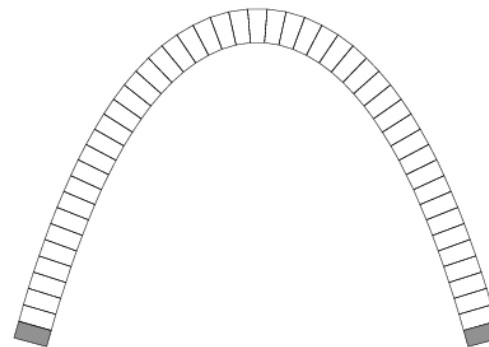




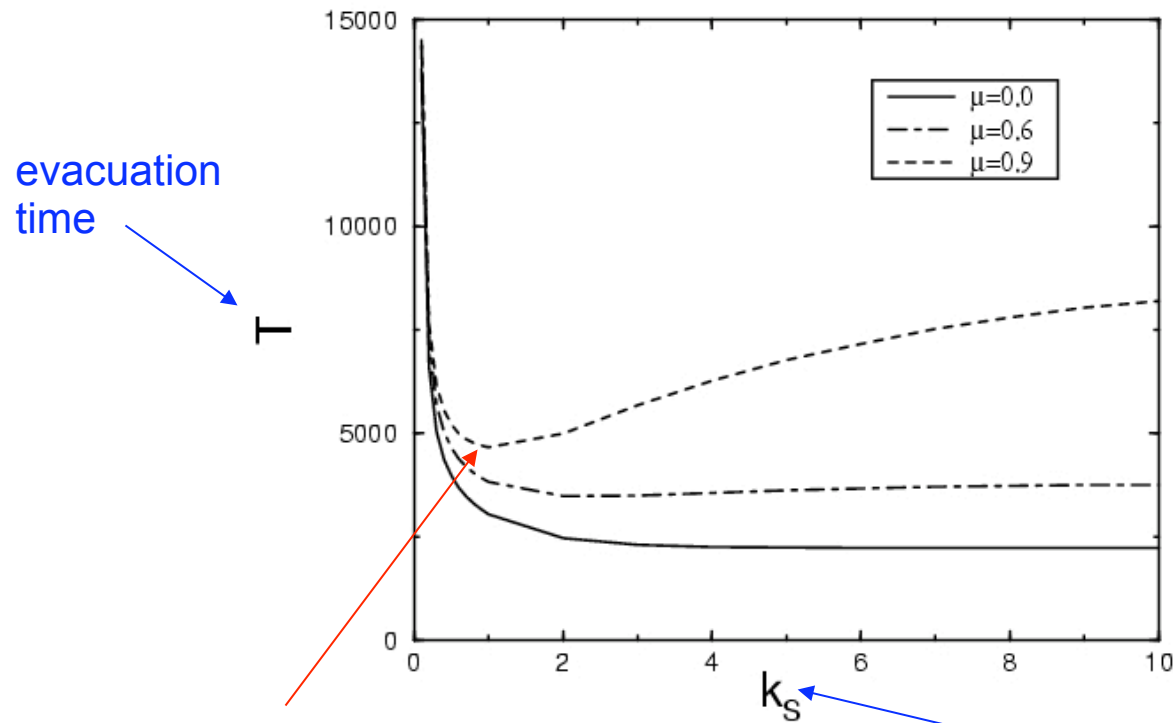
# Friction at Exits

“Friction” at exits increases evacuation times by reducing the outflow

Granular materials:  
**Arching**



# Evacuation Scenario With Friction Effects



(Kirchner, Nishinari, Schadschneider 2003)

