1	The Transition to Grandparenthood and its Impact on the Big Five Personality
2	Traits and Life Satisfaction
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36 Abstract

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Keywords: grandparenthood, Big Five, life satisfaction, development, propensity

score matching

Word count: abc

The Transition to Grandparenthood and its Impact on the Big Five Personality Traits and Life Satisfaction

In view of an aging demographic and an increased share of childcare functions being fulfilled by grandparents, intergenerational relations have received heightened attention from psychological and sociological research in recent years (Bengtson, 2001). With regard to personality development, the transition to grandparenthood has been posited as an important developmental task in old age (Hutteman et al., 2014). However, empirical research into the psychological consequences of this transition is sparse. Testing hypotheses derived from neo-socioanalytic theory (Roberts & Wood, 2006) in a matched control-group design (see Luhmann et al., 2014), we aim to investigate whether the transition to grandparenthood affects the Big Five personality traits and life satisfaction.

Personality Development in Middle Adulthood and Old Age

In accordance with the life span perspective characterizing aging as a lifelong
process of development and adaptation (Baltes et al., 2006), personality traits are subject
to change throughout the entire life span (Costa et al., 2019; Specht, 2017; Specht et al.,
2014). Although a major portion of development takes place in adolescence and emerging
adulthood (Bleidorn & Schwaba, 2017; Schwaba & Bleidorn, 2018), evidence has
accumulated that the Big Five personality traits also undergo changes in middle and old
adulthood (e.g., Kandler et al., 2015; Lucas & Donnellan, 2011; Mõttus et al., 2012;
Wagner et al., 2016; for a review, see Specht, 2017).

Changes over time occur both in mean trait levels of these age groups (i.e.,
mean-level change; Roberts et al., 2006) and in the relative ordering of people to each other
on trait dimensions (i.e., rank-order stability; Anusic & Schimmack, 2016; Roberts &
DelVecchio, 2000). Mean-level changes in middle adulthood (ca. 30–60 years old;
Hutteman et al., 2014) are typically characterized in terms of greater maturity as
evidenced by increased agreeableness and conscientiousness, and decreased neuroticism

(Roberts et al., 2006). In old age (ca. 60 years and older; Hutteman et al., 2014), research is generally more sparse but there is some evidence for a reversal of the maturity effect, especially following retirement (sometimes termed La dolce vita effect; Marsh et al., 2013; cf. Schwaba & Bleidorn, 2019) and at the end of life in ill health (Wagner et al., 2016). In 70 terms of rank-order stability, some prior studies have shown support for an inverted 71 U-shape trajectory (Ardelt, 2000; Lucas & Donnellan, 2011; Specht et al., 2011; Wortman et al., 2012): Rank-order stability rises until reaching a plateau in midlife, and decreases, 73 again, in old age. However, evidence is mixed whether rank-order stability actually decreases again in old age (see Costa et al., 2019). Nonetheless, the historical view that 75 personality is stable, or "set like plaster" (Specht, 2017, p. 64) after one reaches adulthood (or leaves emerging adulthood behind; Bleidorn & Schwaba, 2017) can be largely 77 abandoned (Specht et al., 2014). Theories explaining the mechanisms of personality development in middle 79 adulthood and old age emphasize as interdependent sources of stability and change both genetic influences and life experiences (Specht et al., 2014; Wagner et al., 2020). Here, we 81 focus on the latter¹ and conceptualize the transition to grandparenthood as a life experience that offers the adoption of a new social role according to the social investment principle of neo-socioanalytic theory (Lodi-Smith & Roberts, 2007; Roberts & Wood, 2006). According to the social investment principle, normative life events or transitions 85 such as entering the work force or becoming a parent lead to personality maturation through the adoption of new social roles (Roberts et al., 2005). These new roles encourage 87 or compel people to act in a more agreeable, conscientious, and emotionally stable way, and the experiences in these role as well as societal expectations towards them are hypothesized to drive long-term personality development (Lodi-Smith & Roberts, 2007). Conversely, consistent social roles foster personality stability. The paradoxical theory of

¹ In a behavior-genetic twin study, Kandler et al. (2015) found that environmental factors were the main source of personality development in old age.

personality coherence (Caspi & Moffitt, 1993) offers another explanation for personality
development stating that trait change is more likely whenever people transition into
unknown environments where pre-existing behavioral responses are no longer appropriate
and societal norms or social expectations give clear indications how to behave instead
(vs. environments where no such guidance is available). This supports the view that
age-graded, normative life experiences such as possibly the transition to grandparenthood
drive personality development (see also Specht et al., 2014).

Certain life events such as the first romantic relationship (Wagner et al., 2015) or 99 the transition from high school to university (Lüdtke et al., 2011) have (partly) been found 100 to be accompanied by mean-level increases in line with the social investment principle (for 101 a review, see Bleidorn et al., 2018). However, recent evidence regarding the transition to 102 parenthood failed to empirically support the social investment principle (Asselmann & 103 Specht, 2020; van Scheppingen et al., 2016). An analysis of monthly trajectories of the Big 104 Five before and after nine major life events only found limited support for the social investment principle, that is, small increases were only found in emotional stability 106 following the transition to employment but not for the other traits or for the other life 107 events theoretically linked to social investment (Denissen et al., 2019). It has also been 108 emphasized recently that effects of life events on the Big Five personality trends generally 109 tend to be small, and need to be properly analyzed using robust, prospective designs and 110 appropriate control groups (Bleidorn et al., 2018; Luhmann et al., 2014). 111

Overall, much remains unknown regarding the environmental factors underlying
personality development in middle adulthood and old age. One indication that age-graded,
normative life experiences contribute to change following a period of relative stability is
recent research on retirement (Bleidorn & Schwaba, 2018; Schwaba & Bleidorn, 2019).
While these results were only partly in line with the social investment principle in terms of
mean-level changes and displayed substantial individual differences in change trajectories,
the authors also discuss that as social role "divestment" (Schwaba & Bleidorn, 2019, p. X)

retirement functions differently compared to social investment which adds a role. The
transition to grandparenthood could represent such an investment in older
adulthood—given that grandparents have regular contact with their grandchild and
actively take part in childcare (i.e., invest psychologically in the new grandparent role;
Lodi-Smith & Roberts, 2007), to some degree.

124 Grandparenthood

The transition to grandparenthood, that is, the birth of the first grandchild, can be described as a time-discrete life event marking the beginning of one's status as a grandparent (Luhmann et al., 2012). In terms of characteristics of major life events (Luhmann et al., 2020), the transition to grandparenthood stands out in that it is externally caused (by one's own children), while at the same time predictable (as soon as one's children reveal their family planning or pregnancy), as well as generally positive in valence and emotionally significant.

