

1 **Title: The power of peer networking for improving STEM faculty**
2 **job applications: a successful pilot program**

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20 **Abstract:**

21 In order to successfully obtain a faculty position, postdoctoral fellows or 'postdocs', must
22 submit an application which requires considerable time and effort to produce. These job
23 applications are often reviewed by mentors and colleagues, but rarely are postdocs offered the
24 opportunity to solicit feedback multiple times from reviewers with the same breadth of expertise
25 often found on an academic search committee. To address this gap, this manuscript describes
26 an international peer reviewing program for small groups of postdocs with a broad range of
27 expertise to reciprocally and iteratively provide feedback to each other on their application
28 materials. Over 145 postdocs have participated, often multiple times, over three years. A survey
29 of participants in this program revealed that nearly all participants would recommend
30 participation in such a program to other faculty applicants. Furthermore, this program was more
31 likely to attract participants who struggled to find mentoring and support elsewhere, either
32 because they changed fields or because of their identity as a woman or member of an
33 underrepresented population in STEM. Participation in programs like this one could provide
34 early career academics like postdocs with a diverse and supportive community of peer mentors
35 during the difficult search for a faculty position. Such psychosocial support and encouragement
36 has been shown to prevent attrition of individuals from these populations and programs like this
37 one target the largest 'leak' in the pipeline, that of postdoc to faculty. Implementation of similar
38 peer reviewing programs by universities or professional scientific societies could provide a
39 valuable mechanism of support and increased chances of success for early-career academics
40 in their search for independence.

41

42 Introduction

43 The purpose of a postdoctoral appointment is the acquisition of additional skills or
44 training post-PhD in preparation for transitioning into an independent position as a primary
45 scientific investigator (National Research Council 2014), originally in academia (NAS et al.
46 2000), although the function has broadened to include training for a multitude of other career
47 paths (McConnell et al. 2018). Thus, by definition postdoctoral appointments are temporary
48 (average = ~2.7 years; Acton et al. 2019, Andalib et al. 2018, McConnell et al. 2018, but see
49 Fernandes et al. 2020), although individuals may complete multiple postdoctoral positions in
50 different labs before gaining independence (Powell 2020, Shaw et al. 2015, Woolston 2020).
51 Because of the limited duration and lack of funding security for postdoctoral positions, and the
52 highly competitive tenure-track faculty job market (Alund et al. 2020, Andalib et al. 2018, Kahn &
53 Ginther 2017, Sauermann & Roach 2012, Zimmerman 2018), postdocs spend a significant
54 amount of time searching for their next appointment. Some will begin to search for the next
55 position as soon as they begin their current position and many apply for postdoctoral and
56 tenure-track positions simultaneously over multiple years (Fernandes et al. 2020).

57 An application packet for a faculty position ('faculty application') consists of multiple
58 highly crafted documents, typically including a curriculum vitae (CV), cover letter, statements of
59 research, teaching, and, sometimes, diversity (for a description of these documents and the
60 faculty application process, see Fernandes et al. 2020, Groll 2017). To maximize the chance of
61 success, applicants spend a significant amount of time writing and polishing these documents.
62 Numerous opinion and advice pieces have been published on how to write these documents
63 (e.g., Anderson 2019, Reyes 2020, Smith 2020a & 2020b). In addition, Offices of Postdoctoral
64 Education across institutions, as well as the National Postdoctoral Association in the USA, and
65 some scientific societies host frequent seminars/webinars and provide extensive advice on the
66 structure and content of these documents (e.g., Omary et al. 2019, Shaw et al. 2015). Almost all
67 of these seminars and advice columns direct postdocs to solicit feedback from a wide circle of
68 peers and mentors.

69 Formal and informal mentors are often willing to provide constructive feedback (Hayter &
70 Parker 2019); however, some mentors may be unwilling to spend time on this task or unable to
71 offer useful feedback, especially for postdocs applying for positions in fields or institutions
72 different than the mentors' own (Alund et al. 2020, Aschwanden 2006, Hayter & Parker 2019,
73 Scaffidi & Berman 2011). Postdoctoral peers and senior graduate students can also serve as
74 additional reviewers, but most research groups only have a couple of postdocs at a time or may
75 have none at all (Acton et al. 2019, Bruckman & Sebestyen 2017). Moreover, the breadth of
76 scientific expertise represented within a research group or postdoc's network rarely matches the
77 breadth of expertise represented by search committees in academia. Thus, while one's
78 colleagues/labmates may be able to comment on the structure and the science within a job
79 application, they may not be able to assess if a research statement is broad and general
80 enough to be understood by, and appeal to the wider audience represented by a search
81 committee. Furthermore, while mentors and peers may be happy to review a document a few
82 times, most mentors and peers lack the time to provide multiple rounds of feedback on >10
83 pages of job application materials.

