

→ bridging.systems

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Bridging Systems

Open Problems for Countering Destructive Divisiveness across
Ranking, Recommenders, and Governance

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Divisiveness appears to be increasing in much of the world, leading to concern about political violence and a decreasing capacity to collaboratively address large-scale societal challenges. In this paper we aim to articulate an interdisciplinary research and practice area focused on what we call *bridging systems*: systems that increase mutual understanding and trust across divides, creating space for productive conflict, deliberation, or cooperation. We give examples of bridging systems across three domains: recommender systems on social media, collective response systems, and human-facilitated group deliberation. We argue that these examples can be more meaningfully understood as processes for *attention allocation* (as opposed to “content distribution” or “amplification”) and develop a corresponding framework to explore similarities—and opportunities for bridging—across these seemingly disparate domains. We focus particularly on the potential of *bridging-based ranking* to bring the benefits of offline bridging into spaces that are already governed by algorithms. Throughout, we suggest research directions that could improve our capacity to incorporate bridging into a world increasingly mediated by algorithms and artificial intelligence.

This document is a draft. A revised version will be published with the
Knight First Amendment Institute at Columbia University.

*Aviv Ovadya is an affiliate at the Berkman Klein Center for Internet & Society, the Knight Center for the Governance of AI, and the Thoughtful Technology Project. This work was supported by the Knight Purpose Fellow at the Harvard Kennedy School's Belter Center (2021-2022).
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Probabilistic Foundations
of Partisan (Un)Sorting

Luke Thorburn
October 2023

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Probabilistic Foundations of Partisan (Un)Sorting

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Motivation

How to quantify bridging?

Of all the ways to operationalize bridging, why is *diverse approval* so common/successful?



How to ground technical approaches to bridging in political, democratic, and peacebuilding theory?

- I. Sortedness
- II. Why unsort?
- III. How to unsort?
- IV. Can we unsort?

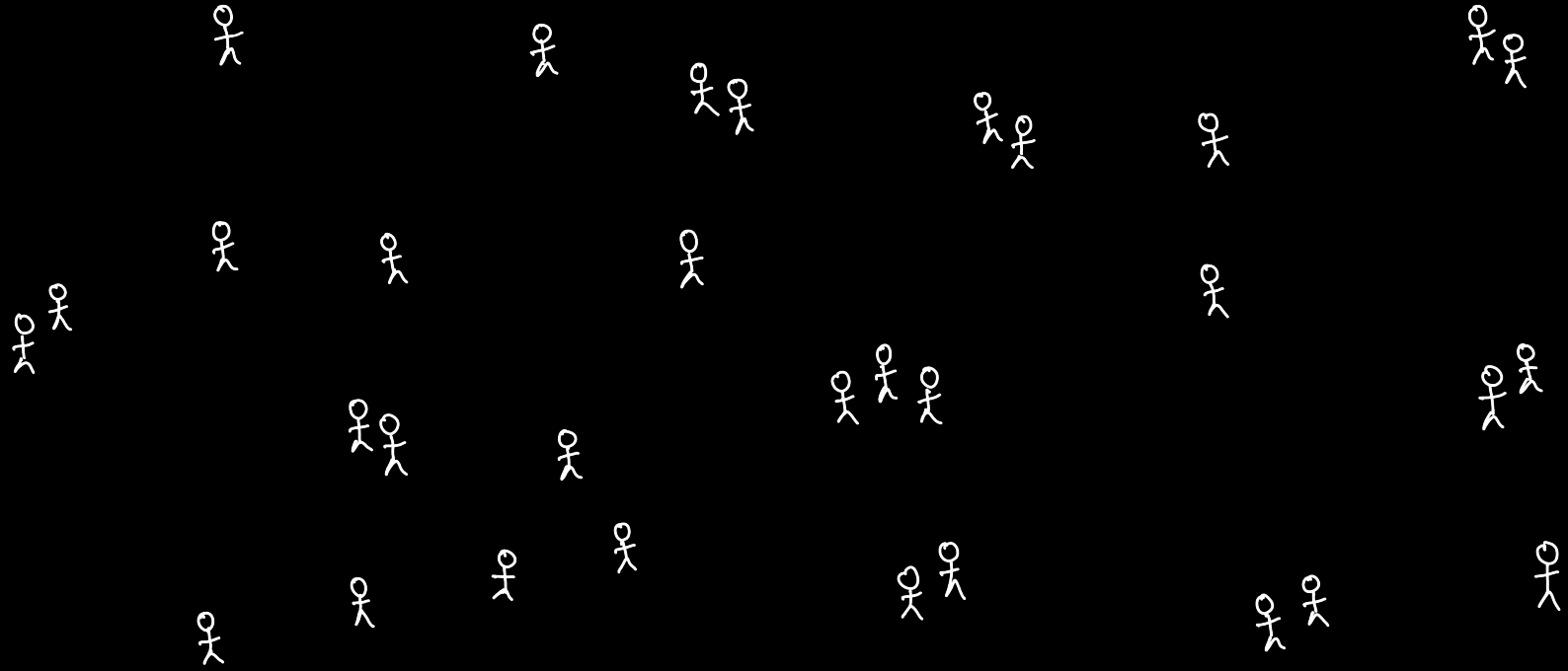
I. Sortedness

II. Why unsort?

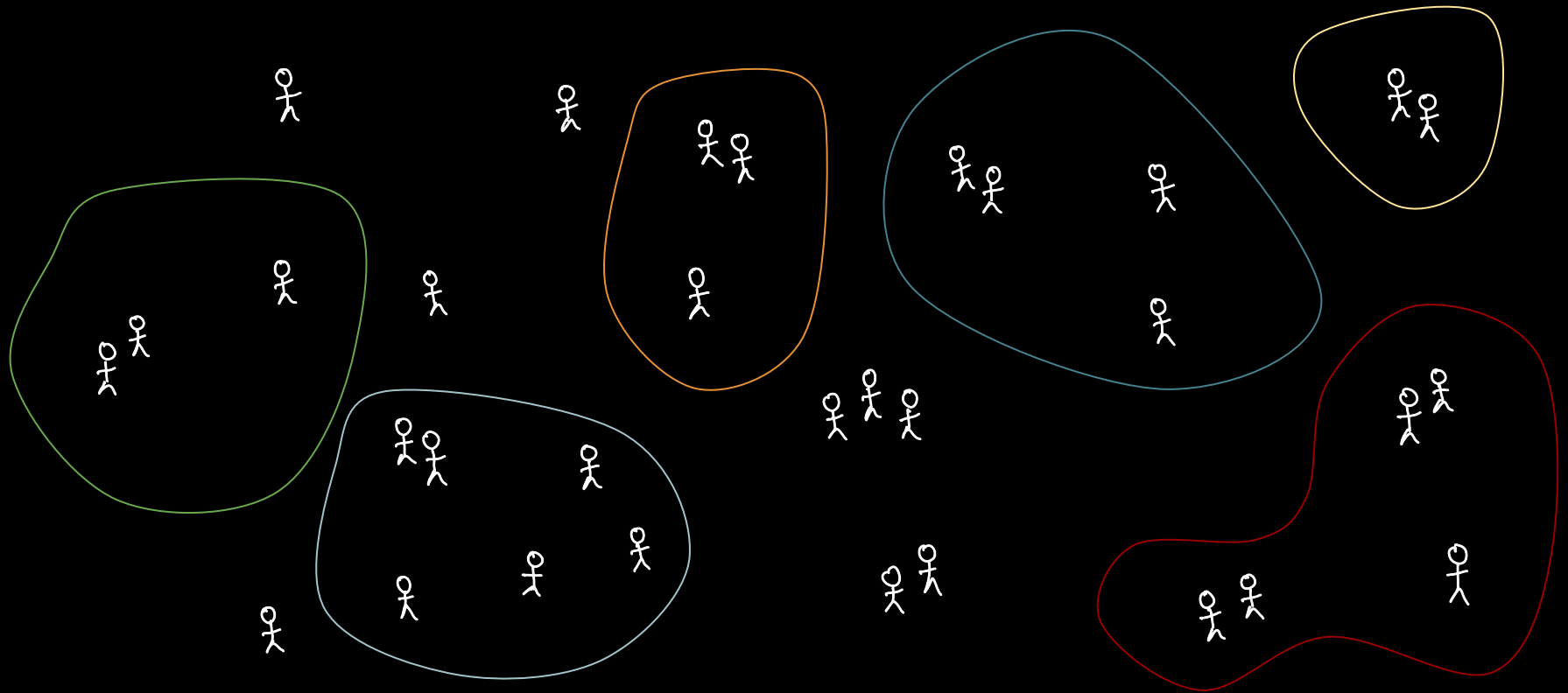
III. How to unsort?

