

Computational  
Social Science

# Social Segregation, Misperceptions, and Emergent Cyclical Voting Patterns

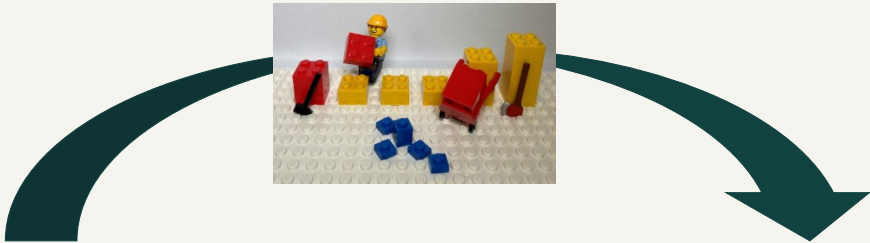
D.M. Mayerhoffer, J. Schulz

JT Keynes Gesellschaft 2024

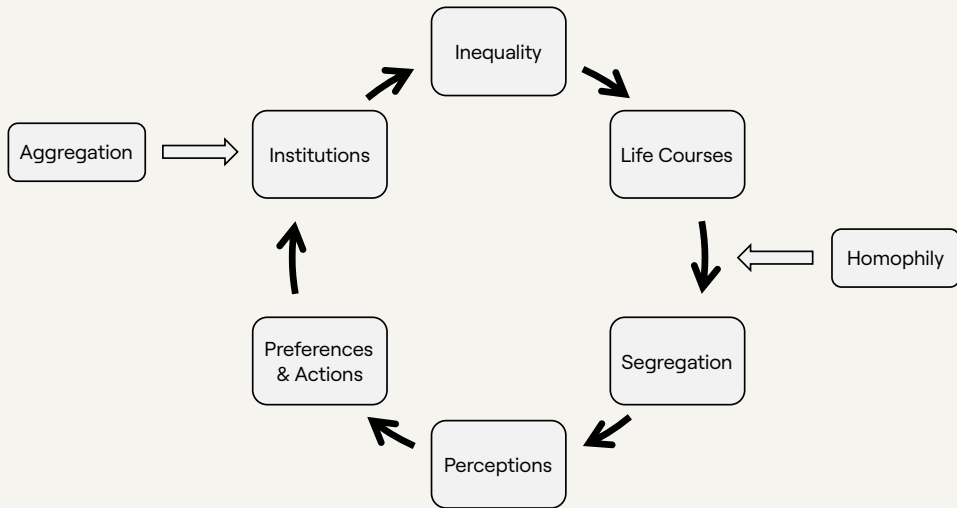


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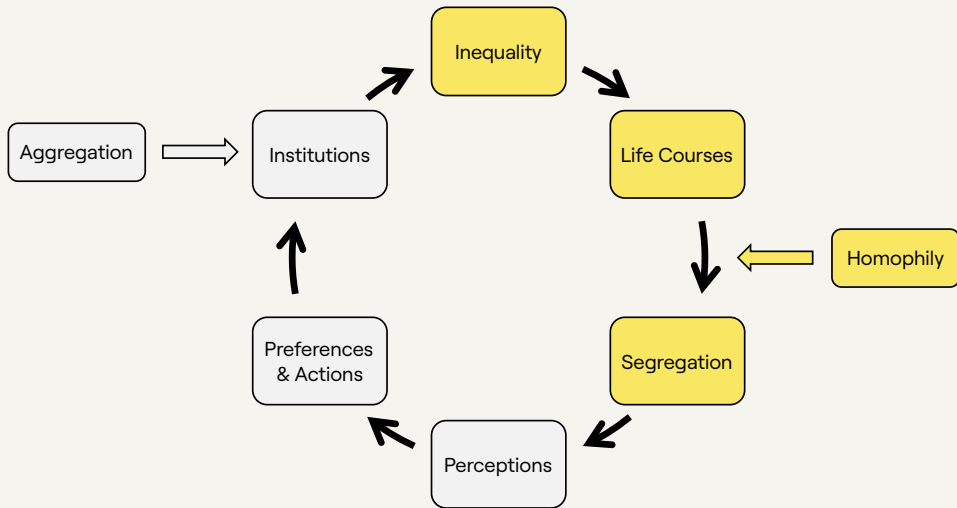
# Motivation



