

# Collective Motion of Humans in Mosh and Circle Pits at Heavy Metal Concerts<sup>1</sup>

Silverberg, J. L., Bierbaum, M., Sethna, J. P., & Cohen, I. (2013). Collective motion of humans in mosh and circle pits at heavy metal concerts. *Physical Review Letters*, 110(22)  
doi:10.1103/PhysRevLett.110.228701.

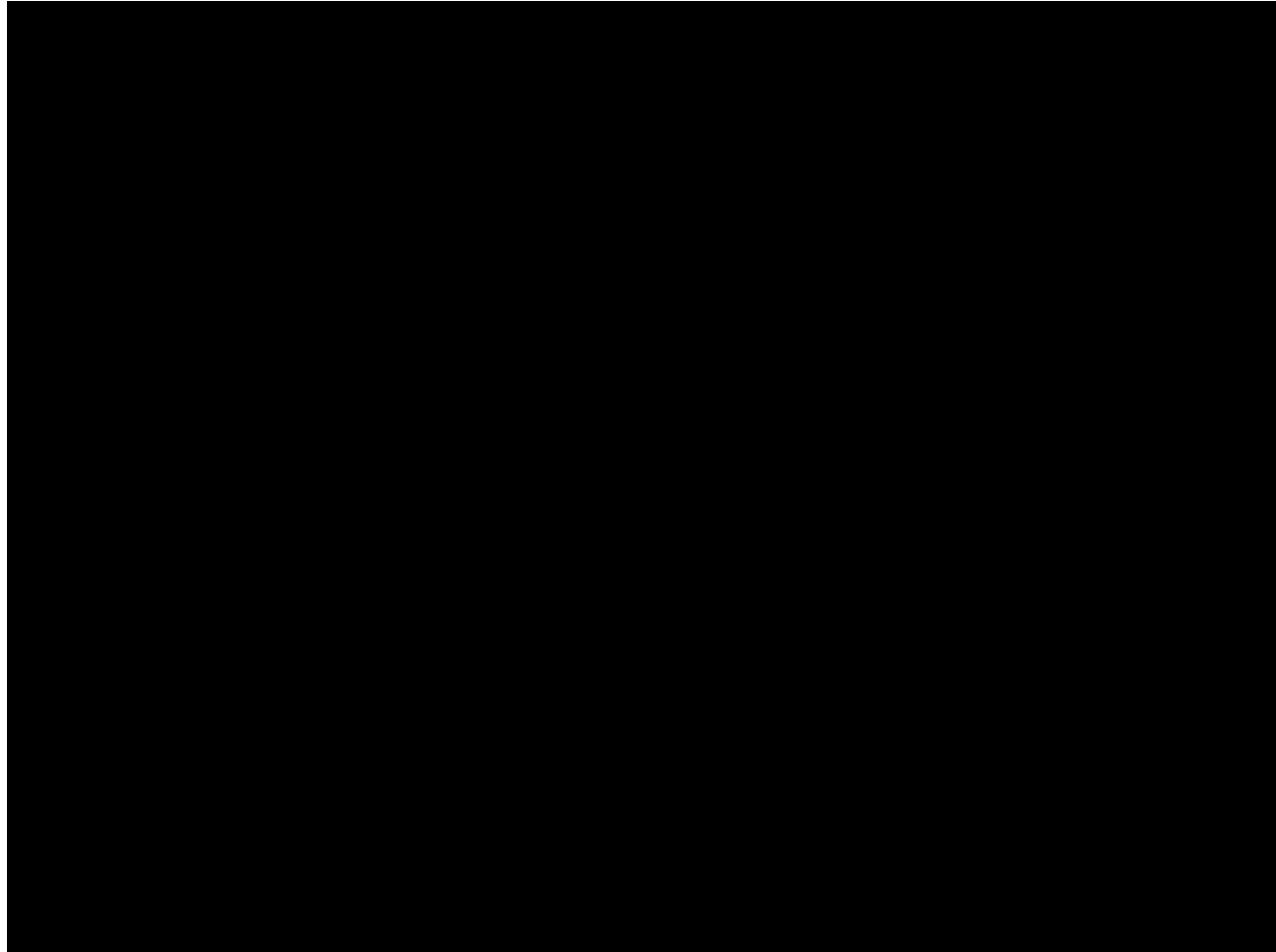


# Modeling Human Collective Behaviors

- Studying emergent behaviors in crowds not regulated by social norms
  - High-volume pedestrian traffic
  - Panicked escapes from crowded environment
- Better understanding can lead to better social engineering



What exactly is a mosh pit?



