



# Recommendation of content to mitigate the echo chamber effect



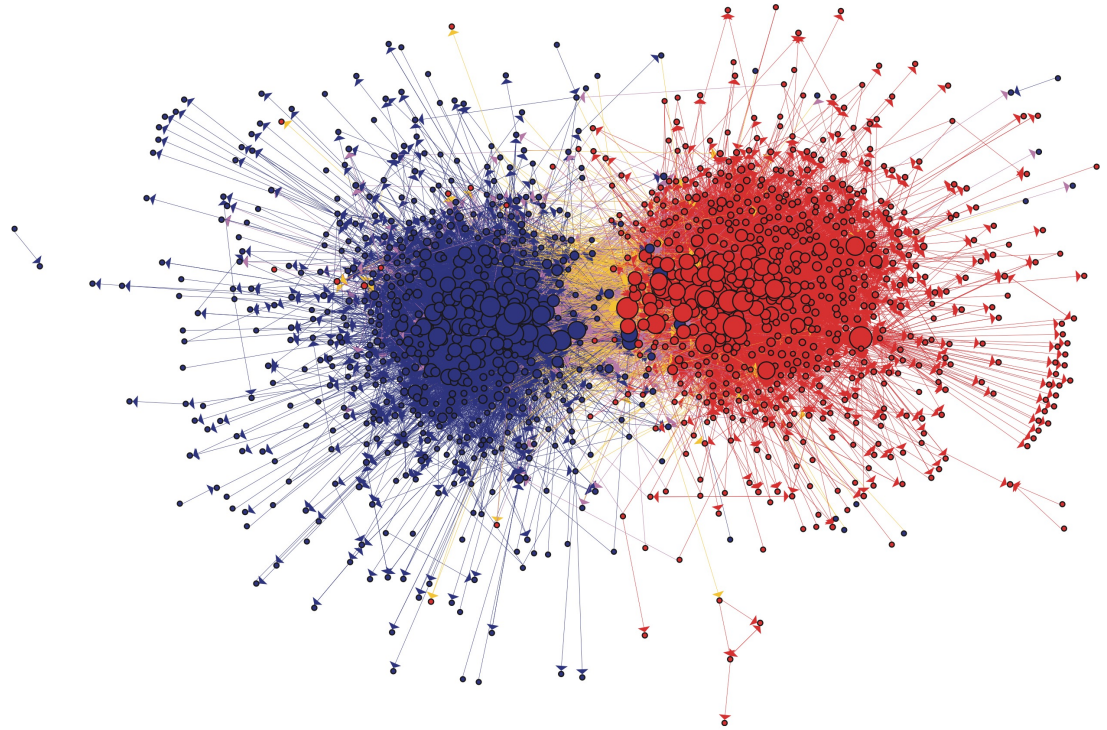
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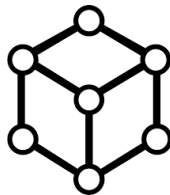


# The echo chamber effect



L. A. Adamic and N. Glance, 'The political blogosphere and the 2004 U.S. election: divided they blog', in Proceedings of the 3rd international workshop on Link discovery, in LinkKDD '05. New York, NY, USA: Association for Computing Machinery, Aug. 2005, pp. 36–43. doi: 10.1145/1134271.1134277.