Grandparenthood can also be characterized as a developmental task (Hutteman et 132 al., 2014) mostly associated with the period of (early) old age—although considerable 133 variation in the age at the transition to grandparenthood exists both within and across 134 cultures (Leopold & Skopek, 2015; Skopek & Leopold, 2017). Still, the period where 135 parents on average experience the birth of their first grandchild coincides with the end of 136 midlife stability in terms of personality development (Specht, 2017), where retirement, 137 shifting social roles, and initial cognitive and health declines can potentially be disruptive 138 to life circumstances putting personality development into motion (e.g., Mueller et al., 2016; Stephan et al., 2014). As a developmental task, grandparenthood is expected to follow a normative sequence of aging that is subject to societal expectations and values differing across cultures and historical time (Hutteman et al., 2014). Mastering developmental tasks to a high degree is hypothesized to drive personality development towards maturation 143 similarly to propositions by the social investment principle, that is, leading to higher levels

of agreeableness and conscientiousness, and lower levels of neuroticism (Roberts et al.,

2005; Roberts & Wood, 2006). In comparison to the transition to parenthood which has 146 been found to be ambivalent in terms of both personality maturation and life satisfaction 147 (Krämer & Rodgers, 2020; van Scheppingen et al., 2016), Hutteman et al. (2014) 148 hypothesize that the transition to grandparenthood is generally seen as positive because it 149 (usually) does not impose the stressful daily demands of childcare on grandparents. 150 While we could not find prior studies investigating development of the Big Five over 151 the transition to grandparenthood, there is some evidence on life satisfaction although it is 152 conflicting: Past research on associations of grandparenthood with life satisfaction often 153 relied on cross-sectional designs (e.g., Mahne & Huxhold, 2014; Triadó et al., 2014). 154 Longitudinal studies utilizing panel data from the Survey of Health, Ageing and 155 Retirement in Europe (SHARE) showed that the birth of a grandchild was followed by improvements to quality of life and life satisfaction only among women (Tanskanen et al., 2019), and only in first-time grandmothers via their daughters (Di Gessa et al., 2019). Several studies emphasized that grandparents actively involved in childcare experienced 159 larger positive effects to life satisfaction (Arpino, Bordone, et al., 2018; Danielsbacka et al., 160 2019; Danielsbacka & Tanskanen, 2016). On the other hand, fixed effects regression 161 $models^2$ using SHARE data did not find any effects of first-time grandparenthood on life 162 satisfaction regardless of grandparental investment and only minor decreases of 163 grandmothers' depressive symptoms (Sheppard & Monden, 2019). In a similar vein, some 164 prospective studies reported beneficial effects of the transition to grandparenthood and of 165 grandparental childcare investment on various health measures, especially in women 166 (Chung & Park, 2018; Condon et al., 2018; Di Gessa et al., 2016a, 2016b). Again, effects 167 on self-rated health did not persevere in fixed effects analyses as reported in Ates (2017) 168 who used longitudinal data from the German Aging Survey (DEAS). 160

² Fixed effects regression models exclusively rely on within-person variance (see Brüderl & Ludwig, 2015; McNeish & Kelley, 2019).

70 Current Study

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Three research questions motivate the current study which is the first to analyze personality development over the transition to grandparenthood with regards to the Big Five traits:

- 174 1. What are the effects of the transition to grandparenthood on mean-level trajectories of the Big Five traits and life satisfaction?
 - 2. How large are interindividual differences in intraindividual change for the Big Five traits and life satisfaction over the transition to grandparenthood?
 - 3. How does the transition to grandparenthood affect rank-order stability of the Big Five traits and life satisfaction?

To address these questions, we will compare development over the transition to 180 grandparenthood with that of matched participants that do not experience this transition 181 during the study period (Luhmann et al., 2014). This is necessary because pre-existing 182 differences in variables related to the development of the Big Five or life satisfaction 183 between those who are observed to become a grandparent and those who are not introduce 184 confounding bias when trying to estimate the effect of the transition to grandparenthood 185 (e.g., VanderWeele et al., 2020). Propensity score matching accounts for confounding 186 through equating the groups in their propensity to experience the event in question, which 187 is calculated from a broad range of covariates related to the event and the outcomes. 188 Thereby, to address confounding balance between the covariates used to calculate the 189 propensity score is also aimed for (Stuart, 2010). We adopt a prospective design that tests effects of first-time grandparents against 191

We adopt a prospective design that tests effects of first-time grandparents against
two propensity-score-matched control groups: first, a matched control group of parents
(but not grandparents) with at least their oldest child in reproductive age, and, second, a
matched control group of nonparents. This allows us to disentangle potential effects
attributable to becoming a grandparent from effects attributable to being a parent, thus,

addressing selection effects into grandparenthood and confounding more comprehensively 196 than previous research. Our comparative design also controls for average age-related and 197 historical trends in the Big Five traits and life satisfaction (Luhmann et al., 2014), and 198 enables us to report effects of the transition to grandparenthood unconfounded by 199 instrumentation effects, which describe the tendency of reporting lower well-being scores 200 with each repeated measurement (Baird et al., 2010). We go beyond previous studies 201 utilizing matched control groups (Anusic et al., 2014a, 2014b; Yap et al., 2012) in that we 202 performed the matching at a specific time point preceding the transition to 203 grandparenthood (at least two years before) and not based on individual survey years. 204 This design choice ensures that the covariates involved in the matching procedure are not 205 already influenced by the event or anticipation of it (Elwert & Winship, 2014; Greenland, 206 2003; Rosenbaum, 1984; VanderWeele, 2019; VanderWeele et al., 2020), thereby also reducing the risk of confounding through collider bias (Elwert & Winship, 2014). Similar approaches in the study of life events have recently been adopted (Balbo & Arpino, 2016; Krämer & Rodgers, 2020; van Scheppingen & Leopold, 2020). 210 Informed by the social investment principle and previous research on personality 211 development in middle adulthood and old age, we preregistered the following hypotheses (prior to data analysis; osf.io/): 213

- H1a: Following the birth of their first grandchild, grandparents increase slightly in agreeableness and conscientiousness, and decrease in neuroticism as compared to the matched control groups of parents (but not grandparents) and nonparents, but do not differ in their trajectories of extraversion and openness to experience.
- H1b: Grandmothers increase in life satisfaction following the transition to grandparenthood as compared to the matched control groups (but grandfathers do not).
- H2: Individual differences in intraindividual change in the Big Five and life satisfaction are larger in the grandparent group than the control group.

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- H3a: Compared to the matched control groups, grandparents' rank-order stability of 223 the Big Five decreases over the transition to grandparenthood. 224
 - H3b: Grandparents' rank-order stability of life satisfaction is comparatively stable over the transition to grandparenthood.

Exploratorily, we further probe the social investment principle by testing two moderators of potential social investment and role conflict, hours of grandchild care and 228 performing paid work.

Methods 230

Samples 231

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To evaluate these hypotheses, we used data from two population-representative 232 panel studies: the Longitudinal Internet Studies for the Social Sciences (LISS) panel from 233 the Netherlands and the Health and Retirement Study (HRS) from the United States. 234 The LISS panel is a representative sample of the Dutch population initiated in 2008 235 with data collection still ongoing (Scherpenzeel, 2011; van der Laan, 2009). It is 236 administered by CentERdata (Tilburg University, The Netherlands). Included households 237 are a true probability sample of households drawn from the population register 238 (Scherpenzeel & Das, 2010). While originally roughly half of invited households consented 239 to participate, refreshment samples were drawn in order to oversample previously 240 underrepresented groups using information about response rates and their association with 241 demographic variables (household type, age, ethnicity; see 242 https://www.lissdata.nl/about-panel/sample-and-recruitment). Data collection was carried out online and participants lacking the necessary technical equipment were outfitted with it. We included yearly assessments from 2008 to 2020 from several different modules (see Measures) as well as data on basic demographics which was assessed on a monthly rate. For later coding of covariates from these monthly demographic data we used the first 247 available assessment in each year.