# Modeling a Mosh Pit

- Analyzed six YouTube videos of sufficient video quality
- Conducted a particle image velocimetry (PIV) analysis
- Matched data to models of interacting gaseous particles
- Conducted simulations to explore parameter space

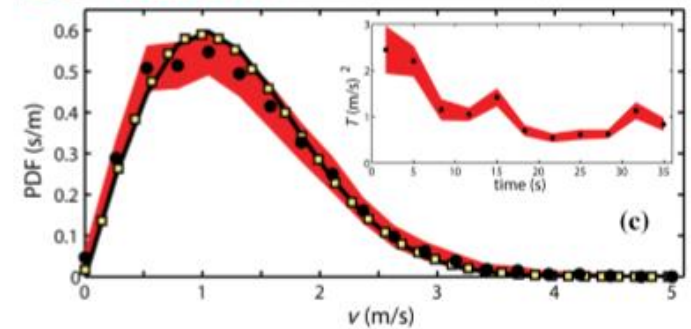
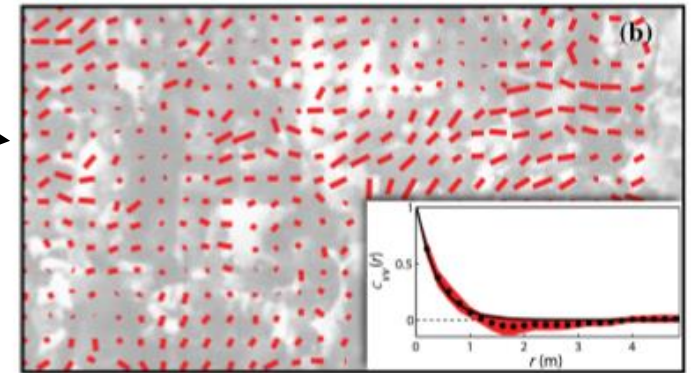


Illustration of PIV analysis

# Mosh Pit Simulation

Forces considered include:

A repulsive force between MASHers:

$$\vec{F}_i^{\text{repulsion}} = \begin{cases} \epsilon \left(1 - \frac{r_{ij}}{2r_0}\right)^{3/2} \hat{r}_{ij} & r_{ij} < 2r_0 \\ 0 & \text{otherwise,} \end{cases}$$

A propulsion force that propels MASHers:

$$\vec{F}_i^{\text{propulsion}} = \mu(v_0 - v_i)\hat{v}_i$$

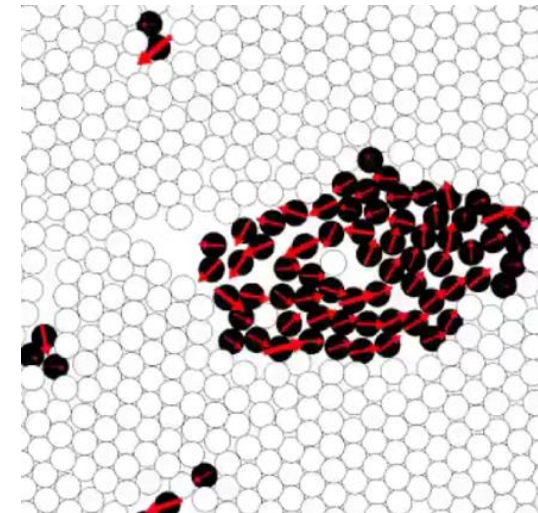
A flocking term that causes MASHer clustering:

$$\vec{F}_i^{\text{flocking}} = \alpha \frac{\sum_{j=0}^{N_i} \vec{v}_j}{\left| \sum_{j=1}^{N_i} \vec{v}_j \right|},$$

A noise term:

$$\vec{F}_i^{\text{noise}} = \vec{\eta}_i.$$

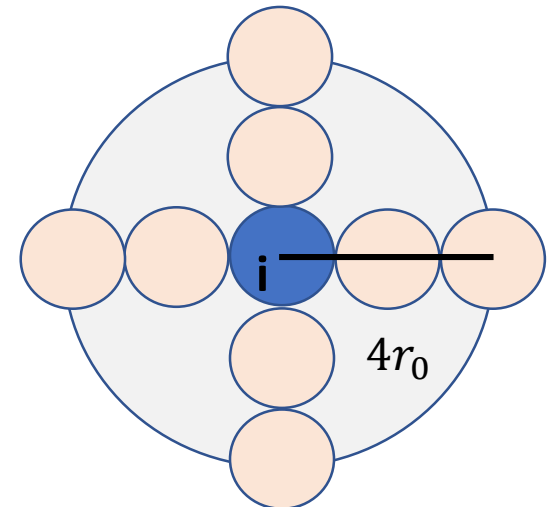
**MASH: mobile active simulated humanoid**



$$\vec{F}_i^{\text{total}} = \vec{F}_i^{\text{repulsion}} + \vec{F}_i^{\text{propulsion}} + \vec{F}_i^{\text{flocking}} + \vec{F}_i^{\text{noise}}$$

