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# Preliminary Evidence That CD38 Moderates the Association of **Neuroticism on Amygdala-Subgenual Cingulate Connectivity**

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#### **OPEN ACCESS**

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#### Specialty section:

This article was submitted to Neurogenomics. a section of the iournal Frontiers in Neuroscience

Received: 30 August 2019 Accepted: 08 January 2020 Published: xx January 2020

#### Citation:

50	Tabak BA, Young KS, Torre JB,
51	Way BM, Burklund LJ,
52	Eisenberger NI, Lieberman MD and
53	<mark>Craske MG</mark> (2020) Preliminary
50	Evidence That CD38 Moderates
54	the Association of Neuroticism on
55	Amygdala-Subgenual Cingulate
56	Connectivity. Front. Neurosci. 14:11.
57	doi: 10.3389/fnins.2020.00011

CD38 genetic variation has been associated with autism spectrum disorders and social anxiety disorder, which may result from CD38's regulation of oxytocin secretion. Converging evidence has found that the rs3796863 A-allele contributes to increased social sensitivity compared to the CC genotype. The current study examined the moderating role of CD38 genetic variants (rs3796863 and rs6449182) that have been associated with enhanced (or reduced) social sensitivity on neural activation related to neuroticism, which is commonly elevated in individuals with social anxiety and depression. Adults (n = 72) with varying levels of social anxiety and depression provided biological samples for DNA extraction, completed a measure of neuroticism, and participated in a standardized emotion processing task (affect matching) while undergoing fMRI. A significant interaction effect was found for rs3796863 x neuroticism that predicted right amygdala-subgenual anterior cingulate cortex (sgACC) functional connectivity. Simple slopes analyses showed a positive association between neuroticism and right amygdala-sgACC connectivity among rs3796863 A-allele carriers. Findings suggest that the more socially sensitive rs3796863 A-allele may partially explain the relationship between a known risk factor (i.e., neuroticism) and promising biomarker (i.e., amygdala-sgACC connectivity) in the development and maintenance of social anxiety and depression.

Keywords: CD38, fMRI, functional connectivity, neuroticism, psychopathology, oxytocin

# INTRODUCTION

The multifunctional protein CD38 (Cluster of Differentiation 38) contributes to individual differences in social cognition and behavior, which may result from CD38's regulation of oxytocin secretion (Jin et al., 2007). The majority of human research associating CD38 genetic variation and social phenotypes has focused on two genetic variants of interest, rs3796863 (located in intron 7 on chromosome 4p15; Malavasi et al., 2008), and rs6449182 (located in a regulatory region in 

intron 1; Ferrero et al., 1999). Compared to individuals with the 115 rs3796863 CC genotype, A-allele carriers have been associated 116 with enhanced social sensitivity in the form of increased 117 parental sensitivity (Feldman et al., 2012), higher levels of 118 empathy and altruism (Liu et al., 2017), and decreased risk 119 of social impairments and autism spectrum disorders (Lerer 120 et al., 2010; Munesue et al., 2010). Individuals carrying the 121 A-allele have shown greater CD38 gene expression (Lerer 122 et al., 2010) and higher levels of unextracted plasma oxytocin 123 (Feldman et al., 2012) in comparison to individuals with 124 the CC genotype. However, contrary to previous results 125 demonstrating beneficial socioemotional outcomes associated 126 127 with the rs3796863 A-allele, our research group found that among 128 individuals who experienced higher levels of interpersonal stress, 129 A-allele carriers had higher levels of social anxiety and depression 130 over a 6-year period compared to those with the CC genotype (Tabak et al., 2016). 131

As research on oxytocin, and oxytocin system related genes 132 such as CD38, has progressed paradoxical results such as these 133 have led to the hypothesis that oxytocin enhances sensitivity to 134 positive or negative social stimuli (Olff et al., 2013; Shamay-135 Tsoory and Abu-Akel, 2015). Work focusing on oxytocin system 136 genes has shown that variants associated with enhanced social 137 sensitivity may contribute to positive or negative outcomes 138 depending on relevant environmental factors and individual 139 differences (Tabak, 2013). For example, several studies focused on 140 variation in the oxytocin receptor gene polymorphism rs53576 141 have found that G-allele carriers who experienced childhood 142 maltreatment were at greater risk for mental health concerns 143 (Bradley et al., 2011; McQuaid et al., 2013; Andreou et al., 2018), 144 even though the majority of research examining this SNP has 145 146 found the G-allele to be beneficial or protective. Further research 147 focusing on variations in oxytocin system genes has shown that alleles previously associated with beneficial social outcomes 148 may also be related to psychopathology when accounting for 149 relevant moderators (Kushner et al., 2018). Together, studies such 150 as these demonstrate that variation in oxytocin system genes, 151 including CD38, may contribute to enhanced levels of social 152 sensitivity, which can exacerbate the effects of environmental 153 stressors that contribute to the development and maintenance 154 of psychopathology (Tabak, 2013). This is particularly relevant 155 because positive associations between oxytocin and human 156 social processes have often overshadowed evidence of the 157 potential role of oxytocin in the development of psychopathology 158 (McQuaid et al., 2014). 159

