# Models of Opinion Formation

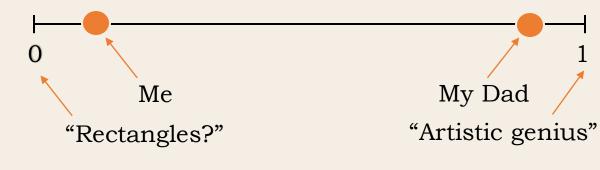
Andrew Nugent (a.nugent@warwick.ac.uk) Supervised by Susana Gomes and Marie-Therese Wolfram





Engineering and Physical Sciences Research Council

## What do you think of this painting?





Orange, Red, Yellow Mark Rothko, 1961

### Bounded Confidence





Orange, Red, Yellow Mark Rothko, 1961

## Bounded Confidence



Individual *i*'s opinion:  $x_i$ 

Confidence radius: *R* 

Confidence set:

$$I(i, x) = \{ j : |x_i - x_j| < R \}$$



Orange, Red, Yellow Mark Rothko, 1961

#### Hegselmann Krause Model

Individual *i*'s opinion:  $x_i$ 

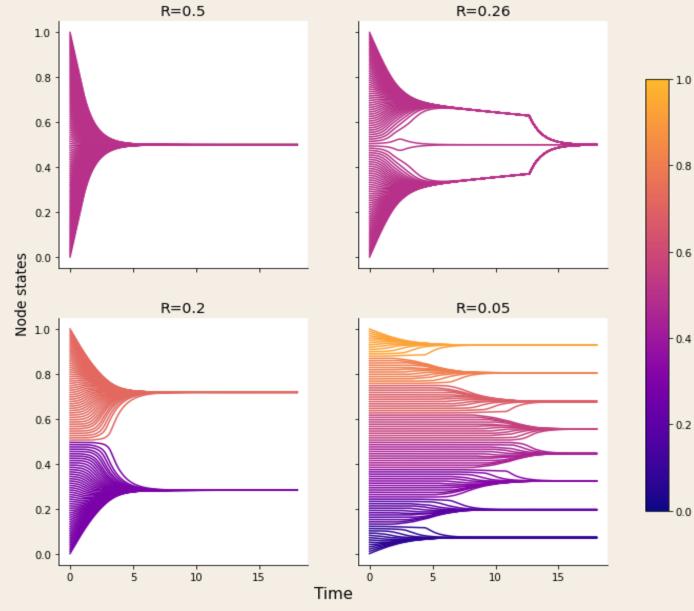
Confidence radius: *R* 

Confidence set:

 $I(i, x) = \{ j : |x_i - x_j| < R \}$ 

Opinion dynamics:

$$\frac{dx_i}{dt} = \frac{1}{N} \sum_{j \in I(i, x)} (x_j - x_i) \ , t \in [0, T]$$



Example Hegselmann-Krause model dynamics.

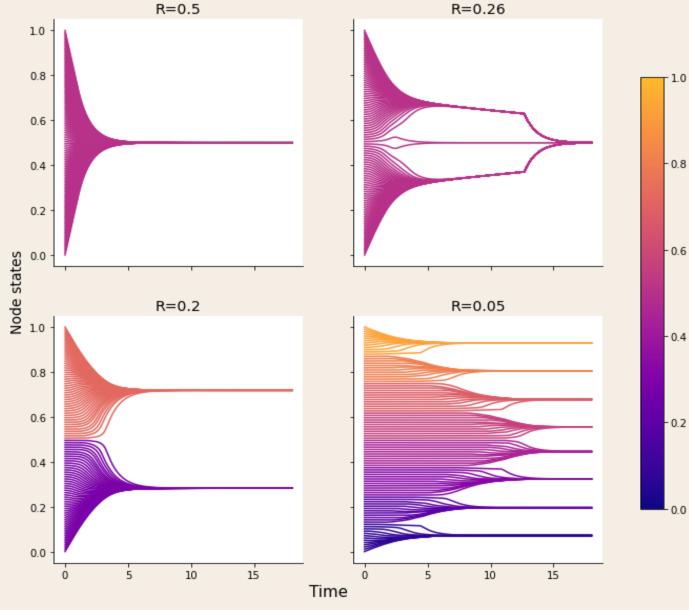
#### Hegselmann Krause Model

Opinion dynamics:

$$\frac{dx_i}{dt} = \frac{1}{N} \sum_{j \in I(i, x)} (x_j - x_i) , t \in [0, T]$$