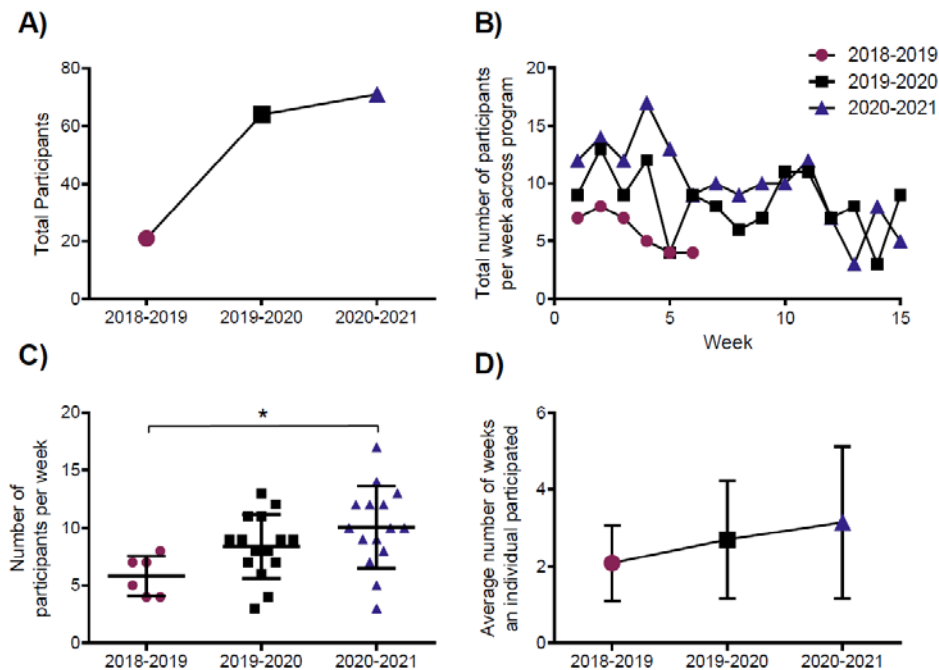
84 Overall, opportunities to have job applications critiqued repeatedly by a broad scientific
85 audience are generally scarce. Regardless of the underlying causes, postdocs could benefit
86 from a variety of options for getting feedback on their job application materials. This situation is
87 exacerbated for postdocs from marginalized groups, who are more likely to struggle to form a
88 supportive peer network and have less access to mentoring and support than postdocs from
89 majority groups (Beech et al. 2013, Yadav & Seals 2019). Therefore, here, we present a
90 potential solution in the form of an open and inclusive international program of peer review for
91 job application materials that we have been running since 2018. In this program, participants
92 have the opportunity to repeatedly share all or part of their application package with a small
93 group of peer reviewers. They engage in reciprocal constructive commentary in a supportive
94 and encouraging manner with the ultimate desire of seeing each other attain an independent
95 faculty position. Peer review programs are most well-known from their use in manuscripts
96 (Rennie 2016, Tennant et al. 2017, Tennant & Ross-Hellauer 2020, but see Haffer et al. 2019,
97 Murray et al. 2018) and grant application review (Azoulay & Li 2020, Demicheli et al. 2007,
98 Marsh et al. 2009 but see Lauer & Roychowdhury 2021, Witteman et al. 2019), but have been
99 successfully implemented in many other contexts for purposes of professional development and
100 community building, especially for postdocs and early career researchers (Dickson et al. 2021,
101 Eisen & Eaton 2017, Kulage et al. 2017).

102 This manuscript has three goals: i) to describe the history and organizational details of
103 our program; ii) to use survey data to assess the experiences of participants and
104 nonparticipants on the benefits and limitations of this type of program; and iii) to suggest
105 methods of implementation for other organizations (i.e., Offices of Postdoctoral Education,
106 postdoctoral societies, or scientific societies).

107 Program Description

108 This program began organically after its founder, Dr. Grogan, observed frequent
109 requests for peer review of job application materials on the FuturePI Slack Group
110 (<https://futurepislack.wordpress.com/>) and realized the group could benefit from the organization
111 of formal peer-reviewing of application materials during the Fall 2018 job application season. In
112 its first year, the FuturePI Reviewing Groups program (hereafter called the Program) ran for 7
113 weeks, from mid-August to mid-October. In subsequent years, the timeline expanded to 15
114 weeks, from early August to the end of November (Supplemental Material). The program is
115 announced through the FuturePI Slack #general and #Jobapp_reviewer channels two weeks
116 before its start to give participants time to sign up, with sign-ups handled on an open-access
117 Google Sheet. Participants are asked to provide their names, email addresses, general field of
118 study, and the type of jobs they are applying to, and to indicate which weeks they would like to
119 participate (see Supplemental Figure 2 for example). Reviewing groups are organized weekly,
120 with sign-ups for the upcoming week closing on Sunday morning. All interested participants for a
121 given week are emailed the day before groups are assigned to confirm their willingness to
122 participate that week, and then reviewing groups are organized the next morning. Each
123 reviewing group is emailed at the start of the week with contact information for their group and
124 instructed to send whatever documents they want to be reviewed and to provide feedback on
125 each other's documents by the end of the week (for example announcement, confirmation, and
126 assignment emails, see Supplemental Materials). For the first three years of operation,

127 participants were instructed to send their documents to each other on Monday and provide
128 feedback for group members' documents by Friday, but this schedule can be adjusted easily.
129 Participation in the program is open to any current member of FuturePI Slack and the program
130 has grown since its first year, from 21 unique participants in 2018 to 71 in 2020 (Figure 1A). The
131 number of unique individuals who participate each week varies considerably (mean = 8.7, range
132 = 3-17; Figure 1B), but has steadily increased since the program's beginning ($F = 4.363$, $p =$
133 0.02 , Figure 1C). Additionally, the number of times that any given individual participates has
134 also increased, although not significantly ($F = 1.039$, $p = 0.36$; Figure 1D).
135



136
137 **Figure 1.** Program participation for the FuturePI Reviewing Groups Program from 2018 to 2021. A) The
138 total number of unique individuals who participated in the reviewing program per year, B) the total number
139 and C) average of individuals who participated each week of the program by year, D) the average number
140 of weeks an individual participated by year.

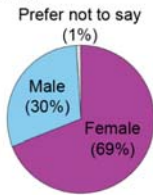
141 Program Feedback Survey

142 Given the increase in participation and anecdotal commentary about the benefits of participating
143 in the program, we developed a survey for participants and non-participants in the Program to
144 assess participants' experiences and identify areas for improvement (Supplemental Table 1).
145 Through this survey (University of Cincinnati IRB# 2020-0891), we collected demographic and
146 participation-related information from members of the FuturePI Slack community. To maintain
147 anonymity and promote ease of response, the survey, which took ~5-10 minutes to complete,
148 was conducted through Google Forms and all questions were optional, except the IRB
149 permission. Respondents were recruited from previous and current participants in the program
150 either through messages posted on FuturePI Slack or through direct email. Responses were
151 collected within two months starting in early February and ending at the end of March 2021.

