

# The diversification of individual research agendas

## A comparison across disciplines and countries

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B E H A V E

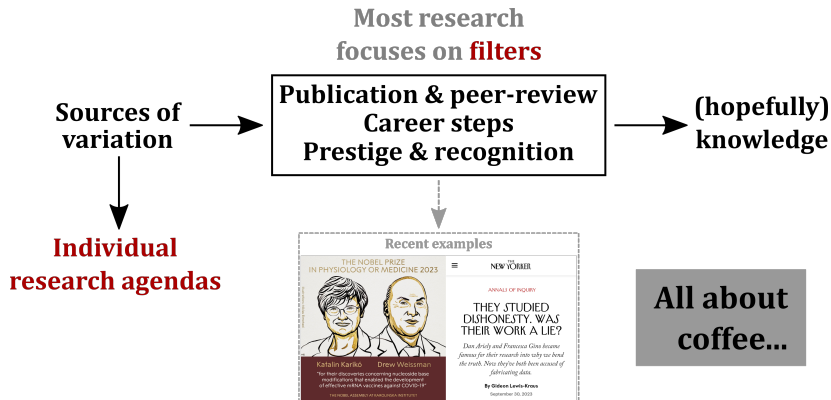
## Overall goal

Investigating the factors affecting the choice of research topics.

- 0 Introductory chapter
- 1 Thirty Years of Climate Change Research. A fine-grained analysis of geographical specialization (under review)
- 2 *The diversification of individual research agendas: a comparison across disciplines and countries* (in progress)
- 3 Who's your peer? An ABM exploration of editors' strategy in reviewer selection (in progress)

(other projects: CIG funding, ERC topics, COST)

# Cartoonish scientific pipeline



# Research agenda diversification

When choosing to pursue a new research line, scholars have to balance between *exploration* and *exploitation* (Kuhn 1977, March 1991).

Under what conditions can scholars (are incentivized to) have a broader (narrower) research agenda?

Relevant factors at different levels of description:

- Individual level (curiosity, seniority, gender, ...)
- Disciplinary level (hierarchy and specialization, ...)
- Institutional level (career systems, funding, mobility, ...)

A promising theoretical framework is the one of *protected space* (Whitley 2000): social and/or technical dependence on others restricts protected space. Varies across disciplines and institutional contexts.

# Design of the study

Comparative study across disciplines and countries (NB: observational).

Selection of fields (soft-hard, lab, paradigms):

- History and Philosophy of Science (HPS, 1207)\*
- Sociology and Political Science (SPS, 3312)
- Economics and Econometrics (ECO, 2002)
- Immunology (IMM, 2403)
- Statistical and Nonlinear Physics (SNP, 3109)

Selection of countries with different models of career progression (internal vs external career, chair system or not):

- Italy
- Norway
- Germany
- Netherlands

# Hypotheses

- H1: Disciplines with higher levels of dependence display lower levels of diversification (higher specialization).
- H1.1: In lab-based disciplines individuals display a delayed increase in diversification during the career (delayed independence).
- H2: Chair systems (and other institutional settings that increase dependence) display lower levels of diversification.
- H3: Mobility is associated with higher diversification (effect and/or selection).

## Iterative data collection via Scopus API

- 1 Publications in field and country
- 2 All publications by authors with at least 2 of those
- 3 Authors with modal field as target

Field	Authors	Observations
HPS	573	5,178
SPS	4,106	37,568
ECO	8,934	63,494
IMM	4,624	108,560
SNP	1,402	68,149
<b>Total</b>	<b>19,639</b>	<b>282,949</b>

# Measurement of research agenda variety

Large Language Models allow to embed documents in a vector space (SentenceBERT, Reimers and Gurevych 2019). We can compute distances in this abstract space.

A continuous measure has advantages over a discrete one: no fixed and arbitrary level of description.