Faster-is-slower effect

effective velocity



# Evacuation and motivation

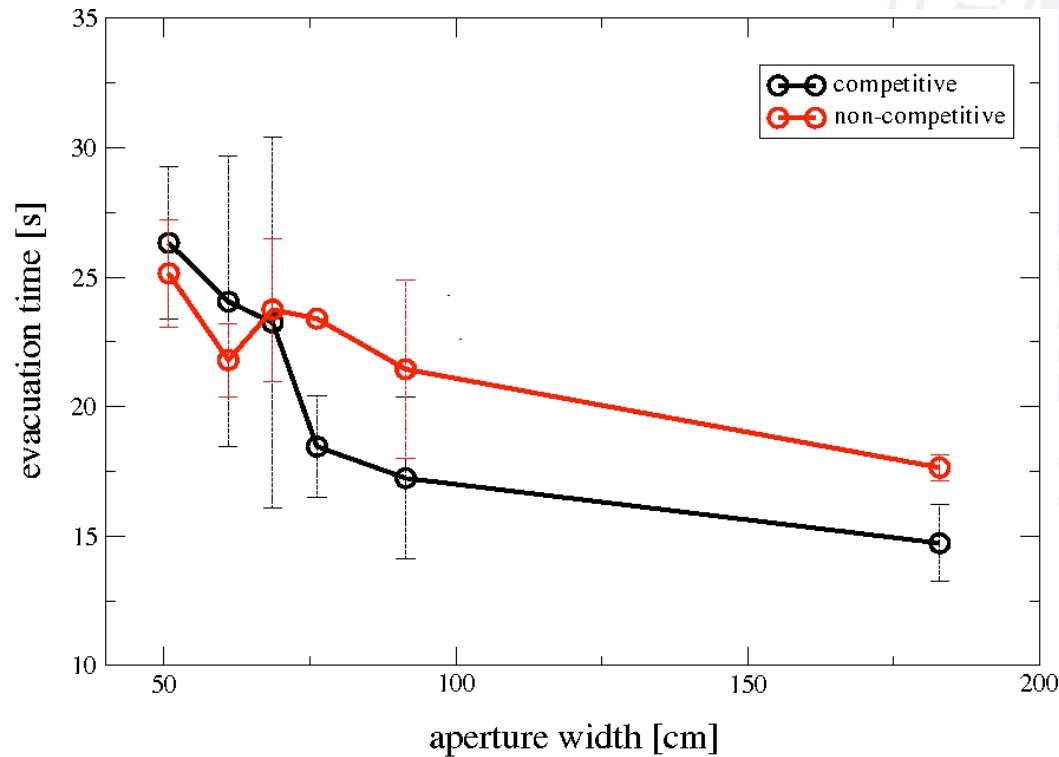


(K. Nishinari)

- evacuation times for different
- motivation levels (cooperative vs. competitive)
- exit widths

surprising result:  
for narrow exits  
cooperation is better!!!

# Experiments: Egress from airplane



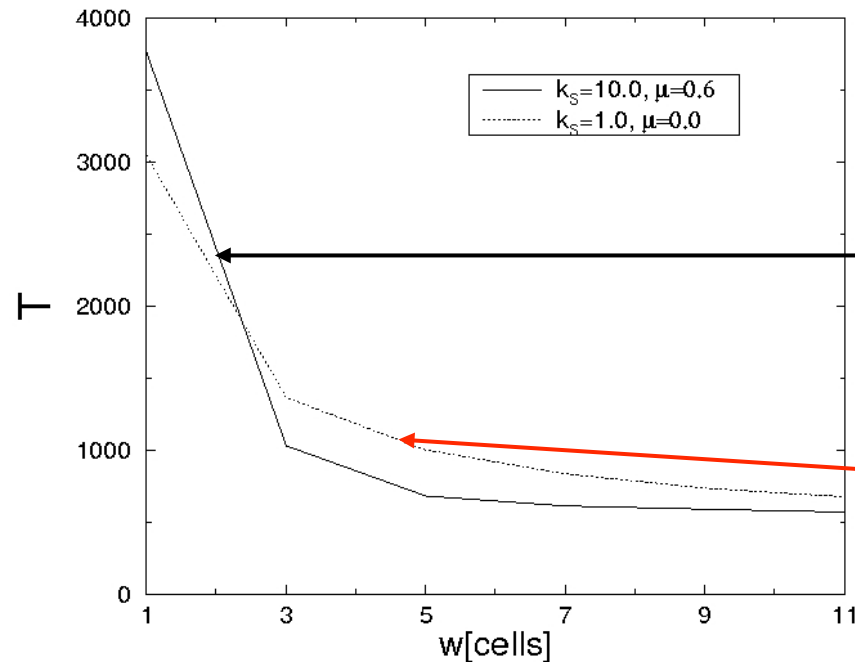
$T_{\text{comp}} > T_{\text{coop}}$  for  $w < w_c$