In the present study, we sought to build on our previous 160 161 findings (Tabak et al., 2016) by investigating the underlying mechanisms that connect CD38, social sensitivity, and 162 163 psychopathology. To examine this question, we focused on 164 how CD38 genetic variation moderated a neural circuit that includes regions that have been associated with hyperactivation 165 in both depression and social anxiety; specifically, we examined 166 connectivity between the subgenual anterior cingulate cortex 167 (sgACC) and the amygdala. 168

A host of neuroimaging research has focused on the sgACC and amygdala in depressed individuals (for review see Ressler and Mayberg, 2007). There is evidence of heightened activation in the amygdala and sgACC in individuals with 172 depression when viewing negative stimuli, and post-treatment 173 decreases in depression symptoms have been associated with 174 decreased activation in these regions (Ressler and Mayberg, 175 2007). Studies have also confirmed connectivity between the 176 amygdala and sgACC (Stein et al., 2007) and this neural circuit 177 has important relevance for emotion dysregulation, a prominent 178 characteristic of mood disorders (Joormann and Vanderlind, 179 2014). Findings have shown greater positive amygdala-sgACC 180 functional connectivity in depressed adolescents during resting-181 state (Connolly et al., 2013) and while processing fearful facial 182 stimuli (Ho et al., 2014) compared to healthy controls. Similar 183 results have emerged in relatives of individuals diagnosed with 184 major depressive disorder (Wackerhagen et al., 2017). Studies of 185 individuals with social anxiety disorder have also found increased 186 amygdala activation during emotional face processing (Ball et al., 187 2012) and when viewing negative (e.g., fearful or threatening) 188 stimuli compared to healthy controls (Freitas-Ferrari et al., 189 2010; Gentili et al., 2016). In addition, meta-analytic effects for 190 increased activation in the sgACC have been found in individuals 191 with social anxiety disorder (Gentili et al., 2016). Thus, there 192 is evidence for amygdala and sgACC hyperactivation in both 193 depression and social anxiety disorder, and evidence for altered 194 functional connectivity between these regions in depression. 195

Elevated levels of neuroticism are a risk factor for depression 196 and anxiety, including social anxiety (Kotov et al., 2010). 197 Therefore, neuroticism is often examined as a trait level 198 individual difference that is positively associated with current 199 levels of anxiety and depression, as well as potentially higher 200 future levels of psychopathology. Neuroticism is also associated 201 with more negative responses to stress, increased reactivity 202 to threatening stimuli (Barlow et al., 2014), and heightened 203 activation in the amygdala and sgACC (Haas et al., 2007). 204 Given the relationship between neuroticism, psychopathology, 205 and threat reactivity, it is important to note that a meta-analysis 206 of neuroimaging studies examining neuroticism and emotion 207 processing did not find an association between neuroticism and 208 amygdala activation (Servaas et al., 2013). Rather, findings from 209 Servaas et al. (2013) suggest that the role of neuroticism in 210 amygdala activation appears to be related to altered connectivity 211 between the amygdala and frontal regions that result in emotion 212 dysregulation (Servaas et al., 2013). Indeed, Cremers et al. 213 (2010) found more inverse functional connectivity in the left 214 amygdala and anterior cingulate cortex among individuals with 215 higher levels of neuroticism when viewing negative stimuli. 216 Previous work by Pezawas et al. (2005) also found that inverse 217 connectivity between the amygdala and sgACC was associated 218 with increased harm avoidance (a construct highly correlated 219 with neuroticism that has been associated with affective disorder 220 symptomology; Jylhä and Isometsä, 2006) in short allele carriers 221 in the 5-HTTLPR polymorphism. In sum, previous findings 222 suggest that higher levels of neuroticism and altered connectivity 223 between the amygdala and sgACC may represent a common 224 neurobiological mechanism underlying the development of social 225 anxiety disorder and major depression. 226

In the present study, based on the associations between CD38 227 genetic variation and affective reactivity (Sauer et al., 2012), 228

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social anxiety, and depression (Tabak et al., 2016), we examined 229 the relationship between amygdala-sgACC connectivity and 230 neuroticism in individuals with varying levels of social anxiety 231 and depression. Using an a priori seed-based approach, we 232 used psychophysiological interaction (PPI) analysis to investigate 233 whether CD38 moderates the relationship between neuroticism 234 and amygdala-sgACC connectivity. We hypothesized that higher 235 levels of neuroticism would be related to positive connectivity 236 in this neural circuit in individuals with genotypes (i.e., the 237 rs3796863 A-allele) that have been associated previously with 238 enhanced social sensitivity. We also examined variation in a 239 second CD38 SNP, rs6449182, since there is evidence that this 240 241 polymorphism is functional and the G allele is associated with 242 increased CD38 expression (Jamroziak et al., 2009; Polzonetti 243 et al., 2012; but see Riebold et al., 2011).

