1	FTO affects food cravings and interacts with age to				
2	influence age-related decline in food cravings				
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Highlights

- FTO is associated with differences in body mass index (BMI) and odds of obesity.
- Present results showed FTO rs9939609 A allele correlating with higher food craving.
- Higher food craving correlated with higher BMI.
- Carriers of A allele did not show the typical age-related decline in food craving.
- No evidence of FTO effects on dopamine D2 receptor availability.

29 Abstract

30 The fat mass and obesity associated gene (FTO) was the first gene 31 identified by genome-wide association studies to correlate with higher body mass 32 index (BMI) and increased odds of obesity. FTO remains the locus with the 33 largest and most replicated effect on body weight, but the mechanism whereby 34 FTO affects body weight and the development of obesity is not fully understood. 35 Here we tested whether FTO is associated with differences in food cravings and 36 a key aspect of dopamine function that has been hypothesized to influence food 37 reward mechanisms. Moreover, as food cravings and dopamine function are 38 known to decline with age, we explored effects of age on relations between FTO 39 and food cravings and dopamine function. Seven-eight healthy subjects between 40 22 and 83 years old completed the Food Cravings Questionnaire and underwent 41 genotyping for FTO rs9939609, the first FTO single nucleotide polymorphism 42 associated with obesity. Compared to TT homozygotes, individuals carrying the 43 obesity-susceptible A allele had higher total food cravings, which correlated with 44 higher BMI. Additionally, food cravings declined with age, but this age effect 45 differed across variants of FTO rs9939609: while TT homozygotes showed the 46 typical age-related decline in food cravings, there was no such decline among A 47 carriers. All subjects were scanned with [18F]fallypride PET to assess a recent 48 proposal that at the neurochemical level FTO alters dopamine D2-like receptor (DRD2) function to influence food reward related mechanisms. However, we 49 50 observed no evidence of FTO effects on DRD2 availability.

51

52 Keywords: FTO, food cravings, aging, dopamine receptor availability

53 Introduction

54 Studies of heritability have found that genetic differences explain 40% to 70% of the variance in individual susceptibility to obesity (Maes et al., 1997; Elks 55 56 et al., 2012), which affects more than 10% of the world's population 57 (Collaborators et al., 2017). In 2007, the fat mass and obesity associated gene 58 (FTO) became the first gene identified by genome-wide association studies to 59 correlate with higher body mass index (BMI) and increased odds of obesity 60 (Frayling et al., 2007; Scuteri et al., 2007). Subsequent genome-wide studies 61 have linked other loci with obesity susceptibility, but FTO remains the locus with 62 the largest effect (Speliotes et al., 2010) and is the most widely replicated across 63 ethnic groups (Lu and Loos, 2013). The risk allele is also common, with the minor 64 allele frequency ranging from 12% in East Asians to 42% in Europeans (Li et al., 65 2012). The mechanism whereby FTO affects body weight and the development 66 of obesity is not well understood, but evidence to date suggests a role for FTO in 67 adipogenesis, energy metabolism, and nutrient intake (Yang et al., 2017). 68 It has also been proposed that FTO influences food reward mechanisms. 69 Individuals with at least one A allele of FTO rs9939609 (the first FTO single

70 nucleotide polymorphism associated with obesity) have been reported to show

71 greater externally driven eating (Velders et al., 2012), lowered satiety (Wardle et

al., 2008; den Hoed et al., 2009), enhanced fMRI response to food (Karra et al.,

73 2013), and report more frequent loss of control over eating than those having two

T alleles (Tanofsky-Kraff et al., 2009). The control of eating is particularly hard in

the context of heightened food cravings (Hill, 2007), but little data have

76 addressed whether FTO rs9939609 is associated with alterations in food 77 cravings. One study (Huang et al., 2014) observed no relation between FTO and 78 participants' responses on one question about how often they experienced 79 cravings in the previous week, but there was an indication of a possible 80 interaction between FTO and diet on the change in craving from baseline to 6 81 months after participating in a weight loss program, with evidence of an FTO 82 effect only arising in those with high protein intake. In evaluating such a result, it 83 is worth noting that food craving is a multidimensional construct (Cepeda-Benito 84 et al., 2000). It is not clear which aspects of craving this single-guestion test 85 captured and how different aspects of cravings relate to FTO. It is also unclear 86 whether the restriction of the sample to overweight and obese subjects impacted 87 the ability to observe effects.