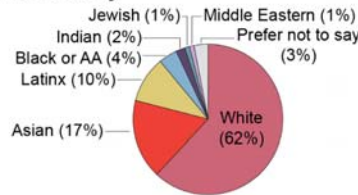
152 Data were organized and analyzed in Excel, OriginPro2015, and GraphPad Prism 6
 153 respectively. Answers to open-ended questions were stripped of white space, punctuation,
 154 numbers, and English “stop words” (e.g., and, the, is) using the package *tm* (Version 0.7-8;
 155 Feinerer & Hornik 2020) and after manual editing to change plural nouns to singular nouns and
 156 stem words with the same root (e.g., standardizing review, reviews, and reviewed as “review”).
 157 Then word clouds were generated using the package *wordcloud* (Version 2.6; Fellows 2018) in
 158 RStudio.

159 Survey Respondent Demographics

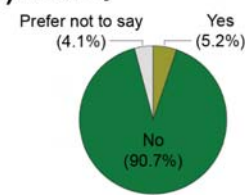
A) Gender



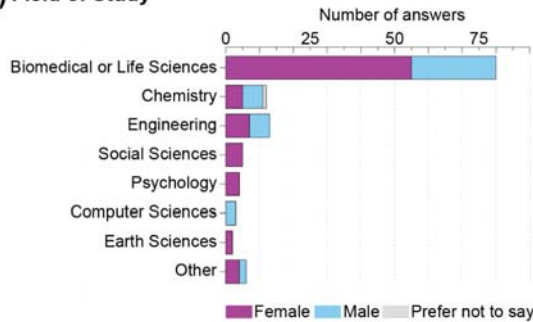
B) Race/Ethnicity



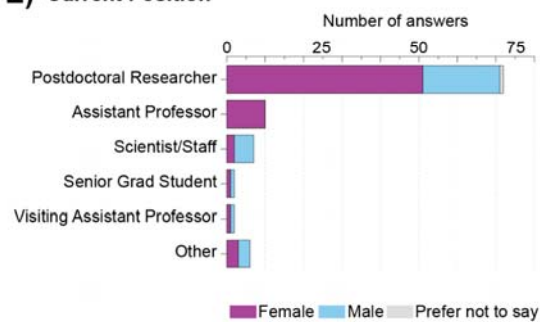
C) Disability



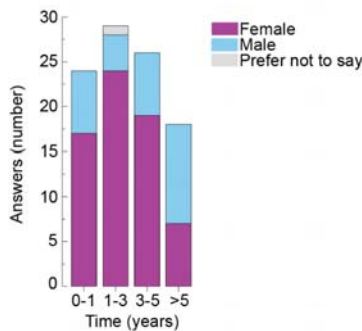
D) Field of Study



E) Current Position



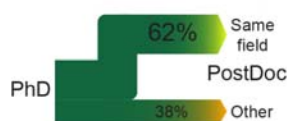
F) Years in Position



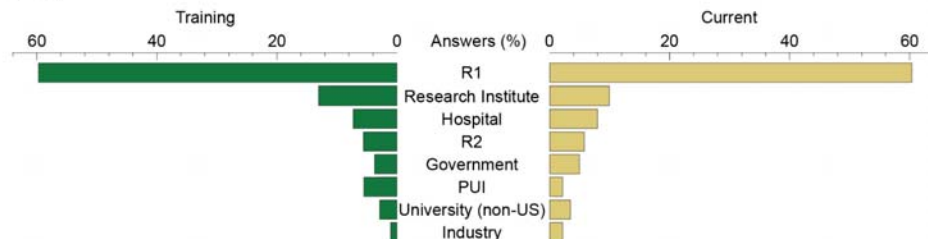
G) Location: Current and Applications



H) Scientific Trajectory



I) Types of Institutions



161 *Figure 2. Self-identified demographics and career information of survey respondents, which included both*
162 *program participants and non-participants: the distribution of survey respondents by A) gender, B)*
163 *race/ethnicity, and C) disability status; The distribution of respondents, split by gender, according to D)*
164 *field of study, E) current position title, and F) years in current position; G) map of the current location of*
165 *survey respondents (solid circles) compared to the location of positions to which respondents applied*
166 *(dashed circles); H) the representation of percentage of survey respondents who either remained in the*
167 *same field as their Ph.D. training or switched scientific fields post-graduation; I) the type of institution at*
168 *which survey respondents were or are employed.*

