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Who are the Scrooges?

Personality Predictors of Holiday Spending

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Abstract:

The sharp increase in consumption over the holiday season has important economic implications, yet the psychology underlying this phenomenon has received limited attention. Here, we evaluate the role of individual differences in holiday spending patterns. Using 2 million transactions across 2,133 individuals, we investigate the relationship between the Big 5 personality traits on spending at Christmas. Zero-order correlations suggest holiday spending is associated with conscientiousness, neuroticism and extraversion; the relationship with neuroticism persists after accounting for possible confounders, including income and demographics. These results improve our understanding of how different personality traits predict how people respond to the environmental demands of the holiday season and have broader implications for how personality relates to consumer behavior.

Keywords: *Consumer Psychology, Big 5 Personality, Spending, Holiday Season.*

1 In most Western countries, the holiday season has evolved from a time devoted to
2 religious celebration and family, to one that is associated with materialism, consumerism and
3 excess (Belk, 2001; Kasser & Sheldon, 2002). Given the importance of holiday shopping to the
4 broader economy, seasonal increases in holiday spending are widely studied in disciplines such
5 as marketing and economics (Dinner, Van Heerde, & Neslin, 2014; Waldfogel, 2002). However,
6 the psychological factors underlying changes in spending behavior over this period have received
7 comparatively little attention. This is surprising, as individual differences are likely to shape how
8 people react to holiday-related environmental stressors in terms of their subsequent financial
9 behaviors. For example, the holiday season is often a time of increased stress, and psychological
10 stress reduces self-control (Fedorikhin & Patrick, 2010), which may lead to excessive spending.

11 Socio-demographic characteristics, money management skills, and psychological factors
12 such as self-control are known contributors to variance in holiday spending (McNair, Summers,
13 de Bruin, & Ranyard, 2016). However, empirical studies of consumption behavior have not
14 previously been evaluated in the context of the Big Five personality framework (c.f., Matz,
15 Gladstone & Stillwell, 2016). Therefore, our aim is to evaluate the role of individual differences
16 in holiday spending patterns.

17 There are several reasons to believe that personality traits influence holiday spending
18 behavior. First, traits have been linked to broad range financial outcomes, including employee
19 wages and occupational prestige (Judge, Higgins, Thoresen & Barrick, 1999), as well as
20 spending and consumption habits (Trosi, Christopher & Marek, 2006; Matz, Gladstone &
21 Stillwell, 2016). This suggests that holiday spending may be associated with traits relevant to
22 financial or occupational achievement, such as conscientiousness or openness to experience.
23 However, spending over the holiday season is far more than simply a snapshot of consumption at

24 a given time of year, or a reflection of one's disposable income. Holiday spending includes a
25 social component, as most spending over this period involves others, such as gifts for friends and
26 family or attending holiday-themed parties. In other words, holiday spending may be as much a
27 function of socially relevant traits, such as extraversion and agreeableness, as they are
28 achievement-oriented ones.

29 Furthermore, personality traits may be associated with more than just the aggregate
30 amount spent over this period. Holiday seasons often require additional preparation and planning
31 on the part of spenders. Organized gift givers may prepare lists of recipients and potential gifts
32 ahead of time. (Some may even check such lists twice.) Savvy consumers may look out for
33 holiday deals and savings, and so purchases may be timed strategically. Those who plan ahead
34 can take advantage of early sales, while others rush out to complete their shopping on the eve of
35 their celebrated holiday. The degree of preparation and planning over the holiday season is likely
36 to be associated with individual differences, including broad traits as conscientiousness.

37 The goal of the current study is to provide descriptive insights into which personality
38 characteristics are associated with the greatest spending during the holiday period, which we
39 believe can provide both theoretical and practical insights. Theoretically, identifying the
40 relationships between traits and specific financial behaviors, such as spending habits, points to
41 the potential mechanisms that link traits to behavioral outcomes (e.g., Judge et al, 1999; Roberts,
42 Kuncel, Shiner, Caspi & Goldberg, 2007; Solomon & Jackson, 2014). On a practical level, these
43 insights could be used by companies in predicting the psychological antecedents of customer
44 spending patterns. The findings could also prove useful to consumers trying to anticipate and
45 reduce potentially harmful spending behavior, in order to make financial decisions more in line
46 with their long-term preferences.

