# **Crowdsourcing Data Analysis**



Eric Luis Uhlmann (INSEAD), and many wonderful collaborators & colleagues at many institutions

## Many Many Analysts Projects!

#### **Published** projects

- <u>Bastiaansen et al., 2019</u> Time to get personal? The impact of researchers choices on the selection of treatment targets using the experience sampling methodology
- <u>Boehm et al., 2018</u> Estimating across-trial variability parameters of the Diffusion Decision Model: Expert advice and recommendations
- <u>Botvinik-Nezer et al., 2020</u> Variability in the analysis of a single neuroimaging dataset by many teams
- <u>Dutilh et al., 2019</u> The Quality of Response Time Data Inference: A Blinded, Collaborative Assessment of the Validity of Cognitive Models
- Functional Imaging Analysis Contest 2006
- <u>Fillard 2011</u> Quantitative evaluation of 10 tractography algorithms on a realistic diffusion MR phantom
- <u>Huntington--Klein 2021</u> The Influence of Hidden Researcher Decisions in Applied Microeconomics [preprint]
- <u>Maier-Hein 2017</u> The challenge of mapping the human connectome based on diffusion tractography
- <u>Salganik et al., 2020</u> Measuring the predictability of life outcomes with a scientific mass collaboration
- <u>Schweinsberg et al., 2020</u> Radical dispersion in estimates when independent scientists
  operationalize and test the same hypothesis with the same data
- <u>Silberzahn et al., 2018</u> Many Analysts, One Data Set: Making Transparent How Variations in Analytic Choices Affect Results
- <u>Starns et al., 2019</u> Assessing theoretical conclusions with blinded inference to investigate a
  potential inference crisis
- <u>van Dongen et al., 2019</u> Multiple Perspectives on Inference for Two Simple Statistical Scenarios

#### Unpublished projects

- MAPS: Mapping the Analytical Paths of a Crowdsourced Data Analysis
- <u>Breznau</u>, <u>Nate</u>, <u>Eike Mark Rinke</u>, <u>and Alexander Wuttke</u> et al. 2018. How Many Replicators Does It Take to Achieve Reliability? Investigating Researcher Variability in a Crowdsourced Replication. Working Paper. <u>SocArXiv</u>.
- <u>Breznau</u>, Nate, Eike Mark Rinke, Alexander Wuttke, et al. 2021. Observing Many Researchers Using the Same Data and Hypothesis Reveals a Hidden Universe of Data Analysis. Working Paper. <u>MetaArXiv</u>.
- The MARP Team (in preparation). A Many Analysts Approach to the Relation Between Religiosity and Well-being. <u>https://osf.io/qbdce/</u>

#### **Ongoing projects**

- Multi100: 100 results from 100 published social science papers will be re-analysed by independent analysts. A call for collaboration will be advertised soon.
- EEGManyPipelines (https://www.eegmanypipelines.org/). "Participants in this project will
  get access to an EEG dataset and are invited to analyze the data with an analysis pipeline they
  deem sensible and representative of their own research. Participants will then report their
  results and a detailed description of the analysis pipeline back to us. We will use these reports
  to map the diversity of analysis pipelines and the effect of pipeline parameters on obtained
  results."
- Many Speech Analyses <u>https://many-speech-analyses.github.io/</u>
- Many EcoEvo Analysts https://osf.io/mn5aj/

### List of many analyst projects, created by Aczél Balázs and team

https://docs.google.com/document/d/12XICX0UWKLH1RJ9NsSciWxXn4DD0oh4slqd\_TmKjp0A/edit#

## Key questions for future research (and current debate)

- Replicate the replicators: Analysis-contingent results appear to be replicable, but more extensions are needed (current project in Finance most welcome!)
- Aggregation or parsing: Should we average across analyses or try to explain dispersion? McGuire's (1983) perspectivism suggests massive moderation, but...
- The parsing problem: What explains the variability in results?
  - Hypothesis characteristics, e.g., latitude of construal (Menkveld et al., 2021)
  - Operationalization of variables (Schweinsberg et al., 2021)
  - Covariates (Silberzahn et al., 2018)
  - Specificity of the research question (Auspurg & Brüderl 2021; ongoing adversarial collaboration)
  - Analyst characteristics, e.g., expertise (Breznau et al., 2021; Menkveld et al., 2021; Silberzahn et al., 2018)
- Confirmation bias or rational belief updating? (Menkveld et al., 2021; Silberzahn et al., 2018)
- Crowd analysis or multiverse? (Auspurg & Brüderl 2021)