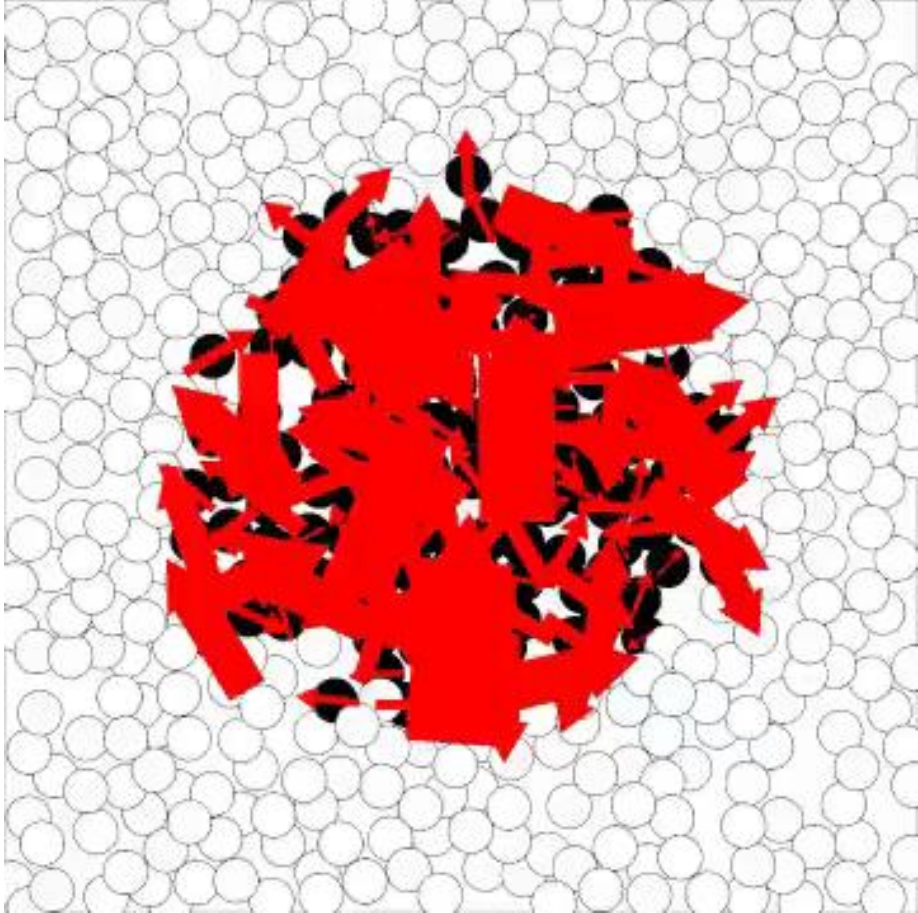
# Simulation parameters for different MASHer types

- For **passive** MASHers
  - Prefer to be stationary ( $v_0 = 0$ ); no coupling to neighbors ( $\alpha = 0$ ); no randomness ( $\overline{\eta}_i = 0$ )
- For **active** MASHers
  - Prefer to be in constant motion ( $v_0 = 1$ ); variable coupling to neighbors ( $0 \leq \alpha \leq 1$ ); variable level of randomness ( $0 \leq \sigma \leq 3$ )
- For **all** MASHers
  - Repulsion force dominates during contact ( $\varepsilon = 25$ );
  - Flocking force calculated from MASHers within a circle of radius “two-MASHers” ( $r_{flock} = 4r_0$ )