# The Nexus of (Income) Inequality, Its Perception, and Perpetuation



# The Nexus of (Income) Inequality, Its Perception, and Perpetuation



# Homophilic Network Formation

## Focus: Labour Income

Exponential income distribution

## Random Geometric Graph (RGG) Type of Network

► Example

Preferential attachment procedure applied to a node property other than degree

⇒  $\rho$  setting the strength of the attachment

- Nodes choose their link-neighbours.
  - ⇒ Homophily in income (McPherson, 2001; Talaga and Nowak, 2020)
- 5 links, i.e., closest layer of interaction (Mac Carron et al. 2016)
- Weight in choice inversely related to the distance in their defining characteristic (i.e., income):  
 $(\text{Exp}[\rho \cdot |Y_i - Y_j|])^{-1}$  with  $\rho \in \mathbb{R}_0^+$  as homophily strength

# Outcome of Homophily: Connected but Segregated Graph

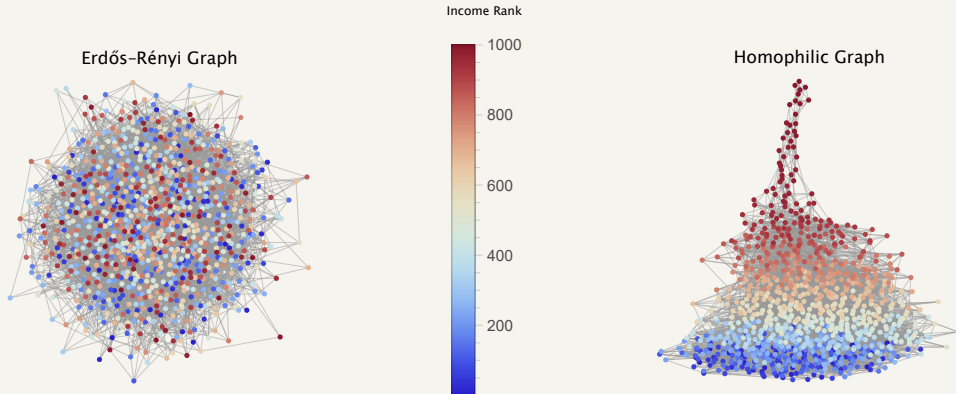
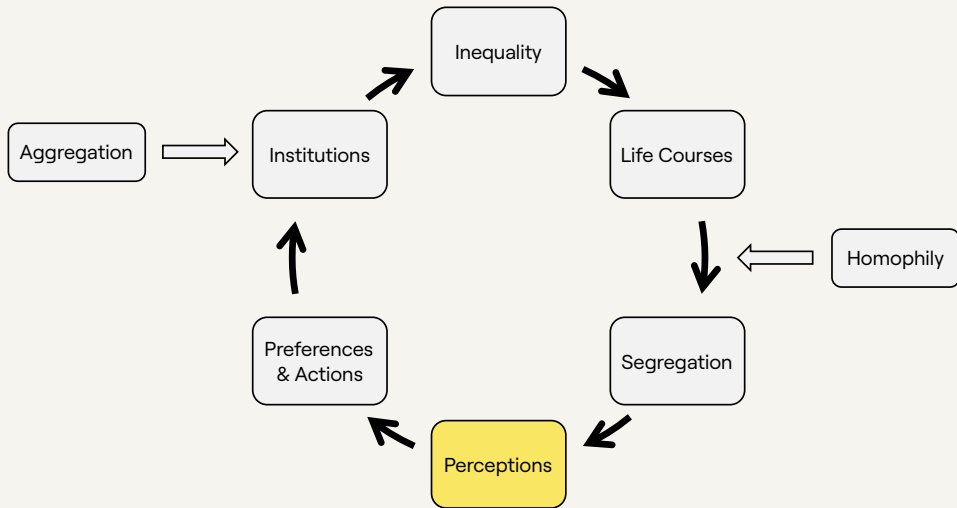


Figure: Graph resulting from homophilic linkage (compared to ER network). The network is [highly segregated](#) and exhibits [\(Weak\) Small Worldiness](#). Most ego networks are symmetric in income ranks ([Linkage PDF](#)).