$T_{\text{comp}} < T_{\text{coop}}$  for  $w > w_c$

(Muir/Bottomley,/Marisson, 1996)



# Model Approach



- **Competitive behaviour:**
  - large  $k_s$  + large friction  $\mu$
- **Cooperative behaviour:**
  - small  $k_s$  + no friction  $\mu=0$

(Kirchner, Klüpfel, Nishinari, Schadschneider, Schreckenberg 2003)



# Empirics II



# Experiments

status of empirical results unsatisfactory

large-scale laboratory experiments (more than 300 persons) performed at

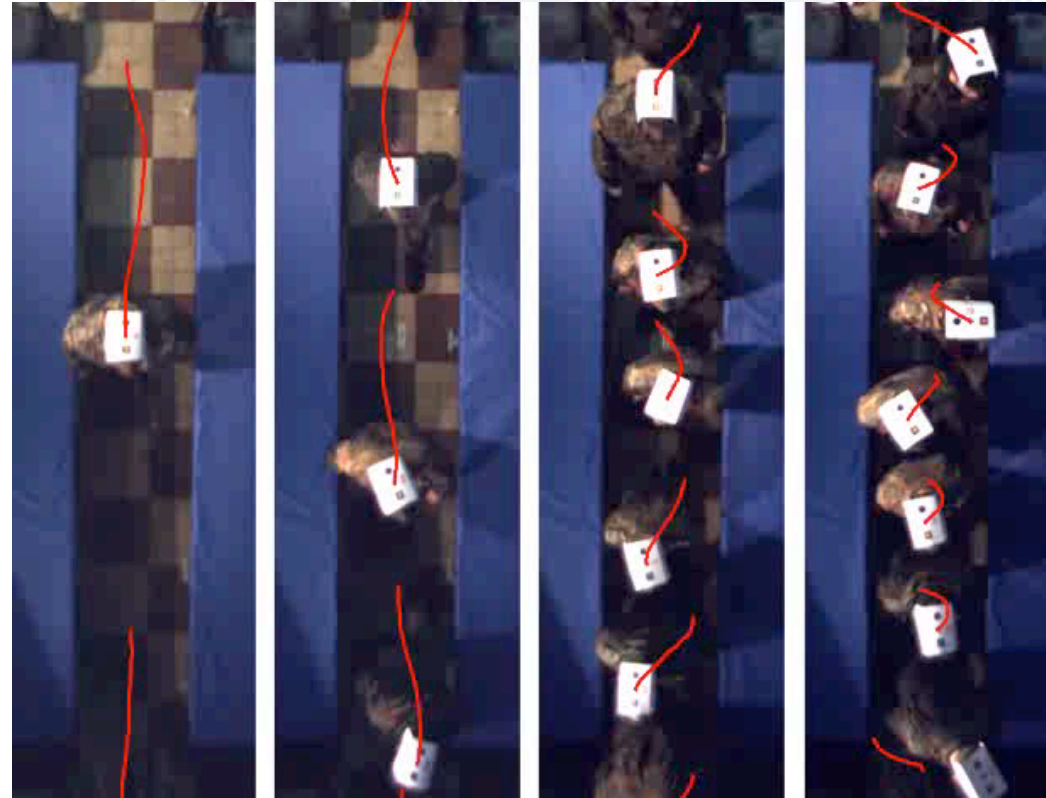
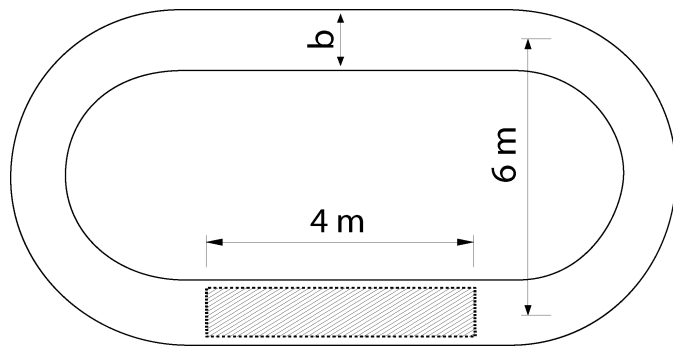
- Bergische Kaserne Düsseldorf
- Düsseldorf exhibition center
- Esprit Arena Düsseldorf