The HRS is a longitudinal population-representative study of older adults in the US 249 (Sonnega et al., 2014) administered by the Survey Research Center (University of 250 Michigan, United States). Initiated in 1992 with a first cohort of individuals aged 51-61 251 and their spouses, the study has since been extended with additional cohorts in the 1990s. 252 In addition to the HRS core interview every two years (in-person or as a telephone survey), 253 the study has since 2006 included a leave-behind questionnaire covering a broad range of 254 psychosocial topics including the Big Five personality traits and life satisfaction. These 255 topics, however, were only administered every four years starting in 2006 for one half of the 256 sample and in 2008 for the other half. We included personality data from 2006 to 2016, all 257 available data for the coding of the transition to grandparenthood from 1996 to 2016, as 258 well as covariate data from 2006 to 2016 including variables drawn from the Imputations 259 File and the Family Data (available up to 2014).

These two panel studies provided the advantage that they contained several waves 261 of personality data as well as information on grandparent status and a broad range of 262 covariates at each wave. While the HRS provided a large sample with a wider age range, 263 the LISS panel was smaller and vounger³ but provided more frequent personality 264 assessments spaced every one to two years. Note that M. van Scheppingen has previously 265 used the LISS panel to analyze???. B. Chopik has previously used the HRS to analyze 266 ???. These publications do not overlap with the current study in the central focus of 267 grandparenthood. The present study used de-identified archival data in the public 268 domain, and, thus, it was not necessary to obtain ethical approval from an IRB. 269

Measures

³ The reason for the included grandparents from the LISS panel being younger was that grandparenthood questions were part of the *Work and Schooling* module and—for reasons unknown to us—filtered to participants performing paid work. Thus, older, retired first-time grandparents from the LISS panel could not be included.

⁴ Publications using LISS panel data can be searched at https://www.dataarchive.lissdata.nl/publications/. Publications using HRS data can be searched at https://hrs.isr.umich.edu/publications/biblio/.

1 Personality

In the LISS panel, the Big Five personality traits were assessed using the 50-item 272 version of the IPIP Big-Five inventory scales (Goldberg, 1992). For each Big Five trait, ten 273 5-point Likert-scale items were answered (1 = very inaccurate, 2 = moderately inaccurate, 3 274 = neither inaccurate nor accurate, 4 = moderately accurate, 5 = very accurate). Example items included "Like order" (conscientiousness), "Sympathize with others' feelings" (agreeableness), "Worry about things" (neuroticism), "Have a vivid imagination" (openness 277 to experience), and "Start conversations" (extraversion). At each wave, we took a 278 participant's mean of each subscale as their trait score. Internal consistencies, as indicated 279 by McDonald's ω (McNeish, 2018), averaged XX over all traits and years ranging from XX 280 (X) in year to XX (X) in year. Another study has shown measurement invariance for these 281 scales across time and age groups (Schwaba & Bleidorn, 2018). The Big Five (and life 282 satisfaction) were contained in the *Personality* module which was administered yearly but 283 with planned missingness in some years for certain cohorts (see Denissen et al., 2019). 284 Thus, there are one to two years between included assessments, given no other sources of 285 missingness. 286 In the HRS, the Midlife Development Inventory (MIDI) scales were administered to 287 measure the Big Five (Lachman & Weaver, 1997). This scale was constructed for use in 288 large-scale panel studies of adults and consisted of 26 adjectives (five each for 280 conscientiousness, agreeableness, and extraversion, four for neuroticism, and seven for 290 openness to experience). Participants were asked to rate on a 4-point scale how well each 291 item described them (1 = a lot, 2 = some, 3 = a little, 4 = not at all). Example items included "Organized" (conscientiousness), "Sympathetic" (agreeableness), "Worrying" (neuroticism), "Imaginative" (openness to experience), and "Talkative" (extraversion). For better comparability with the LISS panel, we reverse scored all items so that higher values 295 corresponded to higher trait levels and, at each wave, took the mean of each subscale as 296 the trait score. Big Five trait scores showed satisfactory internal consistencies which 297

²⁹⁸ averaged XX over all traits and years ranging from XX (X) in year to XX (X) in year.

$_{299}$ Life satisfaction

In both samples, life satisfaction was assessed using the 5-item Satisfaction with Life
Scale (SWLS; Diener et al., 1985) which participants answered on a 7-point Likert scale (1

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307 Transition to Grandparenthood

The procedure to obtain information on grandparents' transition to 308 grandparenthood generally followed the same steps in both samples. The items this coding 309 was based on, however, differed slightly: In the LISS panel, participants were asked "Do 310 you have children and/or grandchildren?" with "children", "grandchildren", and "no children or grandchildren" as possible answer categories. This question was part of the Work and Schooling module and filtered to participants performing paid work. In the HRS, 313 all participants were asked for the total number of grandchildren: "Altogether, how many 314 grandchildren do you (or your husband / wife / partner, or your late husband / wife / 315 partner) have? Include as grandchildren any children of your (or your [late] husband's / 316 wife's / partner's) biological, step- or adopted children". 317 In both samples, we tracked grandparenthood status ($0 = no \ qrandchildren, 1 = at$ 318 least one grandchild) over time. Due to longitudinally inconsistent data in some cases, we 319 included in the grandparent group only participants with exactly one transition from 0 to 1 320 in this grandparenthood status variable, and no transitions back (see Fig. SX). We marked

⁵ In the LISS panel, the "somewhat" was omitted and instead of "or" "nor" was used.

⁶ The reference to step- or adopted children has been added since wave 2006.

participants who continually indicated that they had no grandchildren as potential members of the control groups.

For propensity score matching, we used a broad set of covariates (VanderWeele et

Covariates

325

al., 2020) covering participants' demographics (e.g., education), economic situation (e.g., income), and health (e.g., mobility difficulties). We also included the pre-transition 327 outcome variables as covariates—as recommended in the literature (Cook et al., 2020; 328 Hallberg et al., 2018; Steiner et al., 2010; VanderWeele et al., 2020), as well as the panel 329 wave participation count and the assessment year in order to control for instrumentation 330 effects and historical trends (e.g., 2008 financial crisis; Baird et al., 2010; Luhmann et al., 331 2014). For matching grandparents with the parent control group we additionally included 332 as covariates variables related to fertility and family history (e.g., number of children, age 333 of first three children) which were causally related to the timing of the transition to 334 grandparenthood (i.e., entry into treatment; Arpino, Gumà, et al., 2018; Margolis & 335 Verdery, 2019). 336 Covariate selection has seldom been explicitly discussed in previous longitudinal 337 studies estimating treatment effects of life events (e.g., through a matching design). We see 338 two (in part conflicting) traditions that address covariate selection: First, classical 339 recommendations from psychology argue to include all available variables that are to 340 associated with both the treatment assignment process (i.e., selection into treatment) and 341 the outcome (e.g., Steiner et al., 2010; Stuart, 2010). Second, recommendations from a structural causal modeling perspective (see Elwert & Winship, 2014; Rohrer, 2018) are more cautious aiming to avoid pitfalls such as conditioning on a pre-treatment collider (collider bias) or a mediator (overcontrol bias). Structural causal modeling, however, 345 requires advanced knowledge of the causal structures underlying all involved variables 346 (Pearl, 2009).