IV. Can we unsort?

Societies are hypergraphs (intersecting groups).



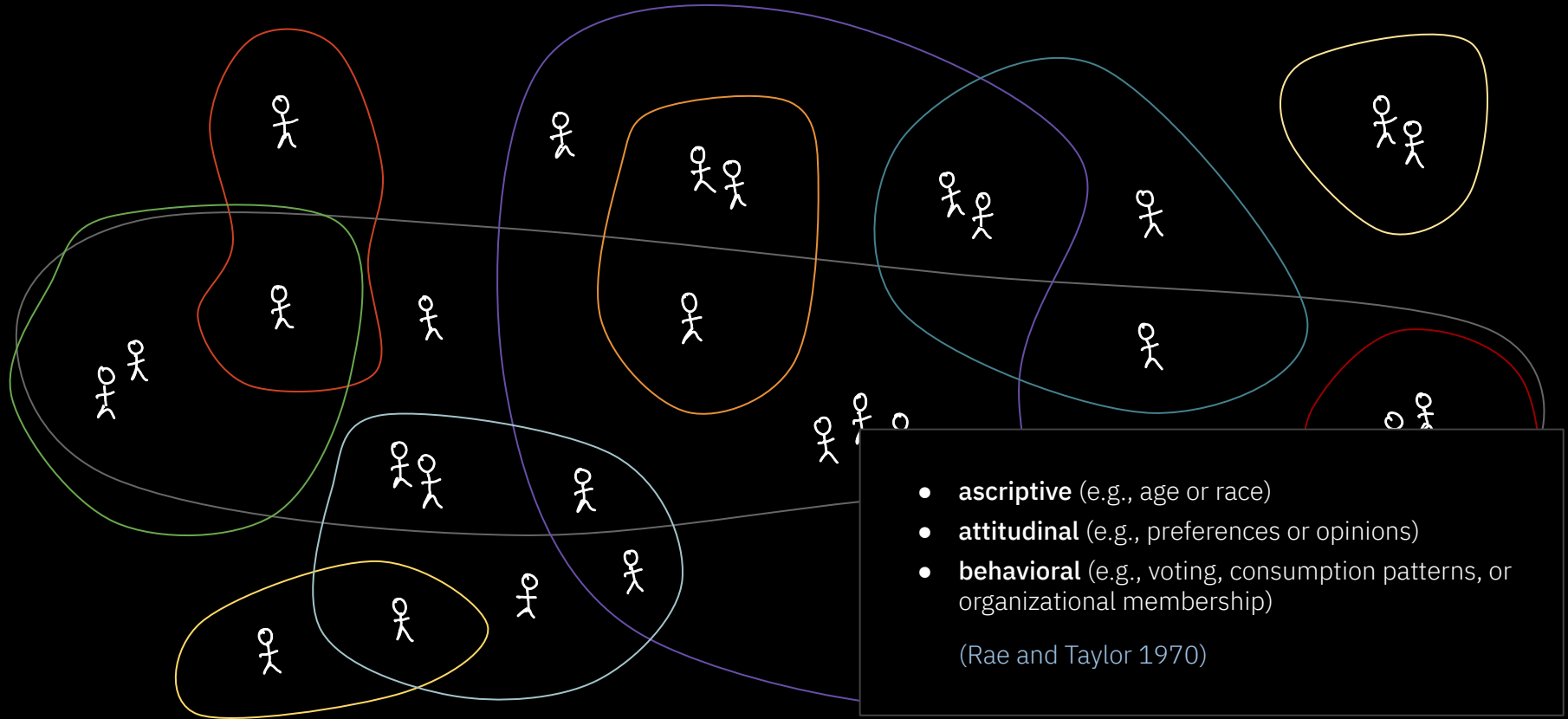
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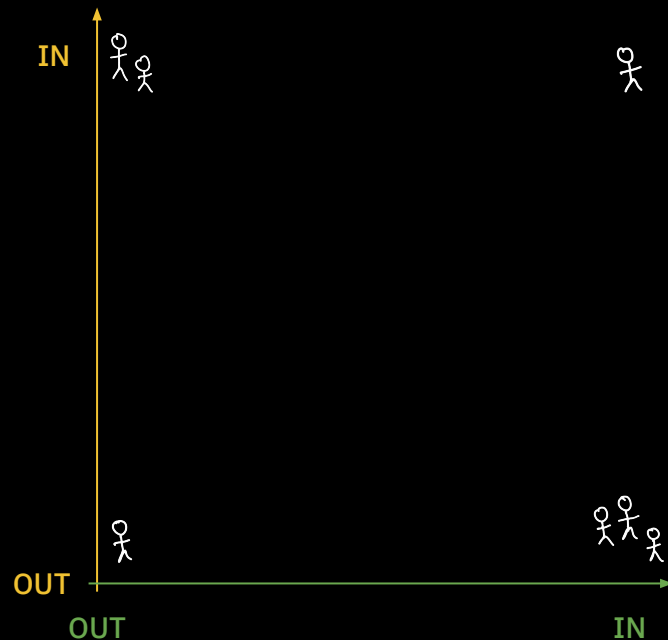
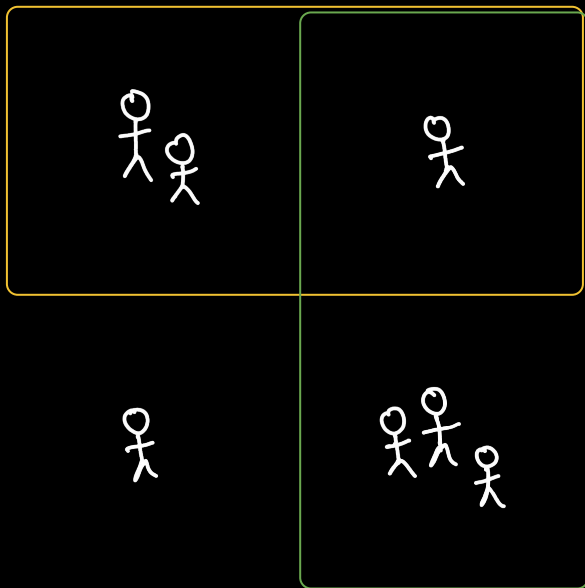
How to quantify the overall amount of crosscutting?