# METHODS

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### 248 Participants

249 The present study includes a subsample from a randomized controlled trial examining the effectiveness of two types of 250 psychotherapy for social anxiety disorder plus a healthy control 251 comparison group (see Craske et al., 2014 for full methods). 252 The current study focused on measurements obtained at 253 baseline before any intervention began and included participants 254 who provided a saliva sample for genotyping and fMRI data 255 (n = 81). Therefore, methods refer to only this aspect of the 256 study for these participants. Participants were 18-45 years old, 257 right-handed, and English speaking. They were either free of 258 medications, or stabilized on medication, and were not currently 259 involved in behavioral therapy (see Craske et al., 2014 for full 260 261 exclusion criteria).

No genotype could be determined for three participants and 262 six participant's fMRI data were removed due to high levels 263 of motion-induced noise (>10% of images had a global signal 264 intensity >2.5 SD of mean, or were affected by motion of 265 >2.5 mm in any direction; Young et al., 2017). This resulted 266 in 72 participants (39 male; 33 female; Mean age = 27.56; 267 Age range = 18-43). Participants self-identified as Caucasian 268 (45.8%), Asian American (25%), Hispanic (13.9%), and Other 269 (15.3%). This study was carried out in accordance with the 270 recommendations of the UCLA Office for the Protection 271 of Human Research Subjects and approved by the UCLA 272 Institutional Review Board. All participants provided written 273 informed consent in accordance with the Declaration of Helsinki. 274

#### 275 276 Materials

#### 277 Neuroticism

<sup>278</sup> The 12-item Eysenck Personality Questionnaire–Revised Short <sup>279</sup> form (EPQR–S; Eysenck and Eysenck, 1992) was used to measure <sup>280</sup> neuroticism ( $\alpha = 0.86$ ).

#### 282 Psychiatric Diagnosis

Even though we focused on trait levels of neuroticism, the majority of participants (n = 57) met diagnostic criteria for social anxiety disorder. Fifteen additional participants did not meet criteria for any diagnosis (i.e., they were a healthy control 286 comparison group). Diagnoses were based on the Diagnostic and 287 Statistical Manual of Mental Disorders, 4th Edition through the 288 use of the Anxiety Disorders Interview Schedule-IV (Brown et al., 289 1994) that were conducted by trained interviewers. Individuals 290 who met criteria for a clinical disorder all had a current diagnosis 291 of social anxiety disorder that was either principal or co-principal, 292 with a clinical severity rating of four or higher (Craske et al., 293 2014). Healthy controls did not have a current or previous 294 psychiatric diagnosis. Among participants who met criteria for 295 social anxiety disorder, 13.9% (rs3796863 CC n = 7, A carrier 296 n = 3; rs6449182 CC n = 8, G carrier n = 2) were currently 297 taking medication for anxiety, depression, or "another emotional 298 problem" (see Burklund et al., 2015 for additional details). 299

#### Genotyping

Participants provided saliva samples using Salivettes (Sarstedt,<br/>Germany). DNA Extraction and genotyping was performed by<br/>Genomeadvisors Inc., La Mirada, CA, United States. CD38<br/>SNPs were genotyped using Taqman SNP Genotyping Assays<br/>(rs6449182: C\_1216863\_10; rs379663: C\_1216944\_10) with<br/>the ABI 7900 Sequence Detection System.302<br/>303

#### Procedure

The EPQR-S was administered 1-2 weeks before participants 310 completed their fMRI session. Before beginning the fMRI 311 procedure, participants practiced the reactivity task that involved 312 viewing and matching images of emotional facial expressions 313 and geometric shapes (Hariri et al., 2002). In the present study, 314 our interest was in examining neural reactivity to negative 315 stimuli (angry, disgusted, or fearful emotional expressions) 316 obtained from the NimStim Face Stimulus set (Tottenham et al., 317 2009). We collapsed across facial expressions in analyses to 318 examine responses to negative facial expressions in general 319 compared to shape matching. This resulted in two conditions: 320 affect match and shape match. Our focus of analysis was 321 on the contrast between matching affect vs. matching shapes, 322 which is a well-validated method of assessing neural activation 323 associated with viewing emotionally evocative human stimuli 324 while controlling for attention and motoric responses (as 325 described in Burklund et al., 2015). This task has been used 326 in previous research examining amygdala-sgACC functional 327 connectivity and depression (Pezawas et al., 2005). Participants 328 also completed two other conditions in which they were asked 329 to engage in affect labeling or gender labeling of the face stimuli 330 (see Burklund et al., 2015 for further details). Regressors for 331 these stimuli were included in first level models, but as they are 332 not the focus of the current investigation, are not reported on 333 here. A previous study by our research group (Burklund et al., 334 2015) also examined neural activation across different clinical 335 subgroups compared to healthy controls in the bilateral amygdala 336 as well as right ventral lateral prefrontal cortex during affect 337 match vs. shape match. In contrast, the current study examined 338 trait levels of neuroticism and focused on functional connectivity 339 between the amygdala and sgACC. 340