# The Nexus of (Income) Inequality, Its Perception, and Perpetuation



# Localised But Otherwise Correct Perception





# Everybody in the Middle Class?

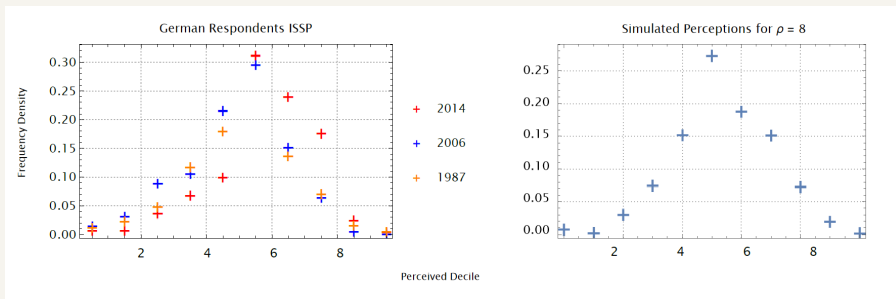
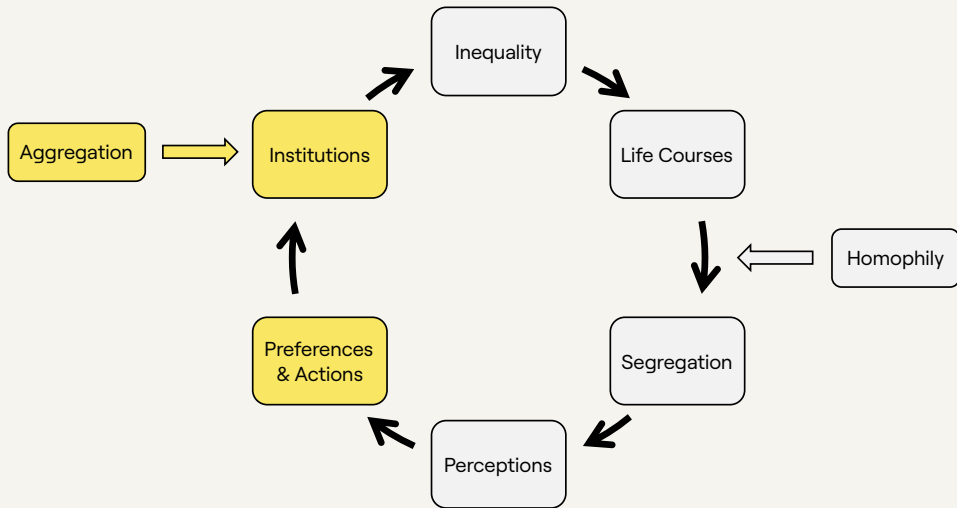


Figure: The figure shows self-perceptions of income deciles from a survey for German respondents in the International Social Survey Program (left panel) and as simulation outcomes in the right panel for  $\rho = 8$ . The middle-class bias that emerges in the simulation baseline model of Schulz et al. (2022) closely mimicks the empirical middle-class bias that empirical surveys consistently demonstrate.