organized by FZ Jülich and Wuppertal University



# Experiments: Fundamental diagram

corridor, periodic



N=14

N=25

N=39

N=56



Wuppertal University



FZ Jülich

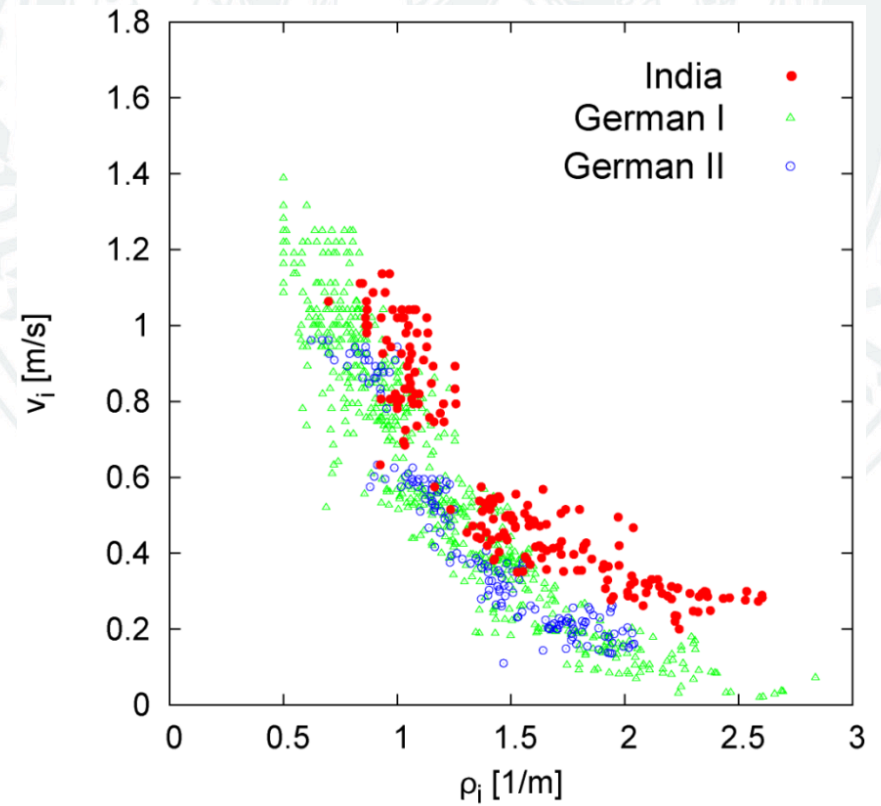
Universität zu Köln





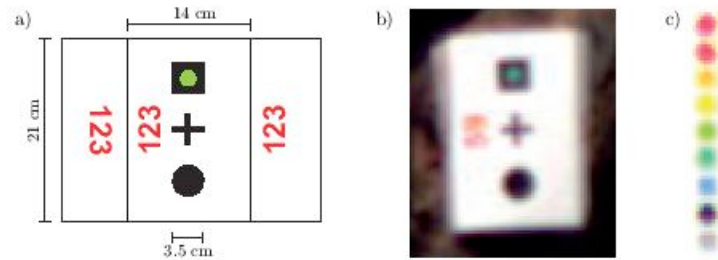
# Influence of culture

## India vs. Germany

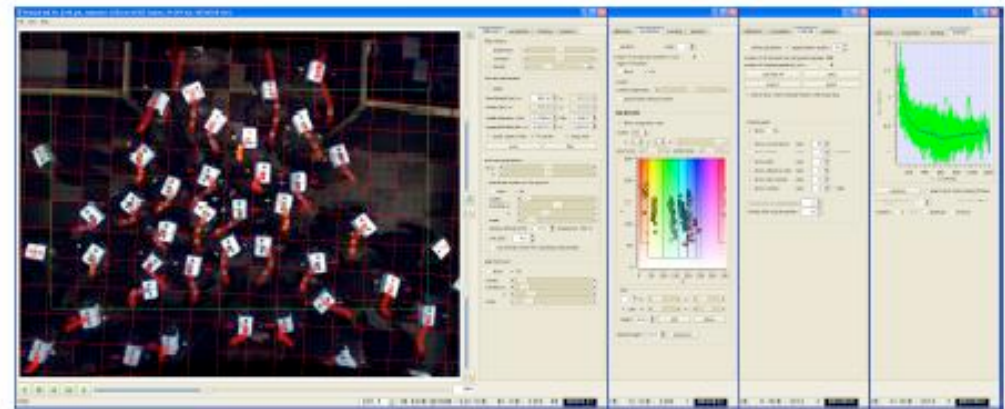


# Automated video analysis

automated determination of trajectories from video