47 We employ a research setting that should provide high ecological validity, by aggregating
48 together more than 2 million individual spending transactions from participant's bank accounts.
49 These records of spending are then matched to survey measures of personality for each
50 individual. This approach has significant advantages over most research to date which has relied
51 on self-reports of spending, which may suffer from well-documented response biases (such as
52 consistency motive, covariation bias, or common-method variance).

53 Our analyses focused assessing the association between personality traits and holiday
54 spending? We pre-registered our expectations on the direction of the associations between
55 holiday spending and personality (osf.io/ew4h5). We acknowledge that our predictions were not
56 based directly on prior theory and are exploratory, but we felt it important to state our
57 expectations *a priori* in the pre-registration. Our knowledge of personality research, and prior
58 findings on the associations between personality and other (non-financial) behaviors, guided our
59 hypotheses. We expected that higher levels of extraversion would be associated with greater
60 spending, because larger friendship networks are likely to expose extraverts to consumption
61 patterns or social comparisons that lead them to spend more (as suggested by Nyhus & Webley,
62 2001). However, given we analyzed relationships among several different personality factors
63 without clear precedents or theoretical predictions about the specific relationships among the
64 factors, we considered this research to be exploratory rather than confirmatory.

65

66 **Method**

67 *Dataset and Participants.* The dataset was collected in collaboration with a UK-based
68 money management app in May 2017. The service provides users with an online dashboard of
69 their money by aggregating transactions across all their different bank accounts. Customer

70 account records provided a daily panel of all debits (outgoing) and credits (incoming)
71 transactions across each of a customers' bank accounts (e.g., checking accounts and credit
72 cards). Customers of the service were sent a survey link by email asking them to take part in the
73 study, with the opportunity to win a tablet computer as a prize. Within the survey, participants
74 consented to match their survey responses with their transaction data for research purposes. In
75 total, 2,133 people completed the personality portion of the study and provided their consent to
76 participate. For 1,875 of those participants, the company provided demographic information on
77 gender and year of birth (12% female, 44% male, 44% unknown; \bar{x} (age) = 37.47 years, SD =
78 11.89). Gender was not measured directly but derived by running first names of account users
79 through a names database, providing gender in just over half of cases. The dataset contained 2.2
80 million individual transaction records in total, meaning participants completed an average of
81 around 1,270 transactions each over the 12-month study period. The sample size was not
82 determined in advance, but rather by the available number of transaction data-linked survey
83 responses. All customer data was fully anonymized before being analyzed in this study, and we
84 received ethical approval for the analysis of the dataset (IRB: 13463/001).

85 The purpose of the mobile application from which the dataset is collected is to provide
86 users with a single dashboard of their financial information, by aggregating outgoing and
87 incoming transactions from multiple bank accounts. For example, if a participant had two
88 checking accounts, one credit card, and one savings account, all with different financial services
89 providers, then data from each of these accounts will be recorded by the application. This
90 pooling of account information represents an advantage over previous research using bank
91 account data which has typically relied on information derived from only a single bank (e.g.,
92 Matz, Gladstone & Stillwell, 2016).