As described by Burklund et al. (2015) we used a block design 341 for stimuli presentation with four blocks per condition (affect 342

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match, shape match, affect label, gender label; all conditions 343 were counterbalanced) and six trials per block (trials lasted 344 5 s, resulting in 30 s blocks). Preceding the stimuli blocks 345 were 10 s fixation crosshairs and 3 s instruction cues. The 346 present analyses build on the prior work published in Burklund 347 et al. (2015) by examining genetic contributions to functional 348 connectivity between areas as a function of neuroticism rather 349 than focusing on group differences in neural activation as was 350 done in the prior work. A Macintosh MacBook Pro computer 351 with MacStim software (WhiteAnt Occasional Publishing)1 and 352 high-resolution goggles (Resonance Technology, Inc.) were used 353 to present stimuli. Responses were collected with an fMRI-354 compatible button box through a custom USB interface. 355

#### 357 fMRI Image Acquisition

358 Magnetic resonance images were acquired using a Trio 3.0 359 Tesla Siemens MRI scanner at the UCLA Ahmanson-Lovelace 360 Brain Mapping Center. For each participant, a high-resolution 361 structural T2-weighted echoplanar imaging volume (spin-echo, 362 TR = 5000 ms, TE = 34 ms, matrix size =  $128 \times 128$ , 363 resolution = 1.6 mm  $\times$  1.6 mm  $\times$  3 mm, FOV = 200 mm, 36 364 slices, 3 mm thick, flip angle =  $90^{\circ}$ , bandwidth = 1302 Hz/Px) 365 was acquired coplanar with the functional scans. Four functional 366 runs were acquired, with a total of 344 volumes (gradient-echo, 367 TR = 3000 ms, TE = 25 ms, flip angle =  $90^{\circ}$ , matrix size =  $64 \times 64$ , 368 resolution = 3.1 mm x 3.1 mm x 3.0 mm, FOV = 200 mm, 36 axial 369 slices, 3 mm thick, bandwidth = 2604 Hz/Px).

#### 371 fMRI Pre-processing and Analysis

372 Imaging data were analyzed using SPM8 (Wellcome Trust 373 Centre for Neuroimaging, University College London, 374 United Kingdom)<sup>2</sup>. Functional images for each participant 375 were realigned to correct for head motion, co-registered to the 376 high-resolution structural images, normalized into a standard 377 stereotactic space as defined by the Montreal Neurological 378 Institute and smoothed with an 8 mm Gaussian kernel FWHM. 379 Experimental blocks were modeled using a boxcar function 380 convolved with the canonical hemodynamic response. Motion 381 parameters were included in the model as regressors of no 382 interest. Linear contrasts for affect match vs. shape match 383 were computed at the first-level for each participant using a 384 fixed-effects model. PPI analyses (Friston et al., 1997) were 385 implemented using generalized PPI (gPPI) within SPM8 386 (McLaren et al., 2012). These analyses were used to examine 387 whether the interaction between neuroticism and CD38 variation 388 predicted functional connectivity between the amygdala and the 389 sgACC. The right and left amygdala were used as separate seed 390 regions for these analyses [anatomically defined ROI; Automated 391 Anatomical Labeling (AAL) library]. We conducted both an 392 ROI-based analysis and a whole-brain analysis to investigate 393 general alterations in right and left amygdala connectivity, 394 focusing on the sgACC. A spherical sgACC ROI (6 mm radius) 395 was created based on coordinates in a previous study examining 396 the moderating role of genetic variation on amygdala-sgACC 397

<sup>2</sup>http://www.fil.ion.ucl.ac.uk 399

### Statistical Analysis

405 ROI analyses: All continuous independent variables and 406 covariates were mean centered before analyses. Using hierarchical 407 multiple linear regression, separate analyses were conducted 408 for each CD38 SNP that included the following predictors 409 of right (or left) amygdala-sgACC connectivity: (a) the main 410 effect of genotype, (b) the main effect of neuroticism, and 411 (c) the interaction effect of genotype x neuroticism. Following 412 the recommendations of Keller (2014) we also ran analyses 413 with the inclusion of additional covariates to assess the 414 robustness of findings including: self-reported race/ethnicity 415 (Asian, Hispanic, Other; Caucasians were designated as the 416 comparison group), gender, age, medication status, group (i.e., 417 clinical vs. healthy controls), and all genotype x covariate as 418 well as neuroticism x covariate interactions. The addition of all 419 robustness covariates and their interactions did not alter the 420 significance of any primary interaction effects.