88 Given the importance of dopamine to reward and addictive behavior (Di 89 Chiara and Bassareo, 2007), it is striking that at the neurochemical level, mice 90 with deficient FTO expression exhibit characteristics similar to mice lacking 91 midbrain dopamine D2 receptors (DRD2) (Bello et al., 2011; Hess et al., 2013). 92 Moreover inactivation of the FTO gene impaired DRD2-dependent neuronal and 93 reward responses in mice, though the study did not observe a significant 94 difference in body weight or DRD2 expression between FTO-deficient and control 95 mice (Hess et al., 2013). Still, other evidence of FTO effects on dopamine-96 dependent reward learning (Sevgi et al., 2015) and resting state functional 97 connectivity in dopaminergic circuitries (Olivo et al., 2016) has led to the recent 98 proposal that FTO alters DRD2 function in the presence of an obesogenic diet to

99 confer risk for obesity (Sun et al., 2017). Evidence of an association between
100 FTO and DRD2 function in humans would further support this hypothesis.

101 Potential relations between FTO, cravings, and DRD2 availability must 102 unfold in the context of life-span development. Fat mass is well-known to 103 increase across adulthood (St-Onge, 2005) and at least one FTO risk gene 104 (rs1421085) has been reported to impact the trajectory of weight gain as well as 105 personality traits and ventral and medial prefrontal brain functions (Chuang et al., 106 2015). At the neurochemical level, the most replicated finding in the dopamine 107 imaging literature is the robust decline in DRD2 availability across adulthood 108 (Ichise et al., 1998; Karrer et al., 2017). We recently reported that associations 109 between DRD2 and BMI change with age (Dang et al., 2016). Finally, both the 110 intensity of craving and the number of foods craved decline with age (Antonini et 111 al., 1993; Pelchat, 1997; Ichise et al., 1998). It is not yet known whether FTO 112 influences the age-related decline in either food cravings or DRD2. However, 113 given the developmental trajectories of these phenotypic variables, it is important 114 to determine whether any potential relations with FTO vary or interact with age. 115 The present study had three objectives. First, we examined the role of 116 FTO rs9939609 in food cravings in individuals spanning the BMI continuum from 117 normal weight to obese. Nine dimensions of food cravings were assessed using 118 the psychometrically validated Food Cravings Questionnaire (Cepeda-Benito et 119 al., 2000) to understand the specificity of the relation between FTO rs9939609 120 and food cravings. Second, we tested the hypothesis that FTO influences DRD2 121 availability, assessed using PET and the high-affinity DRD2 radioligand

[18F]fallypride. Lastly, we explored effects of age on the relation between FTO,
food cravings, and DRD2 to determine whether expected age-related declines in
food cravings and DRD2 availability vary across FTO rs9939609 allele groups.
The results of these inquiries may shed light on possible mechanisms whereby
FTO influences body weight that can be utilized to facilitate greater specificity for
therapies combatting obesity.

128

129 Methods

130 Subjects

131 Seventy-eight healthy subjects between 22 and 83 years old (mean age 132 49.9±18.0 years, 46 females, mean BMI 27.0±5.1) from the Nashville, TN metro 133 area were recruited to participate in this study. Exclusion criteria included any 134 history of psychiatric illness on a screening interview (a Structural Interview for 135 Clinical DSM-IV Diagnosis was also available for all subjects and confirmed no 136 history of major Axis I disorders) (First et al., 1997), any history of head trauma, 137 any significant medical condition, or any condition that would interfere with MRI 138 (e.g. inability to fit in the scanner, claustrophobia, cochlear implant, metal 139 fragments in eyes, cardiac pacemaker, neural stimulator, pregnancy, and metallic body inclusions or other contraindicated metal implanted in the body). Subjects 140 141 with major medical disorders including diabetes and/or abnormalities on 142 screening comprehensive metabolic panel or complete blood count were 143 excluded. Subjects were also excluded if they reported a history of substance 144 abuse, current tobacco use, alcohol consumption greater than 8 ounces of

145 whiskey or equivalent per week, use of psychostimulants (excluding caffeine) 146 more than twice at any time in their life or at all in the past 6 months, or any 147 psychotropic medication in the last 6 months other than occasional use of 148 benzodiazepines for sleep. Any illicit drug use in the last 2 months was grounds 149 for exclusion, even in subjects who did not otherwise meet criteria for substance 150 abuse. Urine drug tests were administered, and subjects testing positive for the 151 presence of amphetamines, cocaine, marijuana, PCP, opiates, benzodiazepines, 152 or barbiturates were excluded. Written informed consent was obtained from all 153 subjects. This study was approved by the Institutional Review Boards at Yale 154 University and Vanderbilt University and performed in accordance with the ethical 155 standards of the 1964 Declaration of Helsinki and its later amendments. Data are 156 available at the Open Science Framework.

