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# Twotype multiagent game for egress congestion

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# Evacuation simulations

- Crowd evacuating through narrow bottlenecks creates clogging and jams that slow down the egress flow.
- Pushing towards the exit creates **faster-is-slower effect**.
- We present a spatial game to model the interaction of agents in such situations.
- Our model explains the origin of panic.
- We apply the game model to a continuous time egress simulation FDS+Evac  
([http://virtual.vtt.fi/virtual/proj6/fdsevac/documents/FDS+Evac\\_textbased\\_homepage.txt](http://virtual.vtt.fi/virtual/proj6/fdsevac/documents/FDS+Evac_textbased_homepage.txt)).

# Previous research

- Evacuation experiments and computer simulations: S. P. Hoogendorn et al., 2005; Heliövaara et al., 2012; D. Helbing et al., 2000; A. Kirchner et al. 2003.
- Social psychology of panic: A. Mintz, 1951.
- Prisoner's Dilemma (PD) game: R. Brown, 1965; J. S. Coleman, 1990.
- Spatial games and computation: M. A. Nowak et al., 1992; M. Sysi-Aho et al., 2005; Heliövaara et al., 2013; von Schantz et al., 2015.
- Biological evolution and games: J. Maynard Smith, 1982.

# Game matrix for agent-agent interaction

- Estimated evacuation time of agent  $i$ :

$T_i = \frac{\lambda_i}{\beta}$ . Denote  $T_{ij} = (T_i + T_j)/2$ .

Available safe egress time (ASET):  $T_{ASET}$

Cost function:  $u(T_i; T_{ASET})$

Players' strategies: Patient, Impatient

The rules of the game:

- An impatient agent  $i$  can overtake its patient neighbor  $j \Rightarrow$  the cost of agent  $i$  decreases by  $\Delta u(T_{ij}) \simeq u'(T_{ij})\Delta T$ .
- Two patient agents do not interact with each other  $\Rightarrow$  their costs do not change.
- Two impatient agents, neither can overtake the other. Instead they will face a conflict with equal chance of getting injured  $\Rightarrow$  Cost of conflict  $C\Delta T$ .

Game matrix to be minimized:

		Player 2	
		Impatiens	Patient
Player 1	Impatiens	$\frac{c}{\Delta u(T_{ij})}, \frac{c}{\Delta u(T_{ij})}$	$-1, 1$
	Patient	$1, -1$	$0, 0$

The game to be played:

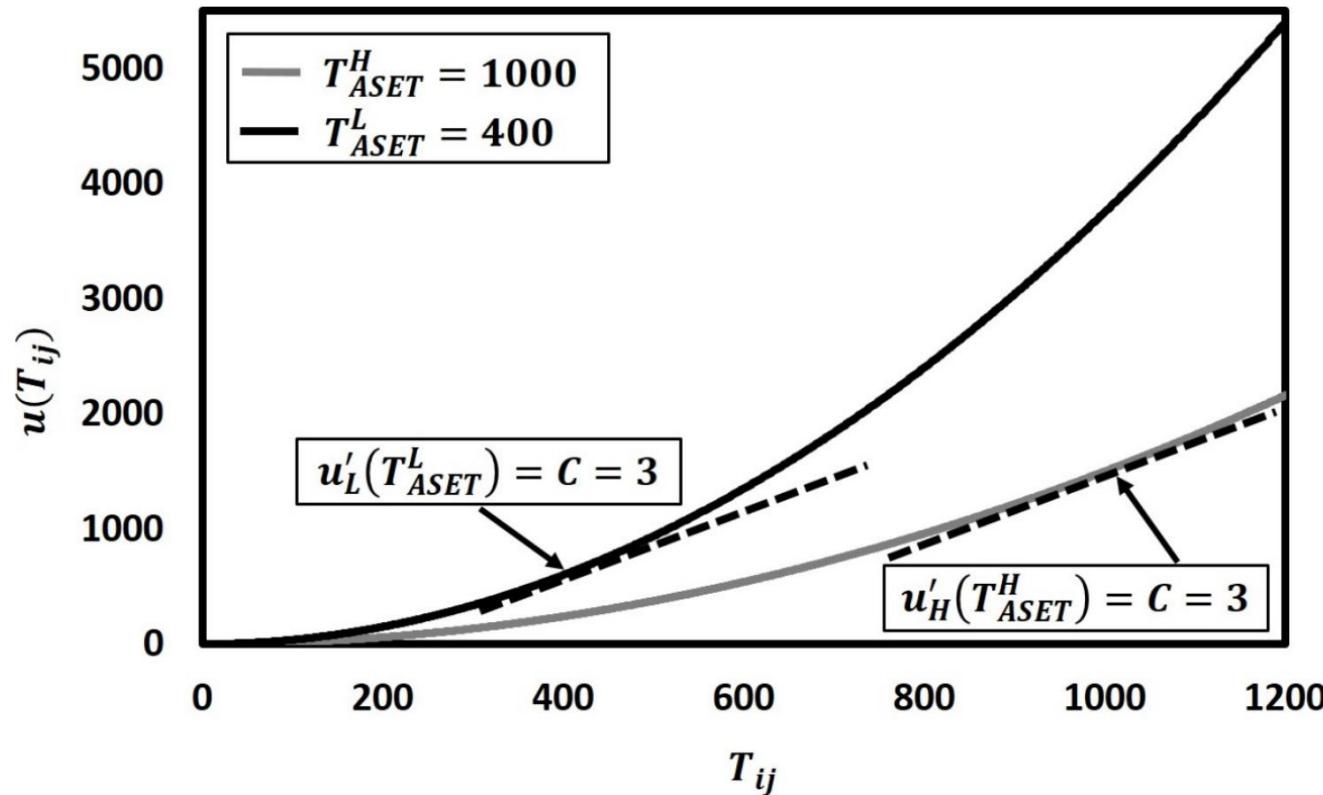
- (i) prisoner's dilemma (PD) if  $0 < \frac{c}{\Delta u(T_{ij})} \leq 1$ ,
- (ii) hawk-dove (HD) if  $\frac{c}{\Delta u(T_{ij})} > 1$ .

Convex cost function:

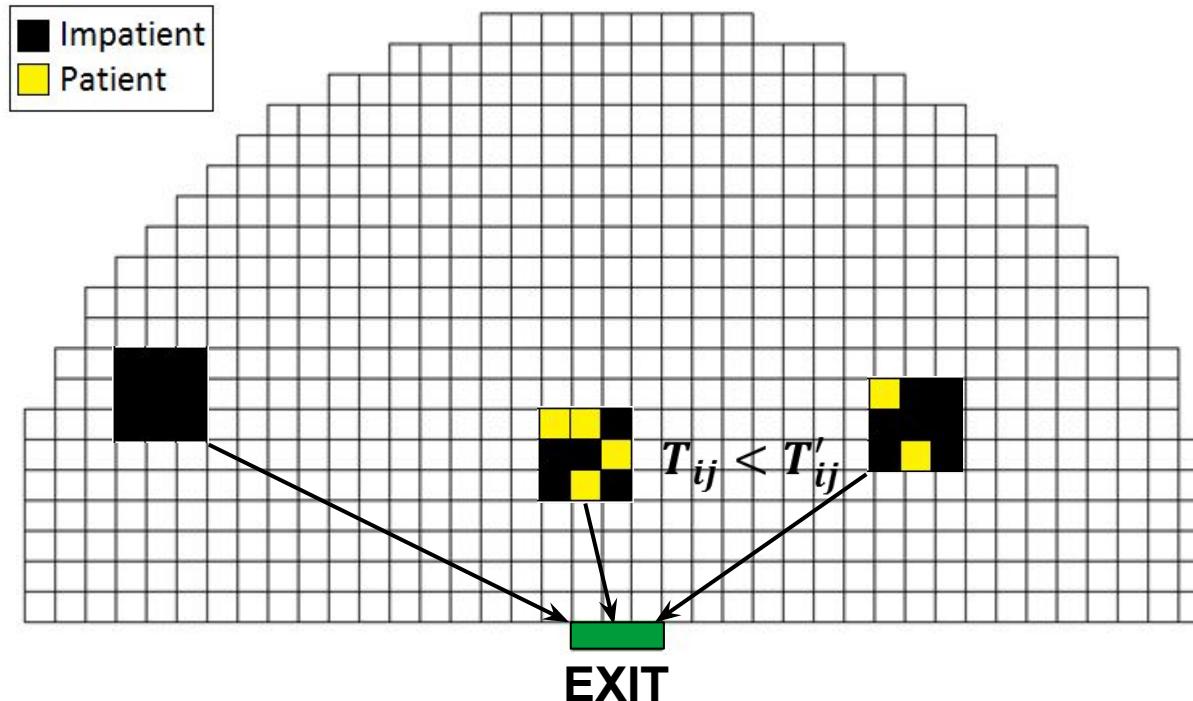
		Player 2	
		Impatiens	Patiens
Player 1	Impatiens	$t, \frac{T_{ASET}}{T_{ij}}, \frac{T_{ASET}}{T_{ij}}$	$t, -1, 1$
	Patiens	$1, -1$	$0, 0$