# The Nexus of (Income) Inequality, Its Perception, and Perpetuation



# Taxable Income and Tax Efficiency

- ▶  $Y$  is total income before taxes
- ▶ Tax base decreases with taxation according to constant elasticity of taxable income  $\epsilon$  with respect to the net of tax rate  $(1 - t)$ 
  - ⇒ Microfoundations from a labour-leisure trade-off with isoelastic utility
- ▶ Lump sum transfer to all individuals with rate  $t$  is therefore

$$\begin{aligned} T &= (1/N) \cdot t \cdot (1 - t)^\epsilon Y \text{ or} \\ &= t \cdot (1 - t)^\epsilon \bar{y}, \end{aligned}$$

with  $\bar{y}$  as the mean pre-tax income.

⇒ Gives rise to a Laffer curve as model closure.

# Laffer Curves for Different $\epsilon$

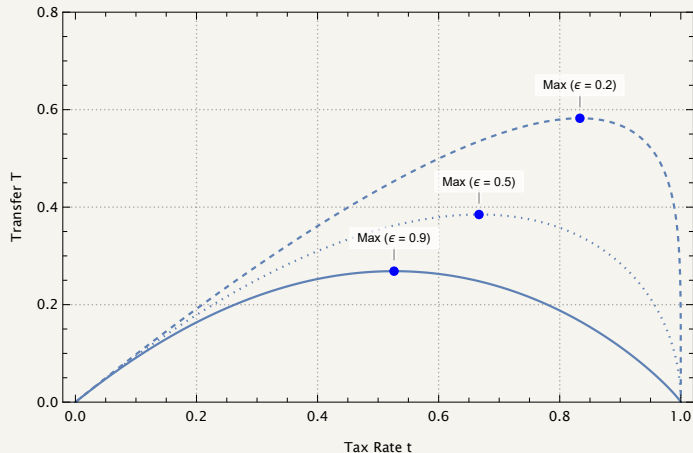


Figure: Laffer curves for different degrees of tax inefficiency with respective maximum revenue points.

# Voting Decisions

Individual Voting Decision of Agent  $i$ :

$$V_i = \begin{cases} 1 & \text{if } t \cdot (1 - t)^\epsilon \cdot \bar{y}_i > t \cdot y_i \\ 0 & \text{if } t \cdot (1 - t)^\epsilon \cdot \bar{y}_i = t \cdot y_i \\ -1 & \text{if } t \cdot (1 - t)^\epsilon \cdot \bar{y}_i < t \cdot y_i \end{cases}$$

Agents form beliefs about the mean income  $\bar{y}_i$  according to

$$\hat{y}_i = a \cdot \bar{y} + (1 - a)l_i,$$

with  $\bar{y}$  as the true mean income,  $l_i$  as the locally perceived mean income and  $0 \leq a \leq 1$  as the weight on the true, global mean income.

The tax rate  $0 < t < 1$  has a majority, if  $V > 0$ :

$$V(t, \epsilon, a, \bar{y}, \vec{l}, \vec{y}) = \sum_{i=1}^N V_i = \sum_{i=1}^N \mathbf{sign}[t \cdot (1 - t)^\epsilon \cdot \hat{y}_i - t \cdot y_i]$$

# Initial Bias and Redistribution

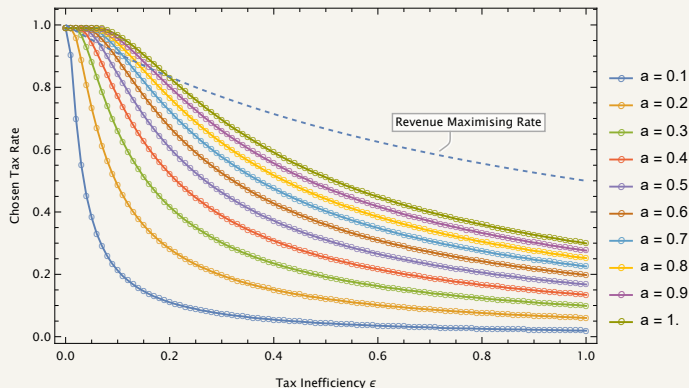


Figure: Implemented tax rates for different weights for the global signal  $a \in [0; 1]$  and for varying the elasticity of taxable income  $\epsilon \in [0, 1]$ . Homophily level kept constant at  $\rho = 8$ . Increasing the weight of the global signal and improving the accuracy of perceptions unanimously increases (implemented) redistribution since agents then expect higher transfers on average.

