

# Subject Indexing for Author Name Disambiguation

Opportunities and Challenges

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#### **Outline**

- Introduction
- Methods
- Subject indexing for author disambiguation
- Concrete use case at GESIS
- Experimental pre-study
- Multi-level approach:
  - Macro-level
  - Meso (intermediary/group)-level
  - Micro (individual)-level
- Conclusion
- Outlook





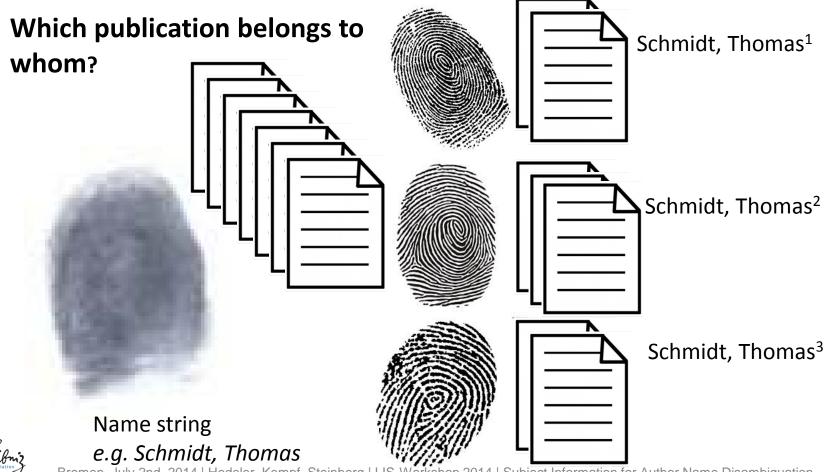
## Introduction (1/2)

- Increased demand for research monitoring
- Increased requirements on reporting systems of research activities
- Increased assessment of researchers/research institutions in terms of their impact
- Research information systems have become increasingly widespread – needed for institutional assessment procedures, accreditations, university rankings etc.
  - > Increased demand for quality-assured data on research activities





## Introduction (2/2)





### Methods for author name disambiguation

### Author grouping methods

 Using clustering techniques on a given data set on the basis of publication properties (co-authors, publication year etc.) to decide whether to group/subdivide publication records assigned to a certain author name.

### Author assignment methods

 Directly assigning each publication to a given author by constructing a model that represents the author (e.g. the probabilities of an author publishing an article with other co-authors, in a given venue or using specific terms in the title of a publication).





### **Publication properties**

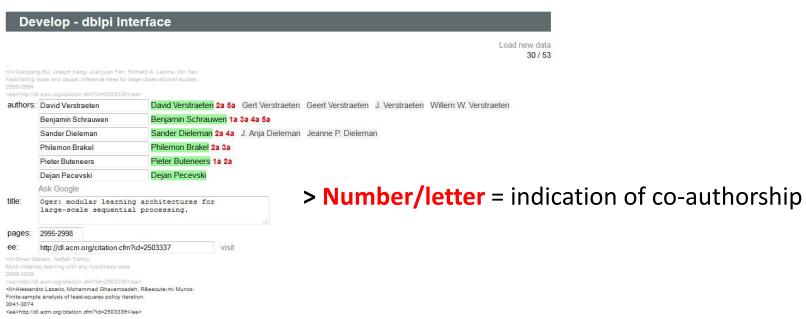
- Publication information:
  - Stream of the name
  - Co-author names (rate of co-authorship depends on the discipline)
  - Affiliations
  - Publication venue title
  - Publication year
  - Keywords from the title
- Additional information:
  - Email addresses
  - Postal addresses
  - Data retrieved from the web





### Example of application (1/2)









## Example of application (2/2)

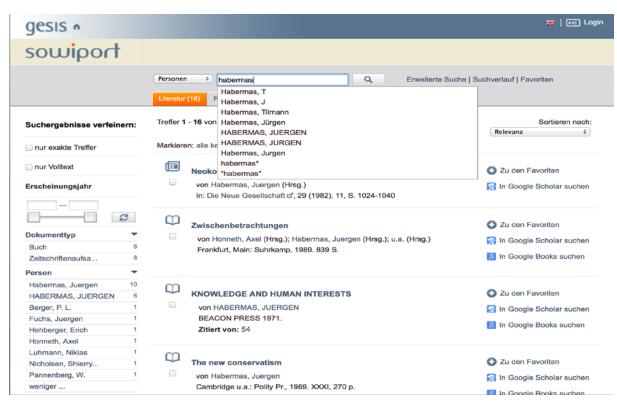
Sonya Coleman	Sean S. Coleman S. R. Coleman S. S. Coleman S
	John S. Coleman <sup>™</sup> Nastaran S. Coleman Robert S.
Bryan Scotney	Bryan A. Scotney T 1d 3a Bryan W. Scotney T 1d 3a
Bryan Gardiner	Bryan Gardiner ST 1d 2a 2b M. B. Gardiner Paul H. B