- Assume  $u(T_{ij}) = \frac{CT_{ij}^2}{2T_{ASET}}$ , if  $T_{ij} \geq 0$ ;  $u(T_{ij}) = 0$ ; if  $T_{ij} < 0$ , and  $u'(T_{ASET}) = C$ .

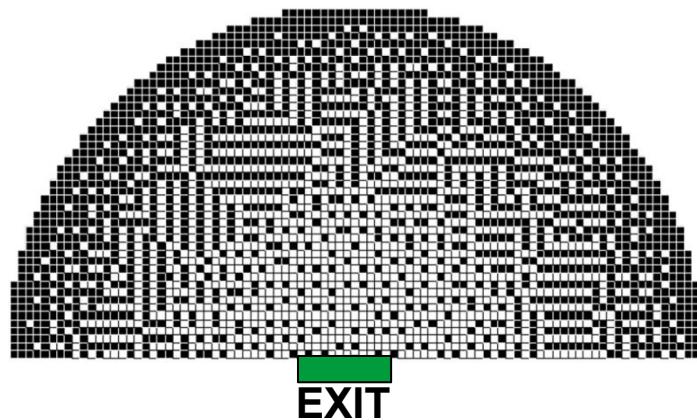
## Convex cost function:



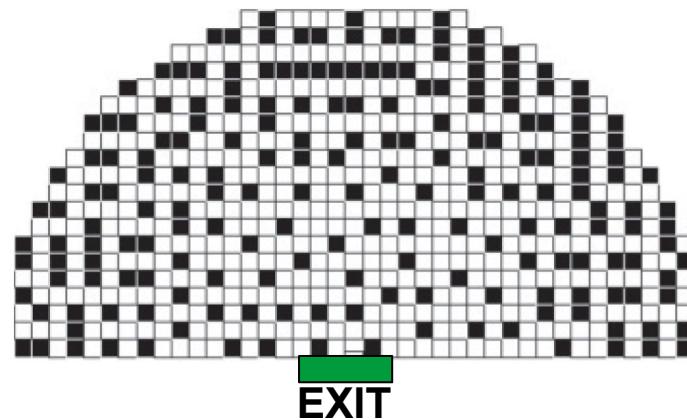
# Spatial setting, BR-dynamics, and shuffle update rule