# Objectives



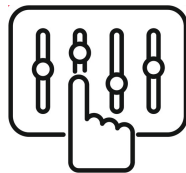
## **Model**

echo chamber dynamics



## **Measure**

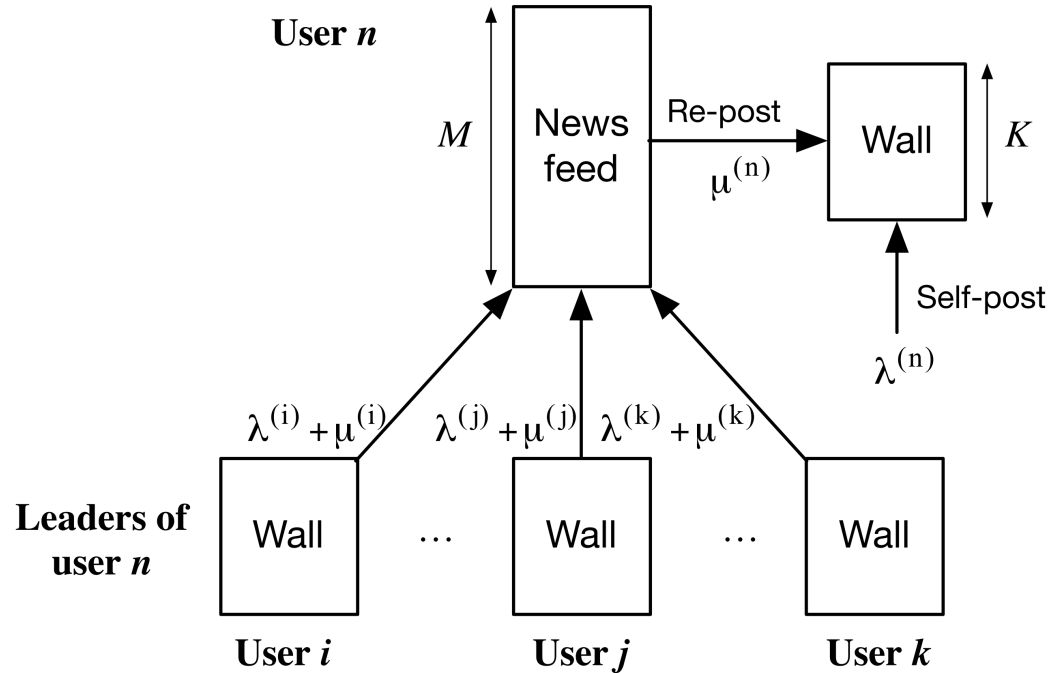
the echo chamber effect



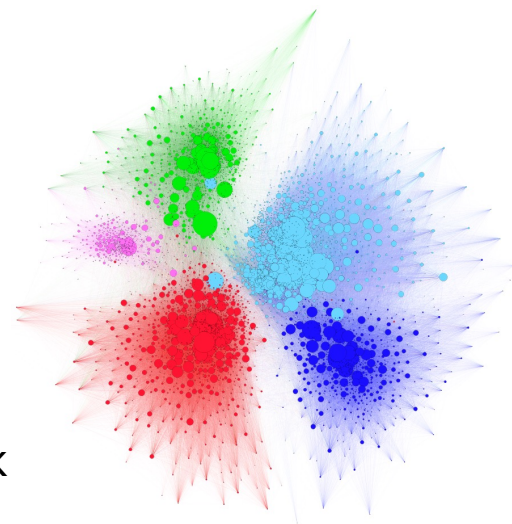
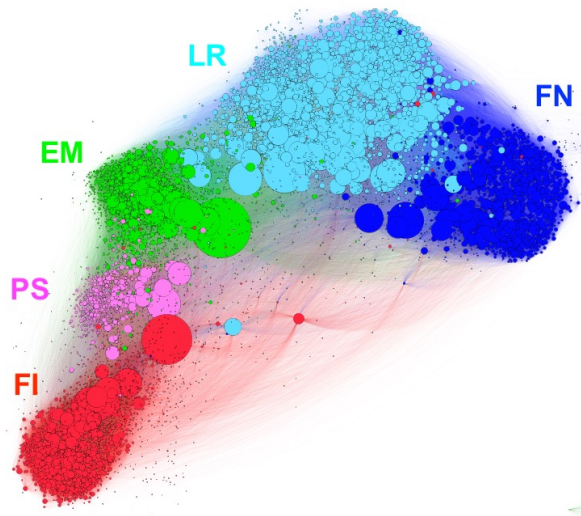
## **Control**

