

# Continuous Opinion Dynamics

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Chair of Systems Design

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# Outline

- 1 Introduction
- 2 Continuous opinion dynamics under bounded confidence
- 3 Continuous opinion dynamics and movie ratings
- 4 Conclusion

# Continuous opinions

- Prices, budgets

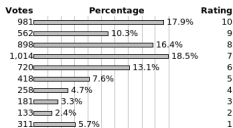


- Estimations: How many noodles?

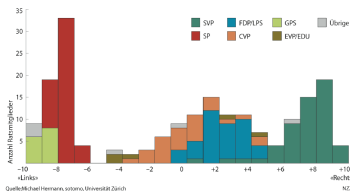


- Political continuum: left—right

- Ratings and grades



Source: IMDb.com



Source: sotomo.geo.unizh.ch, smartvote.ch

# Dynamics

- Agents may change opinion by **averaging** the opinions of others because of
  - ▶ **informational** reasons (in questions of **fact finding**)
  - ▶ **compromising** (in questions of **negotiation**)
  - ▶ **normative** reasons (in questions of **taste**)  
⇒ Agents adjust **towards opinions of others**
- Mathematics of averaging agents
  - ▶ Opinions stabilise if<sup>1</sup>
    - ★ agents have self-confidence
    - ★ confidence is mutual
    - ★ both properties do not fade away
  - ▶ Huge amount of literature on finding consensus
    - ★ Important in coordination (swarming) of mobile autonomous agents
    - ★ Related to synchronisation

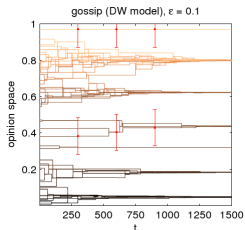
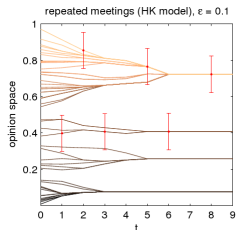
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<sup>1</sup>Lorenz, Physica A, 2005

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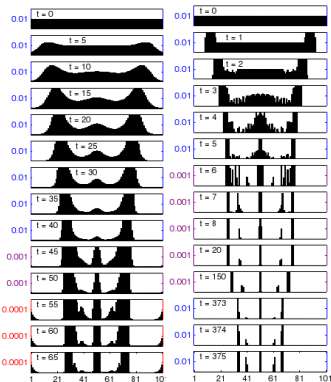
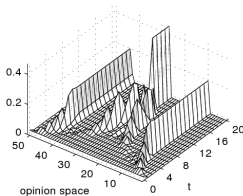
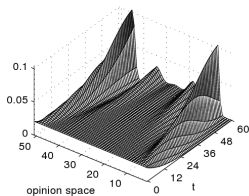
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# Bounded confidence models<sup>2</sup>



DW model,  $n = 51$ ,  $\varepsilon = 5$ ,  $\varepsilon/n = 0.1$

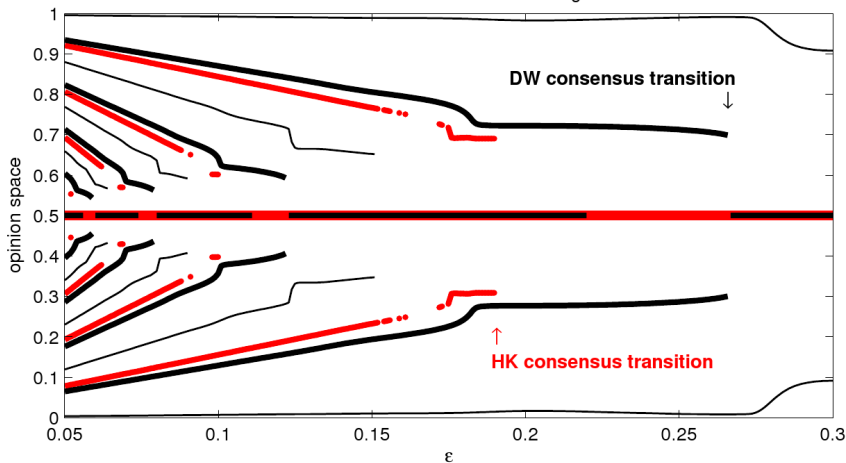
HK model,  $n = 51$ ,  $\varepsilon = 5$ ,  $\varepsilon/n = 0.1$