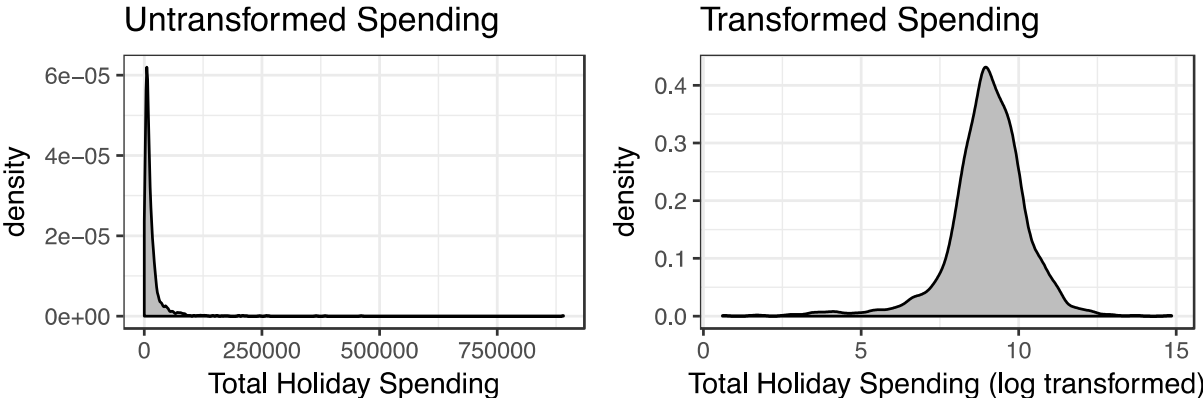
93 The dataset does not provide a representative sample of the UK population. The sample is
94 likely to suffer from selection bias both in the types of users who will choose to sign-up to the
95 service, as well as by those who responded to the email to provide their survey information. The
96 analysis is at the level of individual participants, rather than households. This means there is
97 likely to be noise created by intra-household transfers of wealth (e.g., if one partner buys all the
98 Christmas shopping for the household, and the other buys nothing).

99 **Measures**

100 *Holiday Spending.* Holiday spending was calculated by summing debit transactions in
101 November and December (i.e., total amount spent on purchases across 61 days; $M = \text{£}17,527.43$,
102 $SD = \text{£}69,338.78$, $Median = \text{£}8,758.45$, $IQR = \text{£}12,167.73$). This reflects the way organizations
103 tasked with measuring holiday spending, such as the National Retail Federation, calculate
104 holiday sales (National Retail Federation, 2017). This outcome measure was highly skewed. To
105 allow for model estimation under the assumptions of linear modeling, we log transformed (base
106 e) the spending variable. Figure 1 displays the distribution of the original and transformed
107 variables.

108 *Average Spending Prior to Holiday Season.* An important control variable in this study is
109 an individual's average spending across a two-month period. To avoid overlap with the outcome
110 (i.e., spending during the holiday season), we calculated this variable using all transactions prior
111 to November 1. Specifically, for each individual, we summed the total amount spent prior to
112 November 1, then divided by the number of days the participants had been enrolled in the study.
113 This yielded the participant's average daily spending prior to the holiday season. In order to
114 better compare this estimate to the outcome, we multiplied the participant's average daily
115 spending by 61 (i.e., the number of days in November and December). Thus this estimate of

Figure 1. Distributions of original and log transformed holiday spending. Due to the extreme skew of the original variables, total spending is censored in this plot at 1,000, 000.



116 spending can be interpreted as spending during a two-month period. On average, participants
117 spent £23,028.46 during a given two-month period (SD = £36,824.73, Median = £13,727.48,
118 IQR = £15,614.28). *We followed a similar procedure for income/credits to an account. Here, we*
119 *created a list of spending categories that we considered to be sources of income (e.g., “salary”,*
120 *“(government) benefits”, and used the aggregated transactions in these categories as our*
121 *measure of total income. We excluded credits to their accounts tagged as “repayments”, to avoid*
122 *transactions such as credit-card repayments being counted as income. Participants had an*
123 *average of £1,751.18 entering their account during a two-month period (SD = £5735.49, Median*
124 *= £156.85, IQR = £1,357.54)¹. This distinction in the calculation of income versus spending*
125 *explains the wide discrepancy in average income and spending. These estimates of income were*
126 *also log-transformed.*

127 *Big Five personality.* We used a widely accepted model of personality, the ‘Big Five’
128 (Goldberg, 1992; McCrae & John, 1992), and measured these traits with the BFI-10 inventory,
129 an established short scale of this framework (Rammstedt & John, 2007). With Cronbach’s alphas
130 ranging from $\alpha = .31$ to $.75$, the internal consistencies of scales were found to range from poor to
131 acceptable. We note here that the reliability coefficients for agreeableness ($\alpha = .31$),
132 conscientiousness ($\alpha = .55$), and openness ($\alpha = .32$) were the worst of these ($\alpha = .65$ and $.75$ for
133 neuroticism and extraversion, respectively). As Cronbach’s alpha is influenced by the number of
134 items in a scale, so the BFI-10, with only two items to cover each personality dimension, is likely
135 to have relatively poor values of alpha (Kline, 2000; Woods & Hampson, 2005). We therefore
136 interpret our findings based from these traits with caution, and we encourage readers to do the
137 same. To help correct for the low reliabilities, we construct latent variables for each of the traits

138 and use the estimated scores from the latent variable models in our regression models². The
139 latent variable model is available in the Supplementary File (section 1.2.2).