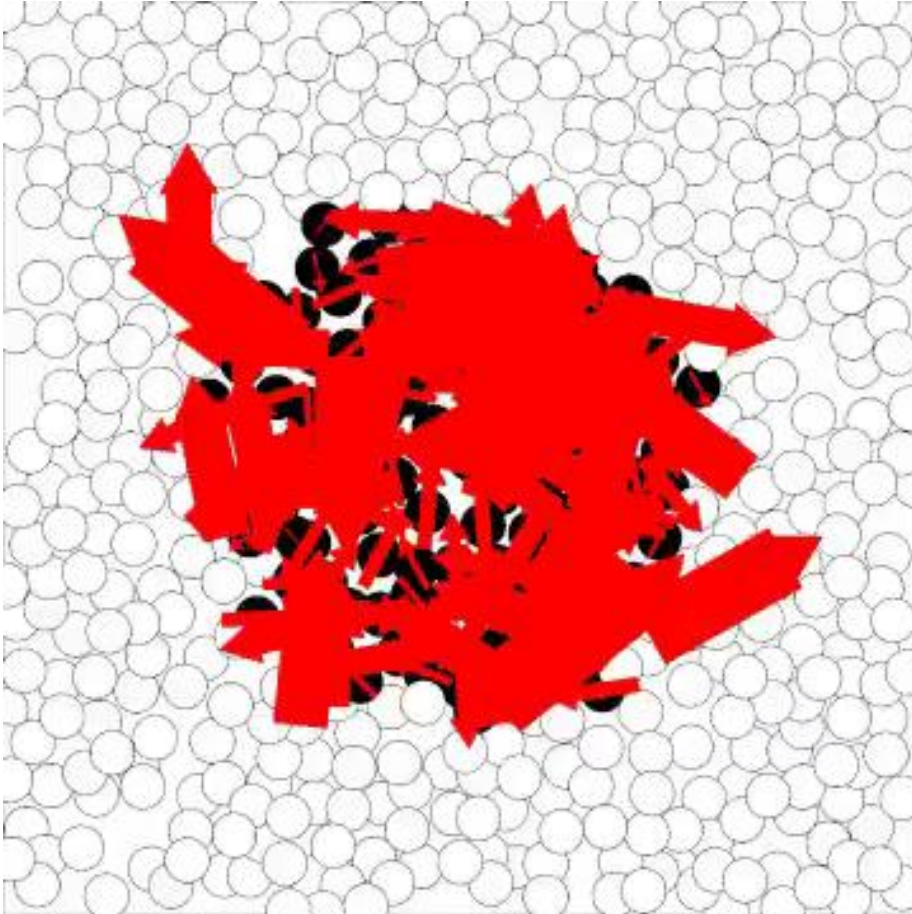


# Emergent behavior #1: Mosh pit



Mosh pit – localized random motion resembling an ideal gas (low coupling, high randomness)

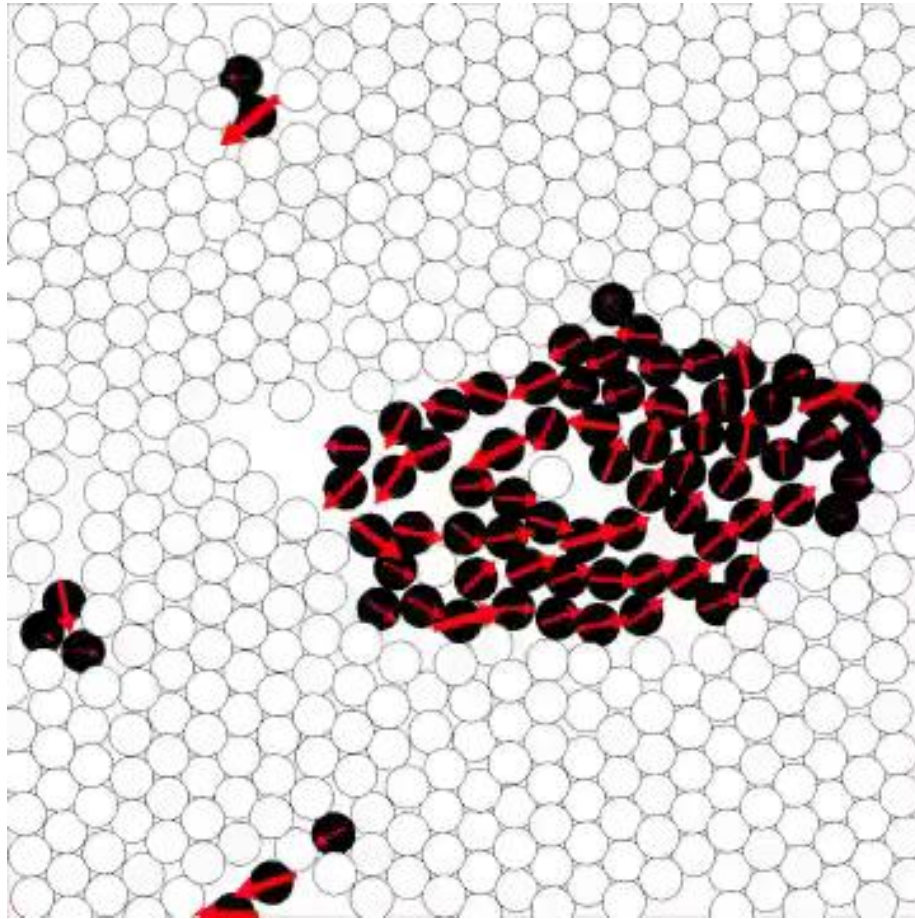
## Emergent behavior #2: Circle pit



Circle pit – localized organized motion with circular geometry (moderate coupling, moderate randomness)