<sup>2</sup>Krause, 1997; Deffuant et al, 2000; Hegselmann-Krause, 2002; Weisbuch et al, 2002

# Bifurcation diagrams<sup>3</sup>

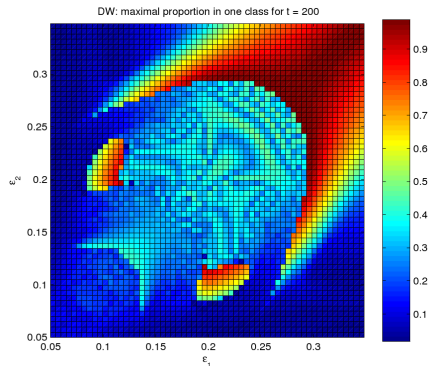
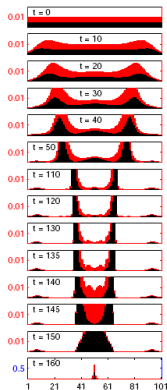
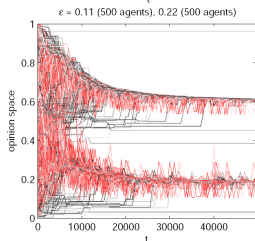
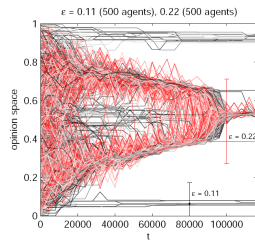
HK and DW model: bifurcation diagram



<sup>3</sup>Idea: Ben-Naim et al, 2003; this version Lorenz, IJMPC, 2007



# Heterogeneous bounds of confidence<sup>4</sup>



<sup>4</sup>Lorenz, arXiv, 2008

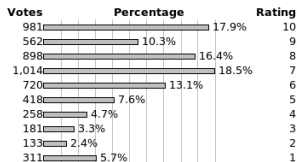


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## Opinion dynamics about movie quality

- On IMDb.com 1,086 movies got more than 20,000 votes (1=awful,...,10=excellent)
- Probabilistic view: Cinemagoer's initial opinion is a **random variable**
- Mini social theory: Final opinion is the **average** of opinions of peers.
- Probabilistic theory: Aggregate distribution should be close to a **Levy skew  $\alpha$ -stable distributions** distribution.
  - ▶ has characteristic function

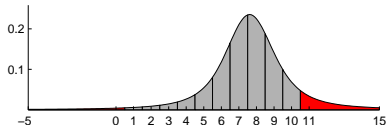


$$\varphi(t; \alpha, \beta, \gamma, \mu) = \exp \left[ \mu - |\sigma t|^\alpha \left( 1 - i\beta \operatorname{sign}(t) \tan\left(\frac{\pi\alpha}{2}\right) \right) \right].$$

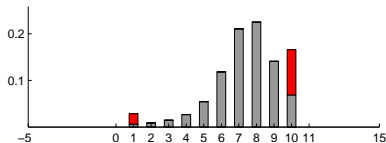
- ▶  $\alpha \in ]0, 2]$ ,  $\beta \in [-1, 1]$ ,  $\gamma \in [0, \infty[$ , and  $\mu \in ]-\infty, \infty[$

# Confined and discretized stable distribution

pdf for Levy skew  $\alpha$ -stable  $S(\alpha, \beta, \gamma, \mu; 1)$   
 $\alpha=1.3202$   $\beta=0.045661$   $\gamma=1.2454$   $\mu=7.7312$

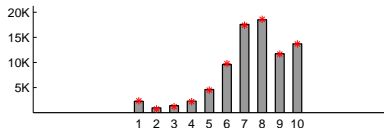


$S(\alpha, \beta, \gamma, \mu; 1)$  pdf in bins 1, ..., 10; mass in tails on top of 1 and 10

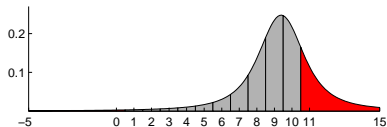


rating histogram "I Am Legend" (2007)