140 It is worth noting that apart from having direct effects on spending behaviors, personality
141 traits may also have indirect effects, such as through income (see Borghans et al., 2008). This is
142 why we controlled for income and other demographics in our main analyses. For clarity, we also
143 present the correlations without controls.

144 **Data analysis**

145 We used R (3.4.2, R Core Team, 2017) and the R-package *lme4* (1.1.14, Bates, Maechler,
146 Bolker, & Walker, 2014) for our analyses. We used a simple linear model to assess the degree to
147 which personality traits are associated with the amount spent during the holiday season. This
148 model includes all personality traits simultaneously and controls for age, gender, income, and
149 average spending in a two-month period (excluding the holiday season). We then used multilevel
150 models to assess trajectories of spending across the holiday season, and to estimate the degree to
151 which these trajectories are associated with personality traits.

152 **Preregistration**

153 Analyses were preregistered and can be found at osf.io/ew4h5. Initially, we had planned
154 to use proportions of spending, rather than the raw amounts. Therefore, the choice to log
155 transform the outcomes was not pre-registered and this decision was made after seeing the data.
156 If outcomes were not transformed, extraversion was negatively associated with holiday spending
157 and associated with trajectories of spending, such that introverts spent relatively equal across the
158 season and extraverts spent less at the beginning and increased their spending leading up to
159 Christmas. We also did not register the use of our measure of income, which we constructed
160 using the objective transaction data rather than using the self-reported measure. When we use the

161 self-reported income measure instead, the results do not change. We chose to use the objective
162 measure as we believe it to be a more accurate measure of income. The spending variable
163 originally used was simply the sum of all spending transactions; this variable does not account
164 for the fact that for a small number of participants, we did not have the full 12-months of data for
165 them. We therefore used a measure that accounted for this difference (see Methods). Also, in the
166 preregistration, we outlined plans for beta regression to estimate participant's proportion of
167 spending. Our attempts to use this model either failed to converge or yielded null results and
168 therefore are not presented here. Additional exploratory analyses include use of the fractional
169 logit, but this also yielded null findings. Finally, we preregistered models assessing changing in
170 spending by day over the two-month holiday period. We report the results of those analyses here.
171 To provide full transparency in our research approach, all analyses performed – whether
172 confirmatory or exploratory – are documented in Supplementary File 1.

173

174 **Results**

175 Person-level summary statistics and correlations are shown in Table 1. Total holiday
176 spending (log-transformed) was positively associated with extraversion ($r = .06$, 95% CI [.02,
177 .10], $t(2,131) = 2.88$, $p = .004$), conscientiousness ($r = .11$, 95% CI [.07, .15], $t(2,131) =$
178 4.99 , $p < .001$) and negatively associated with neuroticism ($r = -.11$, 95% CI [-.16, -.07],
179 $t(2,131) = -5.30$, $p < .001$). Holiday spending was not found to be associated with
180 agreeableness ($r = -.02$, 95% CI [-.07, .02], $t(2,131) = -1.05$, $p = .295$) or openness ($r =$
181 $-.04$, 95% CI [-.08, .00], $t(2,131) = -1.92$, $p = .055$).

182 A single linear model was estimated to assess the relationship of personality traits to
183 holiday spending, controlling for each individual trait, age, gender, income, and average

184 spending in a two-month period. Results are shown in Table 2. In this model, holiday spending
185 was negatively associated with both neuroticism ($b = -0.06$, 95% CI $[-0.11, -0.01]$,
186 $t(1925) = -2.38$, $p = .017$) and openness to experience ($b = -0.09$, 95% CI $[-0.16, -0.02]$,
187 $t(1925) = -2.44$, $p = .015$). These effects are illustrated in Figure 2. Conscientiousness was
188 also weakly associated with holiday spending ($b = 0.05$, 95% CI $[0.00, 0.10]$, $t(1925) = 2.12$, $p =$
189 $.034$). However, given the weak evidentiary value (i.e., the p-value close to .05 and the CI

Table 1. Correlations between study variables.