157

158 Genotyping of FTO

Blood samples from each subject were genotyped for FTO rs9939609 via
Sequenom analysis performed at Vanderbilt University's VANTAGE Genomics
Core (see (Ritchie et al., 2010) for detailed Sequenom genotyping methods).

162

163 Food Cravings Questionnaire – Trait version

164 The Food Cravings Questionnaire assesses motivational states that 165 promote food cravings and ingestive behaviors and has been demonstrated to 166 possess good internal consistency and test-retest reliability (Cepeda-Benito et 167 al., 2000). The self-report questionnaire consists of 39 questions assessing 9 168 dimensions of food cravings: 1) having intentions or plans to consume food, 2) 169 anticipation of positive reinforcement that may result from eating. 3) anticipation 170 of relief from negative states and feelings as a result of eating, 4) lack of control 171 over eating, 5) thoughts or preoccupation with food, 6) cravings as a 172 physiological state, 7) emotions that may be experienced before or during food 173 cravings or eating, 8) cues that may trigger food cravings, and 9) guilt from 174 cravings and/or for giving into them. 175 176 PET data acquisition

177 PET imaging was performed on a GE Discovery STE scanner located at 178 Vanderbilt University Medical Center. The scanner had an axial resolution of 4 179 mm and in-plane resolution of 4.5-5.5 mm FWHM at the center of the field of 180 view. [18F]fallypride ((S)-N-[(1-allyl-2-pyrrolidinyl)methyl]-5-(3[18F]fluoropropyl)-181 2.3- dimethoxybenzamide) was produced in the radiochemistry laboratory 182 attached to the PET unit, following synthesis and quality control procedures 183 described in US Food and Drug Administration IND 47,245. [18F]fallypride is a 184 substituted benzamide with very high affinity to D2/D3 receptors (Mukherjee et 185 al., 1995). 3D emission acquisition scans were performed following a 5.0 mCi 186 slow bolus injection of [18F]fallypride (specific activity greater than 3000 187 Ci/mmol). CT scans were collected for attenuation correction prior to each of the 188 three emission scans, which together lasted approximately 3.5 hours, with two 189 15-minute breaks for subject comfort. PET images were reconstructed with 190 decay correction, attenuation correction, scatter correction, and calibration.

191

192 MRI data acquisition

193	Structural MRI scans were performed on a 3 Tesla Phillips Achieva
194	scanner located at the Vanderbilt University Institute for Imaging Science
195	(VUIIS). T1-weighted high-resolution 3D anatomical scans (TR=8.9ms,
196	TE=4.6ms, FOV=256x256, voxel dimensions= $1 \times 1 \times 1$ mm) were obtained for each
197	participant to aid coregistration and spatial normalization of PET images.
198	
199	[18F]fallypride binding potential (BP _{ND}) image calculation
200	Voxelwise D2/D3 binding potential images were calculated using the
201	simplified reference tissue model, which has been shown to provide stable
202	estimates of [18F]fallypride BP_{ND} (Siessmeier et al., 2005). The cerebellum
203	served as the reference region because of its relative lack of D2/D3 receptors
204	(Camps et al., 1989). The cerebellar reference region was obtained from an atlas
205	provided by the ANSIR laboratory at Wake Forest University. Limited PET spatial
206	resolution introduces blurring and causes signal to spill onto neighboring regions.
207	Because the anterior cerebellum is located proximal to the substantia nigra and
208	colliculus, which both have DRD2, only the posterior 3⁄4 of the cerebellum was
209	included in the region of interest (ROI) to avoid contamination of [18F]fallypride
210	signal from the midbrain nuclei. The cerebellum ROI also excluded voxels within
211	5mm of the overlying cerebral cortex to prevent contamination from cortical
212	signals. The bilateral putamen ROI, drawn according to established guidelines
213	(Mawlawi et al., 2001) on the MNI brain, served as the receptor rich region in the

