	Running head: PSYCHOLOGY STUDENTS' BELIEFS ABOUT OPEN SCIENCE	1
1	What do incoming university students believe about open science practices in psycholog	y?

2 Abstract

- One or two sentences providing a basic introduction to the field, comprehensible to a
- 4 scientist in any discipline. Two to three sentences of more detailed background,
- 5 comprehensible to scientists in related disciplines. One sentence clearly stating the **general**
- 6 **problem** being addressed by this particular study. One sentence summarizing the main
- result (with the words "here we show" or their equivalent). Two or three sentences
- 8 explaining what the main result reveals in direct comparison to what was thought to be
- 9 the case previously, or how the main result adds to previous knowledge. One or two
- sentences to put the results into a more general context. Two or three sentences to
- provide a **broader perspective**, readily comprehensible to a scientist in any discipline.
- 12 Keywords: open science, psychology, teaching, reproducibility, replication
- Word count: X

What do incoming university students believe about open science practices in psychology?

The last decade has seen unprecedented change in methodological and reporting 15 practices in psychology. These changes were partly precipitated by what is popularly 16 known as the "replication crisis": The discovery that close replications of published 17 psychological studies are often unable to replicate the original findings (Klein et al., 2014, 18 2018). These apparent problems with replication have lead to a variety of potential solutions to make research practices more transparent, including more frequent publication of replication studies (see Brandt et al., 2014), more thorough reporting of methods and results (Simmons, Nelson, & Simonsohn, 2012), open sharing of data (see Meyer, 2018), and preregistration of data collection and analysis plans (Nosek, Ebersole, DeHaven, & Mellor, 2018). These calls for more transparent research practices prompted the discipline to reflect on the norms and beliefs that underpin its practice of research. Many studies have polled researchers' understandings of and adherence to open science norms, beliefs, and 26 practices [e.g., Baker (2016); Group (2018), Harris et al. (2018)). In turn, initiatives have 27 been directed toward training undergraduate students in the adoption of an open science 28 ethos (e.g., Chopik, Bremner, Defever, & Keller, 2018; Grahe et al., 2012, pp. Jekel et al. 29 (2020), Schönbrodt(2019)). These initiatives help engrain open science norms and change attitudes about research practices, but we know little about what these students know or 31 believe about open science research practices prior to entering the university classroom. 32

The most comprehensive set of principles for how science *ought* to be practiced are
Merton's (1942) norms of science. Scientists (Anderson et al., 2000) and graduate students
(Anderson & Louis, 1994) alike have historically endorsed the normative value of Merton's
principles. Furthermore, many of the recent practices designed to make science more
transparent and open reflect Mertonian norms. For example, the practice of sharing open
source software directly corresponds to the Mertonian norm of *communism*: Scientists
should have common ownership of scientific goods. Similarly, the practices of sharing of

preprints for open peer review and open data for checking of reproducibility corresponds to
the norm of communality, but also to that of organised skepticism: Scientific claims should
be subjected to critical scrutiny. Preregistration can be connected to the norm of
disinterestedness: By making (and preregistering) decisions about how to analyse data
before results are produced, a researcher can limit the degree to which the substantive
results produced by different analytic strategies affect their decisions regarding which
analyses to report. In this sense, the ongoing reform in psychological research can partly be
understood as simultaneously a set of new practices and a re-affirmation of old norms.

Nevertheless, rapid changes in methodological practice and empirical findings present 48 significant pedagogical challenges for the teacher of psychology. Keeping textbooks and other instructional materials up to date is difficult when supposedly well-established findings are being contradicted by new replications emerging at a rapid pace. Furthermore, 51 training in emerging methodological practices is crucial for graduate students who may go on to apply psychological research methods themselves, so that the next generation of researchers can produce research which is more replicable than that of the last. Even for students who do not go on to conduct research themselves, an understanding of contemporary methodological practices - and problems with methodological practices in psychology - is essential for these students to become informed and critical consumers of knowledge about psychology. However, the question of how best to provide this understanding is by no means trivial to answer. Indeed, there are several reasons why it might be unwise to assume a simple knowledge deficit, where students lack knowledge about reproducibility and open science practices and the teacher's only role is to communicate this knowledge.

First, unlike some areas of psychology covered in undergraduate courses (e.g., models of working memory, or the internal workings of human senses), the replication crisis is frequently discussed in mainstream and social media (e.g., Yong, 2016, 2018; O'Grady, 2020, & Pm, 2020). Many students may plausibly have some knowledge about these issues

obtained prior to (or independently of) their formal studies. Teaching methods should thus be informed by some understanding of what students' pre-existing levels of knowledge are.

Second, when psychology students are beginning their university studies, they are 69 often learning for the first time about how and why it is useful to apply scientific methods 70 to studying human behaviour (rather than only relying on alternative sources of knowledge 71 such as intuition or anecdote or authority). Could an over-emphasis on problems with 72 replicability leave such students unconvinced that scientific methods for studying human 73 behaviour are valuable at all, leaving them to favour even less credible alternative sources of knowledge? It is therefore important to determine what levels of trust in psychological 75 research (and its replicability) are prevalent in incoming undergraduate students. In their 76 examination of the usefulness of a one-hour lecture about the replication crisis, Chopik et al. (2018) found that undergraduate students trusted the results of studies by psychologists less after the lecture than they did before it, although the effect size was fairly small (d = -.36), and mean trust levels remained fairly high after the lecture (M = 4.94 on a scale of 1 to 7). 81

Third, anecdotal evidence suggests that students being taught about open science
practices and reforms to improve reproducibility (such as open sharing of data and analysis
code) are often surprised that this is not already standard practice. In other words,
students' naive conception of how science works may in some ways be closer to that
embodied in recent reforms rather than "business as usual" practices. Indeed, surveys of
scientists' subscriptions to Mertonian norms have often found that while most scientists
endorse Mertonian norms such as communality, universalism and disinterestedness, this is
by no means the case for all scientists. Furthermore, they typically perceive the behaviour
of other scientists as being less consistent with these norms than their own (Anderson,
Martinson, & De Vries, 2007). It is thus possible that, for some students, teaching about
reform may be less a matter of conveying new information and more one of reinforcing
"naive" assumptions. In fact, although beyond the scope of this article, it is possible that

incoming undergraduate students more strongly endorse open science norms than do academics.