- > T = indication of time proximity
- > S = indication of topical closeness





#### Concrete use case at GESIS



## **GESIS Portal** sowiport

#### Literature

- 10 different data sources
- about 7,5 million publication records

#### **Future work:**

- > Disambiguation of streams of author names
- > Linking of individualized author name records to persistent identifiers





## Instruments for content cataloguing at GESIS

- Classification for the Social Sciences (CSS)
  - > Disciplinary assignment

- Thesaurus for the Social Sciences (TSS)
  - > Content information





## gesis

#### Leibniz Institute for the Social Sciences

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0100	Grundlagen der Sosialwissenschaften
0101	Allgemeines zu den Sozia wisserschaft
10101	Allgemeines zu den Sozia wisserso a sten, Geschichte der Sozia wisser Ø.
10102	Wissenschaftstheorie, Wissenschafts-
10102	philosophie, Wissenschaftslogik, Ethik
	der Sozialwissenschaften
10103	generelle Theorien der Sozialwissen-
10103	schaften
10104	Forschungsarten der Sozialforschung
10105	Erhebungstechniken und Analyse-
	techniken der Sozialwissenschaften
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10200	Soziologie
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10203	Soziologie von Gesamtgesellschaften
10204	Industrie- und Betriebssoziologie,
	Arbeitssoz., industrielle Beziehungen
10205	Wirtschaftssoziologie
10206	Verkehrssoziologie
10207	Organisationssoziologie, Militärsoz.
10208	Bildungssoziologie
10209	Familiensoziologie, Sexualsoziologie
10210	Jugendsoziologie (auch Kindheit)
10211	Entwicklungsländersoziologie,
	Entwicklungssoziologie
10212	Agrarsoziologie
10213	Siedlungssoziologie, Stadtsoziologie
10214	Kriminalsoziologie, Rechtssoziologie
10215	Medizinsoziologie
10216	Kultur-, Kunst-, Literatursoziologie
10217	Kommunikationssoziologie,
	Sprachsoziologie, Soziolinguistik
10218	Religionssoziologie
10219	Wissenssoziologie
10220	Wissenschaftssoziologie,
10299	Sonstiges zur Soziolog.
10300	

10300	Demographie
10301	Allgemeines zur Demographie,
	spezielle Theorien, Geschichte
10302	Lehre, Studium, Organisationen
10303	Bevölkerung, Bevölkerungssoziologie
10304	Migration, Migrationssoziologie
10305	Wirtschafts- u. Sozialgeographie
10399	Sonstiges zur Demographie

Ethnologie, Kulturanthropologie

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Sozialpolitik

Sozialpolitik

Arbeitswelt

soziale Sicherung

Vermögenspolitik

Gesundheitspolitik

wissenschaften

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Einkommens-, Lohn-, Tarifpolitik,

Familien-, Jugend-, Altenpolitik

Arpensmarkt- und berurstorschung

Gerontologie, Alterssoziologie

Freizeitforschung, Freizeitsoziologie

Allgemeines zur Sozialarbeit, spezielle

Lehre, Studium, Organisationen der

Sozialpädagogik, Sozialplanung

Raumplanung, Regionalforschung

sonstige Bereiche der angewandten

Literaturwissenschaft, Linguistik

sonstine Geisteswissenschaften

Rechts- und Verwaltungswissensc

Technik- und Naturwissenschaften

Sonstiges zur Sozialpolitik interdisziplinäre Gebiete der Sozial-

Arbeitsmarktforschung Berufsforschung, Berufssoziologie

Arbeitsmarktpolitik

Frauenforschung

soziale Probleme

Theorien, Geschichte

Sozialwesen, Sozialarbeit,

Sonstiges zur Sozialarbeit

Technikfolgenabschätzung

Sozialwissenschaften

Geisteswissenschaften Philosophie Ethik Religion

allgemeine Geschichte

Sozialgeschichte

Rechtswissenschaft

Naturwissenschaften

Sozialmedizin, Medizi

Verwaltungswissenschaft

Sozialarbeit

Sozialarbeit

Ökologie

Geschichte

Recht

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#### Classification cross-concordances