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In selecting covariates, we followed guidelines laid out by VanderWeele et al. (2019; 348 2020) which reconcile both views and offer practical guidance when complete knowledge of 349 the underlying causal structures is unknown: They propose a "modified disjunctive cause 350 criterion" (VanderWeele, 2019, p. 218) recommending to select all available covariates 351 which are assumed to be causes of the outcomes, treatment exposure (i.e., the transition to 352 grandparenthood), or both, as well as any proxies for an unmeasured common cause of the 353 outcomes and treatment exposure. To be excluded from this list are variables assumed to 354 be instrumental variables (i.e., assumed causes of treatment exposure that are unrelated to 355 the outcomes except through the exposure) and collider variables (Elwert & Winship, 356 2014). Because all our covariates were measured at the time of matching (i.e., at least two 357 years before the birth of the grandchild), we judge the risk of covariates introducing 358 collider bias and overcontrol bias to be relatively small.

An overview of the variables we used to compute the propensity scores for matching can be found in the Supplemental Material, alongside justification for each covariate on whether we assume it to be causally related to treatment assignment, the outcomes, or both. Generally, we tried to find substantively equivalent covariates in both samples but had to compromise in a few cases (e.g., children's educational level only in HRS vs. children living at home only in LISS).

Estimating propensity scores requires complete covariate data. Therefore, before computing propensity scores, we performed multiple imputations in order to account for missingness in our covariates (Greenland & Finkle, 1995). Using five imputed data sets computed by classification and regression trees (CART; Burgette & Reiter, 2010) in the R package *mice* (van Buuren & Groothuis-Oudshoorn, 2011), we predicted treatment assignment (i.e., the transition to grandparenthood) five times per observation in logistic regressions with a logit link function.⁷ We averaged these five scores to create the final

 $^{^{7}}$ In these logistic regressions we included all covariates listed above as predictors except for *female* which was later used for exact matching and health-related covariates in LISS wave 2014 which were not altogether assessed in that wave.

propensity score to be used for matching (Mitra & Reiter, 2016). We only used imputed
data for propensity score computation and not in later analyses because missing data in
the outcome variables due to nonresponse was negligible.

376 Moderators

Based on insights from previous research, we tested three variables as potential 377 moderators of the mean-level trajectories of the Big Five and life satisfaction over the transition to grandparenthood: First, we analyzed whether gender acted as a moderator as indicated by research on life satisfaction (Di Gessa et al., 2019; Tanskanen et al., 2019). We coded a dummy variable indicating female gender (0 = male, 1 = female). Second, we 381 tested whether performing paid work or not was associated with divergent trajectories of 382 the Big Five and life satisfaction (see Schwaba & Bleidorn, 2019). Since the LISS subsample 383 of grandparents we identified was based exclusively on participants performing paid work, 384 we performed these analyses only in the HRS subsample. This served two purposes: to test 385 how participants involved in the workforce (even if officially retired) differed from those not 386 working, and to assess whether potential differences in the main results between the LISS 387 and HRS samples disappeared once we constrained the HRS sample in the same way that 388 the LISS sample had already been constrained through filtering. 389

Third, we tested how the involvement in grandchild care affected trajectories of the
Big Five and life satisfaction in grandparents after the transition to grandparenthood. We
coded a dummy variable (0 = provided less than 100 hours of grandchild care, 1 = provided
100 or more hours of grandchild care) as a moderator based on the question "Did you (or
your [late] husband / wife / partner) spend 100 or more hours in total since the last
interview / in the last two years taking care of grand- or great grandchildren?". This
information was only available in the HRS; in the LISS panel only very few participants

⁸ Although dichotomization of a continuous construct (hours of care) is not ideal for moderation analysis (MacCallum et al., 2002), there were too many missing values in the variable assessing hours of care directly (*E063).

answered follow-up questions on intensity of care (>50 in the final analysis sample).

398 Procedure

Drawing on all available data, three main restrictions defined the final analysis 399 samples of grandparents (see Fig. X for participant flowcharts): First, we identified participants who indicated having grandchildren for the first time during study participation (see Measures; $N_{LISS} = 337$; $N_{HRS} = 2982$, including HRS waves 1996-2004 402 before personality assessments were introduced). Second, we restricted the sample to participants with at least one valid personality assessment ($N_{LISS} = 335; N_{HRS} = 1577$). 404 Third, we included in the analysis samples only participants with both a valid personality 405 assessment before and one after the transition to grandparenthood ($N_{LISS} = 253; N_{HRS} =$ 406 721). Lastly, few participants were excluded because of inconsistent or missing information 407 regarding their children¹⁰ resulting the final analysis samples of first-time grandparents, 408 $N_{LISS} = 250$ (XX% female; age at transition to grandparenthood M = XX, SD = XX) and 400 $N_{HRS} = 712$ (XX% female; age at transition to grandparenthood M = XX, SD = XX). 410 To disentangle effects of the transition to grandparenthood from effects of being a 411 parent, we defined two pools of potential control subjects to be involved in the matching 412 procedure: The first pool of potential control subjects comprised parents who had at least 413 one child in reproductive age (defined as $15 \leq age_{firstborn} \leq 65$) but no grandchildren 414 throughout the observation period ($N_{LISS} = 844$ with 3,040 longitudinal observations; 415 $N_{HRS} = 1,891$ with 3,300 longitudinal observations). The second pool of potential matches 416 comprised participants who reported being childless throughout the observation period $(N_{LISS} = 1077 \text{ with } 4,337 \text{ longitudinal observations}; N_{HRS} = 1,577 \text{ with } 2,357 \text{ longitudinal}$ observations). The two control groups were, thus, by definition mutually exclusive. 419

⁹ For the HRS subsample, we also excluded N=30 grandparents in a previous step who reported unrealistically high numbers of grandchildren (> 10) in their first assessment after the transition to grandparenthood.

¹⁰ We opted not to use multiple imputation for these child-related variables such as number of children which defined the control groups and were also later used for computing the propensity scores.

Propensity score matching of grandparents was performed in a grandparent's survey
year preceding the first wave after reporting the transition by at least two years. This
served the purpose to ensure that the covariates used for matching were not affected by the
event itself or its anticipation (e.g., when one's child was already pregnant with the
grandchild; Greenland, 2003; Rosenbaum, 1984; VanderWeele et al., 2020). Propensity
score

426 Analytical Strategy

This design is referred to by Shadish, Cook, and Campbell (2002, p. 182) as an interrupted time-series with a "nonequivalent no-treatment control group".

use linear piecewise regression coefficients in multilevel regression models (Hoffman, 2015) to analyze mean-level changes. Such piecewise growth-curve models have been used in similar analysis contexts (e.g., Bleidorn & Schwaba, 2018; Schwaba & Bleidorn, 2019; van Scheppingen & Leopold, 2020).

For this article, I want to focus on mean-level changes, but we can additionally
analyze rank-order stability over the transition to grandparenthood as well as
interindividual differences in intraindindivual changes Jaap Denissen modeled
interindividual differences in personality trait change as variance in the slopes. Further, he
modeled "more sudden shifts in rank-order trait differences" as the comparison of the
test-retest correlations of the event and the control group (Denissen et al., 2019)

A list of all software we used is provided in the Supplemental Material.