the echo chamber effect

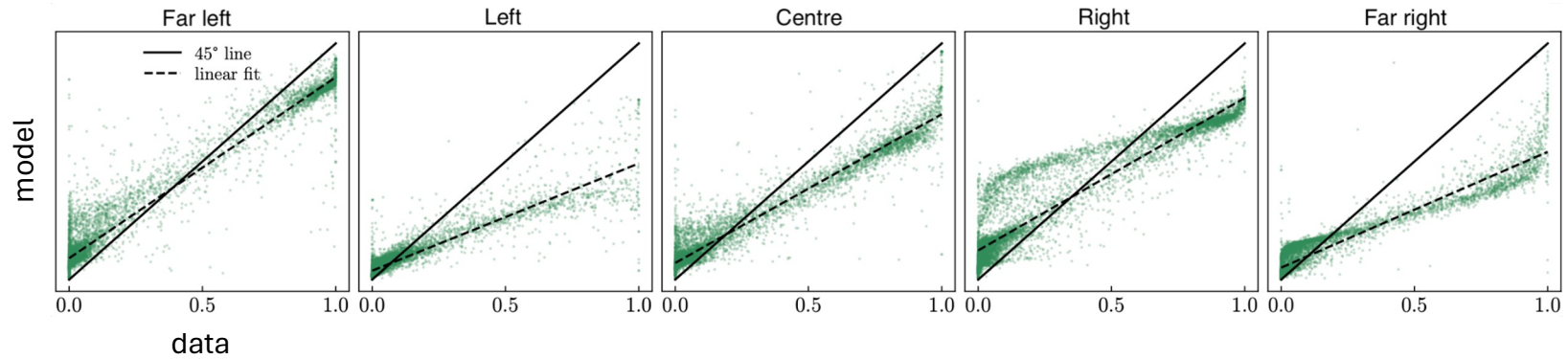
# The Newsfeed Model



# The Elysée2017 dataset

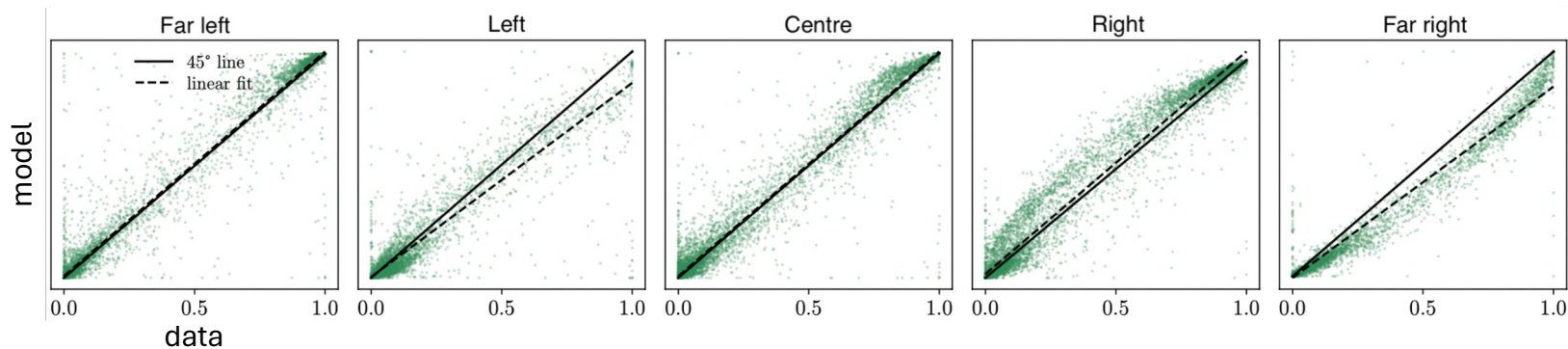


# Empirical evaluation of the model



Distribution of opinions on newsfeeds.

# With reposting preferences



Users repost preferentially according to their views.