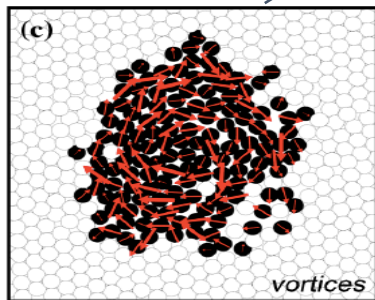
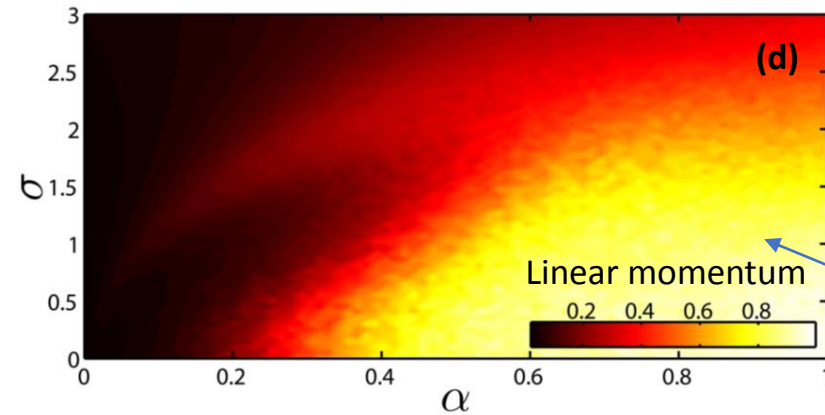
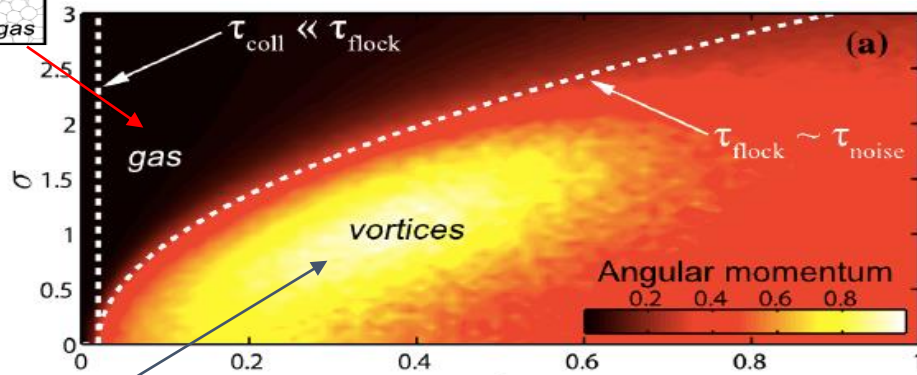
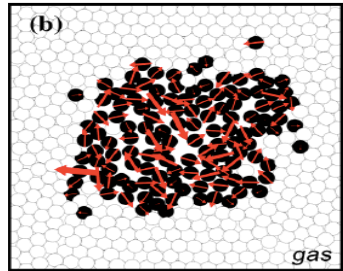


## Emergent behavior #3: Lanes



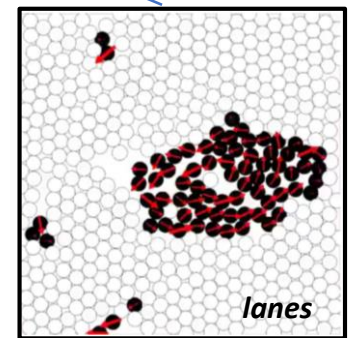
Lanes – localized organized motion with linear predominance (strong coupling, low randomness)