Variable	<i>M</i>	<i>SD</i>	1	2	3	4	5	6	7	8	9
1. age	37.47	11.89									
2. male	0.44	0.50	.05* [.01, .10]								
3. income	4.44	3.20	.21** [.17, .25]	.12** [.08, .16]							
4. spend	9.51	0.95	.25** [.21, .29]	.08** [.04, .12]	.37** [.34, .41]						
5. holiday	9.02	1.26	.17** [.13, .21]	.11** [.07, .16]	.35** [.31, .39]	.63** [.61, .66]					
6. extra	3.96	1.35	-.02 [-.06, .03]	-.06** [-.10, -.02]	.04 [-.01, .08]	.09** [.05, .14]	.06** [.02, .10]				
7. agree	4.89	1.05	.11** [.06, .15]	-.06** [-.10, -.02]	-.02 [-.06, .03]	-.01 [-.05, .03]	-.02 [-.07, .02]	.07** [.03, .11]			
8. con	5.30	1.12	.07** [.03, .11]	.01 [-.03, .05]	.09** [.04, .13]	.10** [.06, .15]	.11** [.07, .15]	.06** [.01, .10]	.12** [.08, .16]		
9. neur	3.07	1.21	-.10** [-.14, -.05]	-.15** [-.19, -.11]	-.08** [-.12, -.04]	-.09** [-.14, -.05]	-.11** [-.16, -.07]	-.10** [-.14, -.05]	-.15** [-.19, -.10]	-.29** [-.33, -.25]	
10. open	5.14	0.95	-.00 [-.04, .04]	-.01 [-.06, .03]	.03 [-.02, .07]	.01 [-.04, .05]	-.04 [-.08, .00]	.31** [.27, .35]	.12** [.08, .16]	.06** [.02, .10]	-.07** [-.11, -.03]

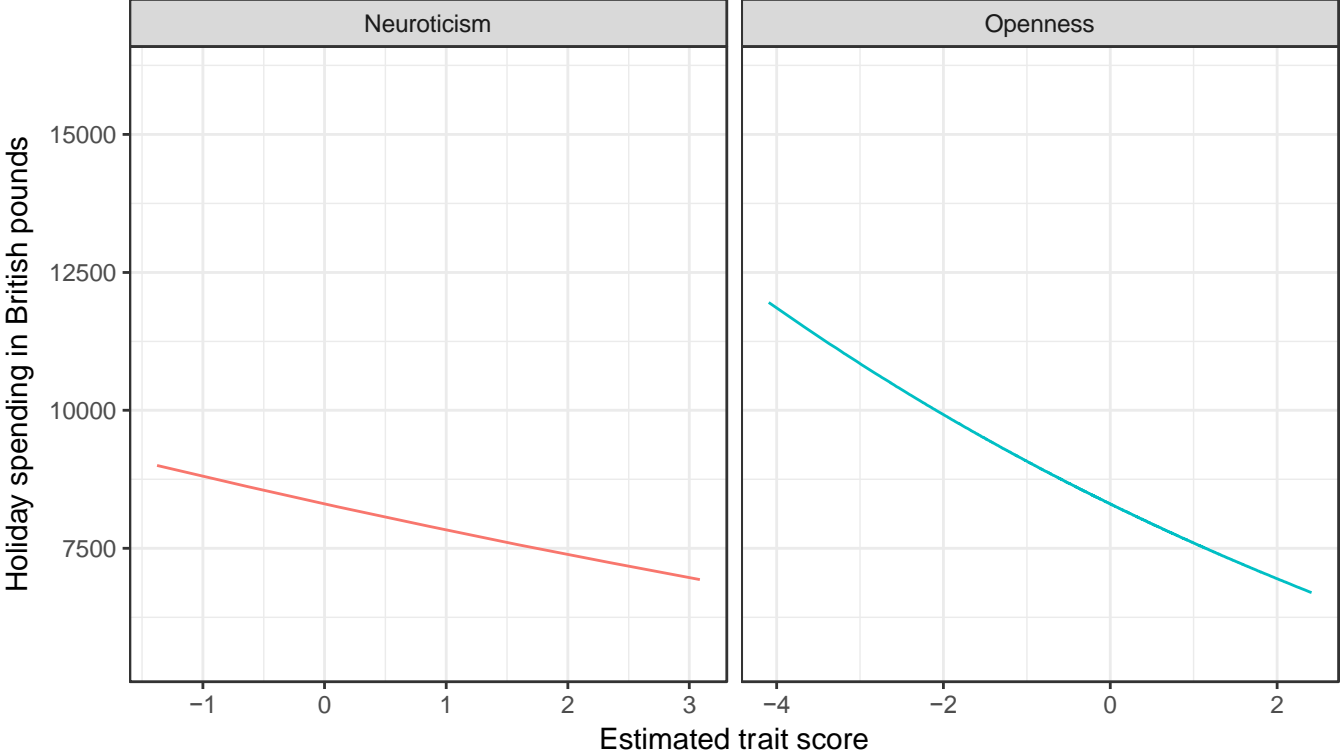
Notes: * $p < .05$, ** $p < .01$, age = age in 2016, male = binary variable indicating whether the participant self-reported their gender as male, income = estimated bi-monthly income in pounds (log transformed), spend = estimated bi-monthly spending in pounds (log transformed), holiday = total amount spent (in pounds, log transformed) in the months of November and December, extra = extraversion, agree = agreeableness, con = conscientiousness, neur = neuroticism, open = openness to experience.