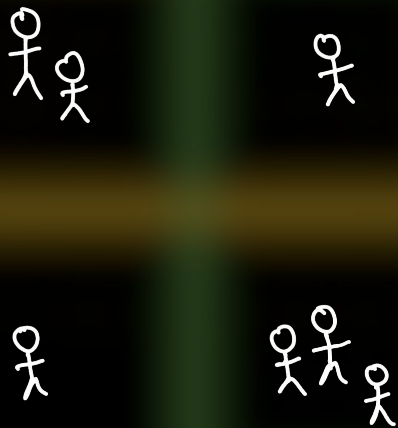
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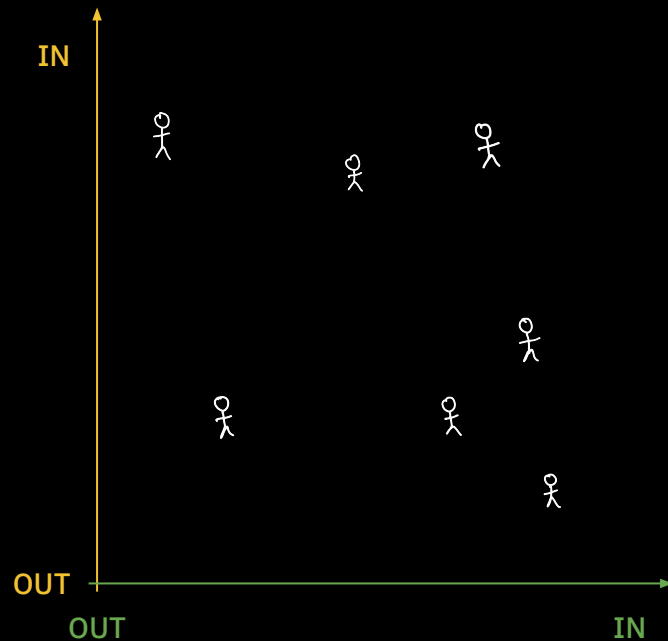
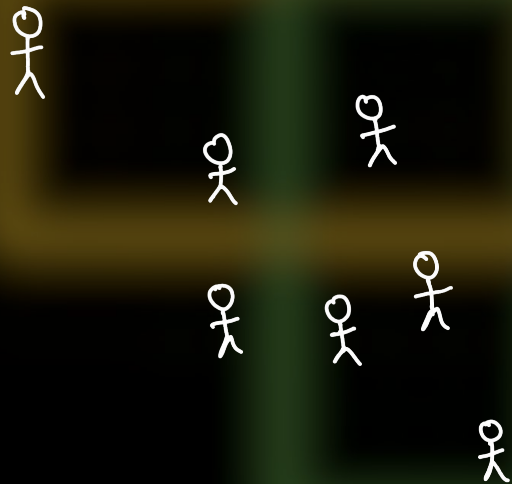
There is a correspondence between hypergraphs and distributions.



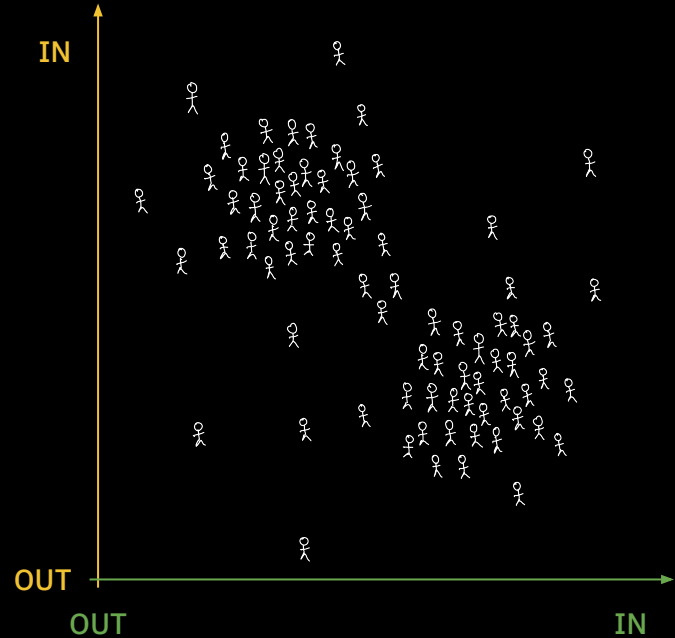
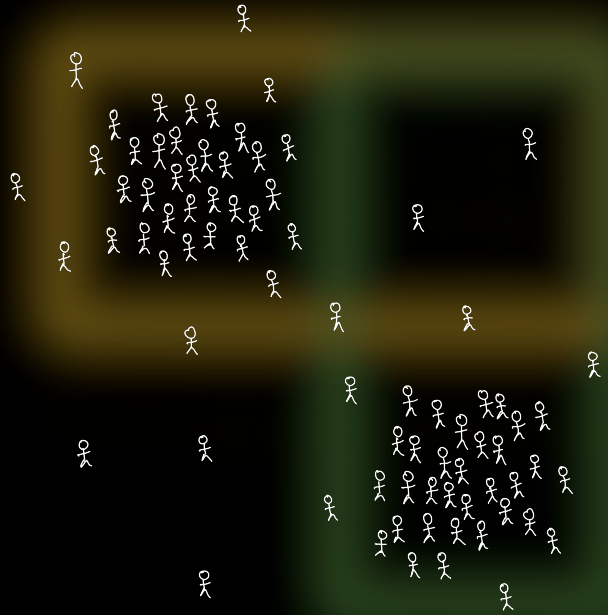
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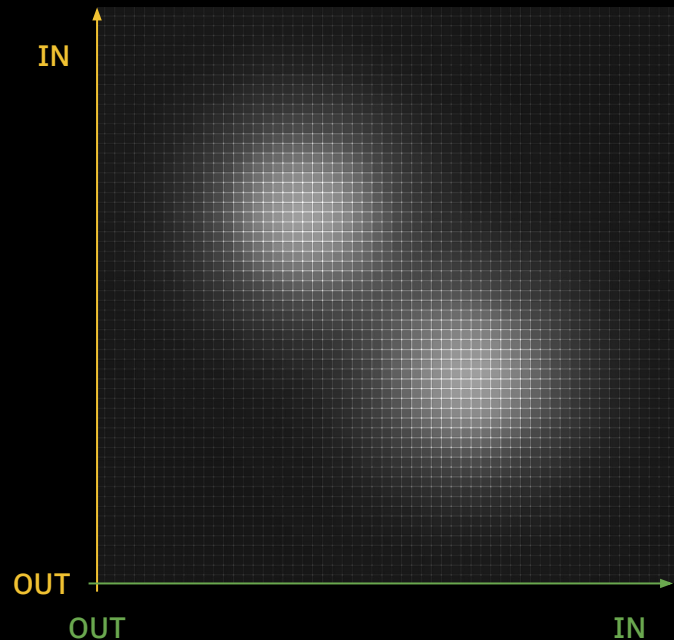
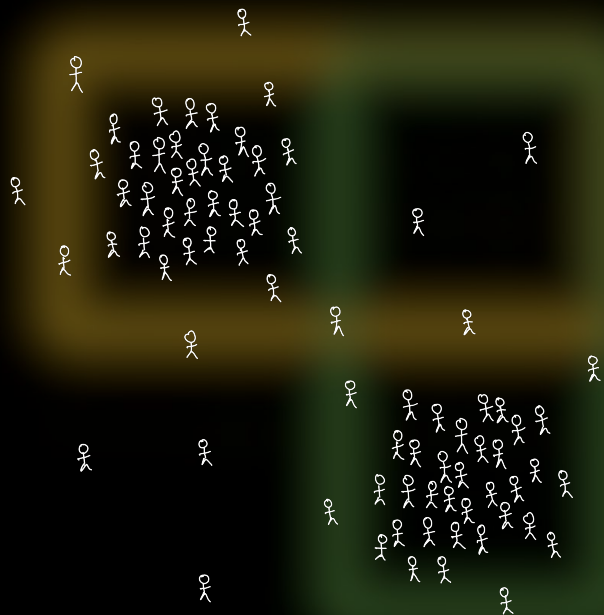
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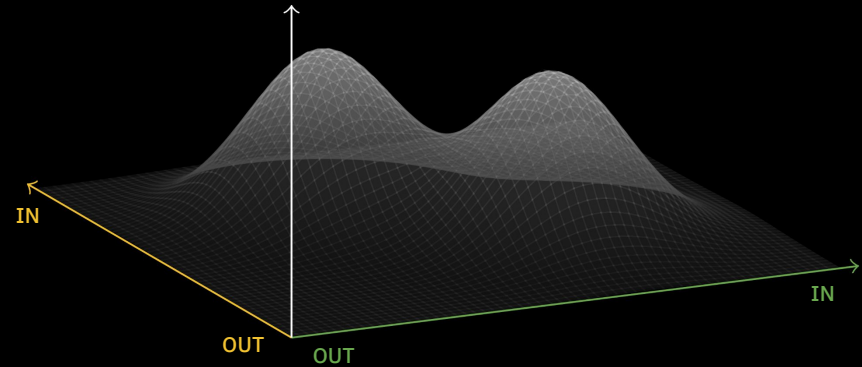
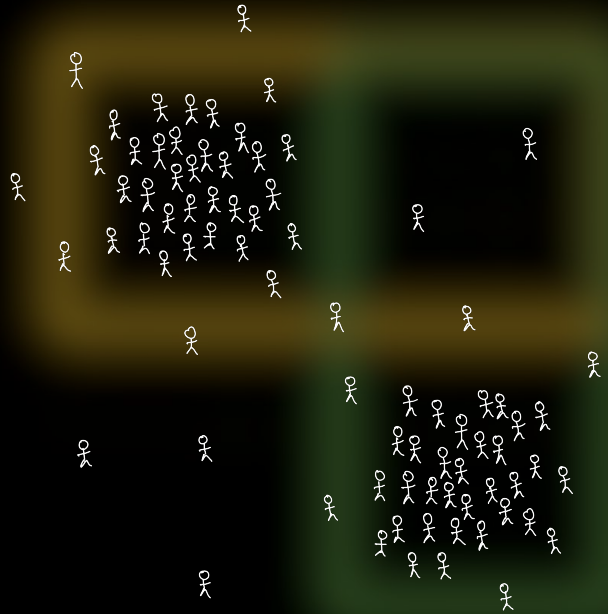
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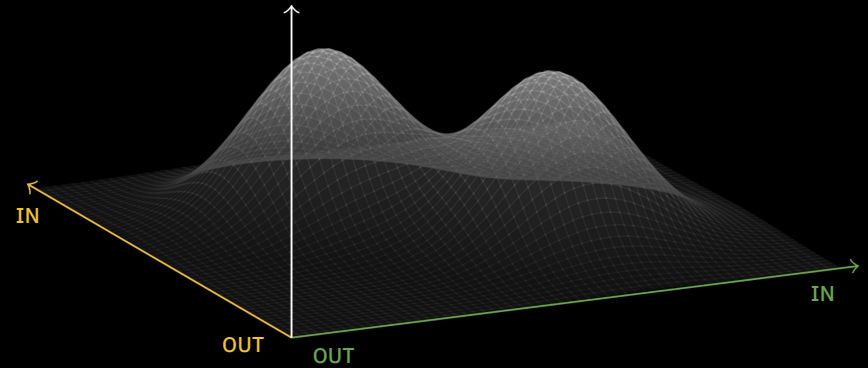
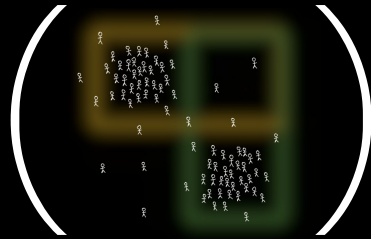