440 Results

441 Discussion

Based on

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443

444

• personality maturation cross-culturally: (Bleidorn et al., 2013; Chopik & Kitayama, 2018)

- facets / nuances (Mõttus & Rozgonjuk, 2021)
- arrival of grandchild associated with retirement decisions (Lumsdaine & Vermeer, 2015); pers X WB interaction over retirement (Henning et al., 2017);
- Does the Transition to Grandparenthood Deter Gray Divorce? A Test of the Braking
 Hypothesis (Brown et al., 2021)
- prolonged period of grandparenthood? (Margolis & Wright, 2017)
- subjective experience of aging (Bordone & Arpino, 2015)
- policy relevance of personality (Bleidorn et al., 2019), e.g., health outcomes (Turiano et al., 2012), but not really evidence for healthy neuroticism (Turiano et al., 2020)

454 Limitations

Despite

456 Conclusions

Our Our

458 Acknowledgements

We thank X for valuable feedback.

460 References

- Anusic, I., & Schimmack, U. (2016). Stability and change of personality traits, self-esteem,
- and well-being: Introducing the meta-analytic stability and change model of retest
- correlations. Journal of Personality and Social Psychology, 110(5), 766–781.
- https://doi.org/10.1037/pspp0000066
- Anusic, I., Yap, S., & Lucas, R. E. (2014a). Does personality moderate reaction and
- adaptation to major life events? Analysis of life satisfaction and affect in an
- Australian national sample. Journal of Research in Personality, 51, 69–77.
- https://doi.org/10.1016/j.jrp.2014.04.009
- Anusic, I., Yap, S., & Lucas, R. E. (2014b). Testing set-point theory in a Swiss national
- sample: Reaction and adaptation to major life events. Social Indicators Research,
- 119(3), 1265-1288. https://doi.org/10.1007/s11205-013-0541-2
- 472 Ardelt, M. (2000). Still stable after all these years? Personality stability theory revisited.
- Social Psychology Quarterly, 63(4), 392–405. https://doi.org/10.2307/2695848
- 474 Arpino, B., Bordone, V., & Balbo, N. (2018). Grandparenting, education and subjective
- well-being of older Europeans. European Journal of Ageing, 15(3), 251–263.
- https://doi.org/10.1007/s10433-018-0467-2
- Arpino, B., Gumà, J., & Julià, A. (2018). Family histories and the demography of
- grandparenthood. Demographic Research, 39(42), 1105–1150.
- https://doi.org/10.4054/DemRes.2018.39.42
- 480 Asselmann, E., & Specht, J. (2020). Testing the Social Investment Principle Around
- 481 Childbirth: Little Evidence for Personality Maturation Before and After Becoming
- a Parent. European Journal of Personality, n/a(n/a).
- https://doi.org/10.1002/per.2269
- Ates, M. (2017). Does grandchild care influence grandparents' self-rated health? Evidence

```
from a fixed effects approach. Social Science & Medicine, 190, 67–74.
485
          https://doi.org/10.1016/j.socscimed.2017.08.021
486
   Baird, B. M., Lucas, R. E., & Donnellan, M. B. (2010). Life satisfaction across the lifespan:
487
           Findings from two nationally representative panel studies. Social Indicators
488
           Research, 99(2), 183–203. https://doi.org/10.1007/s11205-010-9584-9
480
   Balbo, N., & Arpino, B. (2016). The role of family orientations in shaping the effect of
490
           fertility on subjective well-being: A propensity score matching approach.
491
           Demography, 53(4), 955–978. https://doi.org/10.1007/s13524-016-0480-z
492
   Baltes, P. B., Lindenberger, U., & Staudinger, U. M. (2006). Life Span Theory in
493
          Developmental Psychology. In R. M. Lerner & W. Damon (Eds.), Handbook of child
           psychology: Theoretical models of human development (pp. 569–664). John Wiley &
495
           Sons Inc.
496
   Bengtson, V. L. (2001). Beyond the Nuclear Family: The Increasing Importance of
497
          Multigenerational Bonds. Journal of Marriage and Family, 63(1), 1–16.
498
          https://doi.org/10.1111/j.1741-3737.2001.00001.x
499
   Bleidorn, W., Hill, P. L., Back, M. D., Denissen, J. J. A., Hennecke, M., Hopwood, C. J.,
500
           Jokela, M., Kandler, C., Lucas, R. E., Luhmann, M., Orth, U., Wagner, J., Wrzus,
501
           C., Zimmermann, J., & Roberts, B. W. (2019). The policy relevance of personality
502
           traits. American Psychologist, 74(9), 1056–1067.
503
          https://doi.org/10.1037/amp0000503
504
   Bleidorn, W., Hopwood, C. J., & Lucas, R. E. (2018). Life events and personality trait
505
          change. Journal of Personality, 86(1), 83–96. https://doi.org/10.1111/jopy.12286
   Bleidorn, W., Klimstra, T. A., Denissen, J. J. A., Rentfrow, P. J., Potter, J., & Gosling, S.
507
          D. (2013). Personality Maturation Around the World: A Cross-Cultural
508
          Examination of Social-Investment Theory. Psychological Science, 24 (12),
509
          2530-2540.\ https://doi.org/10.1177/0956797613498396
```

- ⁵¹¹ Bleidorn, W., & Schwaba, T. (2018). Retirement is associated with change in self-esteem.
- Psychology and Aging, 33(4), 586–594. https://doi.org/10.1037/pag0000253
- ⁵¹³ Bleidorn, W., & Schwaba, T. (2017). Personality development in emerging adulthood. In
- J. Specht (Ed.), Personality Development Across the Lifespan (pp. 39–51).
- Academic Press. https://doi.org/10.1016/B978-0-12-804674-6.00004-1
- Bordone, V., & Arpino, B. (2015). Do Grandchildren Influence How Old You Feel? Journal
- of Aging and Health, 28(6), 1055–1072. https://doi.org/10.1177/0898264315618920
- Brown, S. L., Lin, I.-F., & Mellencamp, K. A. (2021). Does the Transition to
- Grandparenthood Deter Gray Divorce? A Test of the Braking Hypothesis. Social
- Forces, 99(3), 1209–1232. https://doi.org/10.1093/sf/soaa030
- Brüderl, J., & Ludwig, V. (2015). Fixed-Effects Panel Regression (H. Best & C. Wolf,
- Eds.). SAGE.
- Burgette, L. F., & Reiter, J. P. (2010). Multiple Imputation for Missing Data via
- Sequential Regression Trees. American Journal of Epidemiology, 172(9), 1070–1076.
- https://doi.org/10.1093/aje/kwq260
- ⁵²⁶ Caspi, A., & Moffitt, T. E. (1993). When do individual differences matter? A paradoxical
- theory of personality coherence. Psychological Inquiry, 4(4), 247–271.
- https://doi.org/10.1207/s15327965pli0404_1
- ⁵²⁹ Chopik, W. J., & Kitayama, S. (2018). Personality change across the life span: Insights
- from a cross-cultural, longitudinal study. Journal of Personality, 86(3), 508–521.
- https://doi.org/10.1111/jopy.12332
- ⁵³² Chung, S., & Park, A. (2018). The longitudinal effects of grandchild care on depressive
- symptoms and physical health of grandmothers in South Korea: A latent growth
- approach. Aging & Mental Health, 22(12), 1556-1563.
- https://doi.org/10.1080/13607863.2017.1376312