Table 2 Linear model estimating the relationship of holiday spending (log transformed) to personality traits.

Predictor	<i>b</i>	95% CI	<i>t</i> (1925)	<i>p</i>
Intercept	1.73	[1.29, 2.17]	7.75	< .001
Age	-0.01	[-0.04, 0.05]	-0.24	.808
Male	0.12	[0.03, 0.21]	2.63	.009
Income	0.05	[0.04, 0.07]	7.43	< .001
Spend	0.73	[0.69, 0.78]	30.41	< .001
Extraversion	0.04	[-0.02, 0.11]	1.25	.211
Agreeableness	-0.03	[-0.08, 0.02]	-1.31	.190
Conscientiousness	0.05	[0.00, 0.10]	2.12	.034
Neuroticism	-0.06	[-0.11, -0.01]	-2.38	.017
Openness	-0.09	[-0.16, -0.02]	-2.44	.015

Notes. Estimates of income and spending are log-transformed. Age is standardized. Personality traits are the estimated scores from a latent variable trait model. Male is a binary variable indicating whether the participant's self-reported gender is male.

Figure 2 Predicted holiday spending by neuroticism and openness to experience. Estimates control for age, gender, estimated income, estimated spending, and the other big five personality traits. Shaded areas represent the 95% confidence bands.



190 containing 0), we do not consider this sufficient statistical evidence for a positive association
191 between conscientiousness and holiday spending after controlling for other traits and
192 demographic variables. Other significant variables in the model included: being male, having a
193 higher income, and having a higher total expenditure. A participant's age was not a significant
194 predictor of holiday spending in this model.

195 Finally, we estimated the trajectory of spending across the holiday period. In this
196 analysis, we looked only at transactions that occurred during the months of November and
197 December. We did not find a significant interaction between the personality traits with day of the
198 holiday season in predicting spending. The full results of this model can be seen in the
199 Supplementary File (Table 6)³.

200

201 **Discussion**

202 Taking advantage of a unique data set, the present study found significant relationships between
203 spending amounts over the holiday season and personality. The results indicate that, holding
204 constant financial and demographic covariates, more nervous and stress-reactive participants
205 (higher neuroticism) spent less during the holiday season, as did those with more artistic interests
206 and more active imaginations (higher openness). While these findings were not hypothesized, we
207 can speculate as to why these patterns may have emerged. First, individuals high in openness are
208 typically low in conventionality and traditionalism and this likely makes them less inclined to
209 conform to societal norms regarding gift-giving (e.g., at holiday gatherings or among others
210 outside of close friends and family). As for neuroticism, the measure of this trait in the current
211 study assessed the extent to which an individual gets nervous easily and handles stress. An
212 individual low on this metric of neuroticism is relatively relaxed and not easily unnerved and