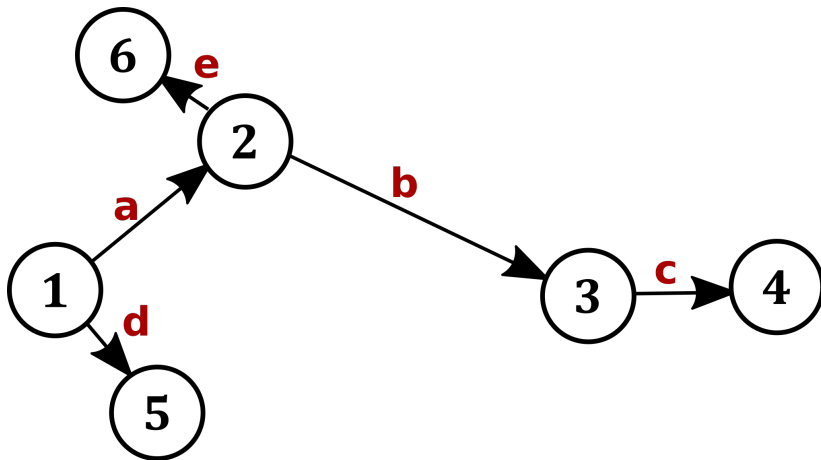
## Outcome of interest

For the given publication, distance from the closest past publication by the focal author

Intuitive interpretation: how far is the given publication from the “comfort zone” of topics you have already published on?



# Example



# Predictors

- Focal author
- Seniority
- Gender
- Country
- Number of authors (scaled by 5)
- New coauthor
- Number of publications (scaled by 10)
- Publication year (scaled by 5)
- Affiliation change
- Country change

Bayesian multilevel model fitted separately for each field:

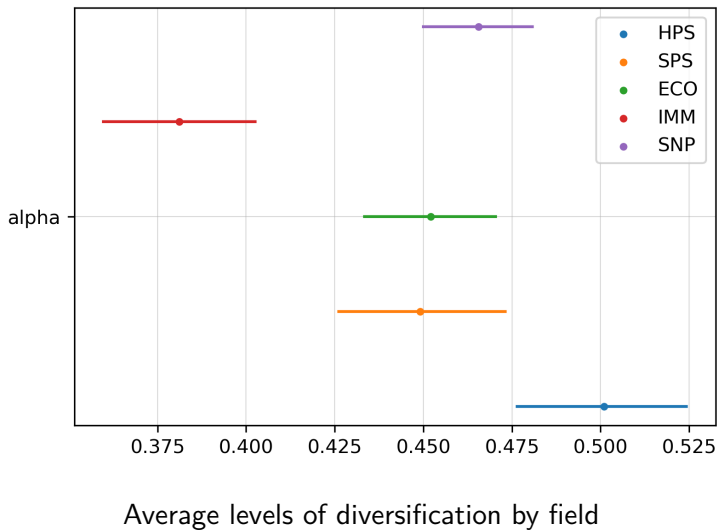
- smoothing prior on time variables (unknown functional form)
- linear model for baseline comparison (robustness check)