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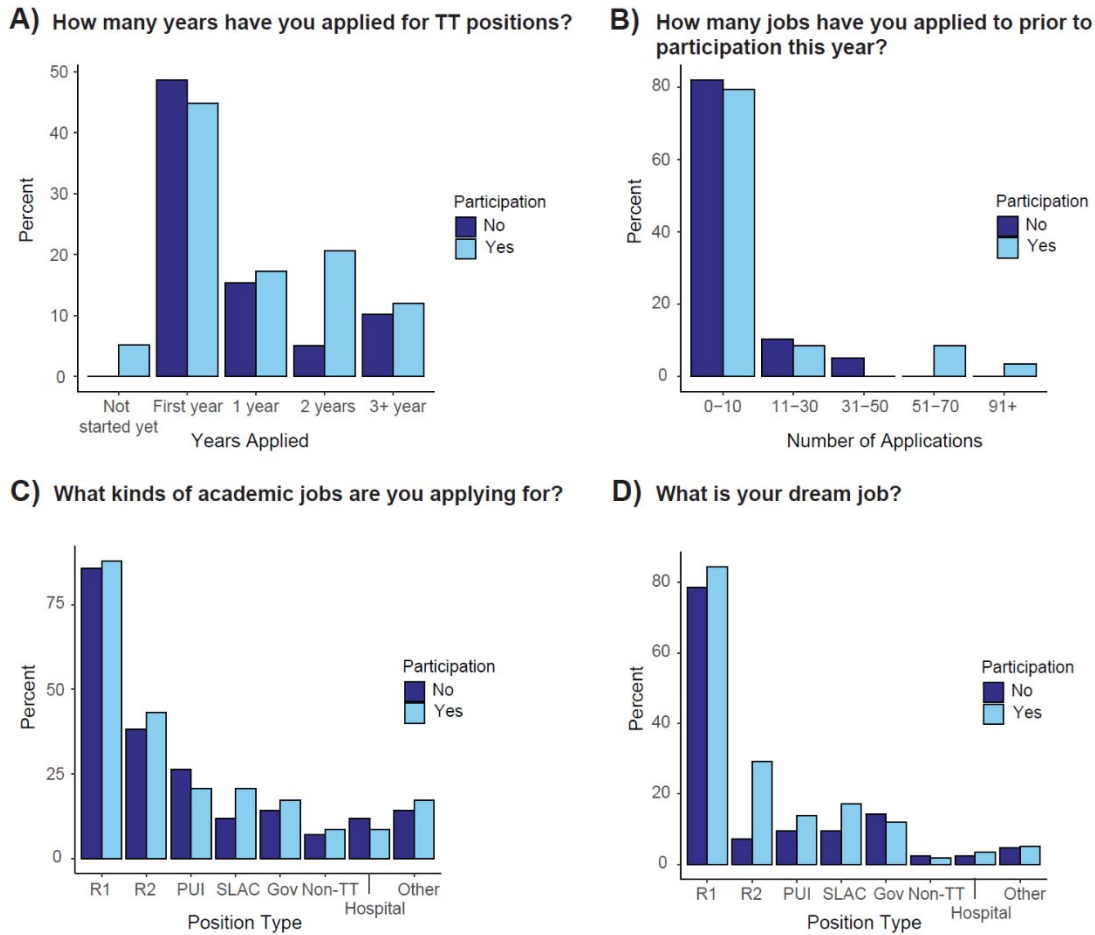
171 All individuals who participated in the survey, regardless of whether they participated in the
172 Program, are hereafter referred to as respondents, while respondents who participated in the
173 Program are referred to as participants and those who did not participate as non-participants,
174 respectively. The majority of our survey respondents (n = 97), which included both program
175 participants and non-participants, identified as female (69%), white (62%), and did not identify
176 as disabled (90.7%; Figure 2A-C). The respondents of this study were more likely to identify as
177 female compared to the respondents of the 2016 USA National Postdoctoral Survey and a
178 recent survey of faculty job applicants, in which 53% and 48.2% of respondents identified as
179 female, respectively (Fernandes et al. 2020, McConnell et al. 2018, but see Afonja et al. 2021).
180 In contrast, in this study, the self-identified race/ethnicity of the respondents was similar to that
181 reported for other postdoctoral or faculty application populations for white, Black or African
182 American, and Latinx/Hispanic identities. Additionally, this study unexpectedly included fewer
183 Asian respondents (17.0%) compared to the percentage of Asian postdocs in the US
184 postdoctoral population (24.8%; McConnell et al. 2018). Nearly 10% of our respondents
185 identified as having a disability, higher than the 6% (12 out of 175) reported by a similar survey
186 of postdocs and early career researchers in ecology and evolution (Wanelik et al. 2020).

187

188 Compared to a recent survey of faculty applicants (also organized in part through FuturePI
189 Slack; Fernandes et al. 2020), the respondent population of this study was similarly biased
190 towards postdocs over graduate students, staff scientists, or Assistant Professor and had many
191 more respondents working in Biomedical or Life Sciences, with less than 15 respondents each
192 from Chemistry, Engineering, Social Sciences, and other fields (Figure 2D-E). As FuturePI
193 Slack is an international organization, the survey respondents were located across the globe
194 and were applying to a similarly broad geographic range of jobs (Figure 2G). We had a nearly
195 equal number of survey respondents across the various ranges of job tenure from 0-5 years.
196 Nearly 54% of respondents were currently employed at an R1 institution (Carnegie
197 classification), with the rest of the respondents mostly employed at research institutes,
198 hospitals, R2 or PUI institutions, or in government positions (Figure 2I). Fewer respondents
199 (40.8%) reported being trained at an R1 institution compared to other types of institutions.
200 Interestingly, nearly 40% of our survey respondents reported they had changed fields between
201 their PhD and their current position (Figure 2H). Of the 97 survey respondents, a majority (n =
202 58; Figure 5A) were participants in the Program at least once in the previous three years while
203 39 respondents were non-participants.

204

205 Survey Respondent Job Application Journey
206



207
208 *Figure 3. Comparison of the faculty job application journey for participants and nonparticipants: A) the*
209 *number of years spent searching for a faculty job, B) number of job applications and C) types of job*
210 *applications submitted by participants and nonparticipants, and D) the dream job for participants and*
211 *nonparticipants. For C & D, Other includes applications for faculty, research scientist, and postdoctoral*
212 *positions at Professional Schools, Research Institutes, non-profits, and industry companies*
213

214 To assess the job application trajectory difference between participants and non-participants,
215 the survey included questions detailing the number of years respondents had been on the job
216 market, as well as the number of job applications submitted either prior to the program
217 (participants) or prior to this year (non-participants). Respondents in their first year of the job
218 market were the largest portion (>40% of total) for both participants and non-participants (Figure
219 3A). However, more than 30% of participants were in their third or greater year of the job search
220 compared with only ~15% of non-participants (Figure 3A, left two columns). Notably, three
221 participants were in their sixth year on the job market. While the majority of respondents (~80%)
222 had submitted ten or fewer applications, some of the respondents had already submitted
223 substantial numbers of applications, including six individuals who reported submitting >90
224 applications. In comparison, none of the non-participant had submitted more than 50

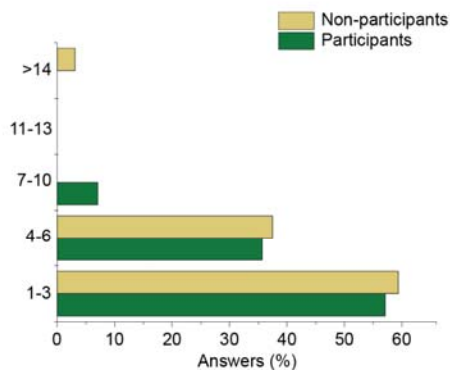
225 applications at the time of the survey. From these data, we observed that the participants
226 tended to be further along in their job search trajectory, having spent more years searching for
227 jobs and submitting many more applications.