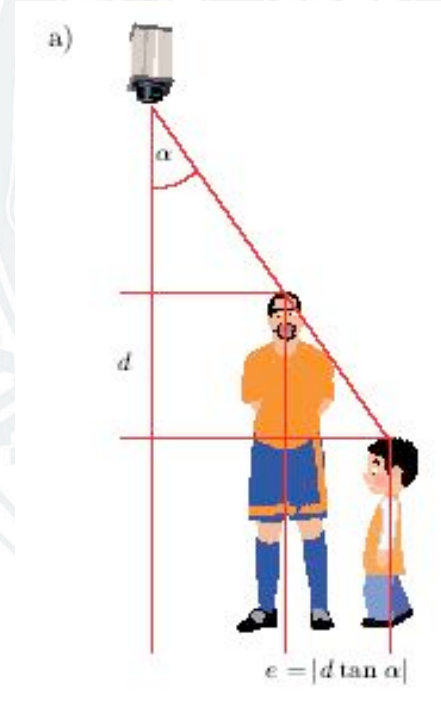
pasteboard for detection and height correction



PeTrack: software tool for video analysis (M. Boltes, FZ Jülich)



# Automated video analysis



# Bottlenecks



(University Wuppertal, FZ Jülich)

# Bottleneck

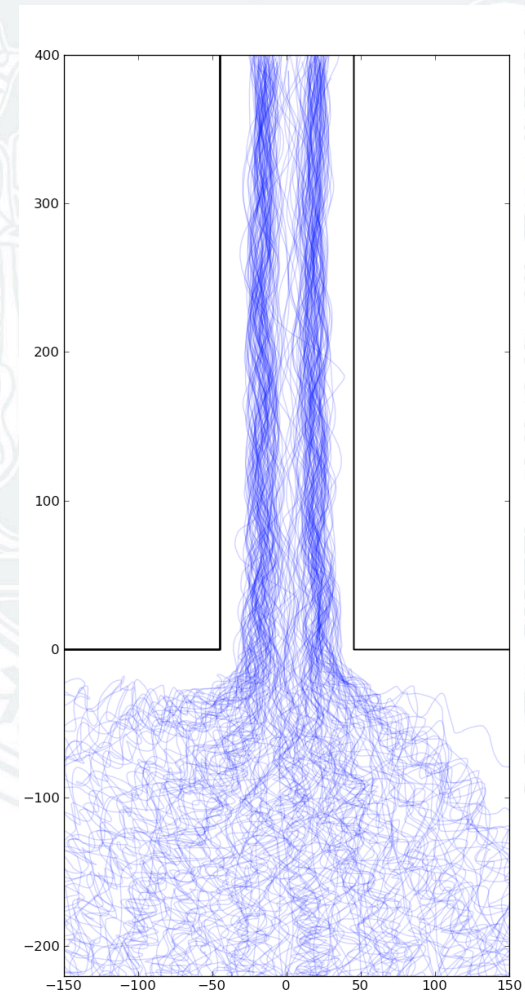
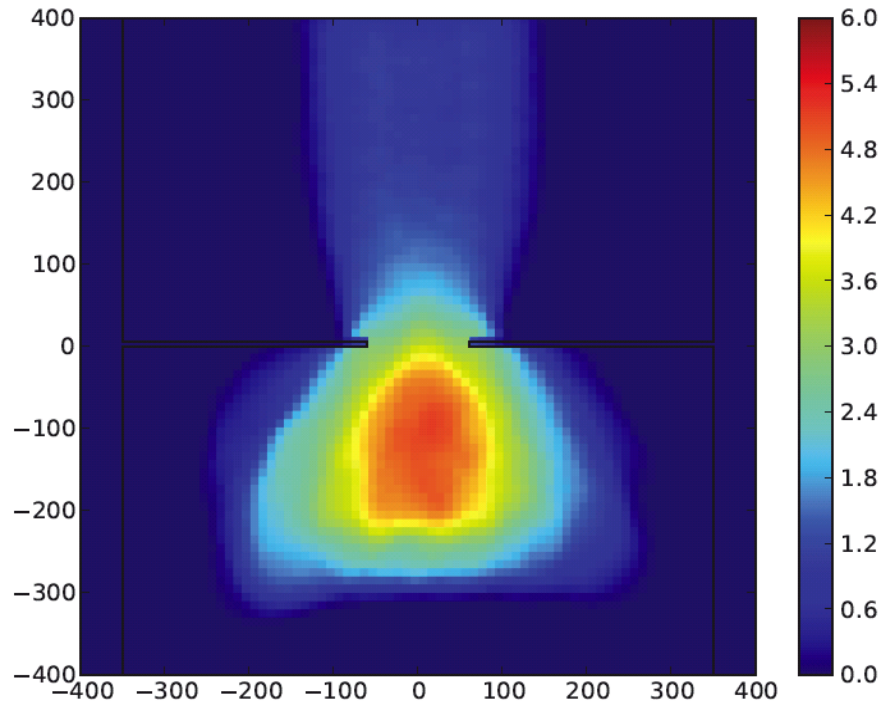
## Densities via Voronoi diagram