These considerations suggest that it is important that teachers wishing to inform 96 undergraduate psychology students about the replication crisis and open science practices 97 have some understanding of what such students actually know and believe about these 98 topics already. In addition, undergraduate psychology students themselves represent one of the most important audiences for psychological research: The number of undergraduate 100 students enrolled in psychology courses in any given year dwarfs the number of academics 101 working in psychology. As such, the preferences of these students with respect to 102 reproducibility and open science practices are themselves important as a phenomenon of 103 interest. If, for example, undergraduate psychology students have a strong preference that 104 journal articles are freely available to members of the public, this preference on the part of 105 some of the consumers of the knowledge we produce should have some bearing on our 106 choices in relation to sharing of manuscripts. This is especially the case given that 107 undergraduate students are directly or indirectly responsible for much of the funding which 108 allows universities to operate and research to be conducted. In fact, in serving as 109 participants for course credit in many universities, undergraduate psychology students also provide the data underlying much psychological research. 111

For these reasons, we aimed to conduct a study describing what incoming
undergraduate students of psychology believe about reproducibility and open science
practices in psychology. Our survey encompassed norms (how students felt research should
be conducted), norms in practice (how students believe psychological research is
conducted) and replicability (how replicable students believe psychological research is). In
doing so we hope to provide knowledge which can inform the pedagogy of teaching about
replication and open science practices. This study is exploratory (see Wagenmakers,
Wetzels, Borsboom, van der Maas, & Kievit, 2012) and descriptive, and does not involve
the specification or testing of hypotheses.

121 Methods

We report how we determined our sample size, all data exclusions (if any), all manipulations, and all measures in the study.

124 Participants

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Of those who started the survey (n = 423), we screened out 184 participants who 125 were not eligible to participate based on the combination of our preregistered exclusion 126 criteria. Specifically, we screened out people who were younger than 18 years (n=7). We 127 also screened out individuals who had already started a psychology unit at a university, 128 regardless of whether they had completed it (n = 72); were not enrolled in a psychology 129 unit at a university (n=1); or did not answer this question (n=14). We then excluded 130 additional responses that Qualtrics flagged as spam (n = 1) or as a survey preview (n = 1). Finally, we excluded participants who met all other eligibility criteria, but did not respond to any of the main items in the study (n = 88). 133

The remaining 239 participants were eligible based on starting their first unit of study in psychology at a university within the next month. For those individuals who were screened out, our Qualtrics program automatically directed them to the debriefing form.

Of the remaining 239 participants, most reported that they were 18-24 years old (n = 193), 21 reported that they were 25-34 years old, 12 were 35-44 years old, 12 were 45-54 years old, and 1 was 55-64 years old.

Nearly all reported that they graduated from high school or secondary school (n = 230). Of those participants who attended high school, a little less than half completed psychology courses in high school (n = 106). In terms of their nationality, most participants reported that they were Australian (n = 125), from the United Kingdom (n = 43), or Chinese (n = 15). In terms of where the participants were attending university, most reported that they were in Australia (n = 160), the United Kingdom (n = 63), or

New Zealand (n = 11). Finally, about 2/3rds of participants reported that at least one of

their parents attended university (n = 157).

148 Material

Procedure Procedure

Data analysis

	X
critical_cnorm	2.410042
critical_norm	4.322176
prereg_norm	3.974895
prereg_cnorm	2.753138
reg_report_norm	3.355649
reg_report_cnorm	3.556485
phack_cnorm	2.133891
phack_norm	4.338912
hark_cnorm	1.661088
hark_norm	3.887029
info_for_rep_norm	4.422594
info_for_rep_cnorm	1.514644
preprint_norm	1.610879
preprint_cnorm	4.357143
open_materials_norm	3.689076
open_materials_cnorm	2.497908
open_data_norm	2.656904
open_data_cnorm	3.485356
open_access_norm	3.857143
open_access_cnorm	2.531381

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152 Results

Discussion

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Reproducible Code Statement

We used R (Version 3.6.3; R Core Team, 2020) and the R-packages dplyr (Version 1.0.2; Wickham et al., 2020), forcats (Version 0.5.0; Wickham, 2020), ggplot2 (Version 3.3.3; Wickham, 2016), here (Version 0.1; Müller, 2017), papaja (Version 0.1.0.9842; Aust & Barth, 2018), purrr (Version 0.3.4; Henry & Wickham, 2020), readr (Version 1.3.1; Wickham, Hester, & Francois, 2018), stringr (Version 1.4.0; Wickham, 2019), tibble (Version 3.0.4; Müller & Wickham, 2020), tidyr (Version 1.1.1; Wickham & Henry, 2020), and tidyverse (Version 1.3.0; Wickham, Averick, et al., 2019) for all our analyses.

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