- Condon, J., Luszcz, M., & McKee, I. (2018). The transition to grandparenthood: A 536 prospective study of mental health implications. Aging & Mental Health, 22(3), 537 336-343. https://doi.org/10.1080/13607863.2016.1248897 538
- Cook, T. D., Zhu, N., Klein, A., Starkey, P., & Thomas, J. (2020). How much bias results 539 if a quasi-experimental design combines local comparison groups, a pretest outcome 540 measure and other covariates?: A within study comparison of preschool effects. 541
- Psychological Methods, Advance Online Publication, 0. 542
- https://doi.org/10.1037/met0000260 543
- Costa, P. T., McCrae, R. R., & Löckenhoff, C. E. (2019). Personality Across the Life Span. Annual Review of Psychology, 70(1), 423-448.
- https://doi.org/10.1146/annurev-psych-010418-103244
- Danielsbacka, M., & Tanskanen, A. O. (2016). The association between grandparental 547 investment and grandparents' happiness in Finland. Personal Relationships, 23(4), 548 787–800. https://doi.org/10.1111/pere.12160 549
- Danielsbacka, M., Tanskanen, A. O., Coall, D. A., & Jokela, M. (2019). Grandparental 550 childcare, health and well-being in Europe: A within-individual investigation of 551 longitudinal data. Social Science & Medicine, 230, 194–203. 552 https://doi.org/10.1016/j.socscimed.2019.03.031
- Denissen, J. J. A., Luhmann, M., Chung, J. M., & Bleidorn, W. (2019). Transactions 554 between life events and personality traits across the adult lifespan. Journal of 555 Personality and Social Psychology, 116(4), 612–633.
- https://doi.org/10.1037/pspp0000196 557

- Diener, E., Emmons, R. A., Larsen, R. J., & Griffin, S. (1985). The Satisfaction With Life 558 Scale. Journal of Personality Assessment, 49(1), 71–75.
- https://doi.org/10.1207/s15327752jpa4901__13
- Di Gessa, G., Bordone, V., & Arpino, B. (2019). Becoming a Grandparent and Its Effect

```
on Well-Being: The Role of Order of Transitions, Time, and Gender. The Journals
562
           of Gerontology, Series B: Psychological Sciences and Social Sciences, Advance
563
           Online Publication. https://doi.org/10.1093/geronb/gbz135
564
   Di Gessa, G., Glaser, K., & Tinker, A. (2016a). The Health Impact of Intensive and
565
           Nonintensive Grandchild Care in Europe: New Evidence From SHARE. The
566
           Journals of Gerontology, Series B: Psychological Sciences and Social Sciences,
567
           71(5), 867–879. https://doi.org/10.1093/geronb/gbv055
568
   Di Gessa, G., Glaser, K., & Tinker, A. (2016b). The impact of caring for grandchildren on
569
           the health of grandparents in Europe: A lifecourse approach. Social Science \mathcal{E}
570
           Medicine, 152, 166–175. https://doi.org/10.1016/j.socscimed.2016.01.041
571
   Elwert, F., & Winship, C. (2014). Endogenous Selection Bias: The Problem of
           Conditioning on a Collider Variable. Annual Review of Sociology, 40(1), 31–53.
573
          https://doi.org/10.1146/annurev-soc-071913-043455
574
   Goldberg, L. R. (1992). The development of markers for the Big-Five factor structure.
575
           Psychological Assessment, 4(1), 26-42. https://doi.org/10.1037/1040-3590.4.1.26
576
   Greenland, S. (2003). Quantifying biases in causal models: Classical confounding vs
577
          collider-stratification bias. Epidemiology, 14(3), 300–306.
578
          https://doi.org/10.1097/01.EDE.0000042804.12056.6C
579
   Greenland, S., & Finkle, W. D. (1995). A Critical Look at Methods for Handling Missing
           Covariates in Epidemiologic Regression Analyses. American Journal of
581
           Epidemiology, 142(12), 1255-1264.
582
          https://doi.org/10.1093/oxfordjournals.aje.a117592
583
   Hallberg, K., Cook, T. D., Steiner, P. M., & Clark, M. H. (2018). Pretest Measures of the
584
          Study Outcome and the Elimination of Selection Bias: Evidence from Three Within
585
          Study Comparisons. Prevention Science, 19(3), 274–283.
586
          https://doi.org/10.1007/s11121-016-0732-6
```

- Henning, G., Hansson, I., Berg, A. I., Lindwall, M., & Johansson, B. (2017). The role of
 personality for subjective well-being in the retirement transition Comparing
 variable- and person-oriented models. *Personality and Individual Differences*, 116,
 385–392. https://doi.org/10.1016/j.paid.2017.05.017
- Hoffman, L. (2015). Longitudinal analysis: Modeling within-person fluctuation and change.

 Routledge/Taylor & Francis Group.
- Hutteman, R., Hennecke, M., Orth, U., Reitz, A. K., & Specht, J. (2014). Developmental
 Tasks as a Framework to Study Personality Development in Adulthood and Old
 Age. European Journal of Personality, 28(3), 267–278.
 https://doi.org/10.1002/per.1959
- Kandler, C., Kornadt, A. E., Hagemeyer, B., & Neyer, F. J. (2015). Patterns and sources
 of personality development in old age. *Journal of Personality and Social Psychology*,

 109(1), 175–191. https://doi.org/10.1037/pspp0000028
- Krämer, M. D., & Rodgers, J. L. (2020). The impact of having children on domain-specific life satisfaction: A quasi-experimental longitudinal investigation using the Socio-Economic Panel (SOEP) data. Journal of Personality and Social Psychology, 119(6), 1497–1514. https://doi.org/10.1037/pspp0000279
- Lachman, M. E., & Weaver, S. L. (1997). The Midlife Development Inventory (MIDI)

 personality scales: Scale construction and scoring. Brandeis University.
- Leopold, T., & Skopek, J. (2015). The Demography of Grandparenthood: An International Profile. Social Forces, 94(2), 801–832. https://doi.org/10.1093/sf/sov066
- Lodi-Smith, J., & Roberts, B. W. (2007). Social Investment and Personality: A