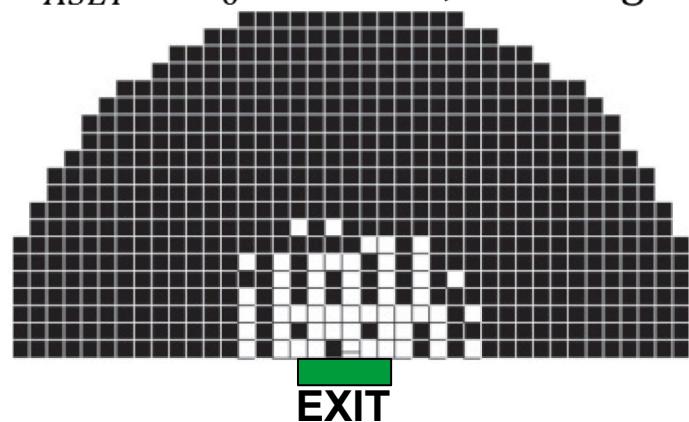
# Equilibria in discrete grid



$T_{ASET} = T_0 = 2800\text{ s}$ , 3180 agents

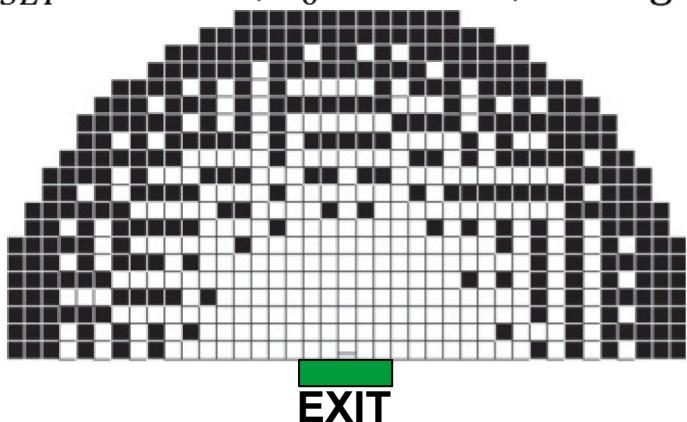


$T_{ASET} = 1500\text{ s}$ ,  $T_0 = 1500\text{ s}$ , 628 agents



$T_{ASET} = 100\text{ s}$ ,  $T_0 = 100\text{ s}$ , 628 agents

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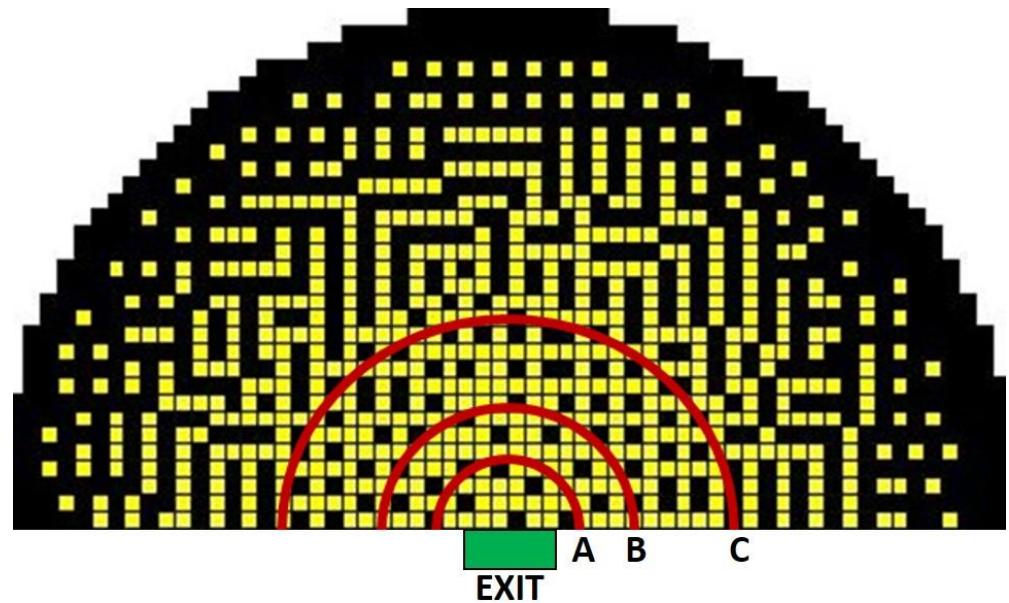