Order parameter (how many opinion clusters form):

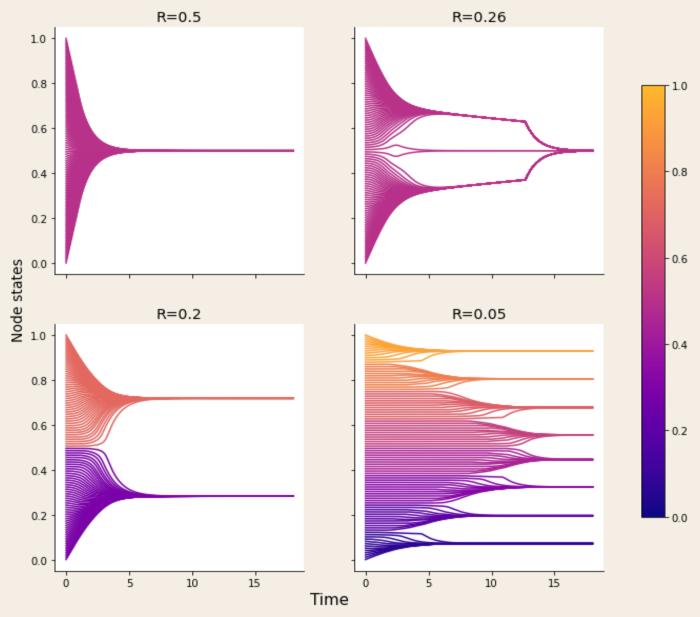
$$Q = \frac{1}{N^2} \sum_{i,j=1}^{N} \mathbf{1}_{\{|x_i(T) - x_j(T)| < R\}}$$



Example Hegselmann-Krause model dynamics.

#### Extensions to the HK model

- 1. Individuals interact across a **social network**.
- 2. Individuals have opinions on **multiple topics**.
- 3. Individuals' opinions are affected by **noise**.



Example Hegselmann-Krause model dynamics.

#### Social Network Model

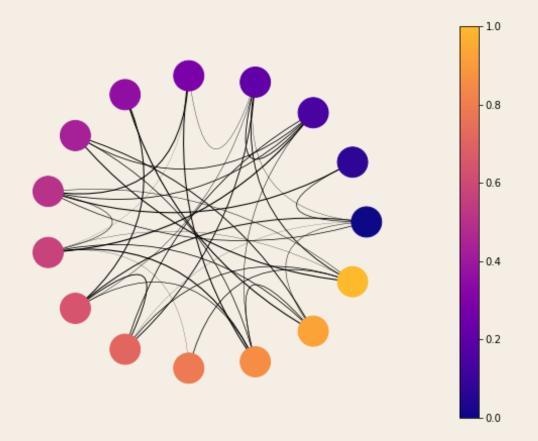
Opinion dynamics:

$$\frac{dx_i}{dt} = \frac{1}{N} \sum_{j \in I(i, x)} (x_j - x_i) , t \in [0, T]$$

Opinion dynamics on a network:

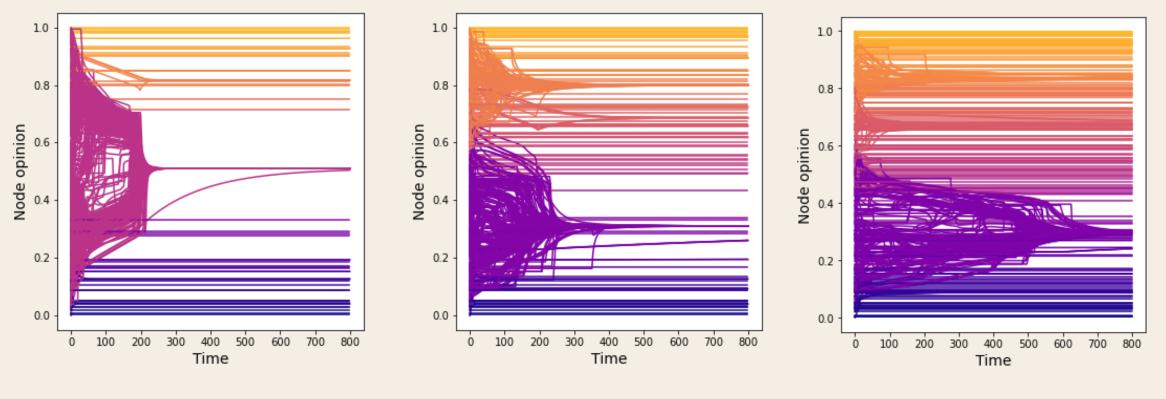
$$\frac{dx_i}{dt} = \frac{1}{k_i} \sum_{j \in I(i, x)} w_{ij}(x_j - x_i),$$

$$k_i = \sum_{j \in V} w_{ij}$$



Example weighted Erdős-Rényi random network with nodes coloured by opinion.

#### Social Network Model

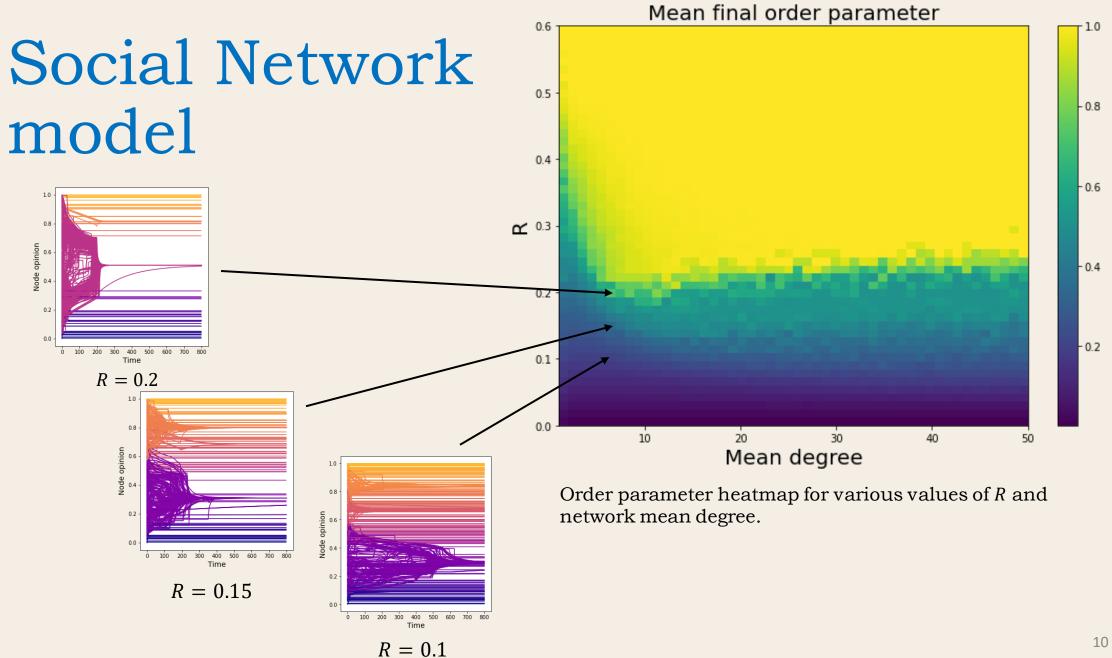


R = 0.2

R = 0.15

R = 0.1

Example network model dynamics.