Stan - cmdstanpy implementation

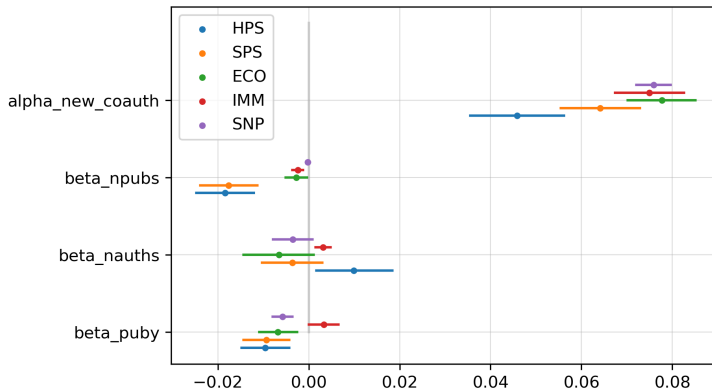


Preliminary results from random subsample of 300 authors per field

# Results - Intercept

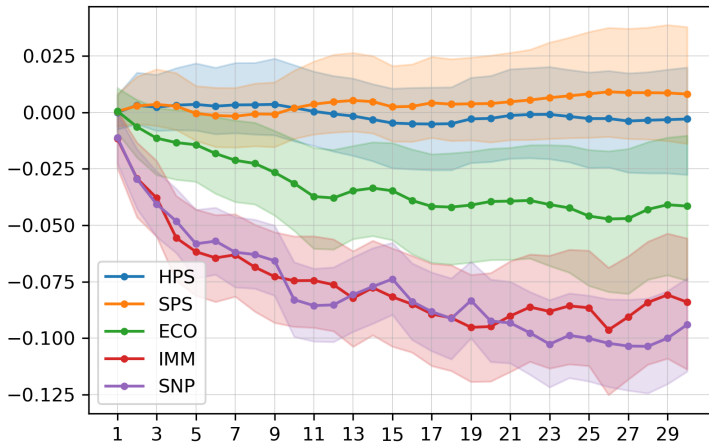


# Results - Linear effects



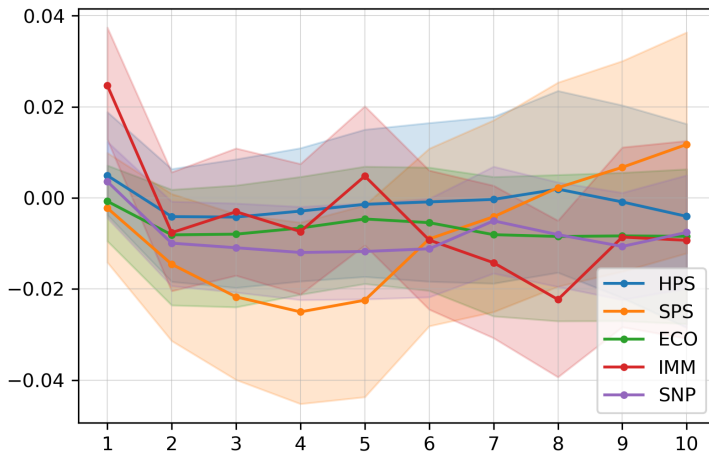
Effect of predictors by field

# Results - Seniority



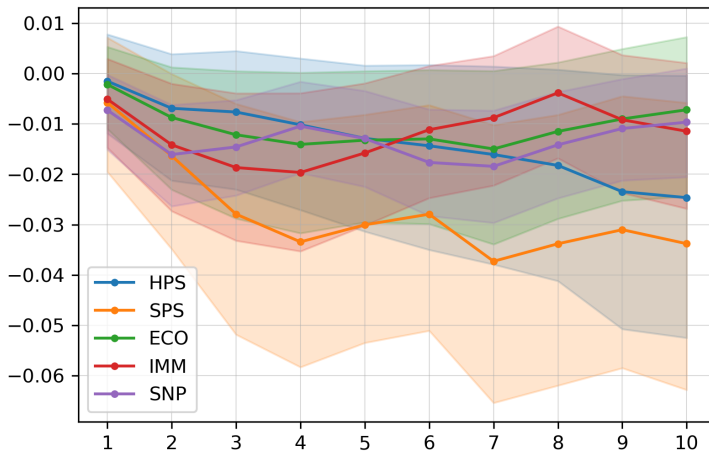
Evolution of variety over the career by field