213 may be less inclined to spend money on expensive social events or on purchasing the “perfect”
214 gift for others. In other words, those who are low in neuroticism may be more inclined to spend
215 their money more freely, untethered by the pressure and fear of disappointing others. The zero-
216 order correlations between holiday spending and personality also show a positive association
217 with extraversion (e.g., having a larger social network on which to spend holiday funds) and
218 conscientiousness (e.g., being more organized and pro-active regarding holiday events and
219 spending). Further exploratory and confirmatory research is needed to identify the mechanisms
220 underlying these findings, but the results indicate that at least some variance in holiday
221 consumption patterns can be explained by Big Five personality traits. That said, we did not find
222 evidence for a significant relationship between personality traits and trajectories of holiday
223 spending. In other words, we were not able to distinguish between those who plan their holiday
224 purchases well in advance and those who rush to complete their shopping on December 24th.

225 The effect sizes we report between personality and spending were small. This is perhaps
226 unsurprising, given the wealth of influences that shape spending during the holiday season (e.g.,
227 household size, income from multiple sources), as well as our use of brief personality measures
228 and the relatively noisy environment of combining transactions over time to capture spending.

229 While personality may explain only a small amount of variance in holiday spending at an
230 individual level, if we consider these relationships at an aggregated macro-level, such as a
231 retailer modelling the holiday spending patterns of millions of customers, the role of personality
232 may still represent an important component of holiday spending (see Matz, Gladstone, &
233 Stillwell, 2017).

234 Our findings contribute to understanding how individual differences shape consumer
235 behavior by highlighting potential predispositions which encourage or inhibit spending. This is

236 important, as excessive consumption remains a major social challenge for modern society (De
237 Graaf, Wann, & Naylor, 2005). Specifically, the expanding consumer debt burden created by
238 excessive spending poses a risk to countries such as the UK and US —where half or more of
239 household’s report being unable to fund emergency expenses without seeking high-cost credit
240 (Lusardi et al. 2011). In this context, we believe there is benefit to even small gains in
241 understanding who spends the most, and why.

242 For social and personality psychologists, these results can contribute to a deeper
243 understanding of the associations between individual traits and socially-important outcomes. For
244 example, personality traits have been linked with financial success (Judge, Higgins, Thoresen &
245 Barrick, 1999), but the mechanisms underlying these relationships are largely unclear. Is
246 conscientiousness related to greater net worth (Duckworth et al., 2012) because of saving habits,
247 higher lifetime earnings, or less impulsive spending? Our results suggest that conscientiousness
248 is not associated with lower spending during the holiday season (and may be associated with
249 spending more), providing indirect evidence that conscientious individuals increased savings is
250 unlikely to be (at least primarily) the result of differences in spending, and more likely to be
251 driven by income mechanisms, such as higher-paying jobs. Furthermore, our findings suggest
252 new hypotheses concerning the association between neuroticism and openness with financial
253 success, as these relationships may partially depend upon the degree to which these individuals
254 spend money on others.

255 A further contribution of this research is in its methods. While previous research
256 approximated spending with self-reported purchase intention or history (Aaker, 1999; Huang et
257 al., 2012; Sirgy, 1985), we extracted spending directly from bank-reported transaction records. In
258 doing so, we were able to overcome some of the limitations of self-report measures and produce

259 results with high external validity. For example, a participant asked to recall historic spending
260 from 12 months ago is likely to suffer from biases in their recall, while using digital records of
261 behavior reduces the potential for these memory biases.

262 The use of objective measures of spending also have potential limitations. For one, if a
263 user has only connected a subset of their financial accounts to the app, such as by adding only a
264 secondary checking account, then our measures of their spending and income will be
265 underestimated. Self-reports may have provided a more accurate measure of overall spending
266 and income for individuals for whom we are not capturing their full transaction history across
267 their accounts. Furthermore, as our measure of spending includes all money leaving an
268 individual's accounts, this is likely to exaggerate spending in some circumstances. For example,
269 if an individual was to lend money to a friend, knowing they would receive the money back in
270 future, this would be calculated as an expenditure rather than as a debt to be repaid in future.
271 Similarly, transfers across financial products, depending on how these were tagged in the
272 application, were also included in our calculation of expenditure. To limit the over-estimation of
273 spending, we explicitly removed repayments to credit products (i.e., credit card repayments), to
274 prevent these transactions being "double-counted" as expenditure. Despite these attempts to
275 minimize error, our spending variables should be considered as estimates of spending rather than
276 precise measures.