# Segregation and Redistribution

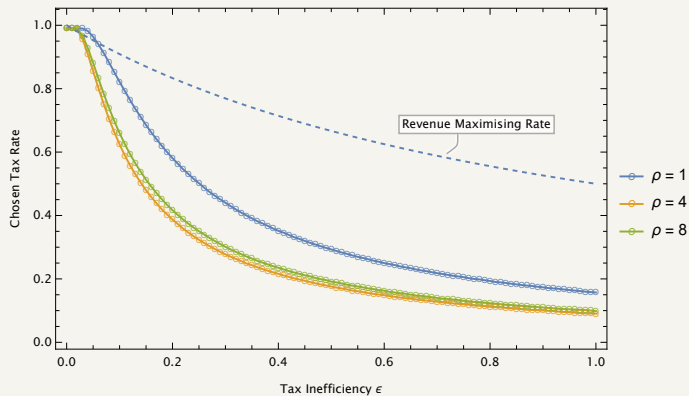
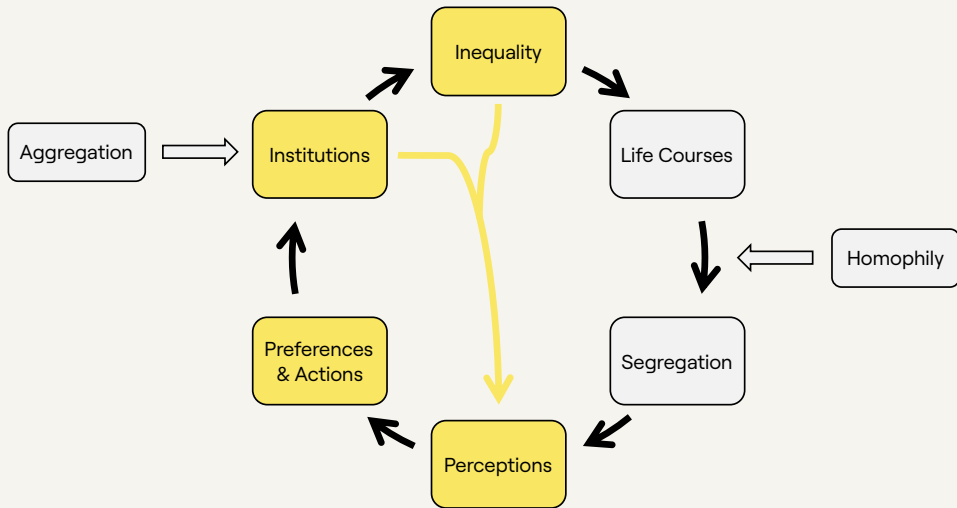


Figure: Implemented tax rates for varying the elasticity of taxable income  $\epsilon \in [0, 1]$ . Weight of the global signals is kept constant at  $a = 0.3$ , homophily strength varies in the range  $\rho \in \{1; 4; 8\}$ . Increasing network segregation decreases (implemented) redistribution.

# The Nexus of (Income) Inequality, Its Perception, and Perpetuation





# Adaptive Expectation and Dynamic Voting

Agents form adaptive expectations about taxation efficiency at time  $\tau$

$$\epsilon_{i,\tau}^e = \epsilon_{i,\tau-1}^e + \lambda(\epsilon_{i,\tau-1} - \epsilon_{i,\tau-1}^e),$$

with  $\lambda$  as the error correction parameter and with  $\lambda = 1$  implying naive expectations, i.e.,  $\epsilon_{i,\tau}^e = \epsilon_{i,\tau-1}$ .