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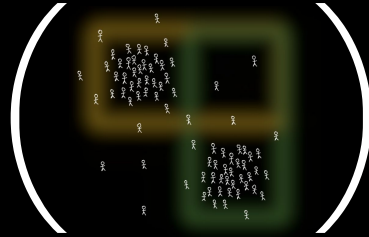
Crosscutting \propto Dependence

Crosscuttingness

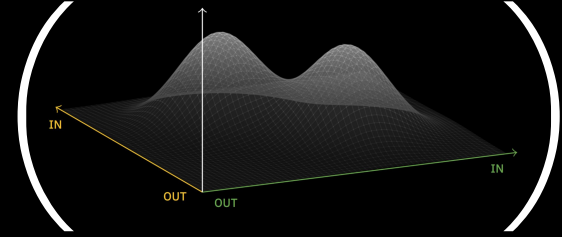


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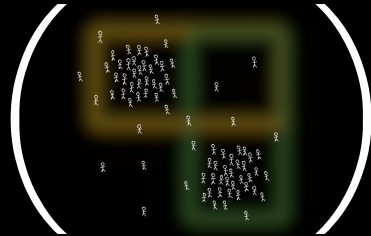


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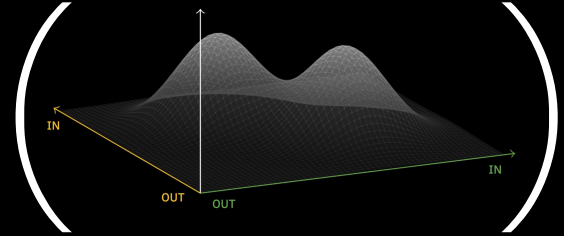


Crosscutting \propto Dependence = Sorting

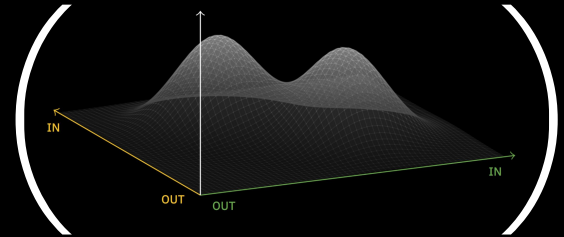
Crosscuttingness



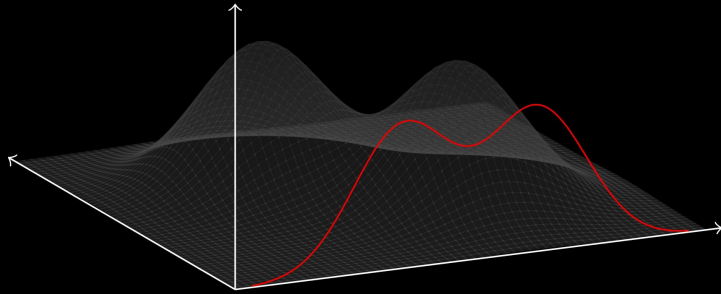
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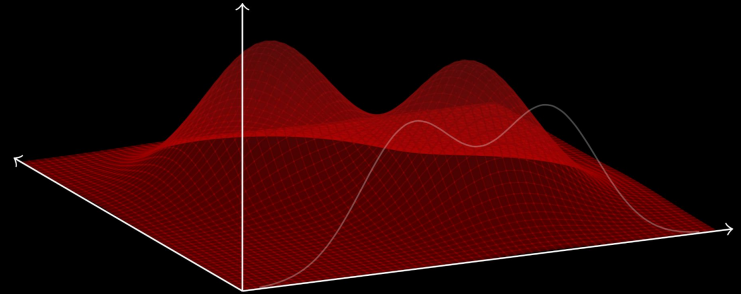
= Sorting



What is sorting?

