- Preregistration: Replication Studies in Linguistic Journals
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## Introduction

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Coordinated efforts to replicate published findings have uncovered surprisingly low rates of successful replications across the psychological sciences (Open Science Collaboration, 2015), economics (Camerer et al., 2016), and social sciences (Camerer et al., 2018). Experimental linguistics shares research practices that have been shown to decrease 10 the replicability of findings. Thus, there are raising concerns about a similarly low number 11 of replication studies conducted and published in this field (e.g. Marsden, Morgan-Short, 12 Thompson, & Abugaber, 2018; Roettger & Baer-Henney, 2019). A number of failed 13 replication attempts in various subfields of linguistics indicate that these concerns warrant attention (e.g. in language comprehension: Papesh, 2015; predictive processing: Nieuwland 15 et al., 2018; among others: Chen, 2007; Stack, James, & Watson, 2018; Westbury, 2018). One driving factor for this phenomenon is an asymmetric incentive system that rewards 17 novel confirmatory findings more than direct replications and null results. This leads to an abundance of positive findings in the absence of possible conflicting negative evidence. In order to thoroughly understand and be able to address this problem, it is important to assess the number of replication attempts and their contributing factors. Other fields such 21 as psychology (Makel, Plucker, & Hegarty, 2012), eudcation science (Makel & Plucker, 2014), and special education research (Makel et al., 2016) have assessed the amount of 23 direct replications in their respective field and report alarmingly low replication rates (0.13% - 1.07%).25 In order to evaluate the replication rate in linguistics, the present study aims at 26 assessing the frequency and typology of replication studies that are published in a representative sample of linguistic journals. The study consists of two parts: First, we will 28 assess the frequency of self-reported replication attempts across 100 linguistic journals and 29 relate the replication rate to factors related to journal policy, impact factor and publication

- type. Second, we will assess the type of replication studies (direct, partial, conceptual)
- published in a subset of 20 journals and relate their frequency to factors like the year of
- publication, and the citation and publication year of the original study.

## Overview Analysis: Rate of Replication Mention

The key dependent variable of the first part of this study is the rate of replication
mention for journals relevant to the field of experimental linguistics. In order to determine
these rates for the individual journals, we will draw on a method introduced by Makel et
al. (2012). We will use the search engine "Web of Science" (https://webofknowledge.com)
for journal articles that contain the search term "replicat\*" in title, abstract or keywords
and compute the rate of replication mention.

Research Questions. We intend to answer the following research questions: How many replication studies have been published in journals representative for experimental linguistic research? How did the rate change over time and how does it relate to journal policy, impact factor, and publication type?

Sample. To obtain a representative sample of journals relevant for the field of
experimental linguistics, we follow the procedure presented here: First, using the Web of
Science advanced search on the "Web of Science Core Collection" database, we filter for the
category "Linguistics" (WC=(Linguistics)) that lists the articles of every journal covered
by Web of Science that was assigned to the subject category of Linguistics (see a list of
categories here). All English language articles from the full available range of complete
years (1945-2020) are taken into account. From the resulting set (159002) only those
articles are selected which contain the search term "experiment\*" in their title, abstract or
keywords using TS="experiment\*" in order to filter for experimental linguistic studies.
This search results in 11093 articles. The relevant journals are selected based on the
obtained article counts. From all journals that include at least one experimental linguistic
study according to our criteria (418), journals with less than 100 published articles are

excluded, yielding 259 remaining journals. Because we are interested in journals with a high proportion of experimental studies, we calculate the ratio of studies that contained the search term "experiment\*" by the total amount of articles per journal and sort the results in descending order. Our sample constitutes the first 100 journals of that list. «««< HEAD Counts have been obtained on the 21st February 2021. More details are given here: https://osf.io/5u6bx/. ====== Counts have been obtained on the 21st February 2021. See here for more details: https://osf.io/q2e9k/ »»»> ac90942f0e565d674f238ce0d72e6106c2e54abbThe total number of articles containing the search term "replicat\*" in 65 title, abstract or keywords is obtained via Web of Science search for the 100 sampled journals. This number and and the total number of experimental studies described above serve as a baseline for calculating the rates of replication mention, following the method used by Makel et al. (2012). The rates of replication mention are calculated by dividing the number of articles containing the term "replicat\*" by the number of articles that contain the term "experiment\*" for each journal, respectively. 71 In order to relate the rate of replication mention to journal policies, we further 72 examine the journals' submission guidelines adopting the procedure used by Martin and 73 Clarke (2017). They grouped psychology journals into four classes determined by what was stated in the "instructions to authors" and "aims and scope" sections on the websites of the respective journals: (1) Journals which stated that they accepted replications; (2) Journals which did not state they accepted replications but did not discourage replications

either; (3) Journals which implicitly discouraged replications through the use of emphasis
on the scientific originality of submissions, (4) Journals which actively discouraged
replications by stating explicitly that they did not accept replications for publication
(Martin & Clarke, 2017, p. 3).

Journal impact factors are extracted via Journal Citation Reports

(https://jcr.clarivate.com). The 2019 journal impact factors are calculated by dividing the

citations in 2019 to items published in 2017 and 2018 by the total number of citable items in 2017 and 2018. The open access category of journals is assessed via Web of Science. We distinguish between three categories: journals which are listed on the Directory of Open Access Journals (DOAJ) ("DOAJ gold"), journals with some articles being published as open access articles ("partial") and journals with no openly accessible articles ("no").