Bilateral mapping between CCS and DDC (CSS > DDC / DDC > CSS )
 (2012/2013)

	kation issenschaften imerkungen)	Rela- tion	Rele- vanz	Dewey-Dezimalklassifikation (inkl. Anmerkungen)				
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	(Hochschule, Fachhochschule, Universitäten) Beispiele: Studium, Lehrerausbildung			30 Schalvissenschaften 31 Bildung und Erdehung 318 Hochschalbildung (Retländereich) 319.01 Philosophie und Theorie 319.02 Verschiedenes 319.035-329.05 Standardschlüssel 319.05 Organisationen 319.02 Ausbildung Fürschung, verwandte Themen 319.03 Personengruppen 319.03 Geschichte, geografische Behandlung, Biografien 319.01 Hochschulbildung mit specifischen Zeilen 319.03-329.02 Einzelne Aften von Hochschulen und Universitäten				

Start voc.	End voc. (main panels)	Rel. in total	Exact Match	Broader Match	Narrower Match	Null Rel.	Simple Matches	Multiple Matches (1:n)	Multiple Matches (n:1)
159	>27,000	169	45	15	89	1	20	41	16





### Thesaurus for the Social Sciences (since 1979)



- Translation into English, French, (Russian)
- About 8,000 subject headings
- About 4,000 nondescriptors/synonyms
- Classification scheme
- Cross-concordances to other vocabularies
- Indexing practice: 10-15
   subject headings/document





#### Thesaurus cross-concordances

- Major terminology mapping initiative (KoMoHe: 2004 2007) funded by the German Federal Ministry of Education and Research
- Mapped vocabularies i.a. AGROVOC, Medical Subject Headings (MeSH), Thesaurus for Economics (STW)

Start voc.	End voc.	Rel. in total	Equiv. Rel.	BT-Rel.	NT-Rel.	Assoc. Rel.	Null-Rel.	Start terms	End terms	Term combi- nations
TSS	IAF (SWD)	8,208	7,098	295	292	356	160	7,662	6,838	551
IAF (SWD)	TSS	9,432	6,276	1,831	134	640	594	8,890	5,556	182

TSS > IAF/IAF > TSS: Bilateral cross-concordance is mutually continuously developed





### **Experimental pre-study**

- Research question:
  - Can topic information (subject headings, class notations) help to distinguish between different authors with the same name?
- Data set: Social Science Research Literature Information System (SOLIS) (since 1978):
  - Bibliographic records including content information on German social science literature (monographs, compilations, journal articles (300 journals) and grey literature)
  - 450,000 social science publications (Jan. 2014) from 1945-
- > At this point of our study we perceive name records in SOLIS as being fully disambiguated.



### Experimental pre-study – set up

- Approach: Longitudinal analysis of content information
  - Publication years: 1954 2013
  - "Profiling" of authors (more than two publications): 63,683 author names (81.14% of publications in single authorship)
  - Multi-level approach:
    - Macro-level: How discriminative/expressive are subject headings/class notations in general?
    - Meso- (group) level: How do topic distributions of research interests along a career look like?
      - Group 1 (5-10 years of publication activity): 16,108 author names
      - Group 2 (20-30 years of publication activity): 7,953 author names
      - Group 3 (40-50 years of publication activity): 482 author names
    - Micro-level:

How do individual topic distributions of research interests along a career look like?