421 Significant interactions were followed by simple slopes 422 analyses to examine the main effects of neuroticism for each 423 genotype group. Analyses were conducted using SPSS 24 and the 424 PROCESS macro (Hayes and Little, 2017). Figure 1 was created using Stata version 14. Bonferroni correction was used to correct for multiple testing for the four primary gene x neuroticism tests (i.e., rs3796863 x neuroticism for left and then right amygdala, 428 and the same two tests for rs6449182), resulting in a threshold of p < 0.0125.

As in previous studies (Feldman et al., 2012; Sauer et al., 2012; Tabak et al., 2016), we used dominant coding for rs3796863 (CC = 0; A-allele carriers [AC and AA] = 1). Based on previous work (Jamroziak et al., 2009; Polzonetti et al., 2012), rs6449182 was also coded in a dominant manner (CC = 0; G-allele carriers [CG or GG] = 1). Genotype frequencies for the total sample of



<sup>398</sup> <sup>1</sup>www.Brainmapping.org/WhiteAnt

connectivity during the same affect match task used in the 400 present study (Pezawas et al., 2005; MNI coordinates: x = 0, 401 y = 37, z = -2). 402

457 participants who provided genetic and fMRI data were in Hardy– 458 Weinberg Equilibrium (rs3796863:  $\chi^2 = 2.6$ , p = 0.11, rs6449182: 459  $\chi^2 = 2.4$ , p = 0.12).

460 Whole brain analyses: Group level whole brain multiple regression analyses were conducted, entering connectivity SPM 461 images for the contrast "Affect Match - Shape Match." 462 Regressors included in the model were the CD38 genotype, 463 neuroticism, and CD38 x neuroticism interaction effects. 464 Gender, age, race/ethnicity, medication status, group, and 465 all genotype x covariate as well as neuroticism x covariate 466 interactions were entered as covariates of no interest. 467

### RESULTS

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471 Table 1 displays sample demographics, means, standard 472 deviations, and genotype frequencies. Our interest in focusing 473 on neuroticism as a trait level individual difference that reflects 474 anxiety and depression symptoms was confirmed by high 475 correlations (rs = 0.73) between neuroticism and the General 476 Distress Anxiety and Depression scales from the Mood and 477 Anxiety Symptoms Questionnaire (Watson et al., 1995). We 478 first examined the correlation between CD38 genotype and 479 neuroticism (including gender, age, race/ethnicity, medication 480 status, and group as covariates) and found no associations 481 between rs3796863 genotype (A/C or A/A genotypes coded 1; 482 *C*/*C* genotype coded 0) (*r* = 0.02, *p* = 0.88) or rs6449182 genotype 483 and neuroticism (G/G or C/G genotypes coded 1; C/C genotype 484 coded 0) (r = 0.05, p = 0.71). 485

### <sup>486</sup> CD38 Variant rs3796863

487 We used hierarchical multiple linear regression analysis and 488 found a main effect of CD38 rs3796863 genotype on right 489 amygdala-sgACC functional connectivity (p = 0.017), but no 490 main effect of neuroticism (see Table 2). However, there was 491 also a significant rs3796863 x neuroticism effect (p = 0.002) that 492 maintained significance following multiple test correction. As 493 shown in Table 2 and Figure 1, simple slopes analysis showed 494 a positive association between neuroticism and right amygdala-495 sgACC connectivity, but the simple slope for individuals with the 496 CC genotype was not significant. There were also no main or 497 interaction effects of genotype or neuroticism when examining 498 left amygdala-sgACC connectivity (See Table 2). 499

### <sup>500</sup> CD38 Variant rs6449182

We followed the same steps and conducted hierarchical multiple linear regression analysis and found no main or interaction effects involving CD38 rs6449182 genotype (see **Table 3**).

### <sup>505</sup> Whole Brain Analyses

Full results of whole brain analyses are presented in **Supplementary Tables S1, S2**).