214 analysis. The cerebellum and putamen ROIs were registered to each subject's 215 T1 image using FSL non-linear registration of the MNI template to each individual 216 subject's T1. T1 images and their associated cerebellum and putamen ROIs 217 were then coregistered to the mean image of all realigned frames in the PET 218 scan using FSL-FLIRT (http://www.fmrib.ox.ac.uk/fsl/, version 6.00). Emission 219 images from the 3 PET scans were merged temporally into a 4D file. To correct 220 for motion during scanning and misalignment between the 3 PET scans, all PET 221 frames were realigned using SPM8 (www.fil.ion.ucl.ac.uk/spm/) to the frame 222 acquired 10 minutes post injection. Model fitting and BP_{ND} calculation were 223 performed using the PMOD Biomedical Imaging Quantification software (PMOD 224 Technologies, Switzerland). Binding potential images represent the ratio of 225 specifically bound ligand ([18F]fallypride in this study) to its free concentration 226 (Fig. 1).

227 Mean BP_{ND} in the striatum, which has the highest concentration of 228 postsynaptic DRD2 in the brain, and the midbrain, the site of dopamine neurons 229 on which presynaptic DRD2 are located, were extracted to test for association 230 with FTO rs9939609. The bilateral midbrain and 3 striatal ROIs (caudate, 231 putamen, and ventral striatum / nucleus accumbens) were drawn in MNI 232 standard space using previously described guidelines (Fig. 1) (Mawlawi et al., 233 2001; Dang et al., 2012), registered to PET images using the same 234 transformations for cerebellum registration to PET images, and thresholded at 235 0.5 after coregistration to exclude voxels on the border that had less than 50% 236 probability of being part of the ROI, thus ensuring high tissue probability for each

- 237 ROI masks. Relations between FTO rs9939609 and BP_{ND} outside the striatum
- and midbrain were examined with an exploratory voxelwise analysis.
- 239

240 Results

241 FTO rs9939609 and food cravings

242 There were 10 AA homozygotes, 40 AT heterozygotes, and 28 TT

243 homozygotes. The allele frequencies were in Hardy-Weinberg equilibrium

244 (χ^2 =0.542, p>0.4). There was no difference in age or gender composition

- between TT homozygotes and individuals carrying at least one A allele.
- 246 Compared to TT homozygotes, A carriers had higher total food cravings score
- 247 (Fig. 2A). We explored the specificity of FTO effects on food cravings by
- examining the role of FTO in each of the nine dimensions of food cravings. At the
- significance level corrected for multiple comparisons of nine dimensions

250 (p<0.006), A carriers scored higher than TT homozygotes on 3 dimensions:

anticipation of relief from negative states and feelings as a result of eating,

having intentions or plans to consume food, and emotions that may be

experienced before or during food cravings or eating. A carriers also scored

higher on 2 other dimensions at the uncorrected significance level (p<0.05):

anticipation of positive reinforcement that may result from eating and thoughts or

256 preoccupation with food. There were trends (p<0.1) for A carriers having higher

257 guilt from cravings and/or for giving into them and lack of control over eating.

258 There was no difference between TT homozygotes and A carriers in responses

to cues that may trigger food cravings and cravings as a physiological state

(Table 1). These results did not change when we controlled for age, gender, andBMI.

262

263 Total food cravings and BMI

264 Total food craving scores positively associated with BMI (β =0.26,

t₇₄=2.236, p<0.05), controlling for age and gender. However, as seen in Figure

266 2B, this association was driven by 3 participants with BMI in the Obese class III

267 category (\geq 40), and was weaker without these 3 participants (β =0.20, t=1.71,

268 p<0.1). Unexpectedly, BMI did not significantly associate with FTO rs9939609

269 (β=0.04, t₇₁=0.324, p>0.7).

270

271 Effects of age on FTO rs9939609 and total food cravings

As expected, food cravings declined with increasing age (r_{76} =-0.28,

p<0.05) (Fig. 3A). Furthermore, age interacted with FTO to predict food cravings

274 (β =0.70, t=2.06, p<0.05). Food cravings declined with age among TT

homozygotes (r₂₆=-0.51, p<0.01), but among A carriers, there was no significant

correlation between food cravings and age (r_{48} =-0.13, p>0.3) (Fig. 3B). Results

277 did not change after controlling for gender and BMI.