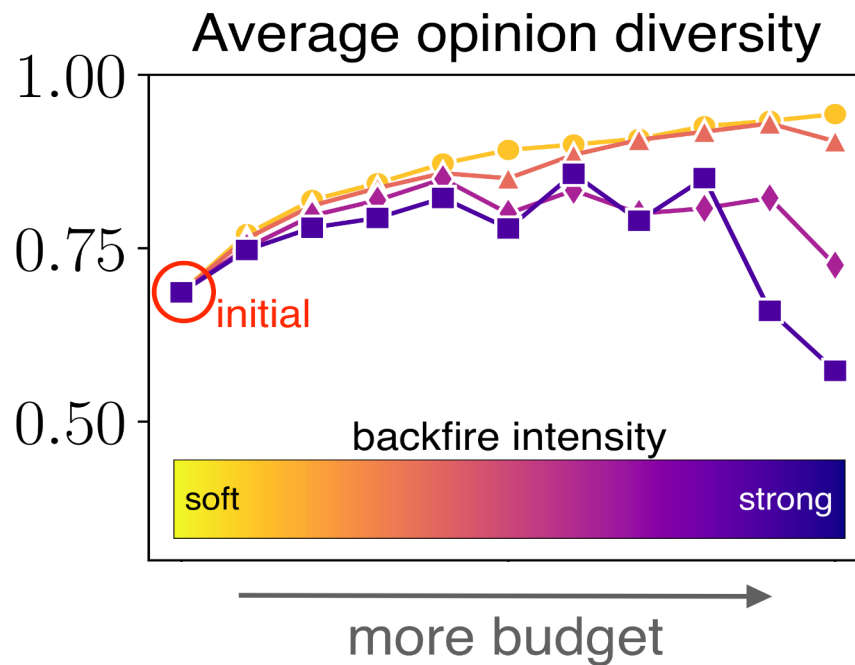
# Controlling the echo chamber effect via recommend ations

- Budgeted: not too many recommendations!
- Avoid backfire effects!

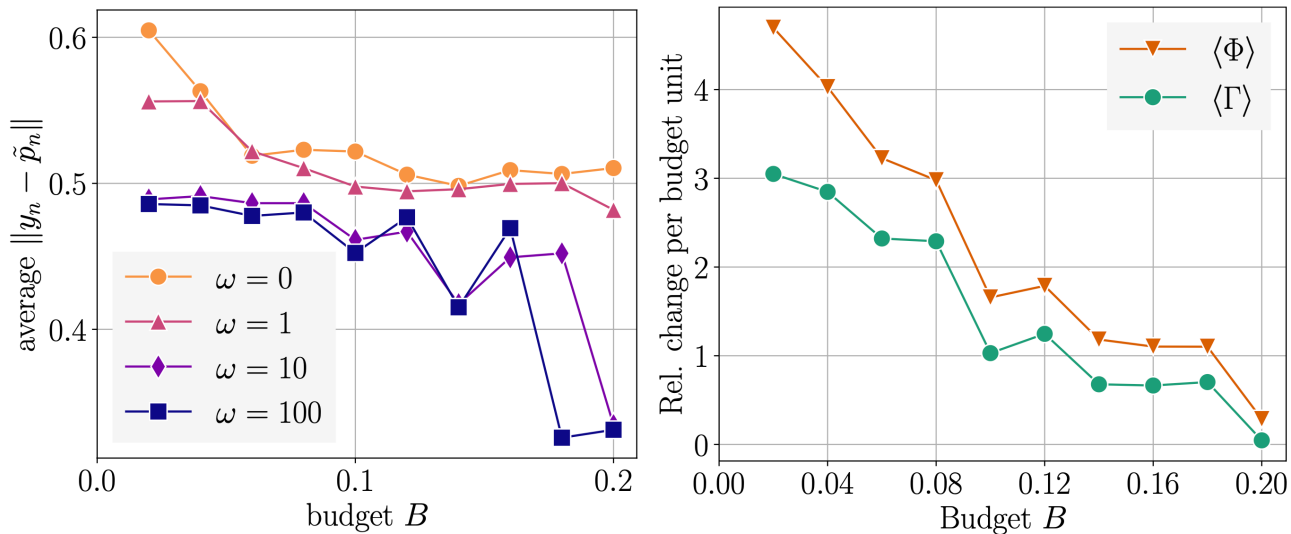
$$\operatorname{argmax}_{x,p} \underbrace{\frac{1}{N} \sum_n \Phi_n}_{\text{Diversity of opinions on newsfeeds}} - \overset{\text{Penalty}}{\omega} \underbrace{\sum_{n,s} \left( \frac{\tilde{p}_n^{(s)} - p_n^{(s)}}{\tilde{p}_n^{(s)} + \epsilon} \right)^2}_{\text{Proportion of change in newsfeeds}}$$



# Main results



# And more...



**Figure 7.6: Left:** average squared difference between recommendation vector and initial newsfeed distribution. **Right:** relative change in the metrics of interest per budget unit, for  $\omega = 10$ .