### 510 **DISCUSSION**

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The present findings are the first showing evidence of a moderating role for CD38 genetic variation on the association between neuroticism and amygdala-sgACC connectivity. 514 Specifically, there was a positive association between neuroticism 515 and right amygdala-sgACC functional connectivity among 516 rs3796863 A-allele carriers. Thus, A-allele carriers with 517 lower levels of neuroticism showed more inverse functional 518 connectivity between right amygdala and sgACC whereas 519 A-allele carriers with higher levels of neuroticism showed more 520 positive connectivity. For illustrative purposes, we created 521 Supplementary Figure S1 to decompose patterns of functional 522 connectivity. Results suggested that the present findings may 523 be driven by A-allele carriers with lower levels of neuroticism, 524 potentially due to better regulation of the amygdala. This finding 525 suggests that results from our previous work, in which we 526 found increased risk for social anxiety and depression over time 527 among rs3796863 A-allele carriers who experienced greater 528 interpersonal stress, may have been specific to individuals with 529 higher levels of neuroticism, who were oversampled (Tabak et al., 530 2016). These results also follow the pattern shown by McQuaid 531 et al. (2016) who found higher levels of depression and suicidal 532 ideation among individuals with the rs3796863 AA genotype 533 compared to C-allele carriers (but see Parris et al., 2018; Handley 534 et al., 2019). Results also suggest that accounting for neuroticism 535 in future studies of CD38 genetic variation may help to explain 536 discrepant associations of the rs3796863 A-allele with outcomes 537 such as greater empathy and altruism (Liu et al., 2017), reduced 538 risk of autism spectrum disorders (Munesue et al., 2010), but also 539 higher levels of depression and suicidal ideation (McQuaid et al., 540 2016). Since the directionality of associations among A-allele 541 carriers has differed across studies, further research that accounts 542 for levels of neuroticism is needed. More broadly, the present 543 finding adds to results from previous studies suggesting a role for 544 oxytocin system genetic variants in enhanced social sensitivity 545 (Tabak, 2013). 546

The present results are also in agreement with studies showing 547 increased connectivity between the amygdala and sgACC in 548 individuals with depression during a facial affect recognition 549 task for fearful stimuli (Ho et al., 2014) and among adult first-550 degree relatives of individuals with major depressive disorder 551 when performing a negative affect matching task (Wackerhagen 552 et al., 2017). In addition, the same neural circuit examined in 553 the present study has also been shown to be moderated by 554 genetic variation in the serotonin system (i.e., more inverse 555 amygdala-sgACC connectivity was related to higher levels of 556 harm avoidance among 5-HTTLPR short allele carriers; Pezawas 557 et al., 2005). In a previous study examining the relationship 558 between neuroticism and amygdala-anterior cingulate cortex 559 (ACC) connectivity, Cremers et al. (2010) found that neuroticism 560 was related to more inverse functional connectivity between the 561 left amygdala and ACC. In the present study, our analyses did 562 not identify a significant relationship between the left amygdala 563 and the ACC; however, whole brain analyses showed a significant 564 interaction effect of rs3796863 x neuroticism predicting positive 565 functional connectivity between the right amygdala and the 566 ACC. One potential explanation for the discrepancy between 567 the present results and those from Cremers et al. (2010) 568 is that the sample in the study by Cremers and colleagues 569 included all healthy individuals, whereas our sample included 570

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TABLE 1 | Descriptive statistics for rs3796863, rs6449182, and major study variables. 571

Variable	All participants	rs3796863 A-Allele Carriers	rs3796863 CC Homozygotes	rs6449182 G-Allele Carriers	rs6449182 CC Homozygotes
Gender		t = -1.3	34 (70)	t = -0.4	78 (69)
Female	34 (47.2%)	16 (57.1%)	18 (40.9%)	10 (52.6%)	24 (46.2%)
Male	38 (52.8%)	12 (42.9%)	26 (59.1%)	9 (47.4%)	28 (53.8%)
		t = 1.44 (58.5)		t = -1.22 (69)	
Age	27.56 (6.51)	26.21 (6.33)	28.44 (6.54)	29.14 (7.13)	26.94 (6.3)
		t = 0.156 (70)		t = -0.101 (69)	
Neuroticism	6.83 (3.59)	6.75 (3.72)	6.89 (3.54)	7.00 (2.85)	6.90 (3.76)
Race/ethnicity		$\chi^2 = 2.5$	3 (3, 72)	$\chi^{2} = 2.0$	2 (3, 71)
Caucasian	33 (45.8%)	15 (53.6%)	18 (40.9%)	10 (52.6%)	22 (42.3%)
Hispanic/Latino	10 (13.9%)	2 (7.1%)	8 (18.2%)	2 (10.5%)	8 (15.4%)
Asian American/Pacific Islander	18 (25%)	6 (21.4%)	12 (27.3%)	3 (15.8%)	15 (28.8%)
Other	11 (15.3%)	5 (17.9%)	6 (13.7%)	4 (21.1%)	7 (13.5%)
CD38 genotype					
AA	8 (11.1%)	-	-	-	-
AC	20 (27.8%)	-	-	-	-
CC	44 (61.81%)	_	_		_

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TABLE 2 (a) CD38 rs3796863 and neuroticism predicting right amygdala-sgACC functional connectivity. (b) CD38 rs3796863 and neuroticism predicting left amygdala-sgACC functional connectivity.