- Group 1 (5-10 years of publication activity): one example
- Group 2 (20-30 years of publication activity): two examples
- Group 3 (40-50 years of publication activity): one example





### Subject headings

- Mean value of subject headings (whole thesaurus) for the average author: 48.11
- Mean value of authors per subject heading (whole thesaurus): 375.46
- for the selection of publications we have included in our pre-study frequencies of use (subject heading/author) range from 1 author (e.g. official title – ger. Amtsbezeichnung) to 29,599 authors (historical development)



## Classification (1/2)

- Mean value of classes (whole classification) for the average author: 6.57
- Mean value of core classes (#1....) for the average author: 6.02
- Mean value of aggregated classes (first 3 digits of classification ID for whole classification) for the average author: 3.98
- Mean value of aggregated core classes (first 3 digits of classification ID for core classes) for the average author: 3.47



## Classification (2/2)

- Average number of author names per class (whole classification): 2,631
- Average number of author names per class (core classes): 2,655
- Average number of author names per aggregated class (first 3 digits of class-ID – whole classification): 7,908
- Average number of author names per aggregated class (first 3 digits of class-ID) of core classes: 10,421
  - > The coverage of the core areas/classes is higher than for the more marginal areas/classes of the classification.





#### Classification

- Average number of classes per author (1<sup>st</sup> group: 5-10 years of publication):
  - Whole classification: 5.45
  - Aggregated classes: 3.61
- Average number of classes per author (2<sup>nd</sup> group: 20-30 years of publication):
  - Whole classification: 10.98
  - Aggregated classes: 5.79
- Average number of classes per author (3<sup>rd</sup> group: 40-50 years of publication):
  - Whole classification: 21.50
  - Aggregated classes: 9.31





### Subject headings

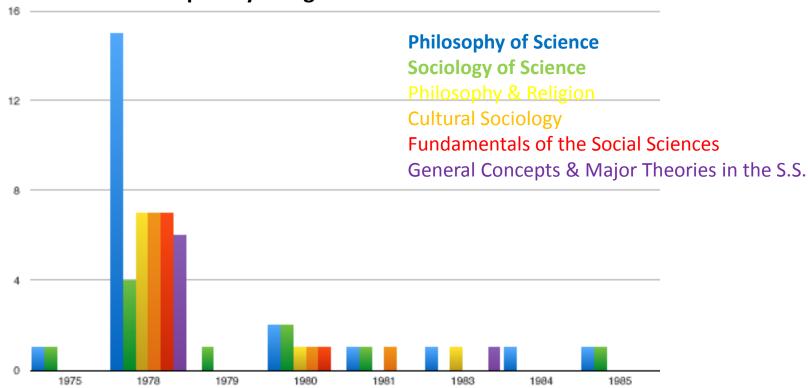
- Average number of different subject headings per author (1<sup>st</sup> group: 5-10 years of publication):
  - -37.87
- Average number of different subject headings per author (2<sup>nd</sup> group: 20-30 years of publication):
  - -84.48
- Average number of different subject headings per author (3<sup>rd</sup> group: 40-50 years of publication):
  - -191.92