278

279 FTO rs9939609 and DRD2 availability

There was no significant difference between TT homozygotes and A carriers in [18F]fallypride BP_{ND} in the midbrain or striatum: caudate, putamen, and ventral striatum (Fig. 4) (Table 1). Voxelwise analysis did not identify any 283 significant difference between TT homozygotes and A carriers in BP_{ND} outside 284 the striatum and midbrain, in addition to confirming the lack of such association in 285 the striatum and midbrain, even at the liberal voxel-level threshold of p<0.001286 uncorrected for multiple comparisons. Sun et al. (2017) proposed that FTO 287 interacts with an obesogenic diet to alter DRD2 function and consequently body 288 weight, suggesting that the relation between FTO and DRD2 might be more 289 discernable among obese individuals. There were 18 subjects with BMI greater 290 than 30 in the present sample. We reanalyzed the data with only these 18 291 subjects and again observed no relation between FTO rs9939609 and DRD2 292 availability in the midbrain or striatum (all p>0.5, all Irl<0.12). [18F]fallypride BP_{ND} 293 declined with age as expected (all r<-0.48, all p<0.00001), but there was no 294 significant interaction of age and FTO rs9939609 on BP_{ND} (all p>0.1, all Irl<0.17). 295 Food cravings did not correlate with [18F]fallypride BP_{ND} in the striatum or 296 midbrain (all p>0.1, all Irl<0.16). Additionally FTO rs9939609 did not significantly 297 interact with [18F]fallypride BP_{ND} in the striatum or midbrain to predict food 298 cravings (all p>0.1, all Irl<0.18). Results controlled for gender and age.

299

300 Discussion

Among individuals spanning the BMI continuum from normal weight to obese, those with at least one FTO rs9939609 obesity-susceptible A allele, relative to TT homozygotes, reported higher food cravings. This relation remained after controlling for BMI, suggesting that FTO rs9939609 influences food cravings independent of individual differences in BMI. These results are 306 congruent with a previous finding that individuals with the A allele reported higher 307 lack of control over eating, which positively correlates with food cravings (Hill, 308 2007; Tanofsky-Kraff et al., 2009). Of the nine dimensions of food cravings, FTO 309 rs9939609 was most strongly associated with emotions (predominantly negative) 310 that may be experienced before or during food cravings or eating, the anticipation 311 of relief from negative states and feelings as a result of eating, and having 312 intentions or plans to consume food. These three dimensions suggest that FTO 313 rs9939609 particularly influences processes that promote food and food seeking 314 behavior as a countermeasure to negative states. Interestingly, the two 315 dimensions not associated with FTO rs9939609 (cravings as a physiological 316 state and cues that may trigger food cravings) are the two dimensions that 317 involve sensory cues, such as external food cues and physiological sensations. 318 This specificity of FTO rs9939609 effects on food cravings suggests that FTO 319 rs9939609 influences the cognitive and motivational, rather than sensory, 320 processes involved in food cravings. The specificity of observed FTO rs9939609 321 effects may explain a previous study's observation of no relation between FTO 322 rs9939609 and response on one question about recent craving frequency 323 (Huang et al., 2014) as this unvalidated generic question may have been too 324 general to capture features of craving related to FTO rs9939609. We note that 325 our suggestion that FTO has less impact on responses to sensory cues in our 326 adult sample stands in contrast to a past finding that the FTO risk allele was 327 associated with parental report of enhanced food responsiveness (eating when 328 food is available) in children (Velders et al., 2012). This may reflect differences in

329 constructs across measures or a developmental difference. Responses to reward
330 mature over development from lower-order sensory processing in subcortical and
331 limbic regions to higher-order processing in frontal cortical brain areas that allow
332 integration of valuation and top-down goal driven behavior (Killgore and
333 Yurgelun-Todd, 2005), and so the impact of FTO may be developmentally
334 specific.

335 Consistent with the extant literature, food cravings declined across 336 adulthood. Our results further demonstrated that FTO rs9939609 interacted with 337 age to predict food cravings. Among TT homozygotes, food cravings declined 338 with age as previously reported. However, among individuals carrying the 339 obesity-susceptible A allele, there was no significant decline in food cravings with 340 age. This preservation of food cravings across adulthood may be specific to 341 craving for fat, rather than protein or carbohydrate, as age-related decline in fat 342 intake has been found significantly reduced among A carriers (Chuang et al., 343 2015). Given the positive association between food cravings and BMI, in our data 344 and as previously shown (Franken and Muris, 2005), these results suggest that 345 individuals carrying the A allele are at risk for larger weight gain over the course 346 of aging as fat mass in the body often increases with age (Ogden et al., 2006). 347 We note that FTO rs9939609 did not associate with BMI in this sample. Genome-348 wide studies found the relation between FTO and BMI by scanning the genome 349 of tens of thousands of subjects, and the effects have been replicated (Loos and 350 Yeo, 2014). It is possible that the lack of effect here just reflects low statistical 351 power, but we cannot rule out that selection biases, such as the requirement that