Independent variable	b	β	SE	R <sup>2</sup>
(a)				
CD38 genotype	-0.312*	-0.282	0.128	0.066
Neuroticism	0.020	0.132	0.018	0.097
Genotype x Neuroticism	0.107**	0.798	0.033	0.217
Simple Slope for A-allele carriers				
Neuroticism	0.082**	0.608	0.021	0.370
Simple Slope for C/C genotype				
Neuroticism	-0.025	-0.162	0.024	0.026
(b)				
CD38 genotype	0.005	0.005	0.125	0.000
Neuroticism	-0.003	-0.020	0.017	0.000
Genotype x Neuroticism	0.052	0.409	0.035	0.032
Simple Slope for A-allele carriers				
Neuroticism	0.028	0.244	0.022	0.060
Simple Slope for C/C genotype				
Neuroticism	-0.024	-0.151	0.024	0.023

The addition of robustness covariates or their interactions did not alter the significance of the primary interaction effects or the significance of simple slopes. \*p < 0.05; 614 671 \*p < 0.005.672

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healthy individuals as well as individuals with anxiety and 617 depressive disorders. 618

Although previous studies have examined the role of genetic 619 variation in 5-HTTLPR and neuroticism (Pluess et al., 2010; 620 Kuepper et al., 2012), to date, there is limited research examining 621 oxytocin related genetic variants and neuroticism. This seems 622 like an important oversight since, in addition to its role in 623 social processes, oxytocin is associated with stress responsivity 624 (Engert et al., 2016; Alley et al., 2019) and evidence suggests 625 that early life adversity can alter the oxytocin system (Bradley 626 et al., 2011; Grimm et al., 2014; Smearman et al., 2016). In 627

addition, neuroticism not only predicts psychopathology over 674 time (Kendall et al., 2015), but it's also associated with negative 675 interpersonal outcomes such as increased reactivity to stressful 676 events following conflict (Suls et al., 1998), a tendency to use 677 negative forms of coping following interpersonal stress (Gunthert 678 et al., 1999), and negative marital outcomes including divorce 679 (Kelly and Conley, 1987). As studies continue to elucidate 680 potential relationships between oxytocin and psychopathology 681 (McQuaid et al., 2014; Gottschalk and Domschke, 2018), the 682 present results suggest that neuroticism should be a target of 683 future oxytocin research. This enhanced focus on neuroticism 684

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85	TABLE 3   (a) CD38 rs6449182 and neuroticism predicting right amygdala-sgACC functional connectivity. (b) CD38 rs6449182 and neuroticism predicting left
	amygdala-sgACC functional connectivity.

Independent variable	b	β	SE	R <sup>2</sup>
(a)				
CD38 genotype	-0.011	-0.009	0.149	0.00
Neuroticism	0.023	0.145	0.019	0.02
Genotype x Neuroticism	-0.061	-0.382	0.050	0.04
Simple Slope for G-allele carriers				
Neuroticism	-0.027	-0.200	0.033	0.04
Simple Slope for C/C genotype				
Neuroticism	0.033	0.207	0.023	0.04
(b)				
CD38 genotype	0.095	0.083	0.138	0.00
Neuroticism	-0.001	-0.005	0.018	0.00
Genotype x Neuroticism	0.016	0.107	0.048	0.00
Simple Slope for G-allele carriers				
Neuroticism	0.013	0.060	0.051	0.00
Simple Slope for C/C genotype				
Neuroticism	-0.003	-0.026	0.018	0.00

The addition of robustness covariates or their interactions did not alter the significance of the primary interaction effects or the significance of simple slopes. \*p < 0.05; 762 \*\*p < 0.01.

would be consistent with elevated levels of anxiety and emotional
 reactivity to negative events that have been seen in mice with
 deletion of the CD38 gene (Martucci et al., 2019).

Exploratory whole brain analyses showed main effects of 711 neuroticism on regions that are considered part of the default 712 mode network, such as the temporoparietal junction, precuneus, 713 and sgACC (Menon, 2011; Li et al., 2014). These findings are 714 consistent with prior work demonstrating altered connectivity of 715 functional brain networks, including the default mode network, 716 in anxiety disorders and depression (Sylvester et al., 2012; Zhu 717 et al., 2012). Future work exploring altered network connectivity 718 in the context of oxytocin would be of much interest in 719 this regard. Additional whole brain analyses suggested that 720 the interaction of genotype and neuroticism might impact 721 a other neural networks, including the ACC, dorsal medial 722 prefrontal cortex, and inferior frontal gyrus regions. These 723 regions have been implicated in a variety of functions including 724 the explicit regulation of emotional reactivity in limbic brain 725 regions (Ochsner and Gross, 2008). The current study was not 726 designed to investigate emotion regulation, instead focusing on 727 emotional reactivity to negative stimuli, but investigation of how 728 neuroticism and CD38 variants interact to impact regulation of 729 emotional reactions would be of interest in future research. 730