## Example 1<sup>st</sup> group: P. K. F. 10 years of publication activity)/29 publications

#### Distribution of most frequently assigned classes

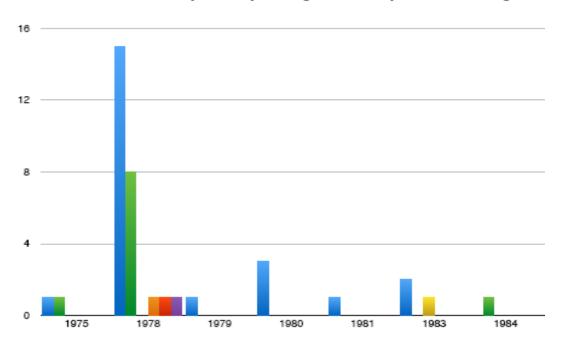






## Example 1<sup>st</sup> group: P. K. F. 10 years of publication activity)/29 publications

#### Distribution of most frequently assigned subject headings



Science Knowledge

Theory

Logic

Experience

Philosophy of

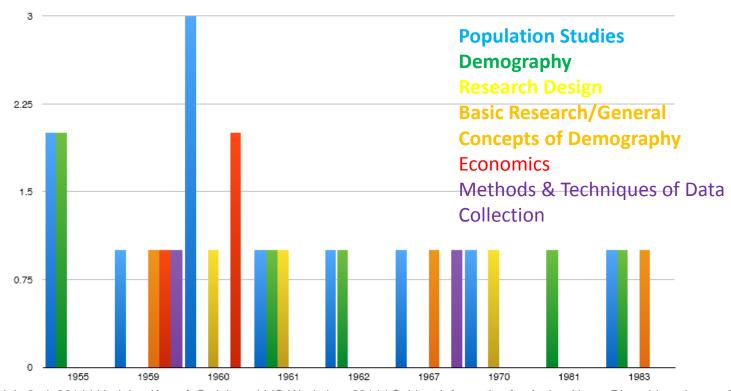
science





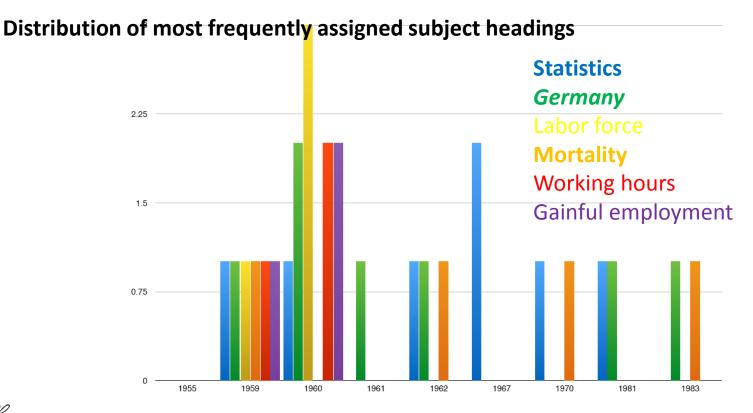
## Example (a) 2<sup>nd</sup> group: S. K. 28 years of publication activity/17 publications

Distribution of most frequently assigned classes





## Example (a) 2<sup>nd</sup> group: S. K. 28 years of publication activity/17 publications

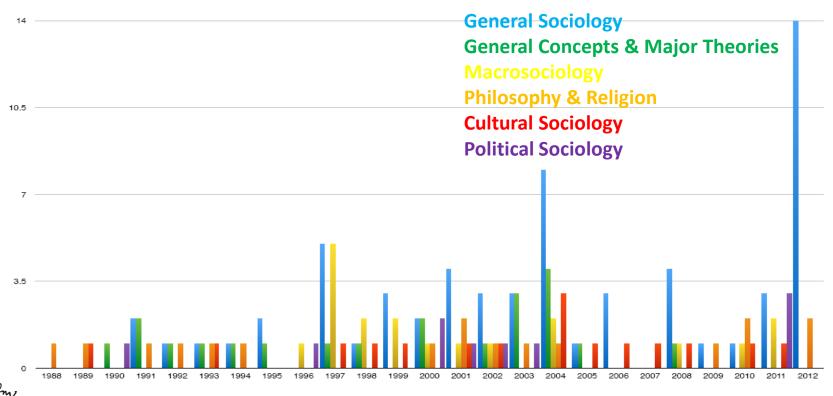






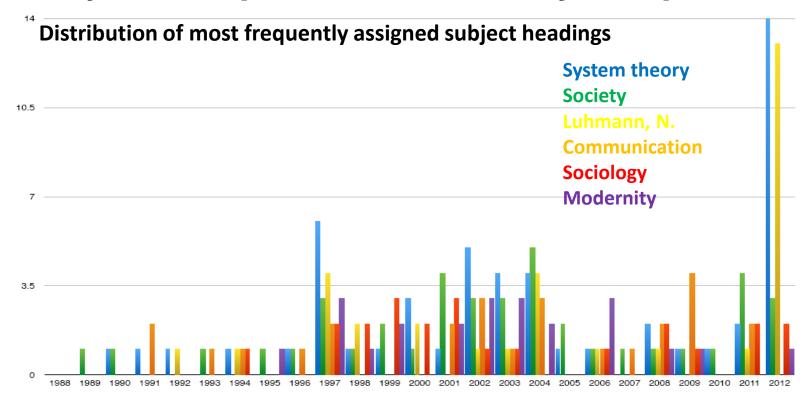
## Example (b) 2<sup>nd</sup> group: A. N. 24 years of publication activity/146 publications