228
229 The types of institutions that the respondents applied to as well as their ideal position were also
230 examined in the survey. Among all respondents, R1 universities were the most applied to
231 position (n = 51 participants and 33 non-participants of 97 total respondents) and most
232 frequently reported dream position (n = 49 participants and 31 non-participants). The
233 participants applied to more non-R1 positions compared to non-participants, which could be due
234 to the career stage and experience of the participant in previous job cycles leading to a
235 broadening of their targeted institution. More participants also reported that their dream jobs
236 were at non-R1 educational institutions, e.g. R2 universities, primary undergraduate institutions
237 (PUIs), and small liberal arts colleges (SLACs).

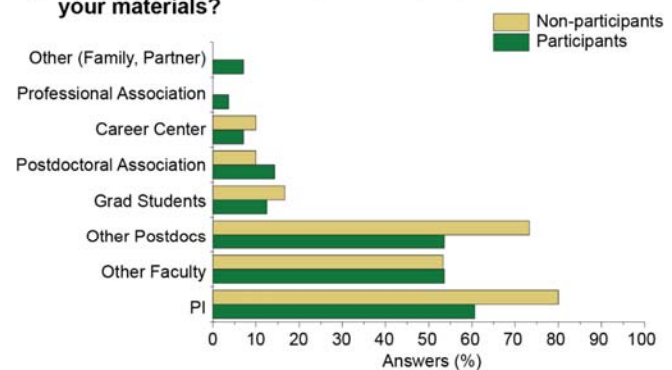
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239 Reviewer Availability for Survey Respondent Application Materials

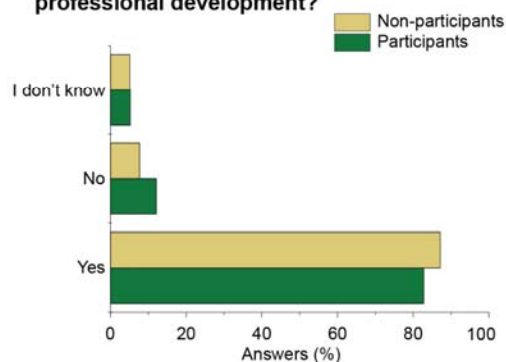
A) How many people reviewed your material?



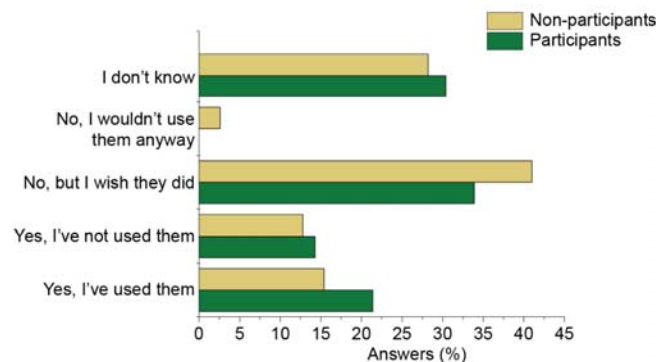
B) What were the career stages of the people who reviewed your materials?



C) Does your institution have an Office for professional development?



D) Do they offer editing services for job application materials?



240

241 *Figure 4. Information on the availability of reviewers for survey respondents' job application materials: A)*
242 *the number and B) career stages of reviewers recruited by survey respondents to review their job*
243 *application materials, C) the percentage of survey respondents who work at an institution that has an*
244 *Office focused on professional development, D) if those offices offer job application editing services, and*
245 *if the respondents have taken advantage of those services or not.*

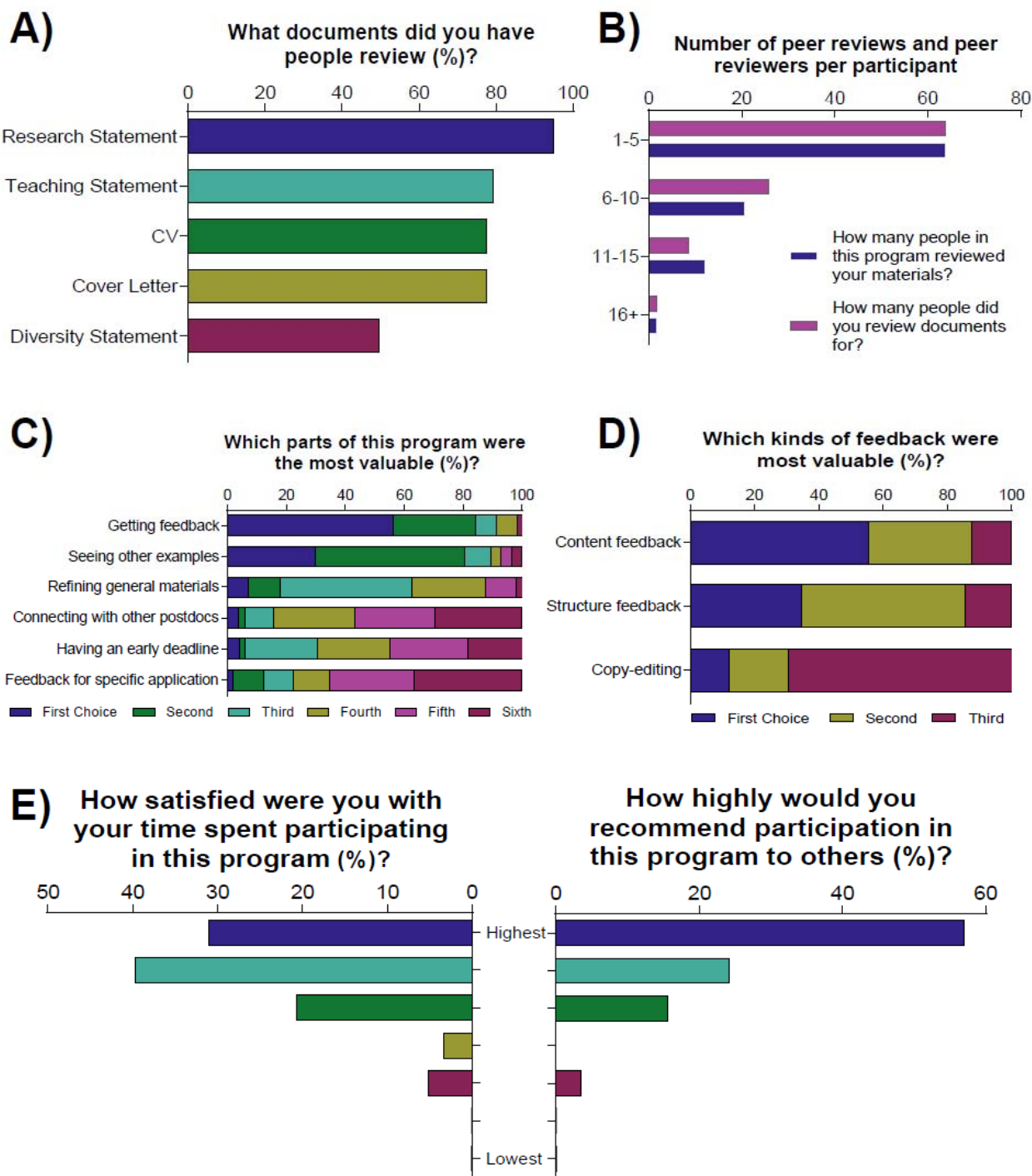
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247 Most of the respondents had their application materials reviewed by either 1-3 people (55-60%)
248 or 4-6 people (35-40%) outside the Program. The application material reviewers consisted of
249 mostly PI, other faculty, and postdoctoral colleagues, but the percentage differed between
250 participants and non-participants. For participants, slightly over 60% had their PI review their
251 materials, ~53% had other faculty reviewers, and nearly 55% recruited other postdoctoral
252 colleagues to review their materials. In contrast, for non-participants, ~80% were able to have
253 their PI review their materials, ~53% had other faculty reviewers, and nearly 75% were able to
254 recruit other postdoctoral colleagues to review their materials. In other words, participants were
255 less likely to have their job application materials reviewed by their PI or other postdoctoral
256 colleagues but were equally likely to have non-PI faculty review their materials. Fewer than 15%
257 of survey respondents, regardless of Program participation, asked graduate students, their
258 postdoctoral association or career center, or other individuals to review their materials.