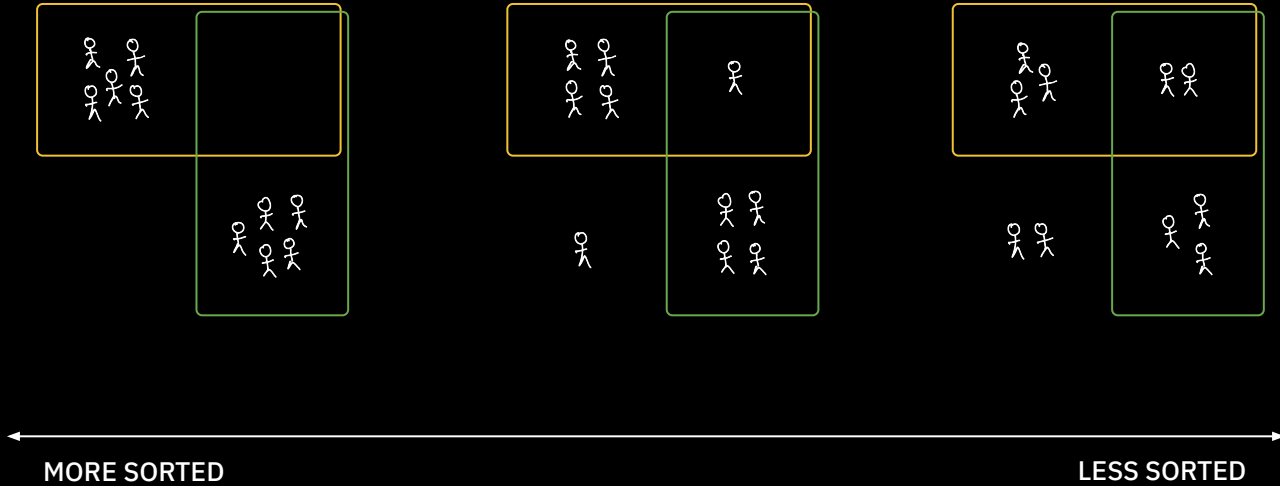


polarization

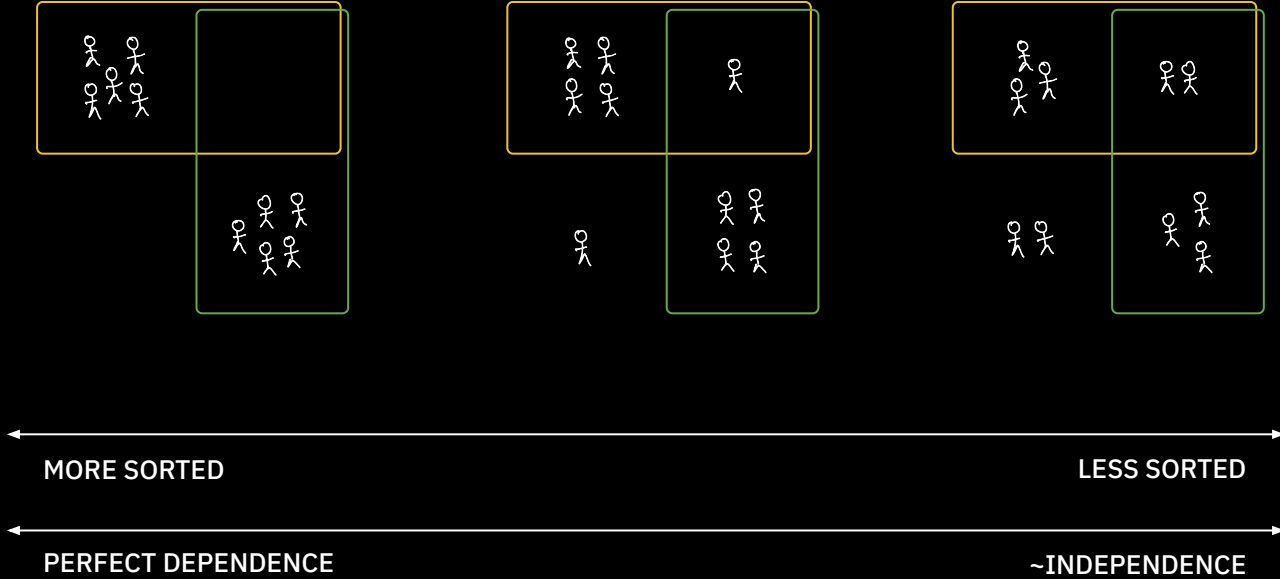


sorting

What is sorting?



What is sorting?



What is sorting?



I. Sortedness

II. Why unsort?

III. How to unsort?

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Sorting is real.

Direct measurement:

(e.g., Abrams et al. 2015, Kaplan et al. 2022)

- ↑ correlations between issue positions
- “no evidence of polarization; the middle has not shrunk”
- ↑ geographic sorting

Explains empirical trends:

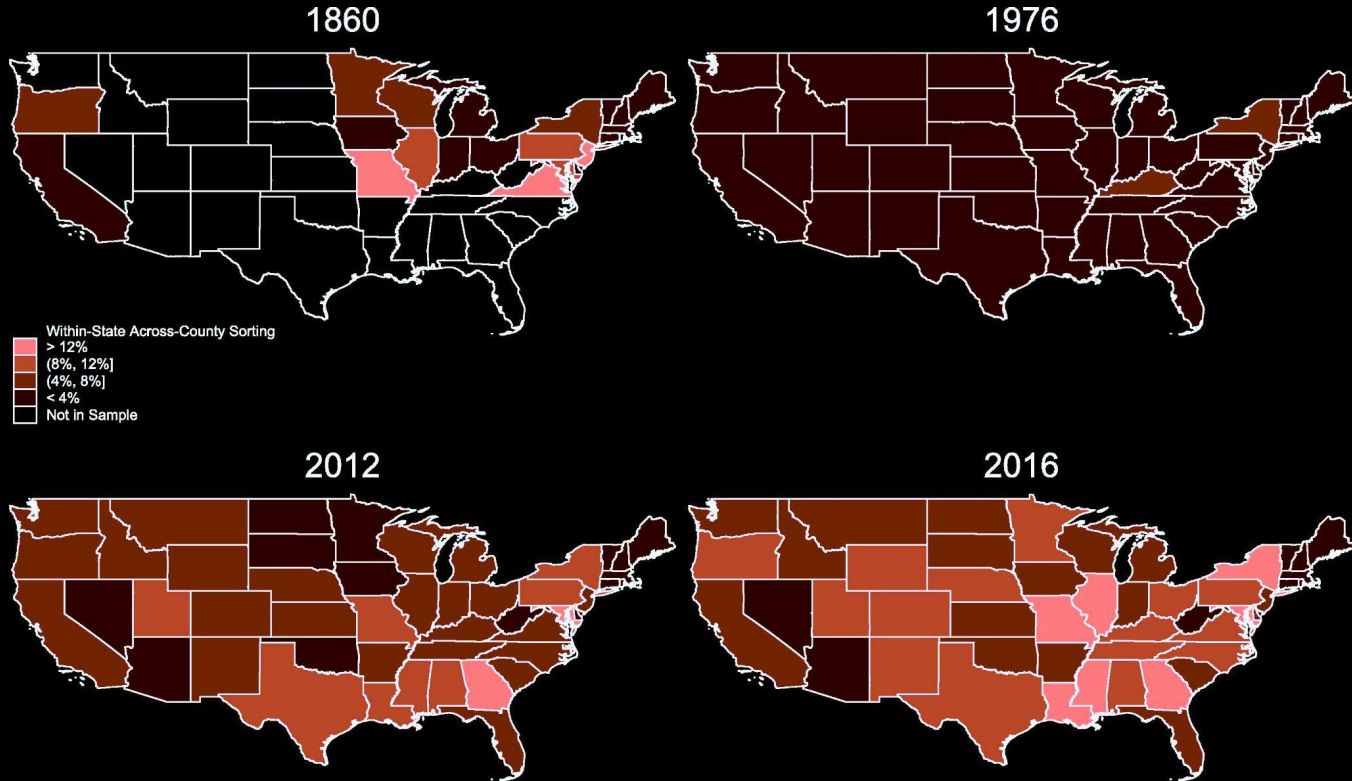
(Levendusky 2009; Abrams & Fiorina 2015; Fiorina 2017)

- ↑ difference in approval ratings
- ↓ split ticket voting
- campaigning to convince → campaigning to mobilize
- ↑ affective polarization

Sorting is bad.

Unsorting is good.

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Sorting is bad.

- ↑ pigeonholing / stereotyping
- ↓ representation of nuanced, crosscutting positions (Fiorina 2016)
- ↑ risk of civil war (Selway 2011; Gubler and Selway 2012; Siroky and Hechter 2016)

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Unsorting is good.

- ↑ “surprising validators” (Glaeser and Sunstein 2014)
- ↑ extent to which any majority will have something in common with a minority
- ↑ weak/long ties → ↑ economic outcomes (Jahani et al., 2023)

Sortedness by other names:

safeguards against factionalism

James Madison, *The Federalist No. 10* (1787)

“intersection of social circles”

Georg Simmel, *Soziologie* (1908)

“overlapping memberships”

Robert Dahl, *A Preface to Democratic Theory* (1956)

“overlapping consensus”

John Rawls, *Political Liberalism* (1993)

“diverse diversities”

Amartya Sen, *Identity and Violence* (2006)

“connected society” / “polypolitanism”

Danielle Allen, *Justice by Means of Democracy* (2023)

Why not unsort?