These beliefs can be expressed as a function of the realized previous-period transfer  $T_{\tau-1}$  by

$$\epsilon_{i,\tau}^e = \lambda \cdot \frac{\log\left(\frac{t_{\tau-1}y_i + T_{\tau-1}}{t_{\tau-1}(a \cdot \bar{y} + (1-a)l_i)}\right)}{\log(1 - t_{\tau-1})} + (1 - \lambda) \cdot \epsilon_{i,\tau-1}^e$$

# Endogenous Opinion Polarisation

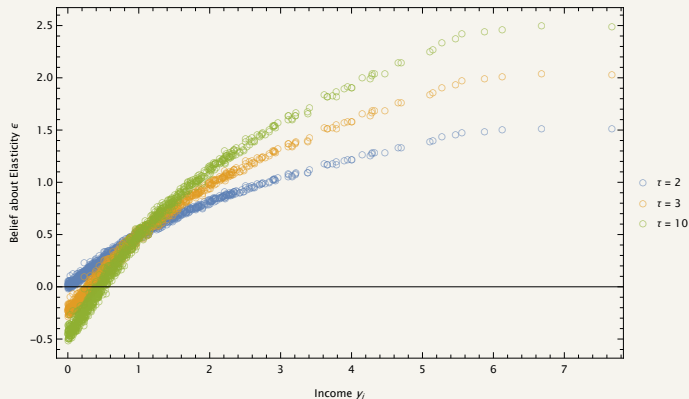


Figure: Agents' beliefs about the elasticity of taxable income  $\epsilon$  against their pre-tax incomes  $y_i$  for  $\rho = 8$ ,  $a = 0.5$ ,  $\lambda = 0.25$  and the true  $\epsilon = 0.5$ . Beliefs are polarized, with poorer agents exhibiting higher trust in tax efficiency. Opinion polarization grows, as is immediately visible by the belief schedules growing steeper through time.

# Dynamic Patterns of (Non-) Convergence and Oscillation

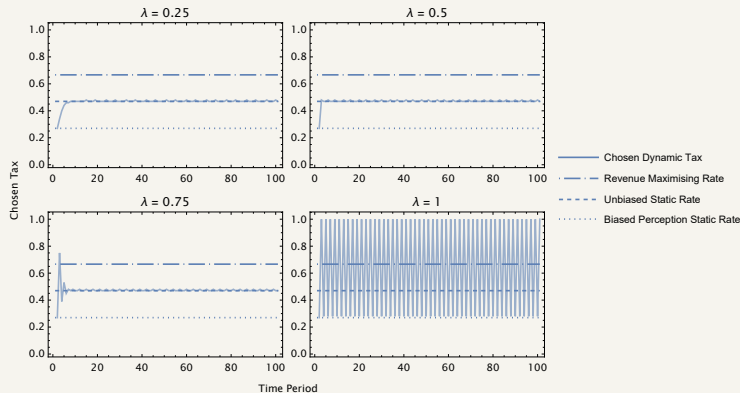


Figure: Chosen tax rates for the dynamical updating process with different error-adjustment parameters  $\lambda \in \{0.25; 0.5; 0.75; 1\}$ . Simulations for  $a = 0.5$ ,  $\rho = 8$  and a true  $\epsilon = 0.5$ .

# Results: Oscillations Without Convergence for High Initial Bias

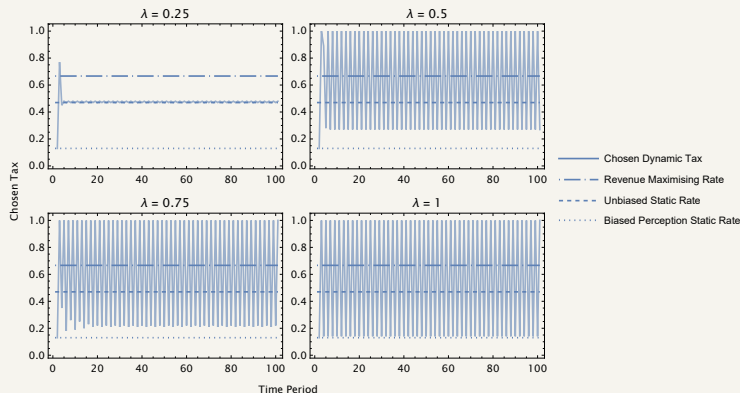


Figure: Chosen tax rates for the dynamical updating process with different error-adjustment parameters  $\lambda \in \{0.25; 0.5; 0.75; 1\}$ . All simulations are conducted for  $a = 0.25$ ,  $\rho = 8$  and a true  $\epsilon = 0.5$ .