277 Our study has several limitations that should be considered when interpreting the
278 findings, and which offer possible avenues for future research. Future research should seek to
279 address the primary limitation of the current work by using more granular measures on both
280 spending and personality. The use of more narrow categorizations (e.g. gifts, parties, charitable
281 donations) of spending, for example, would allow for the evaluation of more fine-grained

282 associations with each of the traits. It remains to be seen whether extraverts are spending more
283 on social outings and whether agreeableness is associated with gift-giving as these relationships
284 are obscured by aggregating total spending. Similarly, it may be that the current measure of
285 personality is too broadly operationalized to capture variance in trajectories of spending. This
286 should be evaluated by using longer personality measures that allow for more narrow evaluation
287 of the individual facets comprising the Big Five traits. Stronger relationships between personality
288 and outcomes often emerge when more narrowly defined facets are used (Paunonen & Ashton
289 2001). For example, while the broad trait of conscientiousness may not be associated with
290 purchasing gifts early in the holiday season, the facet ‘organization’ (a component of
291 conscientiousness) may be.

292 In addition to examining the potential impact of personality on holiday spending, our
293 research poses several other intriguing questions that merit follow-on work. Future research
294 might fruitfully parse different motivations for why people spend more during the holiday
295 season. For instance, if some people spend more primarily to appear wealthy to others (i.e., they
296 are motivated by signaling status to others), we could expect this motivation to increase their
297 visible consumption (e.g. clothing, transportation, housing), and not their private consumption
298 (e.g. groceries, energy bills).

299 Our research provides preliminary, but encouraging, evidence for an association between
300 personality and spending over the holiday season. While many important questions remain for
301 future investigation, by providing objective measures of both annual and holiday spending, these
302 data allow for a truly ecological study of the relationship between personality traits and
303 consumer behavior.

304 **Footnotes**

305

306 ¹ It should be noted that participants did provide a self-report measure of their income when they
307 first signed-up to the money management service. Possible responses were: Less than £10K;
308 £10-20K; £20-30K; £30-40K; £40-50K; £50-60K; £60-70K; £70-80K; More than £80K. We
309 recoded these to be numeric based on taking the value in the middle of the range, and the value
310 85 for the top category (£5K; £15K; £25K; £35K; £45K; £55K; £65K; £75K; £85K). The self-
311 report scale was both highly skewed and showed little relationship with the observed credit for
312 each participant. Specifically, this variable was weakly correlated $r = .06$ ($p < .001$) with our
313 estimate of a participant's income during an average two-month period. We acknowledge that
314 neither measure of income is perfect. We chose to use estimates of income based on the
315 transactions reported through the app, as these are free of social desirability bias and share
316 method variance with our outcome of interest.

317

318 ² Results using estimated latent variable scores did not substantially change the results when
319 compared to using sum scores.

320

321 ³ Additionally, we provide plots summarizing average spending during the holiday season, both
322 on average and at different levels of personality traits. There are no formal tests of these
323 trajectories or patterns. However, we note that spending tends to increase at the beginning of a
324 week (Monday) and decrease on the weekends. There is an additional bump in spending around
325 December 1st. And, perhaps unsurprisingly, the least amount of spending occurs on December
326 25th.

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Supplementary Material

Changes from pre-registration

In an oversight, we omitted age as a covariate to the multilevel model in research question 2, while including it elsewhere. Our intention was to use age as a covariate in all regression models. We also omitted summing the transactions in a single day for research question 2. We initially registered that we would sum transactions for the year to yield total credit and spending values. However, some participants participated for only a portion of the year. These values are thus systemically affected by length of time in the study. We remedied this by calculating average daily credit and spending for each person (total amount received and spent, divided by total days in the study) and multiplied this by 61 to yield a total amount in the same time frame as the season of interest (i.e., November and December).