 Meta-Analysis of the Relationship of Personality Traits to Investment in Work,

 Family, Religion, and Volunteerism. Personality and Social Psychology Review,

 11(1), 68–86. https://doi.org/10.1177/1088868306294590

Lucas, R. E., & Donnellan, M. B. (2011). Personality development across the life span: 613 Longitudinal analyses with a national sample from Germany. Journal of Personality 614 and Social Psychology, 101(4), 847–861. https://doi.org/10.1037/a0024298 615 Luhmann, M., Fassbender, I., Alcock, M., & Haehner, P. (2020). A dimensional taxonomy 616 of perceived characteristics of major life events. Journal of Personality and Social 617 Psychology, No Pagination Specified—No Pagination Specified. 618 https://doi.org/10.1037/pspp0000291 619 Luhmann, M., Hofmann, W., Eid, M., & Lucas, R. E. (2012). Subjective well-being and 620 adaptation to life events: A meta-analysis. Journal of Personality and Social 621 Psychology, 102(3), 592–615. https://doi.org/10.1037/a0025948 622 Luhmann, M., Orth, U., Specht, J., Kandler, C., & Lucas, R. E. (2014). Studying changes 623 in life circumstances and personality: It's about time. European Journal of 624 Personality, 28(3), 256–266. https://doi.org/10.1002/per.1951 625 Lumsdaine, R. L., & Vermeer, S. J. C. (2015). Retirement timing of women and the role of 626 care responsibilities for grandchildren. Demography, 52(2), 433–454. 627 https://doi.org/10.1007/s13524-015-0382-5 628 Lüdtke, O., Roberts, B. W., Trautwein, U., & Nagy, G. (2011). A random walk down 629 university avenue: Life paths, life events, and personality trait change at the 630 transition to university life. Journal of Personality and Social Psychology, 101(3), 631 620-637. https://doi.org/10.1037/a0023743 632 MacCallum, R. C., Zhang, S., Preacher, K. J., & Rucker, D. D. (2002). On the practice of 633 dichotomization of quantitative variables. Psychological Methods, 7(1), 19-40. https://doi.org/10.1037/1082-989X.7.1.19 635 Mahne, K., & Huxhold, O. (2014). Grandparenthood and Subjective Well-Being: 636 Moderating Effects of Educational Level. The Journals of Gerontology: Series B, 637

70(5), 782–792. https://doi.org/10.1093/geronb/gbu147

- Margolis, R., & Verdery, A. M. (2019). A Cohort Perspective on the Demography of
- Grandparenthood: Past, Present, and Future Changes in Race and Sex Disparities
- in the United States. Demography, 56(4), 1495-1518.
- https://doi.org/10.1007/s13524-019-00795-1
- 643 Margolis, R., & Wright, L. (2017). Healthy Grandparenthood: How Long Is It, and How
- Has It Changed? *Demography*, 54 (6), 2073–2099.
- https://doi.org/10.1007/s13524-017-0620-0
- Marsh, H. W., Nagengast, B., & Morin, A. J. S. (2013). Measurement invariance of big-five
- factors over the life span: ESEM tests of gender, age, plasticity, maturity, and la
- dolce vita effects. Developmental Psychology, 49(6), 1194–1218.
- https://doi.org/10.1037/a0026913
- McNeish, D. (2018). Thanks coefficient alpha, we'll take it from here. *Psychological*
- 651 Methods, 23(3), 412–433. https://doi.org/10.1037/met0000144
- McNeish, D., & Kelley, K. (2019). Fixed effects models versus mixed effects models for
- clustered data: Reviewing the approaches, disentangling the differences, and making
- recommendations. Psychological Methods, 24(1), 20–35.
- https://doi.org/10.1037/met0000182
- 656 Mitra, R., & Reiter, J. P. (2016). A comparison of two methods of estimating propensity
- scores after multiple imputation. Statistical Methods in Medical Research, 25(1),
- 658 188–204. https://doi.org/10.1177/0962280212445945
- ⁶⁵⁹ Mõttus, R., Johnson, W., & Deary, I. J. (2012). Personality traits in old age: Measurement
- and rank-order stability and some mean-level change. Psychology and Aging, 27(1),
- 243-249. https://doi.org/10.1037/a0023690
- 662 Mõttus, R., & Rozgonjuk, D. (2021). Development is in the details: Age differences in the
- Big Five domains, facets, and nuances. Journal of Personality and Social
- Psychology, 120(4), 1035–1048. https://doi.org/10.1037/pspp0000276

```
Mueller, S., Wagner, J., Drewelies, J., Duezel, S., Eibich, P., Specht, J., Demuth, I.,
665
           Steinhagen-Thiessen, E., Wagner, G. G., & Gerstorf, D. (2016). Personality
666
           development in old age relates to physical health and cognitive performance:
667
           Evidence from the Berlin Aging Study II. Journal of Research in Personality, 65,
668
           94–108. https://doi.org/10.1016/j.jrp.2016.08.007
669
   Pearl, J. (2009). Causal inference in statistics: An overview. Statistics Surveys, 3, 96–146.
           https://doi.org/10.1214/09-SS057
671
   Roberts, B. W., & DelVecchio, W. F. (2000). The rank-order consistency of personality
672
           traits from childhood to old age: A quantitative review of longitudinal studies.
673
           Psychological Bulletin, 126(1), 3-25. https://doi.org/10.1037/0033-2909.126.1.3
674
   Roberts, B. W., Walton, K. E., & Viechtbauer, W. (2006). Patterns of mean-level change
675
           in personality traits across the life course: A meta-analysis of longitudinal studies.
676
           Psychological Bulletin, 132, 1-25. https://doi.org/10.1037/0033-2909.132.1.1
677
   Roberts, B. W., & Wood, D. (2006). Personality Development in the Context of the
678
           Neo-Socioanalytic Model of Personality. In D. K. Mroczek & T. D. Little (Eds.),
679
           Handbook of Personality Development. Routledge.
680
   Roberts, B. W., Wood, D., & Smith, J. L. (2005). Evaluating Five Factor Theory and
           social investment perspectives on personality trait development. Journal of
682
           Research in Personality, 39(1), 166–184. https://doi.org/10.1016/j.jrp.2004.08.002
683
    Rohrer, J. M. (2018). Thinking Clearly About Correlations and Causation: Graphical
684
           Causal Models for Observational Data. Advances in Methods and Practices in
685
           Psychological Science, 1(1), 27-42. https://doi.org/10.1177/2515245917745629
686
   Rosenbaum, P. (1984). The consequences of adjustment for a concomitant variable that has
687
```

been affected by the treatment. Journal of the Royal Statistical Society. Series A

(General), 147(5), 656-666. https://doi.org/10.2307/2981697

688

- Scherpenzeel, A. (2011). Data Collection in a Probability-Based Internet Panel: How the

 LISS Panel Was Built and How It Can Be Used. Bulletin of Sociological

 Methodology/Bulletin de Méthodologie Sociologique, 109(1), 56–61.
- https://doi.org/10.1177/0759106310387713
- Scherpenzeel, A. C., & Das, M. (2010). True" longitudinal and probability-based internet
 panels: Evidence from the Netherlands. In M. Das, P. Ester, & L. Kaczmirek
 (Eds.), Social and behavioral research and the internet: Advances in applied methods
 and research strategies (pp. 77–104). Taylor & Francis.
- Schwaba, T., & Bleidorn, W. (2019). Personality trait development across the transition to retirement. Journal of Personality and Social Psychology, 116(4), 651–665.
- 700 https://doi.org/10.1037/pspp0000179
- Schwaba, T., & Bleidorn, W. (2018). Individual differences in personality change across the adult life span. *Journal of Personality*, 86(3), 450–464.
- https://doi.org/10.1111/jopy.12327
- Shadish, W. R., Cook, T. D., & Campbell, D. T. (2002). Experimental and
 quasi-experimental designs for generalized causal inference. Houghton, Mifflin and
 Company.
- Sheppard, P., & Monden, C. (2019). Becoming a First-Time Grandparent and Subjective
 Well-Being: A Fixed Effects Approach. Journal of Marriage and Family, 81(4),