The present study has several strengths including a sample of 731 participants with a wide range of social anxiety and depression 732 levels, the focus on a continuous measure of psychopathology 733 risk (i.e., neuroticism), and the examination of genetic variation 734 of a neural circuit through functional connectivity analysis. 735 In addition, the significant gene x neuroticism interaction 736 effect found in the present study withstood multiple test 737 correction and the addition of many robustness covariates 738 and their interaction effects. However, several limitations must 739 also be noted. Although the present sample is slightly larger 740 than other studies examining CD38 genetic moderation of 741

764 neural activation (Sauer et al., 2012, 2013), based on current 765 recommendations (Duncan and Keller, 2011), our sample is 766 small for a GxE interaction study. In addition, the size of 767 the interaction effect found in the present study ( $R^2 = 0.11$ 768 with robustness covariates;  $R^2 = 0.217$  without robustness 769 covariates) is much larger than current estimates for typical 770 GxE effects (Duncan and Keller, 2011). Another limitation 771 is our racially/ethnically heterogeneous sample. To account 772 for this in our statistical analysis, we included race/ethnicity 773 and genotype x race/ethnicity interactions as covariates, 774 which is an established method to statistically reduce the 775 potential effects of population stratification (Keller, 2014). 776 However, the size of our sample prevented us from conducting 777 additional analyses to examine the generalizability of effects 778 within and across racial/ethnic subgroups. Based on these 779 limitations, replication studies with a larger sample size 780 are necessary, and the present results should be viewed as 781 preliminary in nature. 782

There is evidence that CD38 gene expression is positively 783 associated with levels of endogenous oxytocin (Kiss et al., 784 2011), but the way in which CD38 SNP rs3796863 may 785 influence genetic expression is not yet known. Therefore, the 786 present findings suggest that rs3796863 may be tagging a 787 functional SNP that was not genotyped in our study (Lin 788 et al., 2007). In contrast, several studies have found evidence 789 for a functional role for rs6449182 (Jamroziak et al., 2009; 790 Polzonetti et al., 2012), but variation in this SNP was not 791 associated with our outcome. The present study also did not 792 include a direct measurement of endogenous oxytocin, which 793 precludes us from examining the relationship between CD38 794 genetic variation, circulating levels of oxytocin, and neuroticism. 795 However, previous work has found an association between CD38 796 genetic variation and differences in levels of unextracted oxytocin 797 (Feldman et al., 2012). 798

#### Conclusion 799

800 In sum, we found a positive association between neuroticism and 801 right amygdala-sgACC functional connectivity in rs37896863 802 A-allele carriers. Given the correlational nature of functional 803 connectivity analysis, the extent to which the right amygdala 804 is affecting the sgACC or vice versa cannot be determined. 805 However, the present results suggest that the more socially 806 sensitive rs3796863 A-allele may partially explain the 807 relationship between a known risk factor (i.e., neuroticism) and 808 promising biomarker (i.e., amygdala-sgACC connectivity) in the 809 development and maintenance of social anxiety and depression.

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### DATA AVAILABILITY STATEMENT

814 The datasets for this manuscript are not publicly available because consent was not obtained from participants for this 815 purpose during the randomized controlled trial from which this 816 data came (Craske et al., 2014). Requests to access the datasets 817 should be directed to MC, MCraske@mednet.ucla.edu. 818

### ETHICS STATEMENT

The studies involving human participants were reviewed and approved by the UCLA Office for the Protection of Human Research Subjects and the UCLA Institutional Review Board. The patients/participants provided their written informed consent to participate in this study.

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### AUTHOR CONTRIBUTIONS

LB, ML, and MC designed the original study. BT conceptualized the present study. BT, KY, JT, and BW analyzed the data. BT and KY wrote the first draft of the manuscript. BT, KY, BW, LB, NE, ML, and MC contributed to the manuscript revision, read, and approved the submitted version.

### FUNDING

This project was supported by the National Institute of Mental Health (MC, ML, and ST, R21MH081299), and a postdoctoral training fellowship for BT in Biobehavioral Issues in Mental and Physical Health when he was at the University of California, Los Angeles (T32MH15750).

### ACKNOWLEDGMENTS

The authors wish to acknowledge the contribution of Andrea Niles in the collection and organization of data.

### SUPPLEMENTARY MATERIAL

The Supplementary Material for this article can be found online at: https://www.frontiersin.org/articles/10.3389/fnins. 2020.00011/full#supplementary-material

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Conflict of Interest: The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

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