$$\rho_{\text{Voronoi}} = \frac{\int_A p(\vec{x}) d\vec{x}}{|A|} \quad \text{mit} \quad p(\vec{x}) = \begin{cases} 1/A_i & : \vec{x} \in A_i \\ 0 & : \text{else} \end{cases}$$



# Bottleneck



# HERMES



# Hermes project



cooperation between

- police and fire department Düsseldorf
- Esprit Arena Düsseldorf
- University of Cologne, Bonn and Wuppertal
- Jülich Supercomputing Centre
- several industrial partners
- sponsored by BMBF



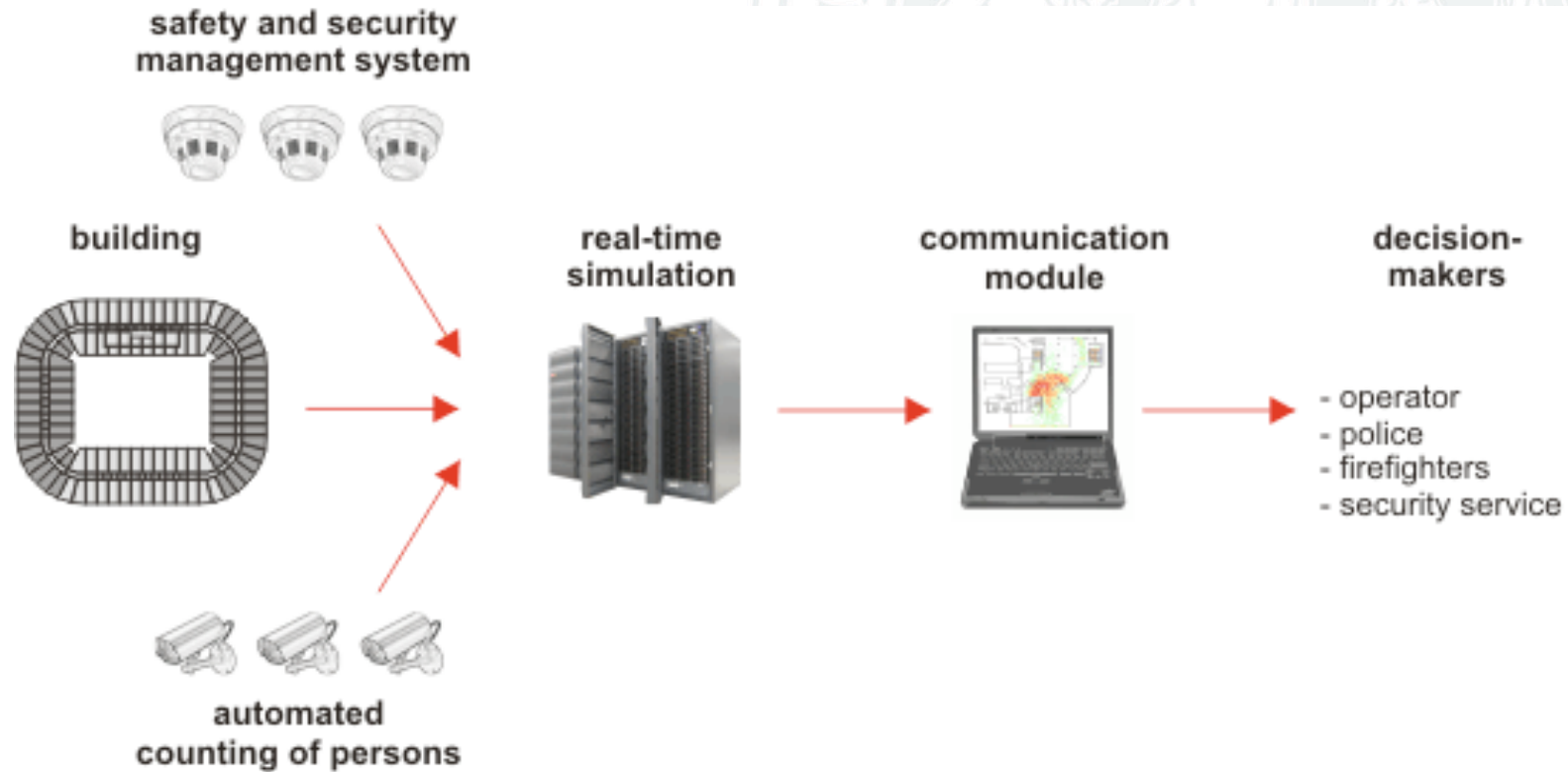


# Esprit Arena, Düsseldorf



*multifunctional arena (66 000 spectators)*  
**site of Eurovision Song Contest 2011**

