Using evidence synthesis in linguistics and computational linguistics in evidence synthesis

<u>Leonie Regina Twente</u> ltwente1@uni-koeln.de

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"The latest research shows that we really should do something with all this research."

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## Evidence synthesis in a nutshell

Key aspects of scientific evidence synthesis

- originates in health sciences (evidence-based medicine)
- adopted for ecology and conservation research, social and education research...and empirical language research!
- reporting standards, procedures and software solutions are developed to ensure high standards of evidence synthesis (standarded methodologies such as the PRISMA statement)

Cf. Chandler et al. (2019); Haddaway and Bilotta (2016); Gough et al. (2017); Moher et al. (2009)

## Evidence synthesis in a nutshell

Key reasons to undertake evidence synthesis

- overcome limitations of single studies by:
- provide robust evidence to inform decision-making ("what works?"; curriculum recommendations, effectiveness of interventions ...)
- build theories on robust evidence instead of single papers with limited external validity
- demonstrate knowledge gaps to direct future research

Cf. Chandler et al. (2019); Haddaway and Bilotta (2016); Gough et al. (2017); Moher et al. (2009)

## Systematic Reviews and Meta-Analyses

#### Systematic reviews minimize risk of bias by:

- carefully reporting all steps of the review for clarity
- identifying all relevant empirical research on a well-defined research question using a refined search strategy
- assessing the quality of the evidence using pre-defined criteria (e.g. for validity)
- synthesizing evidence from multiple studies (through non-quantitative synthesis or meta-analysis)

#### Meta-analysis is an analysis of analysis

• Statistical methods are used to aggregate results from multiple studies

Cf. Chandler et al. (2019); Weiß and Wagner (2019); Gough et al. (2017), Cooper et al. (2009)

## Some examples from linguistic research

#### **Theory-building in phonetics:**

Using meta-analysis for evidence synthesis: The case of incomplete neutralization in German (Nicenboim, Roettger & Vasishth 2018)

#### Multilingualism research with applications in Education Practice and Policy:

A systematic review of the impact of multiple language teaching, prior language experience and acquisition order on students' language proficiency in primary and secondary school (Dyssegaard et al. 2015)

#### **Research in bilingualism with clinical applications:**

Bilingualism Is Associated with a Delayed Onset of Dementia but Not with a Lower Risk of Developing it: a Systematic Review with Meta-Analyses (Brini et al. 2020)

## Methodological problems need to be addressed

**Idea**: Evidence synthesis aims to produce the most recent and robust evidence to drive theory, inform policy and recommend interventions.

**Problem**: Methodological challenges negatively impact the potential of current evidence syntheses.

- Low quality of systematic reviews and meta-analyses → unexplained conflicting evidence
- Redundancy due to duplicate work
- Lack of high-quality primary studies
- High cost for updating reviews when new evidence is published

Cf. Berthele (2019); Westgate and Lindenmayer (2017), Norris and Lourdes (2007)

### Two approaches for better evidence synthesis

**The challenge:** make evidence synthesis more efficient, agile, transparent, rigorous and accessible

**The technical approach**: automation of labor-intensive tasks and reduction of bias, e.g. through implementing text mining and machine learning.

The holistic approach: imagining a new ecosystem for evidence synthesis, including technical solutions for facilitation of collaboration and interoperability

# How computational linguistics improves evidence synthesis

**Context and complication:** scientific literature as a corpus

**Complication:** identification of relevant material (documents, concepts)

**Consequence:** Software such as The *litsearchr* R package (Grames et al. 2019)

- a quick, objective and reproducible method to automate search term selectin
- identifies search terms for systematic reviews using text mining and keyword co-occurrence networks for conducting searches in electronic databases..
- Reduces bias by extracting keywords from a large dataset of highly relevant documents

**Outlook:** Using NLP to understand and map the semantic complexity of scientific literature, modeling context-dependency and temporal shift of word meanings etc.

Cf.. Beller et al. (2018); Westgate and Lindenmayer (2017)

# How open synthesis communities improve evidence synthesis

#### Context:

"we should reconsider the way we synthesize evidence" (Nakagawa et al. p. 1).

#### **Complication**:

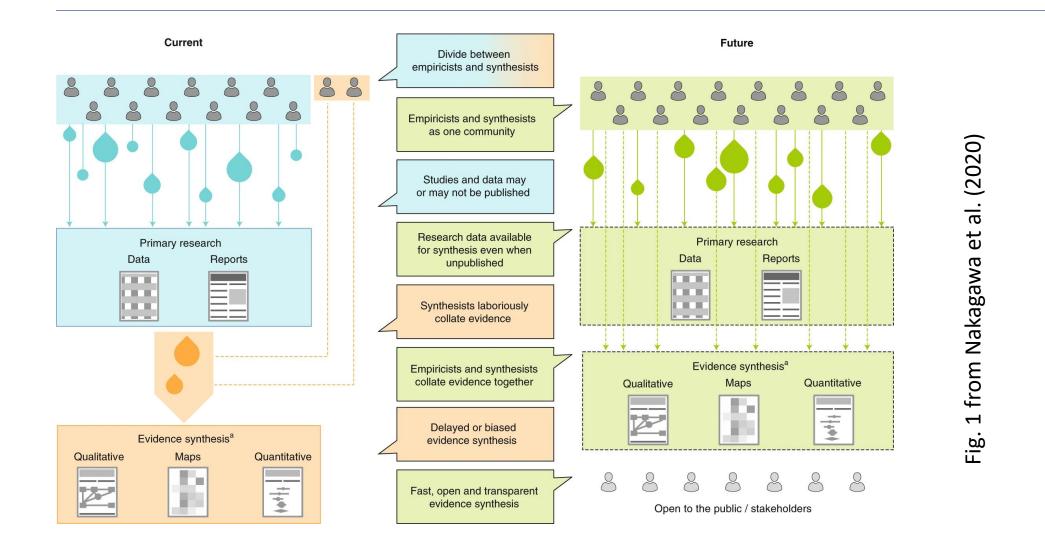
Empiricists and synthesists do not communicate, leading to poor quality and redundancy

#### **Consequence:**

A new ecosystem of evidence synthesis where synthesis is recognized as the end goal of all empirical research. This ecosystem facilitates openness and

Cf. Nakagawa et al. (2020)

### Imagining an ecosystem for evidence synthesis





- Systematic reviews and meta-analysis produce robust evidence to potentially inform decision-making in research and practice
- Current challenges for evidence synthesis: high costs, redundancy, lack of or missing access to high-quality primary research
- Solutions: a new ecosystem of evidence synthesis promotes open synthesis communities and technical solutions to tackle current challenges

## Questions – Discussion – Feedback



Please use the *raise your hand* feature to indicate you want to aks a question



Don't forget to unmute when it's your turn to ask a question



Don't forget to mute when you are done asking your question



Didn't get to ask your question? Want to <u>give feedback</u>? Feel free to get in touch via  $\frown$  or  $\bigcirc$  @LeonieTwente



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