$T_{ASET} = 500\text{ s}$ ,  $T_0 = 400\text{ s}$ , 628 agents

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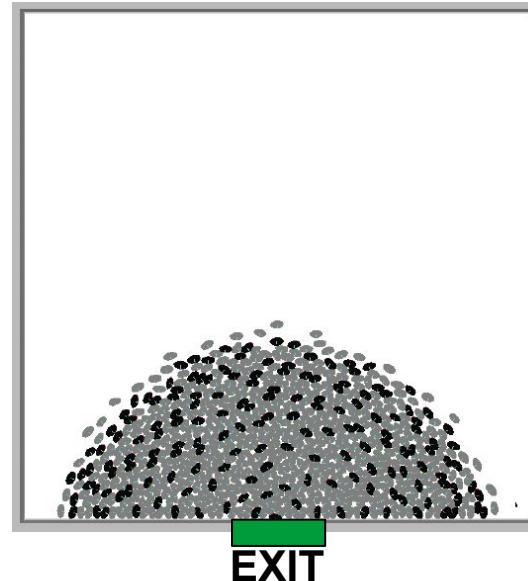
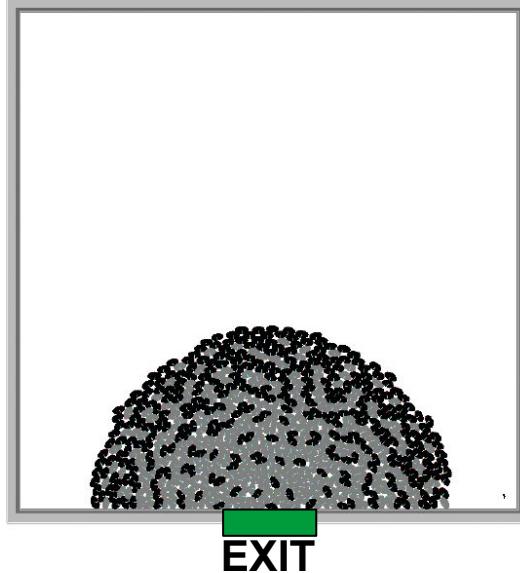
# Evolutionary Stable Strategy, ESS

- Among the semicircles A, B, C, the number of impatient agents in the Moore neighborhood of agents are at most 1,2,4, respectively.
- The proportion of impatient agents along a semicircle approximates the ESS of the game at that distance.
- For the proportion of impatient agents in the Moore neighborhood of agent  $i$  it holds, 
$$\frac{|N_i^{Imp}|}{|N_i|} \leq \frac{T_i}{T_{ASET}}.$$