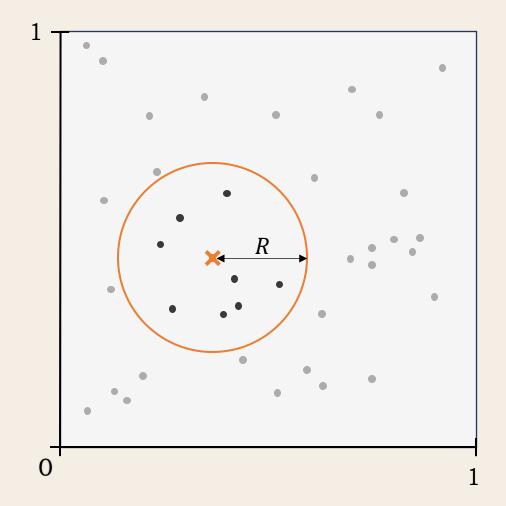
#### Including multiple topics

Opinion dynamics:

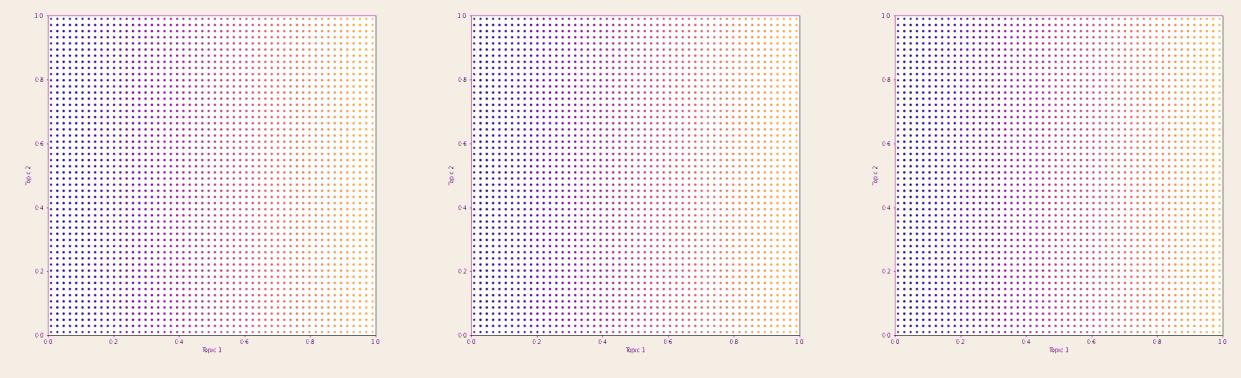
$$\frac{dx_i}{dt} = \frac{1}{N} \sum_{j \in I(i, x)} (x_j - x_i) , t \in [0, T]$$

Can define the confidence set using the Euclidean norm:

$$I(i, x) = \{ j : ||x_i - x_j|| < R \}$$



#### Including multiple topics

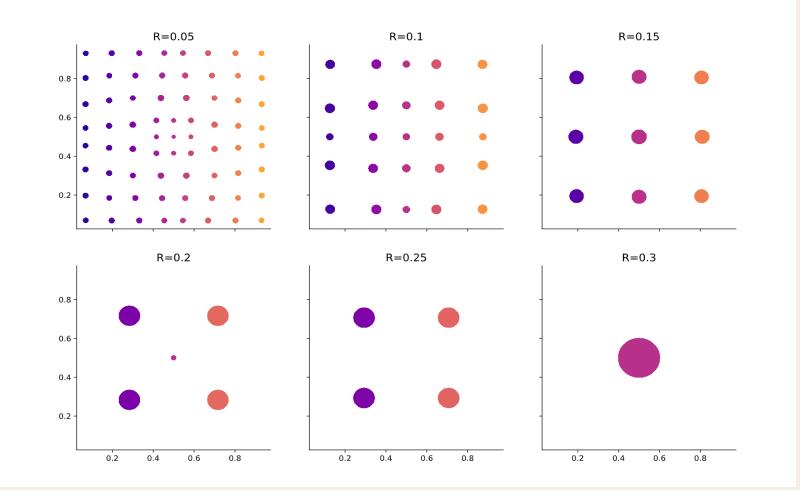


R = 0.30

R = 0.15

R = 0.05

#### Including multiple topics



Example two-dimensional dynamics with the Euclidean norm.