# Results - Affiliation change



Evolution of variety after mobility by field

# Results - Country change



Evolution of variety after international mobility by field



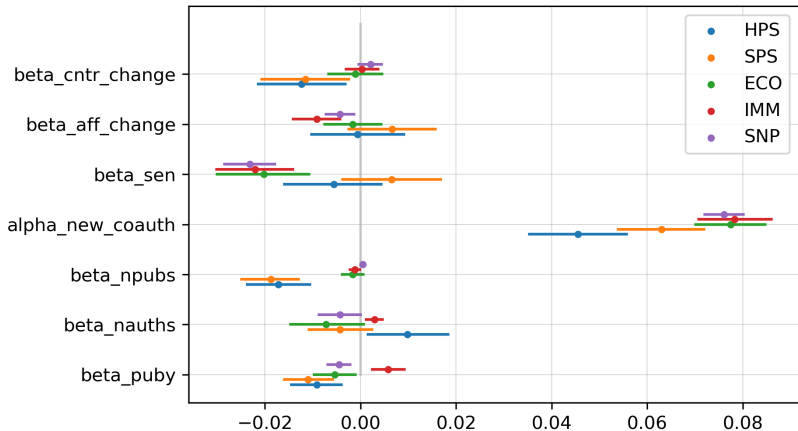
# Conclusions

- Disciplines are the main predictor of the average research agenda diversification
- Specialization is driven by path dependence along the career and mediated by discipline
- Mobility (esp. international) is associated with higher exploitation (cost of moving vs specialization-based mobility; hard to distinguish between effect and selection)
- No striking evidence of difference across institutional systems (low difference / mixing of academic market careers / small sample)

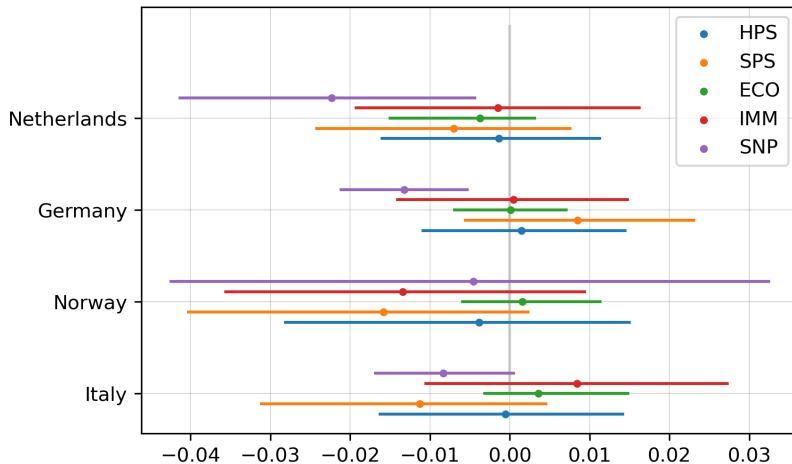
Thanks for your attention

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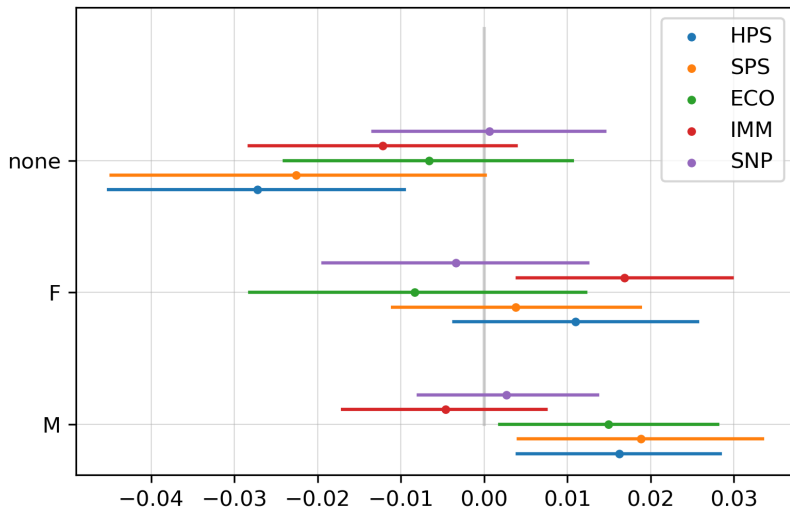
# Linear model



# Country effect



# Gender



# Random distances - field level