# Emergent behavior changes with flocking force and randomness

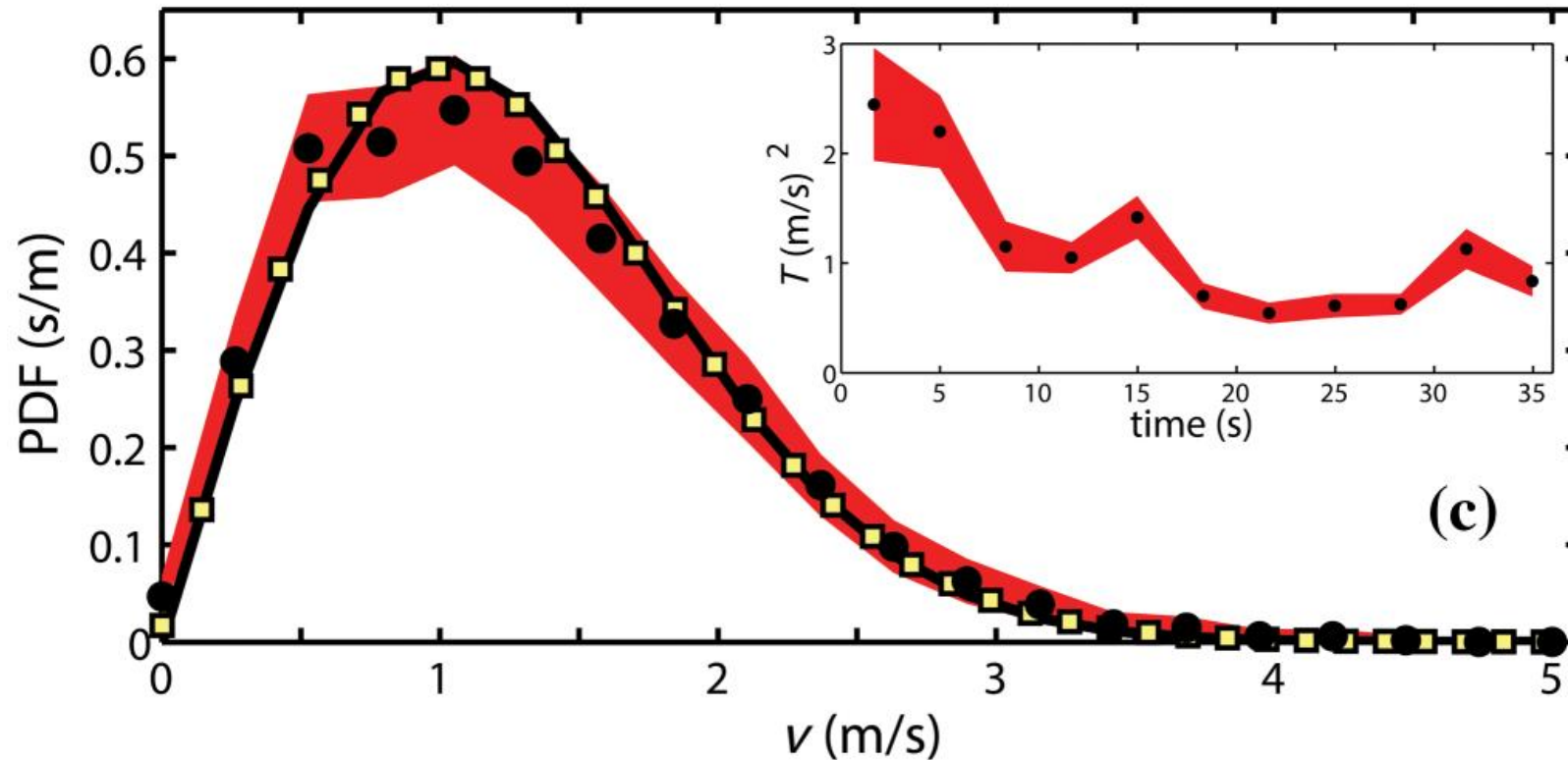


The RMS angular momentum of active MASHERs illustrating gas-like behavior and vortex formation.

RMS of active MASHER linear momentum illustrating a region of lane formation at high flocking and low noise.



# Mosh pits behave like an ideal gas



Inset shows that mosh pits "cool down" with time.

- Measured speed PDF from a video (**solid black circles**)
- Best fit to a 2D Maxwell-Boltzmann distribution (**black line**),
- Speed distribution from simulations (**yellow squares**).

# Comparison with Previous Studies

## Compare Flow Behavior

**Previous Model:** Pedestrian flow is usually well approximated by a laminar flow.

(L. F. Henderson, Nature (London) 229, 381 (1971).)