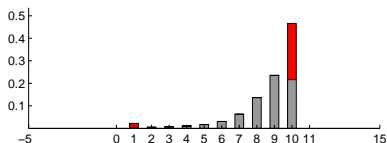
\* is  $S(\alpha, \beta, \gamma, \mu; 1)$ -pdf scaled with #votes



pdf for Levy skew  $\alpha$ -stable  $S(\alpha, \beta, \gamma, \mu; 1)$   
 $\alpha=1.2669$   $\beta=-0.00073142$   $\gamma=1.1933$   $\mu=9.3817$

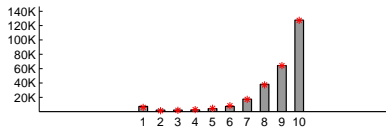


$S(\alpha, \beta, \gamma, \mu; 1)$  pdf in bins 1, ..., 10; mass in tails on top of 1 and 10

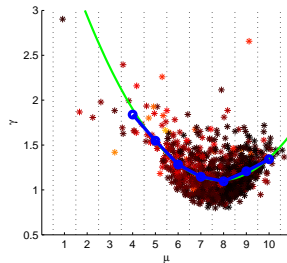
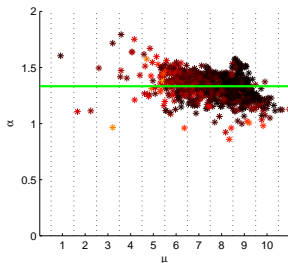
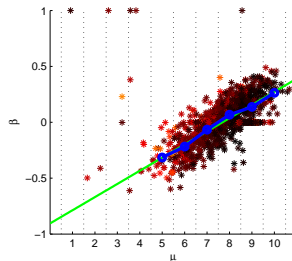
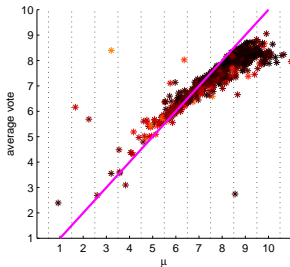


rating histogram "Pulp Fiction" (1994)

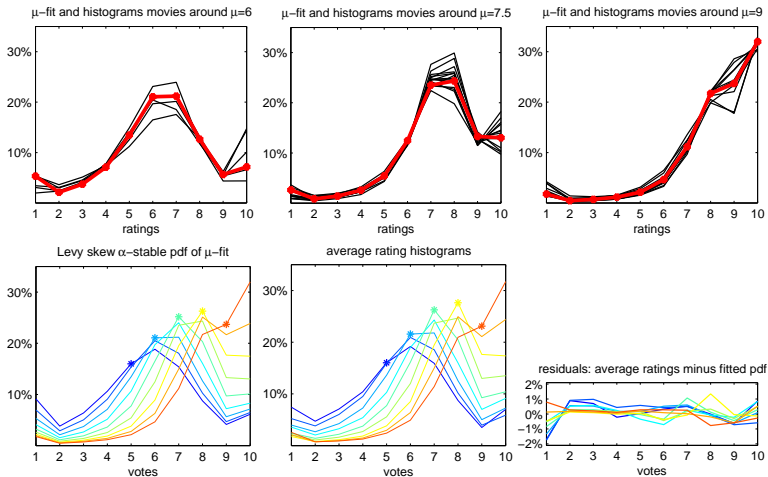
\* is  $S(\alpha, \beta, \gamma, \mu; 1)$ -pdf scaled with #votes



# Confined and discretized stable distribution



# One parameter fit







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# Conclusion

- Continuous opinion dynamics is different from discrete opinion dynamics
- Averaging dynamics
  - ▶ and bounded confidence: Gives a hint on the formation of political parties without a priori definition of parties
  - ▶ could explain the 'Gaussian-like' shapes of movie rating histograms, but initial distributions must have fat tails

## References

-  Jan Lorenz. 2007, Repeated Averaging and Bounded Confidence. Modeling, Analysis and Simulation of Continuous Opinion Dynamics. *Ph.D. Thesis*
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-  Jan Lorenz. 2008 Heterogeneous bounds of confidence: Meet, Discuss and Find Consensus! *submitted arxiv.org/abs/0801.1399*.
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