# Evacuation assistant



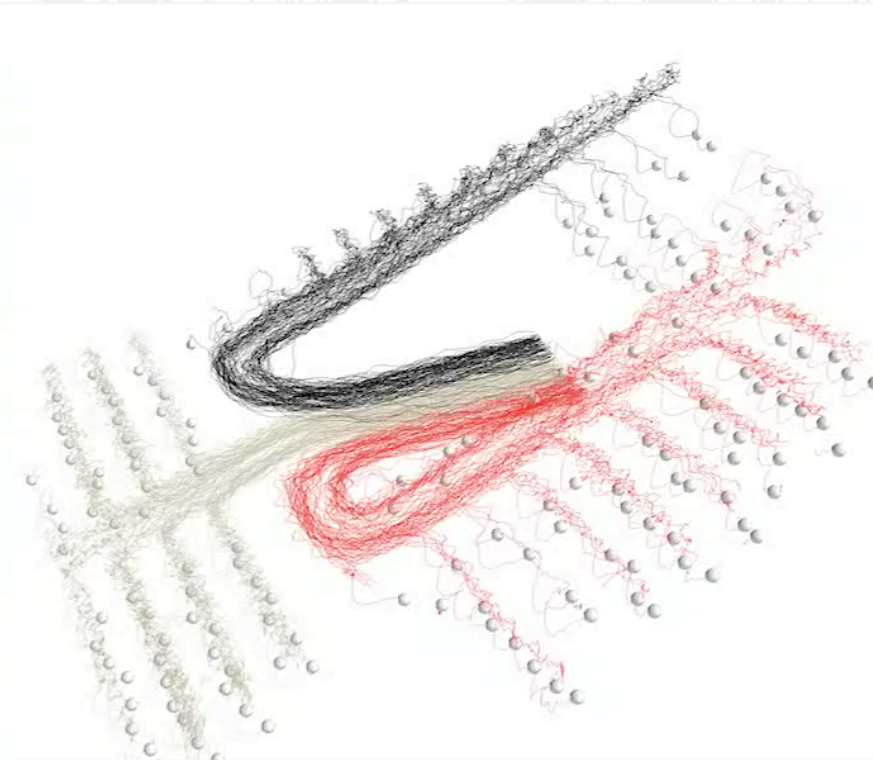
# Hermes Evacuation Assistant



cameras for counting  
provide “initial condition”  
for simulation