$$T_{ASET} = T_0 = 1000 \text{ s, } 1413 \text{ agents}$$

# Equilibria in continuous space: FDS+Evac simulations

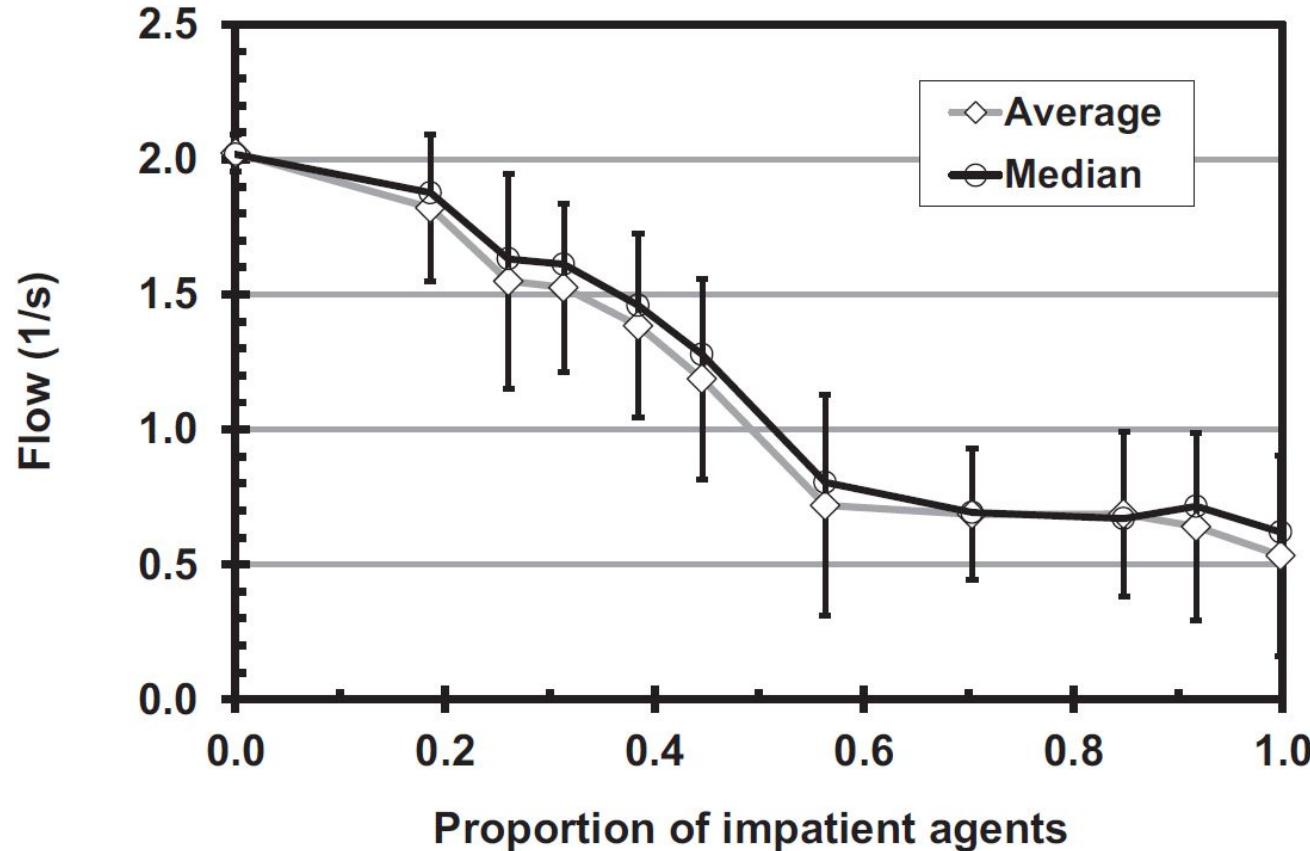


$T_{ASET} = 500s, T_0 = 500s$ , 628 agents

$T_{ASET} = 1500s, T_0 = 1500s$ , 628 agents

- Impatient agents: do not avoid contacts with other agents; accelerate faster to their target velocity; move more nervously.