259
260 Although the majority of survey respondents (>80%) were employed at institutions with Offices
261 for Professional Development, many respondents were either unsure (25-30%) if these offices
262 offered editing services or reported these offices did not offer those services (~35-45%). Of
263 those respondents with professional development offices that offered editing services, the
264 participants (22%) were slightly more likely to have used those services than non-participants
265 (15%). Altogether, over 50% of both participants and non-participants indicated either a
266 willingness to use editing services provided by offices of professional development or a wish
267 that they would offer those services.

268

269 Program Participation Data



270

271 **Figure 5.** Participants were asked to indicate: A) the documents they had peer-reviewed in the program,

272 and B) how many people reviewed the documents for each participant and how many people each

273 participant reviewed documents for, C) the parts of the program and D) types of feedback that

274 *participants felt were most valuable, and E) participants indicated how satisfied they were with their*
275 *participation in the FuturePI Reviewing Groups Program and how highly they would recommend*
276 *participation in the program to others.*
277

278 With nearly all participants indicating they had submitted the research statement for peer
279 review, the research statement was the most reviewed document (Figure 5A) followed closely
280 by the teaching statement, CV, and Cover Letter. The least reviewed document was the
281 Diversity Statement, which may reflect that fewer job applications require this document or the
282 more personal nature of this particular document. The majority (~65%) of the participants
283 reviewed documents and had their documents reviewed by 1-5 people (Figure 5B), implying
284 they participated for 1-2 weeks. Receiving general feedback and seeing other job application
285 examples were reported as the two most valuable aspects of participation by over 80% of the
286 participants (Figure 5C). Refining materials, connecting other postdocs, and having an early
287 deadline were rated as comparably less important or valuable aspects of participating in the
288 program. Comments on the content were reported as most valuable and copy-editing being the
289 least valuable type of feedback (Figure 5D). Participants reported extremely high satisfaction
290 with their participation in the Program, with only 8.6% (5/58) giving a rating lower than 5 out of 7
291 (Figure 5E). Similarly, 96.5% of respondents (56/58) reported they would likely or highly likely to
292 recommend participation in the Program to other colleagues.
293

A) Why did applicants decide to participate in the FuturePI Reviewing Groups Program? (n=49)



B) What concerns did applicants have about participating in the FuturePI Reviewing Groups Program? (n=42)



C) What impact did participating have on applicants? (n=41)



D) What were some examples of helpful feedback? (n=16)



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Figure 6. Word clouds highlighting the most common responses of the participants to the open-ended questions on: A) why they decided to participate in the program, B) what concerns they had about participating prior to doing so, C) what impact did participation have on their job application journey, and D) what were some examples of helpful feedback.

When asked about their motivations for participating in the Program, the respondents were primarily motivated (Figure 6A) to i) seek feedback beyond their own lab (n = 34), especially from peers (n = 12) and people outside of their subdiscipline (n = 16) and ii) to use examples from others to better organize their job documents (n = 10):

"I wanted a broader perspective than could be provided from just the members of my lab, since a faculty search committee will be composed of many people who aren't experts in my area. I also wanted as many eyes as possible to read my documents. And I wanted to see the documents of others to see if anyone had any interesting ideas I could use."

308 *“To get more positive feedback (my PI gave me very negative feedback and it’s [sic]*
309 *discouraging).”*

310 *“It was an amazing opportunity to receive feedback from people unfamiliar with my*
311 *work/area/research, and who could be honest with their feedback as they had no*
312 *investment in the outcome.”*

313 The majority of participants noted, as shown in the representative quotes below, that their
314 participation in the Program improved their confidence in their job application materials, the
315 application process (n = 13; Figure 6C), and the quality of their materials (n = 17), and that they
316 felt more supported during the job application process, which is often a stressful and isolating
317 (n = 14):

318 *“A little bit of positive affirmation took some stress out of the process.”*

319 *“It gave me more confidence, both because someone had looked at my stuff and*
320 *because I felt like a part of a community and that I didn't have to do this all on my own -*
321 *there were other great people like me going through the same thing.”*

322 *“The first year was very helpful. As a first gen with a non-helpful PI, I had no idea of how*
323 *the process worked or what was expected. The second year was less helpful as I felt*
324 *participants were expecting solid feedback without putting in as much effort reviewing for*
325 *others.”*