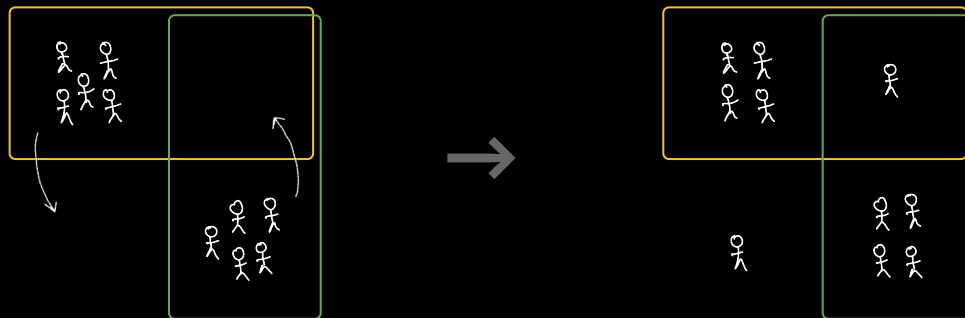
- Probably **too neutral** a goal
- Maybe **absurd if taken to the extreme**
- Maybe **the necessary interventions would be unethical**
- Makes **engaging in politics** more complicated

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Mechanism 1

Conversion



EXAMPLES

common ground

symmacy / common enemies

surprising validation

consilience

weak / long ties

“complicate the narratives”

Most bridging algorithms use “diverse approval”.



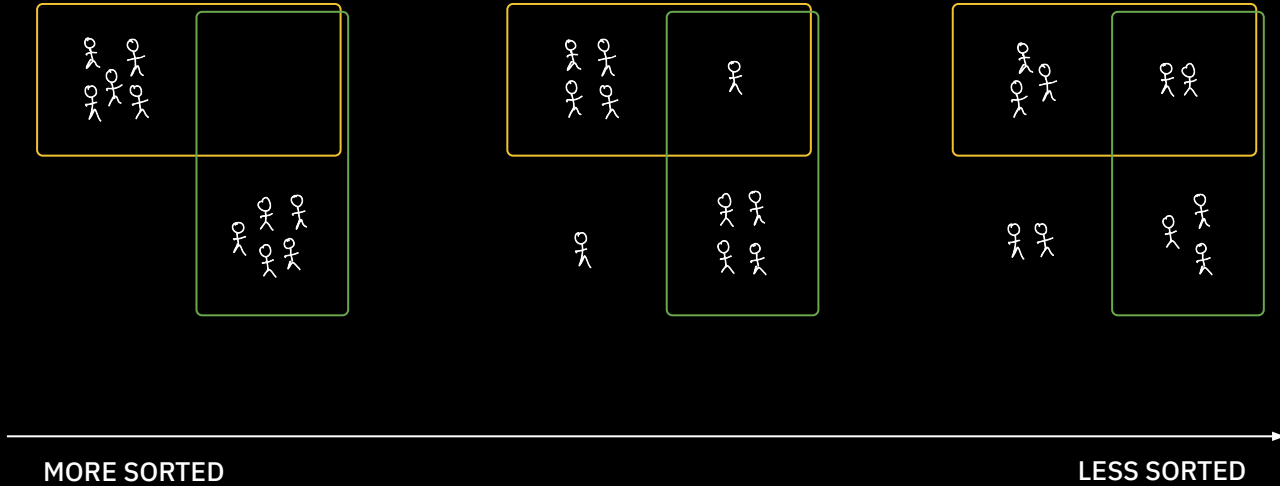
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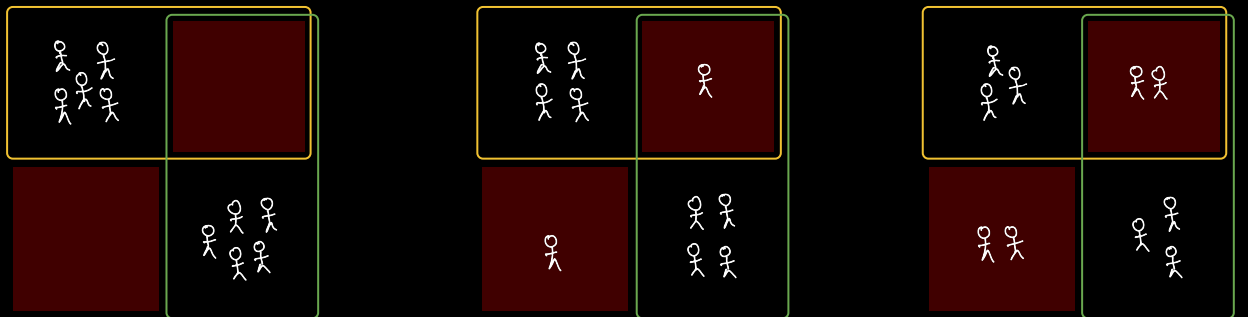
EXAMPLES



Diverse approval selects for unlikely combinations of attributes.



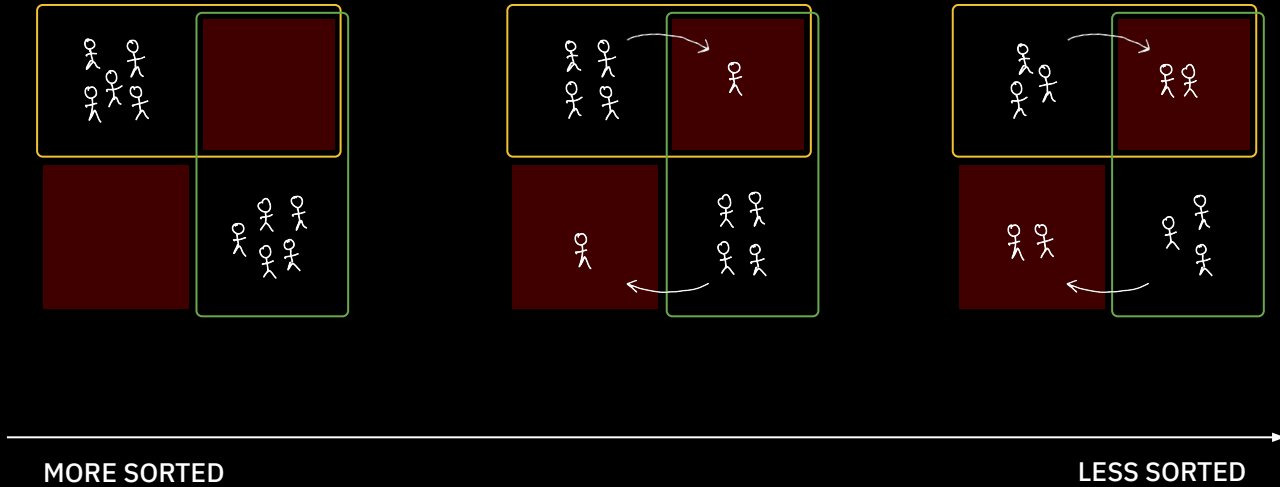
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MORE SORTED

LESS SORTED

Diverse approval selects for unlikely combinations of attributes.