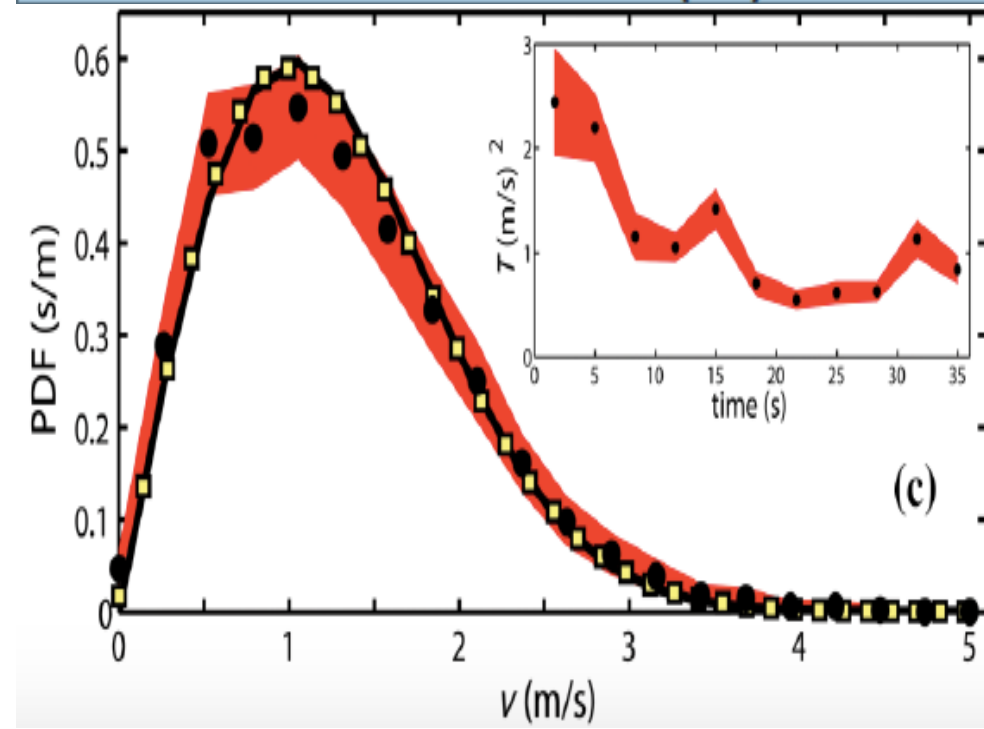
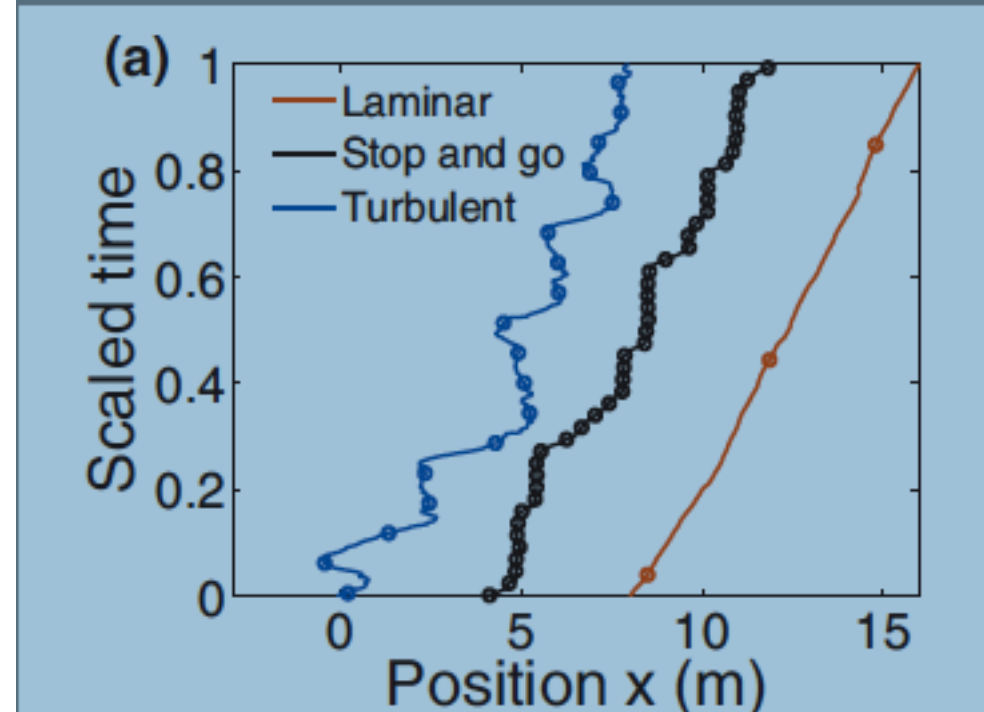
**Current Model:** Studies a more general crowd; therefore expect more complex behavior.

## Different Velocity Distribution

**Previous Studies:** Studies on panic stampede shows that, under high density, human flow exhibits phase transition from laminar flow, to stop-go flow, to turbulent flow.

(D. Helbing, A. Johansson, and H. Z. Al-Abideen, Phys. Rev. E 75, 046109 (2007))

**Current Study:** In a rock concert the human flow cannot be approximated by a laminar flow, yet it obeys Maxwell velocity distribution.



# Emergent Vortex Phenomenon

**Previous Studies:** Under low noise level, vortex formation has been observed in a number of previous studies under different conditions.