We will use Bayesian parameter estimation based on generalized Data Analysis. 89 linear regression models with a binomial link function in order to estimate the rate of 90 replication mention relative to the following predictors: journal impact factors 91 (continuous), open access (binary: open access journal or not), and replication policies 92 (binary: either explicitly encourage or not). The model will be fitted to the proportion of 93 replication mentions per journal using the R package brms (Bürkner, 2016). We will use weakly informative normal priors centered on 0 (sd = 2.5) for the intercept and Cauchy priors centered on zero (scale = 2.5) for all population-level regression coefficients. These priors are what is referred to as regularizing (Gelman, Jakulin, Pittau, Su, & others, 2008), i.e. our prior assumption is agnostic as to whether the predictors affect the dependent variable, thus making our model conservative with regards to the predictors under investigation. Four sampling chains with 2000 iterations each will be run for each model, with a warm-up period of 1000 iterations. For relevant predictor levels and contrasts 101 between predictor levels, we will report the posterior probability for the rate of replication 102 mention. We summarize these distributions by reporting the posterior mean and the 95% 103 credible intervals (calculated as the highest posterior density interval). 104

## Detailed Analysis: Types and Contributing Factors

## 6 Methods

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The second part of the analysis aims at obtaining a better understanding of the underlying mechanisms of replication attempts published in the field of experimental

linguistics. Because the term "replication" is commonly used in ambiguous ways, the
articles that contain the search term "replicat\*" require further analysis to determine
whether the articles in question indeed report a replication study or use the term in a
different way.

Research Questions. We are interested in which kinds of replication studies are published and which factors contribute to their publication. We aim at investigating what types of replication studies are prevalent in the field. We are further interested in the relationship of direct replications and whether the paper was published as open access or not, the number of citations of the initial study and the years between publication of the initial study and the replication attempt.

From the superset of 100 journals obtained above, the first 20 journals 119 (i.e. those journals with the highest proportion of experimental studies) are selected for a 120 more detailed analysis. We exclude those journals for which less than 2 hits 121 (TS=(replicat\*)) can be obtained. This method yields a total number of 274 articles (see 122 here for a list of article counts per journal: https://osf.io/f3yp8/). Because of the skewed 123 distribution of our sample (114 hits for Journal of Memory and Language, and less than 40 124 for all other journals), we randomly select 50 out of the 114 articles for the Journal of 125 Memory and Language to achieve a more balanced distribution of papers across journals by 126 drawing from a uniform distribution in R without replacement (see here for details). 127

Procedure. The sampling procedure above results in 210 possible self-labeled 128 replication studies. In a first step, we will identify whether the article indeed presents a 129 replication study or not. By reading title and abstract of the paper a first intuition of what 130 the article is about can be obtained. The main task is to assess whether the authors claim 131 that their underlying aim was to replicate or reproduce findings or methods of another study (henceforth initial study). A search for occurrences of the search term "replicat" in 133 the text and an assessment of the paragraph before the Methods section as well as the first 134 paragraph of the Discussion section (following the procedure specified by Makel et 135

al. (2016)) helps to further identify the intention communicated by the authors regarding
their use of the term replication. If the authors communicate that (one of) the underlying
aim(s) was to replicate an original study, this article can be treated as a replication. «««<

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Assuming that the authors did not make any drastic changes to the initial study 143 without reporting them, number and type of changes made by the replication study are 144 extracted. The replication studies are classified according to three types: direct replication 145 (0 changes), partial replication (1 change) and conceptual replication (2 or more changes), 146 following Marsden et al. (2018). We note the nature of the change as one of the following 147 categories (yes/no): experimental paradigm, sample, materials/experimental set-up, 148 dependent variable, independent variable, and control. Coding the articles also involves 149 examining the factors open access of that article (yes/no), years between initial study and 150 replication attempt, author overlap of initial study and replication attempt (yes/no), 151 citation counts of both studies and the language under investigation. The information on 152 whether the article is open access as well as citation counts and years of publication for 153 both studies can be obtained from Web of Science. An author overlap is attested when one of the authors is a (co-)author on both articles. 155

Data Analysis. We will use Bayesian parameter estimation based on generalized linear regression models with a logit link function in order to estimate the rate of direct replications relative to the following predictors: year of publication (continuous), open access (binary: open access article or not), time lag between publication of initial study and replication attempt (continuous) and number of citations of initial study (continuous). The model will be fitted to whether the replication mention was a direct replication or not using the R package brms (Bürkner, 2016). The model further includes random intercepts

- 163 for individual journals to account for varying rates of direct replications across journals.
- We will use weakly informative normal priors centered on 0 (sd = 2.5) for the intercept and
- $_{165}$  Cauchy priors centered on zero (scale = 2.5) for all population-level regression coefficients.
- Four sampling chains with 2000 iterations each will be run for each model, with a warm-up
- period of 1000 iterations. For relevant predictor levels and contrasts between predictor
- levels, we will report the posterior probability for the rate of direct replication. We
- summarize these distributions by reporting the posterior mean and the 95% credible
- intervals (calculated as the highest posterior density interval).

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