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Cognitive “biases”

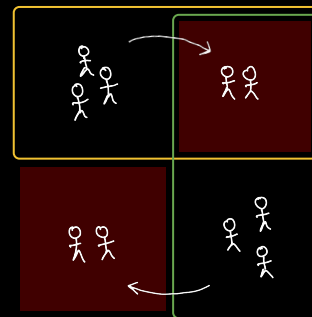
- mere-exposure effect
- illusory truth effect
- experience effects
- anchoring
- pressures to conform

Learning

- learning new facts
- discovering new interests

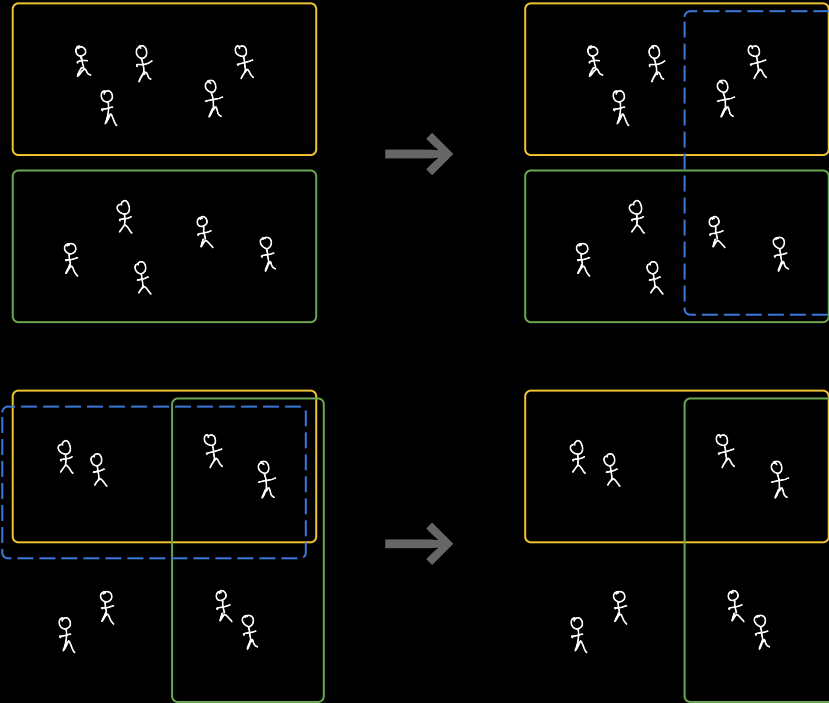
Algorithmic incentives (Brady et al., 2023)

- observational learning
- reinforcement learning
- intentional strategic adaptation



Mechanism 2

Adding or removing groups/dimensions

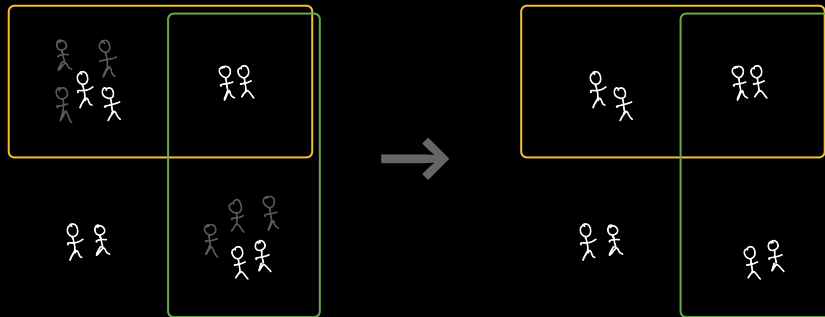
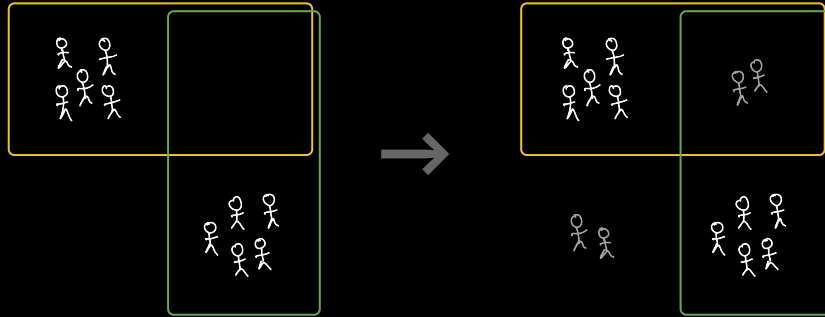