326 *“I'm still on the job market, but it helped me realize that I'm in the same boat as everyone*
327 *else.”*

328
329 In contrast, only three participants felt that their participation had little or no impact. When asked
330 to provide examples of helpful feedback, the participants noted they received helpful feedback
331 about the grammar and structure of their documents (n = 9) and identifying areas which needed
332 more clarity (n = 8):

333 *“One of my reviewers suggested a way to structure my teaching statement that I hadn't*
334 *considered. I still use it!”*

335 *“Pointing out sections that would be unclear to a broader audience, suggestions on how*
336 *to highlight future plans (i.e., what will your lab look like/do)”*

337 *“Grammatical errors were plenty in my text, since I am not a native speaker. So it was*
338 *very helpful for me that (apparently) a native English speaker edited my texts.”*

339 *“Someone told me “This is really cool and I can't wait to see what happens when you get*
340 *a job!” which was so nice and affirming to hear - this whole process is so demoralizing*
341 *and kind of dehumanizing, and it's really hard to get feedback (and praise, honestly) from*
342 *people who don't already know you. This person offered helpful constructively critical*
343 *feedback too, but that was such a nice boost.”*

344 The majority of participants, 29 out of 42, had no concerns about participating (69%). When the
345 participants expressed concern, their concerns revolved primarily around competition and
346 plagiarism (n = 8) or the lack of relevant feedback from reviewers (n = 7):

347 *“In editing peers' diversity statements in particular, I became a little concerned that this*
348 *process might elevate people's statements to sound more aware and conscientious than*
349 *they actually are on their own.”*

350 *“Some concerns about competition with those who may be applying to the same positions*
351 *as myself.”*

352 *“I was worried that my reviewers [sic] fields would be very different from my own.”*

353 *“Some of the feedback I received seemed rushed and as though the other participant*
354 *hadn't put much effort into reviewing my documents.”*
355

356 Among the non-participants, 22 out of 38 were aware of the Program's existence before the
357 survey (Figure 7A), but many of these respondents either were not on the job market in the prior
358 year (n = 6), were too busy (n = 6), or had gotten feedback elsewhere (n = 8) . Of those that
359 planned to go on the job market soon, most (11/19) planned to participate in the Program in the
360 future or were undecided (6/19) - very few non-participants planned never to participate in the
361 Program (2/19; Figure 7B). In our open-ended question about their reasons for not participating,
362 non-participants reported that they generally heard about the Program too late or did not have
363 job materials ready (n = 9), or they wanted feedback from different people than they thought
364 participated (n = 6; Figure 7C):

365 *“I would prefer feedback from people who have already successfully secured the type of*
366 *position I would like.”*

367 *“The main reason I did not think feedback from the peer reviews would be useful was*
368 *that I assumed the majority of reviewers were peers who had yet to successfully get a*
369 *job, and therefore their comments would be less useful than those of people who had*
370 *successfully applied for and gotten an academic position, or people who had served on*
371 *search committees. I do not know how this issue could be addressed within the Future*
372 *PI Slack community, except to ask those who have since moved on to the next career*
373 *stage to contribute back.”*

374 *“I'd like to participate in this program if I know this review program before my*
375 *applications.”*

408 scientific journey, from early graduate student to full professors, a feeling that is exacerbated for
409 individuals from underrepresented or marginalized populations (Stachl & Beranger 2020). Data
410 suggest, however, that having a scientific and social community play a significant role in
411 individual success (Brommer & Eisen 2007, Ysslyk et al. 2019). Further, socio-emotional
412 support and encouragement promote persistence in research careers for early career
413 researchers while lack of these types of support is associated with disengagement from
414 research and possibly attrition (Lambert et al. 2020, Pyhalto et al. 2017, Vekkaila et al. 2016).
415 Social support can even combat, to a small degree, the negative psychological impact of sexism
416 and racism within academia (Rodrigues et al. 2021).

417 Our survey data suggest that at least the Program, and likely FuturePI Slack more
418 broadly, provides vital support to individuals facing greater difficulty in finding mentors for career
419 support, either because of their career trajectory or identity. First, the respondents of this study
420 are more likely to identify as members of historically underrepresented or marginalized groups,
421 e.g., as female (although survey respondents overall are more likely to identify as female: Cull
422 et al. 2005, Sax et al. 2003) or as non-white men, than the pool of postdocs in the USA, where
423 the majority of the respondents are employed. This result is particularly notable given that, in
424 biomedical sciences at least, men and women are equally represented in early career stages of
425 PhDs and postdocs (NSF 2017), but women are significantly less likely than men to transition to
426 an independent PI position (Lerchenmueller & Sorenson 2018), representing only 40% of
427 assistant professors and 30% of associate professors (Jena et al. 2015). The transition from
428 postdoc to independent PI is a major barrier for individuals from underrepresented minority
429 populations (Bhalla 2019, Meyers et al. 2018). However, targeted interventions (e.g. peer review
430 programs or workshops) can significantly increase postdoc confidence in their ability to apply to
431 faculty jobs, which is predicted to increase persistence (Yadav & Seals 2019) at the career
432 stage when these postdocs are most likely to 'leak' out of the pipeline. The demographics of our
433 survey respondents likely also influenced the broad range of jobs our participants apply to:
434 female and underrepresented minority postdocs are more likely to be interested in pursuing both
435 research-intensive and teaching-intensive jobs, rather than only research-intensive jobs, and
436 postdocs who are three or more years into their position are less committed to remaining in
437 academia than postdocs in their first or second year (Lambert et al. 2020). Alternatively,
438 postdocs who receive less mentoring from their primary supervisor are less likely to pursue an
439 academic research career (Scaffidi & Berman 2012).