#### Noisy opinion model

Opinion dynamics:

$$\frac{dx_i}{dt} = \frac{1}{N} \sum_{j \in I(i, x)} (x_j - x_i) , t \in [0, T]$$

Noisy opinion dynamics:

$$dx_{i} = \left(\frac{1}{N}\sum_{j \in I(i, x)} (x_{j} - x_{i})\right)dt + \sigma d\beta_{t}^{(i)}$$
  
diffusion term  
$$diffusion term$$

R=0.5

R=0.2

1.0

0.8

0.6

0.4

0.2

0.8

0.6

Node states

Example of noisy Hegselmann-Krause model dynamics.

R=0.26

R=0.05

1.0

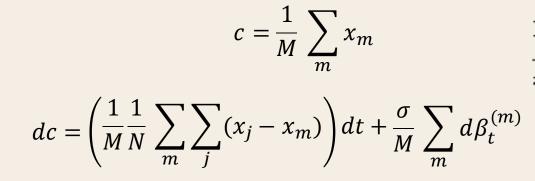
- 0.8

- 0.6

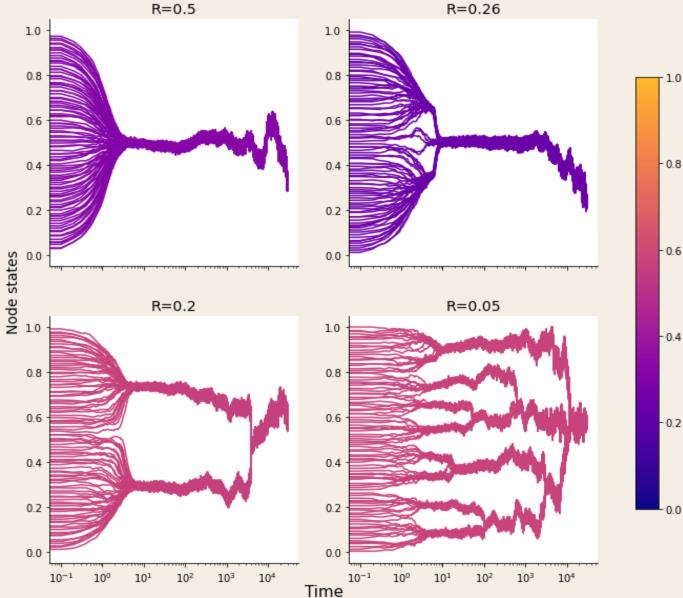
- 0.4

#### Noisy opinion model

Centre of mass of a cluster:



See Noisy Hegselmann-Krause Systems: Phase *Transition and the 2r-Conjecture* by Wang et al.



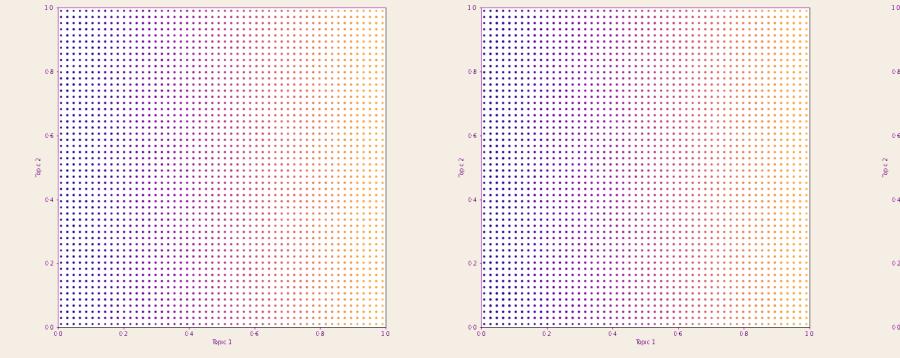
Long-term noisy Hegselmann-Krause model dynamics.

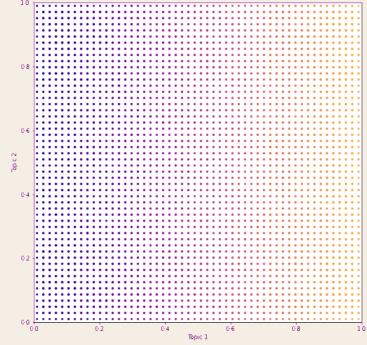
0.8

- 0.6

0.4

# Including multiple topics & noisy opinions





R = 0.26

R = 0.15

R = 0.05

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