EXAMPLES

humanization
intergroup contact
depoliticization

Mechanism 3

Entry or exit of people



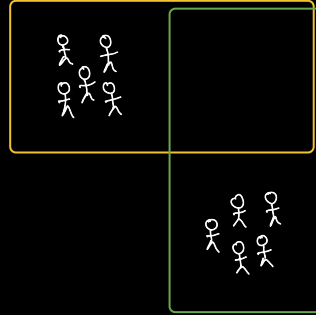
EXAMPLES

- migration
- generational change
- account creation / deletion

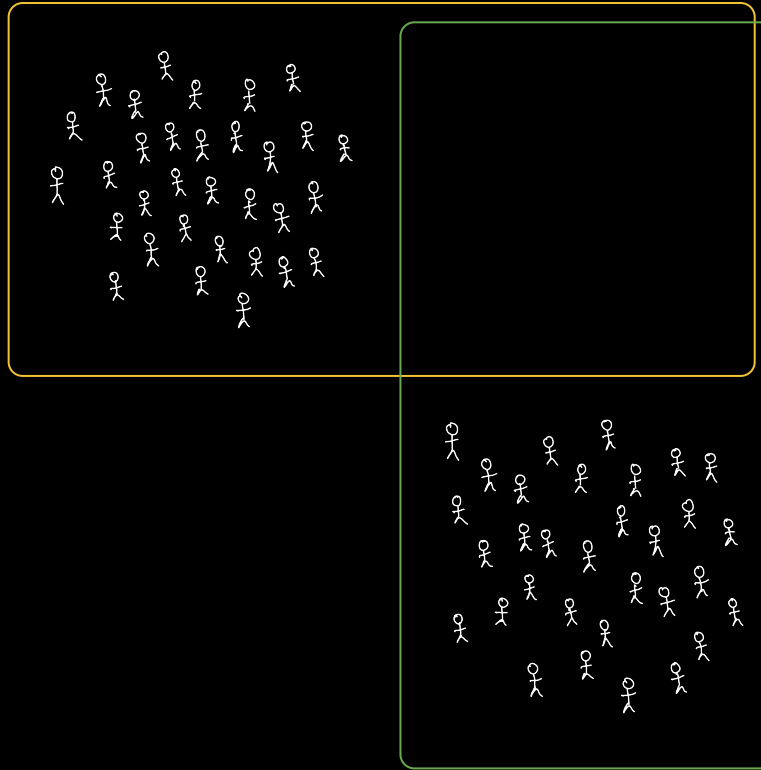
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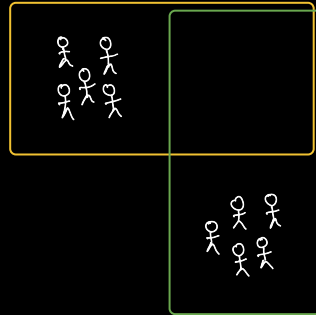
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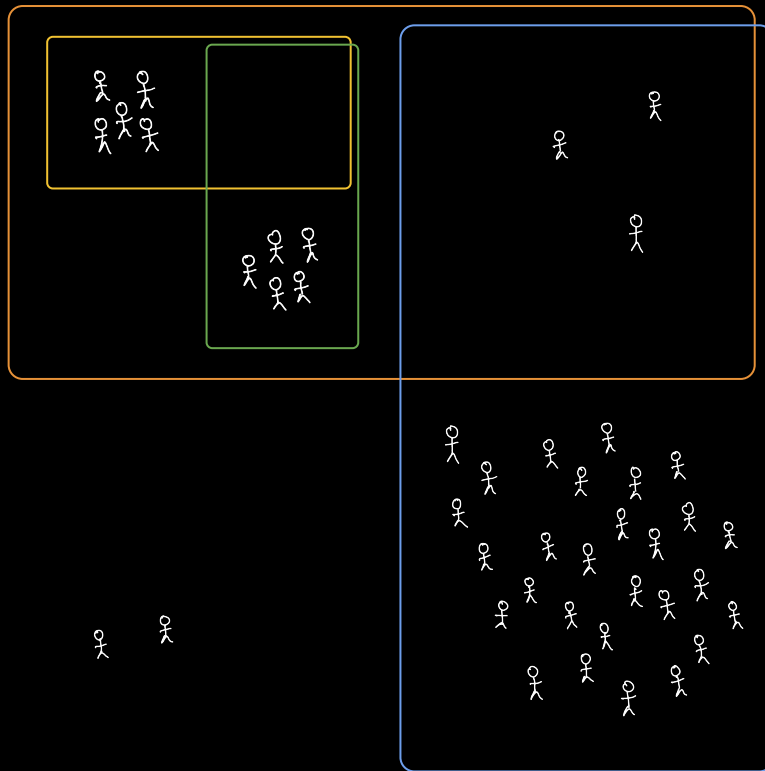
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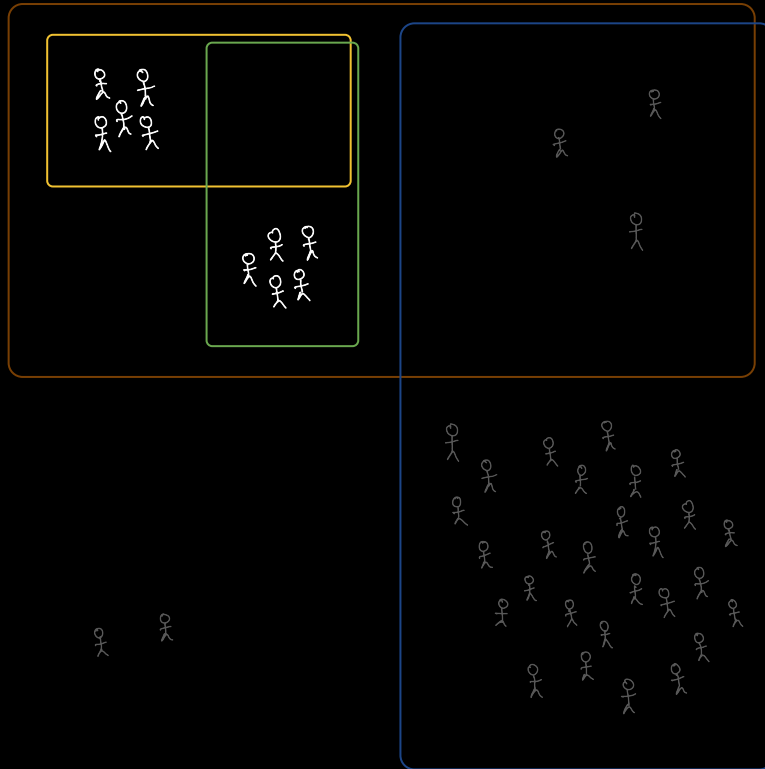
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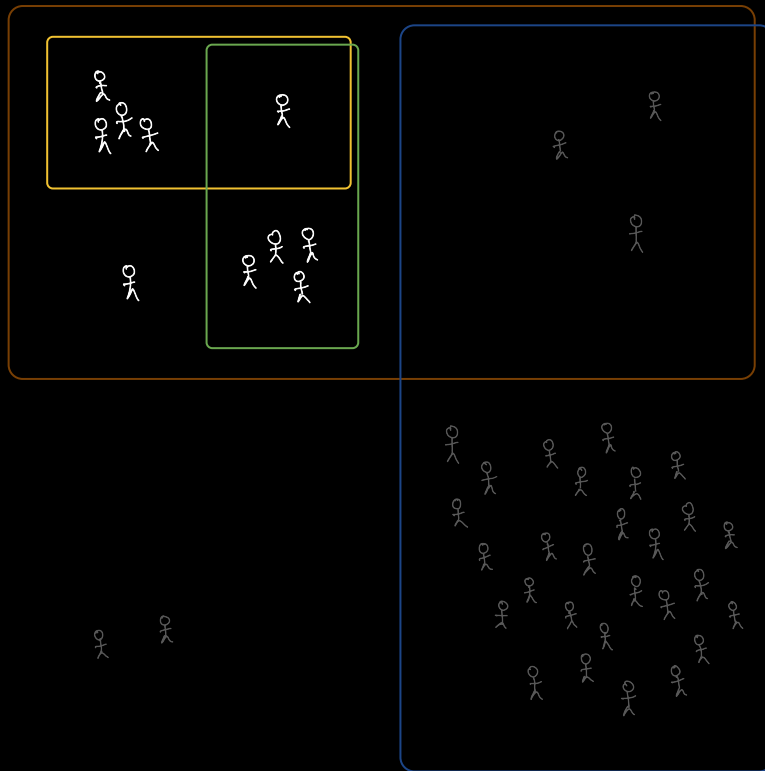
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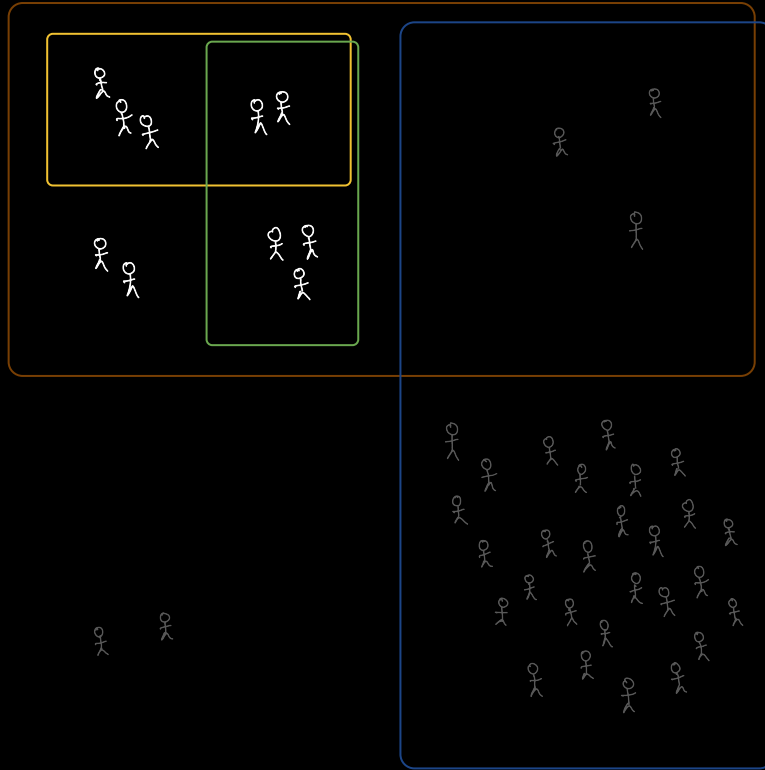
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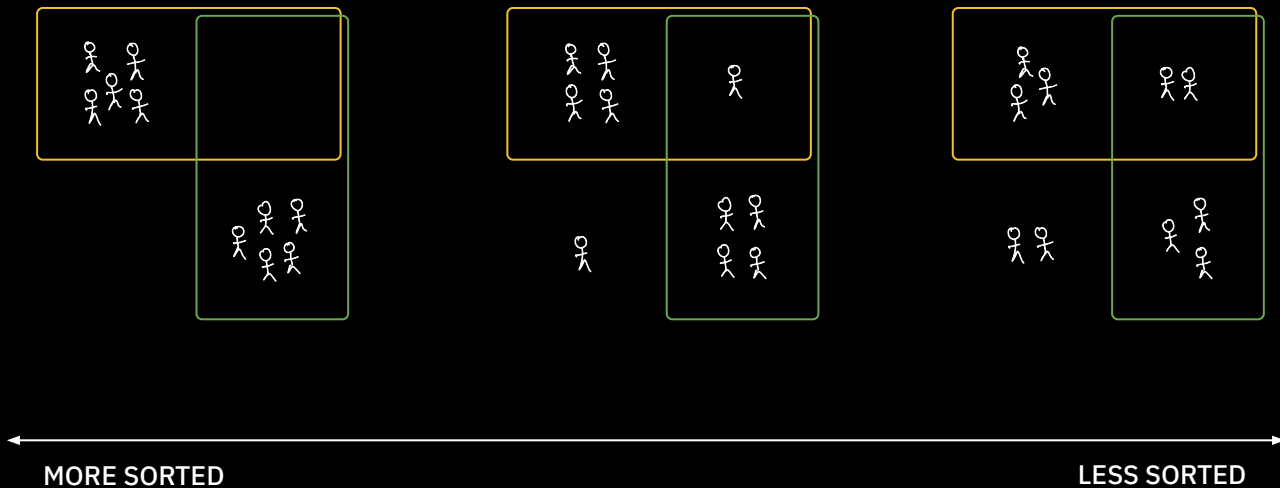
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Sortedness is orthogonal to “public opinion”.



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