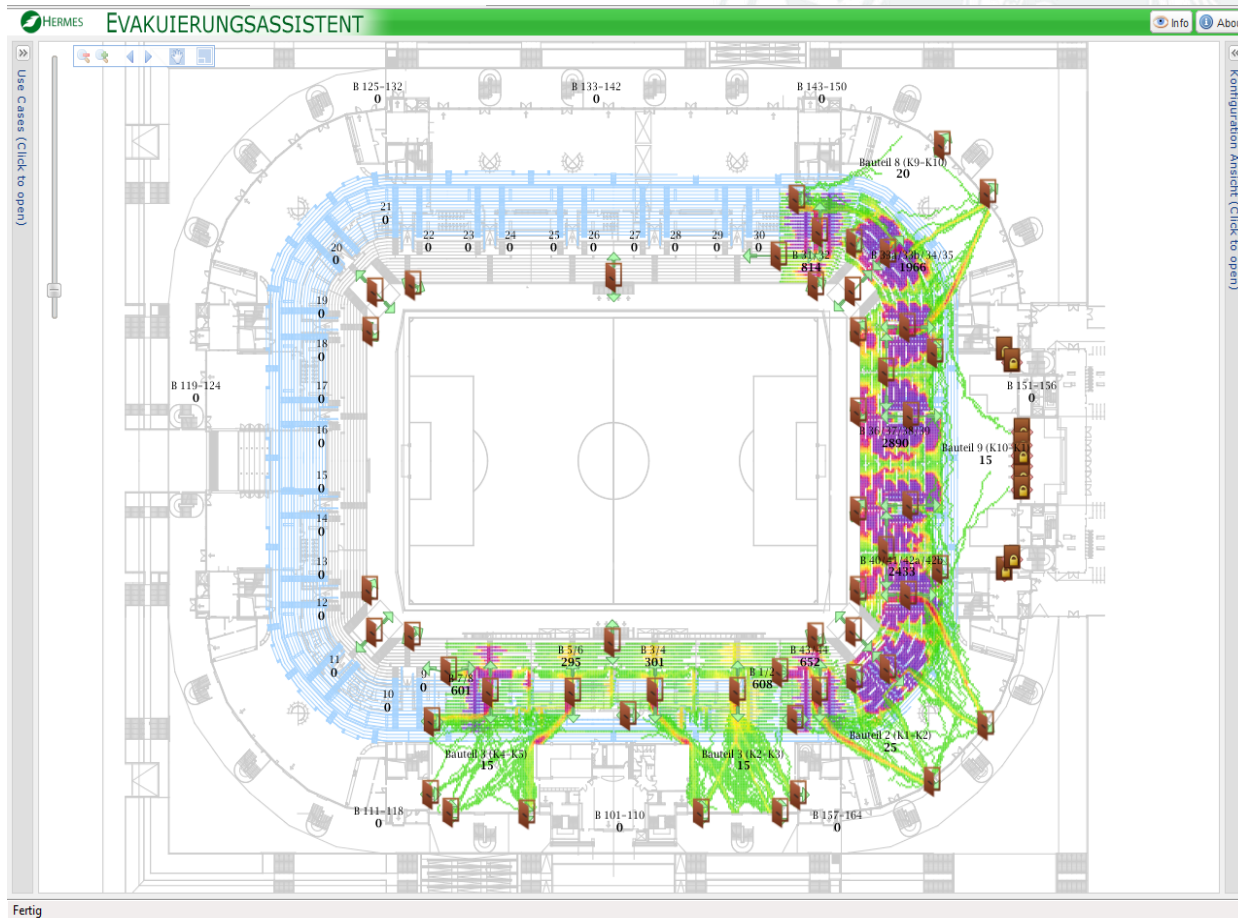
# Esprit Arena: Experiment



(M. Boltes)



# Communication Modul



# The deterministic limit of pedestrian dynamics!