# Almost Instantaneous Convergence for Low Initial Bias

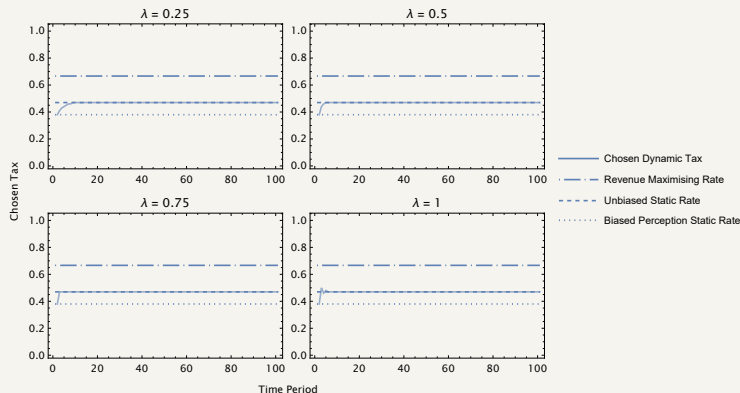


Figure: Chosen tax rates for the dynamical updating process with different error-adjustment parameters  $\lambda \in \{0.25; 0.5; 0.75; 1\}$ . All simulations are conducted for  $a = 0.75$ ,  $\rho = 8$  and a true  $\epsilon = 0.5$ .

## Main Findings

- ▶ Simulation results and empirical preferences consistent with individual perceptions consisting of a localised component and a global signal.
- ▶ Distortion of localised perception because of individuals typically occupying a middle income rank in their ego network
  - ⇒ No appreciation of own benefit from tax.

## Implications

- ▶ Account for lack of connection between actual inequality and redistribution preferences
- ▶ Potential countermeasures:
  - a) Promote knowledge about actual mean income
  - b) Counteract segregation of social contacts

# Other Current and Possible Subprojects

## Baseline Model of Inequality Perception

(SN 70)

## Perceptions of intergroup wage-gaps

(ANS 7 (32))

Importance of global signal and lived experience

- ▶ Perception of intersectionality (wip)

## Homophily, inequality and expenditure cascades

(RBE 10(3))

- ▶ Focus on functional distribution and distribution-growth nexus (accepted for ROPE)
- ▶ Consumption emulation in a SFC model with explicit financial sector (wip)

## Empirical data

(in preparation)

- ▶ Homophily and perception in the POPNET data
- ▶ Studies into inequality perception patterns (planned)

# Save the Date!



Spring School on Perceptions of Wealth Inequality, **March 17 – 28, 2025**, Bamberg  
(with Daria Tisch, MPIfG Cologne and Jan Schulz, Uni Bamberg)

- ▶ Research incubator with associated special issue in Historical Social Research
- ▶ 7 experts from economics, sociology, history, political science and communication studies
- ▶ Travel and accomodation costs fully covered thanks to generous funding by the Volkswagen Foundation



# Thanks for Your Attention! Looking Forward to Your Questions!

[https://www.uni-bamberg.de/fileadmin/uni/fakultaeten/sowi\\_faecher/vwl/BERG/BERG\\_188.pdf](https://www.uni-bamberg.de/fileadmin/uni/fakultaeten/sowi_faecher/vwl/BERG/BERG_188.pdf)