# Faster-is-slower effect



# Cellular automaton model, CA (A. Kirchner et al., 2003)

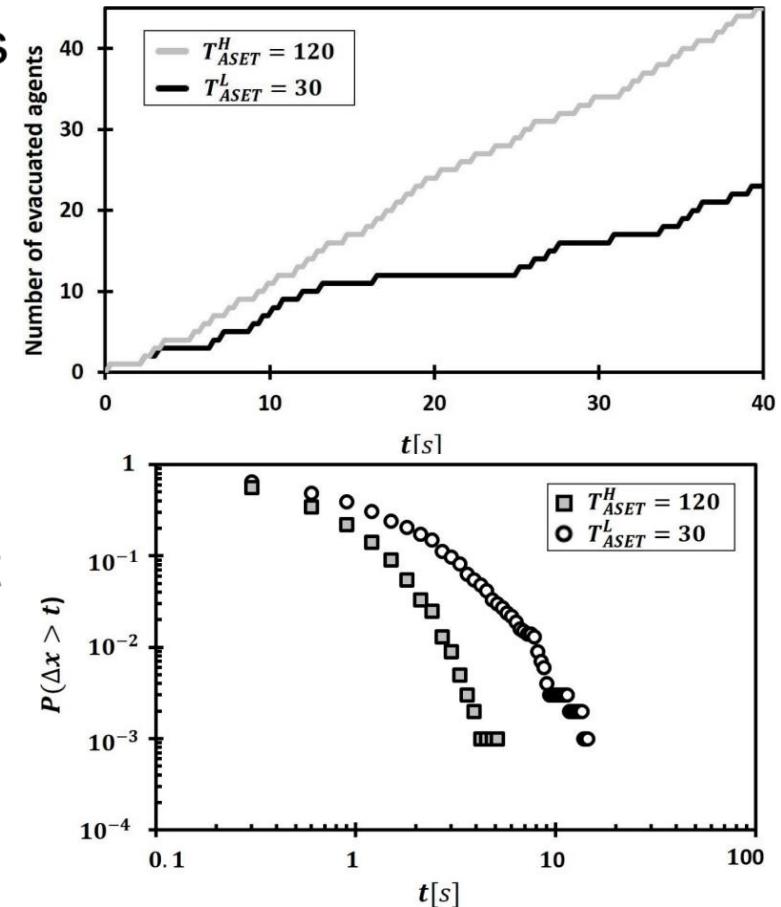
- Agents are located in the cells of a discrete square grid, and they move according to transition probabilities that depend on static and dynamic floor fields.
- If several agents try to move simultaneously to the same cell, the agent allowed to move is determined randomly.
- The spatial game is coupled to the CA by setting the agents to play against the agents in their Moore neighborhood.
- Various strategies correspond to different movement in the grid. Impatient agents rush to the exit, patient agents don't rush.
- Produces qualitatively similar results as FDS+Evac, however is computationally lighter ( $O(M)$  vs.  $O(M^2)$ )

# Equilibrium of the twotype game

- Equilibrium configuration for a crowd with only high  $T_{ASET}$  agents (i), a crowd with only low  $T_{ASET}$  agents (ii), and a crowd with 50% high  $T_{ASET}$  agents and 50% low  $T_{ASET}$  agents (iii).
- Merging low  $T_{ASET}$  agents in the crowd forces high  $T_{ASET}$  agents to play Patient (the yellow area of (iii)).

# Irregular succession of evacuated agents

- The number of evacuated agents increase in an irregular stepwise manner in time.
- Typical for real crowds. It's a result of human arches forming and breaking down.
- The complementary cumulative frequency distribution shows that time lapses  $\Delta x$  between consecutive evacuated agents are longer for low  $T_{ASET}$  agents than for high  $T_{ASET}$  agents.

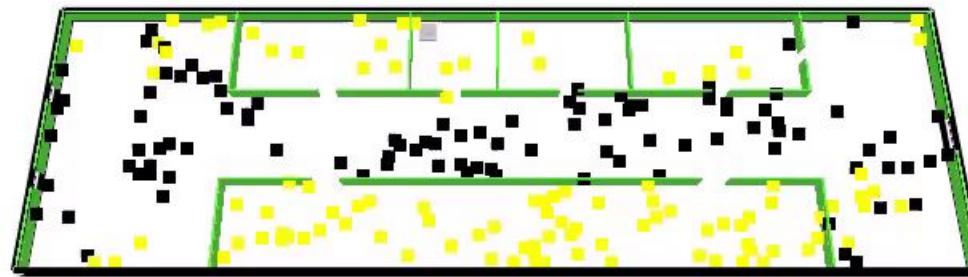


# Conclusions

- Spatial game model describes when, why and how the crowd members adopt impatient pushing behavior.
- FDS+Evac simulation software is based on physics  $\Rightarrow$  simulations too heavy.
- We study the embedding of our spatial game model to the CA-model developed by A. Kirchner et al., 2003  $\Rightarrow$  simulation of agent flow is easy, A. von Schantz and H. Ehtamo, 2014.
- Then the incident commander could give timely and accurate instructions with a real-time model.



# Crowd evacuating from a department store



0:00:00.-5



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