Distribution of most frequently assigned classes





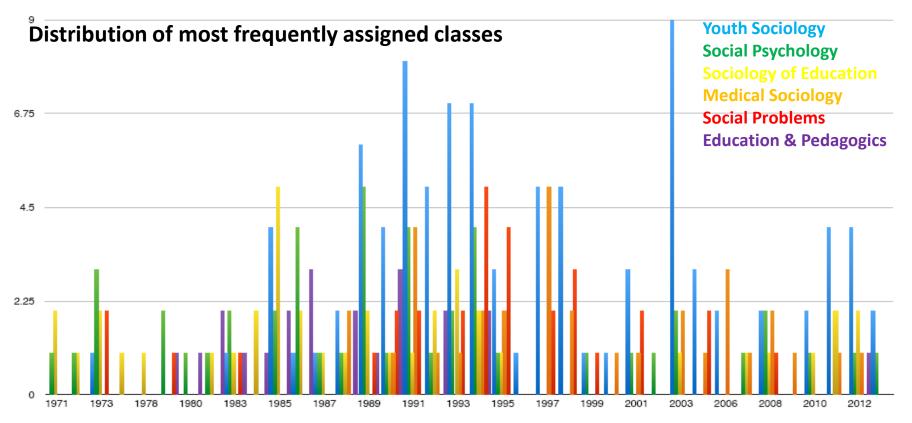
## Example (b) 2<sup>nd</sup> group: A. N. 24 years of publication activity/146 publications







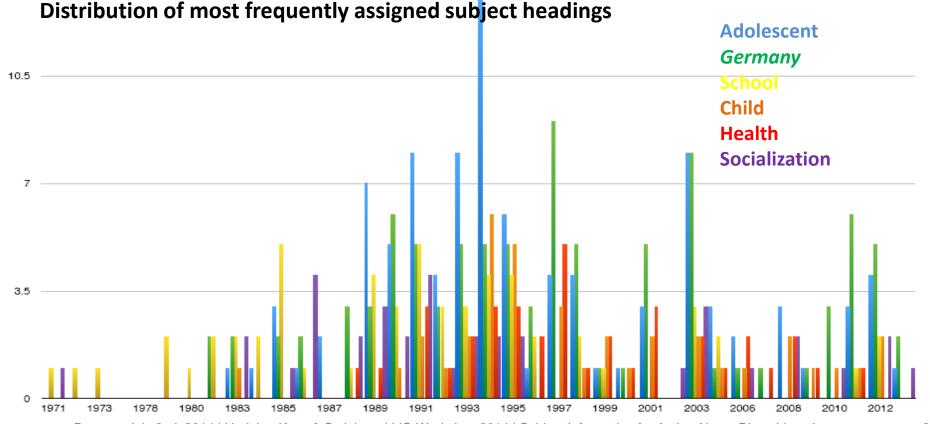
## Example 3<sup>rd</sup> group: K. H. 41 years of publication activity/241 publications







## Example 3<sup>rd</sup> group: K. H. 41 years of publication activity/241 publications





## Preliminary results — for the German-speaking social sciences

#### Research question:

Can topic information (subject headings, classification) help to distinguish between different authors with the same name?

OR: Is there subject continuity along a researcher's career?

#### Macro-level of study:

- Speaking of an "average author" could only serve as an approximation to answer the research question.
- The frequency of use differs enormously between different classes/subject headings.

#### Meso-level of study:

 The average number of classes/subject headings grows continuously along a researcher's career. Using subject information for author name disambiguation therefore might appear rather fruitless. However,...

#### Micro-level of study:

 Considering the most frequently used classes/subject headings assigned to publications of an author could help to profile/ disambiguate an author name. Subject continuity could be identified. This already applies to authors with a rather short period of publication activity.





#### **Outlook**

#### Future workflow

- — ↓ 1<sup>st</sup> step of disambiguation: Preprocessing via standard algorithms on the basis of database-internal publication/author-centred reference information (publication properties like co-authors, year of publication etc.)
- ↓ 2<sup>nd</sup> step of disambiguation: Consideration of classification and subject heading information for cases of doubt
- \Linking person records to authority files: Use of database-external person-centred reference information (individualized/differentiated person records of the Integrated Authority File (IAF)) via mapping of bibliographic records and individualized person IDs on the basis of an overlap of subject information using cross-concordances between classifications (DDC/CSS) and thesauri (IAF/TSS).
  - Preliminary results: Differentiated person records in the IAF only cover a small section of author strings included in the GESIS portal sowiport (mainly German-speaking social scientists)
  - Future work: Taking cross-concordances between thesauri (TSS IAF) and classifications (CSS – DDC) for author name disambiguation into account.



## Thank you very much for your attention.

#### Contact

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