 1016–1026. https://doi.org/10.1111/jomf.12584
- Skopek, J., & Leopold, T. (2017). Who becomes a grandparent and when? Educational differences in the chances and timing of grandparenthood. *Demographic Research*, 37(29), 917–928. https://doi.org/10.4054/DemRes.2017.37.29
- Sonnega, A., Faul, J. D., Ofstedal, M. B., Langa, K. M., Phillips, J. W., & Weir, D. R. (2014). Cohort Profile: The Health and Retirement Study (HRS). *International Journal of Epidemiology*, 43(2), 576–585. https://doi.org/10.1093/ije/dyu067

```
Specht, J. (2017). Personality development in adulthood and old age. In J. Specht (Ed.),
716
           Personality Development Across the Lifespan (pp. 53–67). Academic Press.
717
          https://doi.org/10.1016/B978-0-12-804674-6.00005-3
718
   Specht, J., Bleidorn, W., Denissen, J. J. A., Hennecke, M., Hutteman, R., Kandler, C.,
719
           Luhmann, M., Orth, U., Reitz, A. K., & Zimmermann, J. (2014). What Drives
720
           Adult Personality Development? A Comparison of Theoretical Perspectives and
721
           Empirical Evidence. European Journal of Personality, 28(3), 216–230.
          https://doi.org/10.1002/per.1966
723
   Specht, J., Egloff, B., & Schmukle, S. C. (2011). Stability and change of personality across
724
           the life course: The impact of age and major life events on mean-level and
725
          rank-order stability of the Big Five. Journal of Personality and Social Psychology,
726
           101(4), 862–882. https://doi.org/10.1037/a0024950
727
   Steiner, P., Cook, T., Shadish, W., & Clark, M. (2010). The Importance of Covariate
728
           Selection in Controlling for Selection Bias in Observational Studies. Psychological
729
           Methods, 15, 250–267. https://doi.org/10.1037/a0018719
730
   Stephan, Y., Sutin, A. R., & Terracciano, A. (2014). Physical activity and personality
731
          development across adulthood and old age: Evidence from two longitudinal studies.
732
           Journal of Research in Personality, 49, 1–7.
733
          https://doi.org/10.1016/j.jrp.2013.12.003
734
   Stuart, E. A. (2010). Matching methods for causal inference: A review and a look forward.
735
           Statistical Science: A Review Journal of the Institute of Mathematical Statistics,
736
           25(1), 1–21. https://doi.org/10.1214/09-STS313
737
    Tanskanen, A. O., Danielsbacka, M., Coall, D. A., & Jokela, M. (2019). Transition to
738
           Grandparenthood and Subjective Well-Being in Older Europeans: A Within-Person
739
          Investigation Using Longitudinal Data. Evolutionary Psychology, 17(3),
740
```

1474704919875948. https://doi.org/10.1177/1474704919875948

Triadó, C., Villar, F., Celdrán, M., & Solé, C. (2014). Grandparents Who Provide Auxiliary Care for Their Grandchildren: Satisfaction, Difficulties, and Impact on 743 Their Health and Well-being. Journal of Intergenerational Relationships, 12(2), 744 113–127. https://doi.org/10.1080/15350770.2014.901102 745 Turiano, N. A., Graham, E. K., Weston, S. J., Booth, T., Harrison, F., James, B. D., 746 Lewis, N. A., Makkar, S. R., Mueller, S., Wisniewski, K. M., Zhaoyang, R., Spiro, 747 A., Willis, S., Schaie, K. W., Lipton, R. B., Katz, M., Sliwinski, M., Deary, I. J., 748 Zelinski, E. M., ... Mroczek, D. K. (2020). Is Healthy Neuroticism Associated with 749 Longevity? A Coordinated Integrative Data Analysis. Collabra: Psychology, 6(33). 750 https://doi.org/10.1525/collabra.268 751 Turiano, N. A., Pitzer, L., Armour, C., Karlamangla, A., Ryff, C. D., & Mroczek, D. K. 752 (2012). Personality Trait Level and Change as Predictors of Health Outcomes: 753 Findings From a National Study of Americans (MIDUS). The Journals of 754 Gerontology: Series B, 67B(1), 4-12. https://doi.org/10.1093/geronb/gbr072 755 van Buuren, S., & Groothuis-Oudshoorn, K. (2011). mice: Multivariate imputation by 756 chained equations in r. Journal of Statistical Software, 45(3), 1–67. 757 van der Laan, J. (2009). Representativity of the LISS panel (Discussion Paper 09041). 758 Statistics Netherlands. 759 VanderWeele, T. J. (2019). Principles of confounder selection. European Journal of 760 Epidemiology, 34(3), 211–219. https://doi.org/10.1007/s10654-019-00494-6 761 VanderWeele, T. J., Mathur, M. B., & Chen, Y. (2020). Outcome-Wide Longitudinal 762 Designs for Causal Inference: A New Template for Empirical Studies. Statistical 763 Science, 35(3), 437–466. https://doi.org/10.1214/19-STS728 764 van Scheppingen, M. A., Jackson, J. J., Specht, J., Hutteman, R., Denissen, J. J. A., & 765 Bleidorn, W. (2016). Personality Trait Development During the Transition to 766

Parenthood: A Test of Social Investment Theory. Social Psychological and

```
Personality Science, 7(5), 452–462. https://doi.org/10.1177/1948550616630032
768
   van Scheppingen, M. A., & Leopold, T. (2020). Trajectories of life satisfaction before, upon,
769
          and after divorce: Evidence from a new matching approach. Journal of Personality
770
           and Social Psychology, 119(6), 1444–1458. https://doi.org/10.1037/pspp0000270
771
   Wagner, J., Becker, M., Lüdtke, O., & Trautwein, U. (2015). The First Partnership
           Experience and Personality Development: A Propensity Score Matching Study in
773
           Young Adulthood. Social Psychological and Personality Science, 6(4), 455–463.
774
          https://doi.org/10.1177/1948550614566092
775
   Wagner, J., Orth, U., Bleidorn, W., Hopwood, C. J., & Kandler, C. (2020). Toward an
776
          Integrative Model of Sources of Personality Stability and Change. Current
777
           Directions in Psychological Science, 29(5), 438–444.
778
          https://doi.org/10.1177/0963721420924751
779
   Wagner, J., Ram, N., Smith, J., & Gerstorf, D. (2016). Personality trait development at
780
           the end of life: Antecedents and correlates of mean-level trajectories. Journal of
781
           Personality and Social Psychology, 111(3), 411–429.
782
          https://doi.org/10.1037/pspp0000071
783
   Wortman, J., Lucas, R. E., & Donnellan, M. B. (2012). Stability and change in the Big
784
           Five personality domains: Evidence from a longitudinal study of Australians.
785
           Psychology and Aging, 27(4), 867–874. https://doi.org/10.1037/a0029322
786
   Yap, S., Anusic, I., & Lucas, R. E. (2012). Does personality moderate reaction and
787
          adaptation to major life events? Evidence from the British Household Panel Survey.
788
           Journal of Research in Personality, 46(5), 477–488.
789
          https://doi.org/10.1016/j.jrp.2012.05.005
```