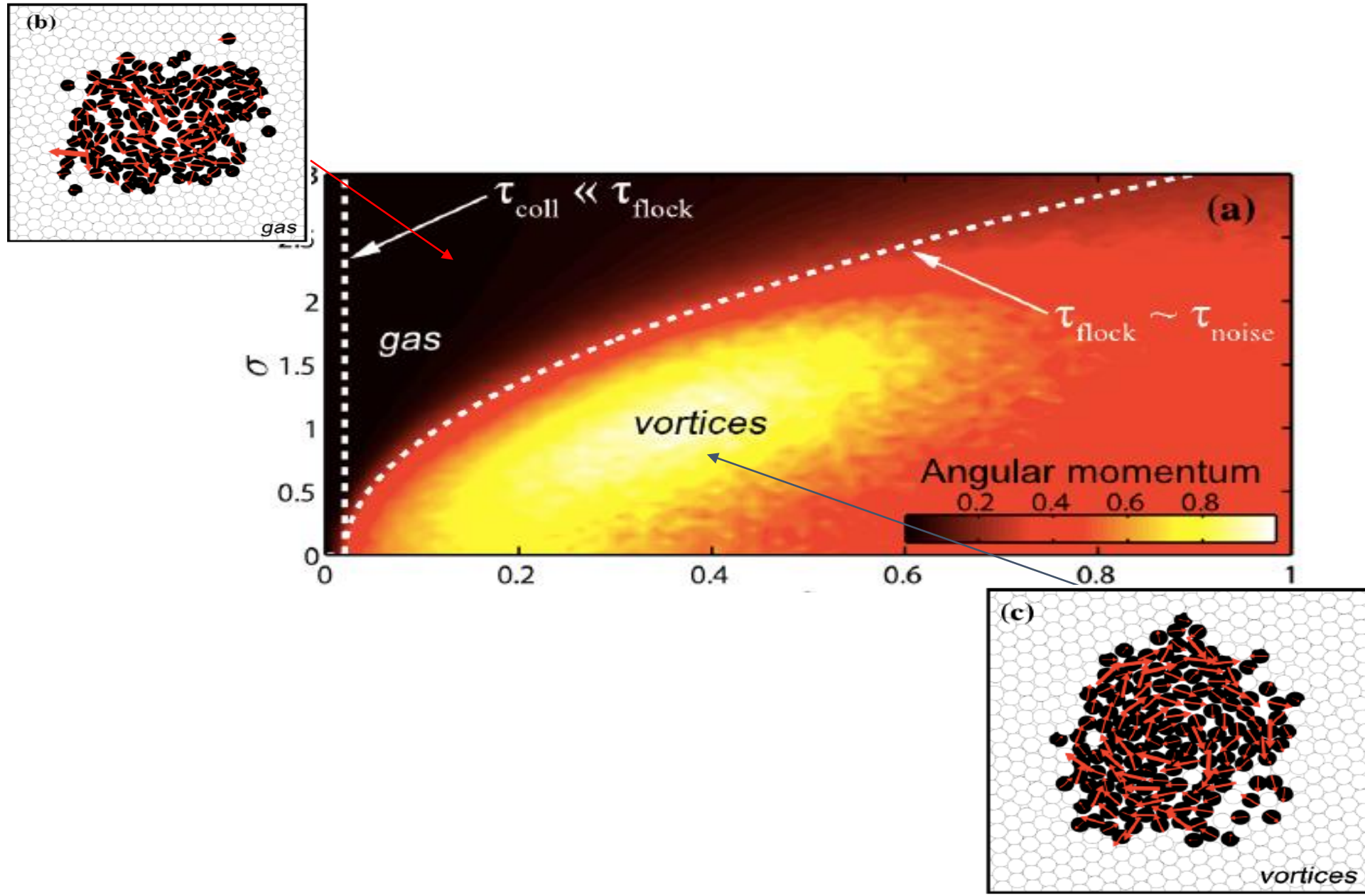
(S. Bazazi, K. S. Pfennig, N. O. Handegard, and I. D. Couzin, *Behav. Ecol. Sociobiol.* 66, 879 (2012).)

(J. Toner, Y. Tu, and S. Ramaswamy, *Ann. Phys. (Amsterdam)* 318, 170 (2005).)

**Current Study:** There exists a phase where vortices exist. However, there is a phase transition from gaseous phase to vortex phase, which has not been observed before.



# A Distinct Phase Transition



# Conclusions

- Repulsion + propulsion + flocking + noise  $\Rightarrow$  Different Patterns
- Random forces dominates ( $\tau_{flock} \gg \tau_{noise} \& \tau_{coll}$ )  $\Rightarrow$  gas like
  - Flocking term dominates ( $\tau_{flock} \ll \tau_{noise} \& \tau_{coll}$ )  $\Rightarrow$  vortex like
  - ( $\tau_{flock} \ll\ll \tau_{noise} \& \tau_{coll}$ )  $\Rightarrow$  lane like
- Understand collective motion (protest, panicked crowds etc.)
  - Architectural safety design
  - Crowd management strategies

# Critiques

agreed by authors

- 50% CW in simulation, 5% CW in observation
- Not based on staged experiments
- Limited access to effective videos
- Some further variations not described well (ninja pits, push pits etc.)

# Citation Report

- 40 citations (SCOPUS, November 28 2017)
- Highlights include:
  - Developing model to explain different observed group behavior in fish<sup>2</sup>
  - Modeling “active matter” via inspiration from human flocking behavior<sup>3</sup>
  - Simulating interaction between social robot and pedestrian crowd<sup>4</sup>
  - Modeling crowd behavior with simple power law based on an “interaction energy” determined by time to collision<sup>5</sup>
  - Describing the motions of self-propelled “partially catalytic spherical colloids”<sup>6</sup>

# References

1. Silverberg, J. L., Bierbaum, M., Sethna, J. P., & Cohen, I. (2013). Collective motion of humans in mosh and circle pits at heavy metal concerts. *Physical Review Letters*, 110(22) doi:10.1103/PhysRevLett.110.228701.
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6. De Graaf, J., Rempfer, G., & Holm, C. (2015). Diffusiophoretic self-propulsion for partially catalytic spherical colloids. *IEEE Transactions on Nanobioscience*, 14(3), 272-288. doi:10.1109/TNB.2015.2403255