440 Further, participants were less likely to ask their PI or other postdocs to review their job
441 application materials than the non-participants. This difference may be due to lack of support
442 more broadly and/or because nearly 40% of our respondents switched fields between their PhD
443 and their current position, a trend that is becoming increasingly common (Zeng et al. 2019), and
444 thus may lack a broad network within their current field. Compared to non-participant
445 respondents, the participants have spent more years on the job market, applied to more jobs,
446 and a wider range of jobs, possibly reflecting a wider net cast by individuals searching for a
447 position for longer. Lastly, the responses to the open-ended survey questions on the benefits of
448 participating in the program confirmed that participants frequently received positive affirmation
449 on the quality of their materials, which helped them to gain confidence and combat imposter
450 syndrome while in the midst of the grueling search for a faculty job. Multiple respondents, in
451 commenting on the difficulty and stress of searching for a faculty position, specifically mentioned

452 that participating in the Program helped them to feel less alone (e.g., Cree-Green et al. 2020,
453 Jaremka et al. 2020) and previous surveys have reported that postdocs found the process of
454 applying for jobs to be easier when they had a strong network of support (Zimmerman 2018).
455 The participants were further emotionally bolstered by the act of helping others to improve their
456 materials and the idea that as a community, early-career academics all rise by helping each
457 other. Community building as a career development strategy provides opportunities (Blackford
458 2018), especially for historically excluded groups, to build social capital and networks that may
459 enhance their career opportunities (Alfred et al. 2019). Similar peer review programs could fulfill
460 the same function by providing peer support and mentorship for early-career academics at their
461 institutions, particularly for those who may lack that support elsewhere.

462 In addition to quantifying the utility of the Program, another goal of this study was, by
463 combining both the survey and additional participant feedback sent directly to the organizers, to
464 identify areas of potential improvement and best practices for participating. For example, this
465 year we began recruiting participants for the program in June 2021 and organized the first week
466 of peer-reviewing in July instead of waiting until August. Because the COVID-19 pandemic has
467 highlighted the need for flexibility, we also transitioned from sending out materials on Monday
468 and asking for feedback by Friday to asking that materials be sent out on Thursday with
469 feedback due back on Monday. One challenge we have consistently encountered is ensuring
470 full participation for and from everyone who signs up. Often, potential participants sign up
471 immediately after the program announcement on FuturePI Slack, but weeks later, these
472 individuals may find themselves with too much other work to participate. We now send an email
473 the day before to everyone who has signed up requesting confirmation that they are still willing
474 and able to participate before assigning groups. Even with this precaution, however, a few times
475 a year even confirmed participants discover they are unable to participate. In these instances,
476 we try to maintain flexibility for those participants and ensure the full benefits of participation for
477 the remaining group members. We now ask participants to notify us if a group member failed to
478 send out their materials or failed to send back feedback on the documents of their group
479 members. If a participant fails to do either of these actions more than twice after confirming their
480 desire to participate, they are removed from participation for the rest of the year in order to
481 ensure other participants do not miss out on feedback from group members too often. So far,
482 we have not had to remove a participant. We also ask to be notified of any unprofessional
483 review comments and immediately bar individuals who provide such comments from
484 participating in any future rounds of peer review (Silbiger & Stubler 2019).

485 Multiple participants suggested the following best practices guidelines, which we plan to
486 include in future Program materials: 1) Participate early when documents are still quite rough in
487 order to get 'big picture' or overall feedback on the ideas and organization; 2) Participate more
488 than once to get a breadth of feedback from at least 4-6 peer reviewers, but on a timeline of
489 every other week to allow for significant revision of early drafts; 3) Participate again ~2 weeks
490 before an important or specific deadline to get specialized feedback on nearly polished
491 documents for a particular application.

492 Finally, the last goal of this study was to provide a model for other organizations wishing
493 to develop similar peer-reviewing programs, in part because trainees' perceived institutional
494 support drives career search efficacy for postdocs (St. Clair et al. 2017). Already, the authors
495 have received anecdotal reports from former participants organically replicating the goals and

496 structure of this program in other organizations (e.g., Plant Postdoc Slack, Victoria University of
497 Wellington Postdoctoral Society, and the NIH Office of Intramural Training and Education) for
498 graduate students, postdocs, and other early-career academics. As indicated in our survey,
499 although 70-80% of the respondents are employed at institutions having offices for professional
500 development whose services might be of use to them, the majority of respondents were either
501 unaware of any offering of editing services or sure that the offices did not offer such services.
502 About 30-35% of respondents reported that these offices did offer such editing services, but
503 only 10-15% of all respondents had taken advantage of this service. Moreover, the organization
504 of similar peer-reviewing programs is not limited to universities and colleges; discipline-specific
505 professional societies and organizations or broader national organizations like the National
506 Postdoctoral Association could organize similar programs, either as a workshop at annual
507 conferences or a multi-week program over the longer term. In fact, the sponsoring of such
508 groups by professional scientific societies has been spontaneously suggested by postdocs in
509 surveys as a way to improve their support of postdocs (Shaw et al. 2015). To lower the effort
510 required to start a similar program, we include a 'starter' package of materials in the
511 supplemental materials we routinely use. The focus can also be expanded to offer peer-review
512 for the other aspects of the faculty application journey such as job talks or chalk talks (e.g.,
513 Henderson et al. 2016) or shifted to other types of academic documents like grant applications,
514 course syllabi, or reappointment/tenure dossiers.

515 Ultimately, programs like the FuturePI Reviewing Groups Program provide an
516 opportunity to improve the quality of one's job application materials, which may, in turn, improve
517 one's odds of success in attaining an independent faculty position. However, programs that
518 build peer-support and mentorship networks for early-career academics may also play a role in
519 retaining and strengthening a diverse academic workforce despite the structural leaks in the
520 pipeline. Our hope is that this Program description inspires other organizations to create similar
521 programs to support vulnerable early-career academics in their search for independence.
522

523 **Supplemental Material**

524 Supplemental Material - 'Starter Pack' of example sign-up sheet, text describing the program,
525 Confirmation email and assignment email.

526 Supplemental Table 1 - Survey Questions
527

528 **Author Contributions**

529 KEG conceived of and designed the study, ET and AGT designed the survey questions with
530 assistance from CG, AS, DK, EK, and KEG. CG, EK, AGT, and KEG analyzed the data. KEG
531 drafted the manuscript with assistance from AS, AGT, and ET. All authors provided edits and
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538

539 Conflicts of Interest

540 The authors declare no conflicts of interest
541
542

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