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# Appendix: Linkage PDF I

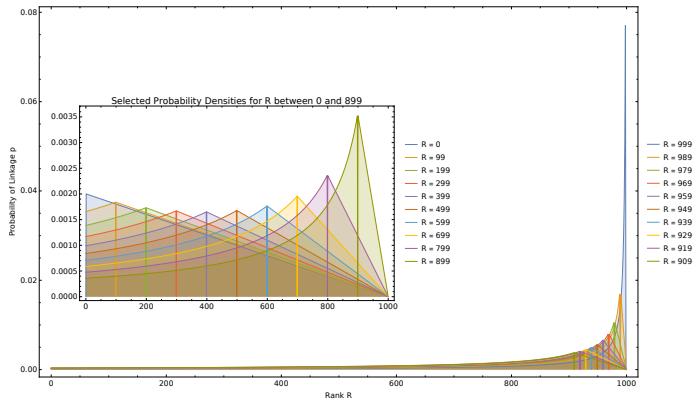


Figure: Theoretical PDF of Linkage Probabilities for Ranks  $R$  and  $\rho = 1$ .

Note: The figure plots the Probability Density Functions (PDFs) of a node with a given income rank for linkage with another node for the whole support of income ranks.



## Appendix: Linkage PDF II

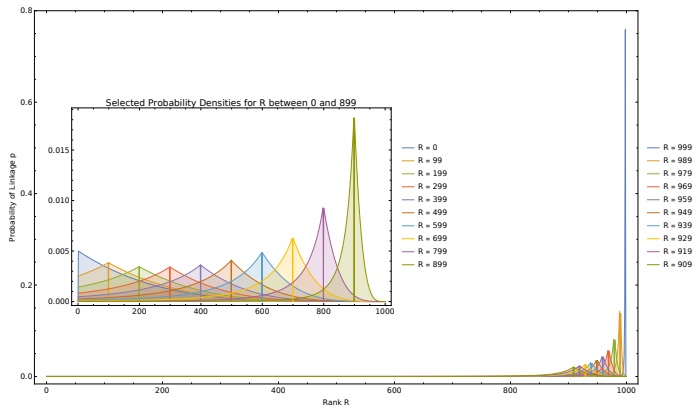


Figure: Theoretical PDF of Linkage Probabilities for Ranks  $R$  and  $\rho = 4$ .

Note: The figure plots the Probability Density Functions (PDFs) of a node with a given income rank for linkage with another node for the whole support of income ranks.

# Appendix: Network Segregation by Income

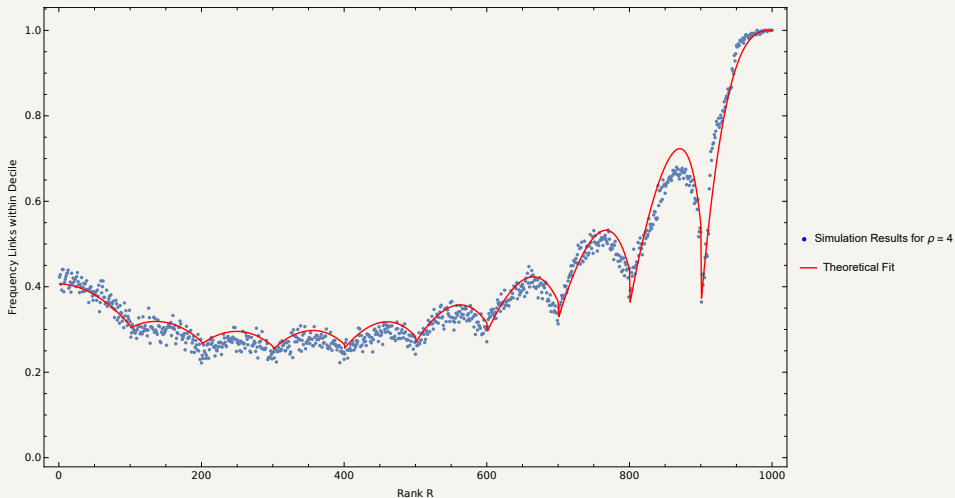


Figure: Links to nodes within the own decile as a function of income rank. Relationship is strongly