352 all subjects be medically and psychiatrically healthy, with no contraindications for 353 scanning and willing to participate, may have limited our ability to observe an 354 effect. The lack of an FTO effect on BMI in this sample strongly suggests that 355 FTO effects on craving are not a consequence of differential BMI across groups. 356 We explored the proposal that FTO modulates DRD2 function to influence 357 body weight. Using PET-[18F]fallypride to assess DRD2 availability, we did not 358 observe any significant association between FTO rs9939609 and DRD2 359 availability, nor any relation between DRD2 availability and food cravings. Sun et 360 al. (2017) hypothesized that FTO interacts with an obesogenic diet to alter DRD2 361 function and body weight, suggesting that the relation between FTO and DRD2 362 might be more discernable among obese individuals. We also did not observe 363 any relation between FTO rs9939609 and DRD2 availability among participants 364 with BMI greater than 30. Besides DRD2 availability, there are other 365 characteristics of DRD2 function such as receptor affinity, susceptibility to 366 desensitization, and responsiveness to up/down regulation (Cooper et al., 2003). 367 Our data did not speak to the relation between FTO rs9939609 and these 368 specific aspects of DRD2 function. Additionally, although rs9939609 is the first 369 single nucleotide polymorphism in the FTO gene associated with obesity, other 370 FTO single nucleotide polymorphisms have been linked to obesity since then and 371 it is not known whether other FTO single nucleotide polymorphisms affect DRD2 372 function. Nonetheless, until there is evidence showing FTO effects on DRD2 373 function in humans, the present results suggest caution in translating such 374 effects in mice to FTO function in humans.

375 It is worth noting that our finding of a positive correlation between food 376 cravings and BMI was weaker without 3 Obese class III participants, and that a 377 previous study did not observe a relation between FTO rs9939609 and food 378 craving in obese individuals (Huang et al., 2014). These results suggest that 379 obese subjects may represent a distinct category with different relationships 380 between FTO, food cravings, and BMI. Future studies with sufficient number of 381 obese and non-obese participants would provide clarity. Moreover the present 382 study excluded individuals with major medical conditions including those 383 associated with obesity, such as diabetes. Individuals with obesity-related 384 medical conditions may also represent another category from individuals without 385 these medical conditions in the context of FTO. We additionally note that FTO 386 effects on BMI vary across ethnicities (Loos and Yeo, 2014), and this may impact 387 relations between FTO and food cravings in different ethnic groups. While FTO 388 effect size is similar among individuals of Asian and European descents, the 389 frequency of the FTO obesity-susceptible A allele is much lower among Asians 390 than Europeans. Also, relative to Europeans, African-Americans exhibit lower 391 correlations between different FTO single nucleotide polymorphisms linked to 392 obesity, and this may impact FTO associations with obesity traits (Loos and Yeo, 393 2014). The present study did not have sufficient representation of different ethnic 394 groups to address the role of ethnicity in FTO effects.

395 A clear limitation of this study is the small sample size, which was 396 necessitated by the expense, time, and safety demands of PET imaging.

397 Although this study had the advantage of testing specific hypotheses of FTO

398 function, genomic studies often involve tens, if not hundreds, of thousands of 399 subjects, because single gene effects are typically modest. This naturally 400 suggests caution in interpreting underpowered analyses. Additionally, although 401 the wide age range in this study allowed an examination of age effects on FTO 402 function, it also introduced a variable that might have obscured the ability to 403 detect some FTO effects, which could explain the lack of a relation between FTO 404 rs9939609 and BMI in this study even though this association has been reported 405 by multiple researchers.

406 In conclusion, the present results showed that relative to FTO rs9939609 407 TT homozygotes, individuals with at least one A allele reported greater food 408 cravings, which positively correlated with BMI. A carriers also did not show the 409 typical age-related decline in food cravings, suggesting that they are at risk for 410 larger weight gain over the course of aging as fat mass often increases with age. 411 While these conclusions are limited by the small sample size, and do not indicate 412 the precise mechanism through which FTO influences food craving, we hope that 413 the present findings encourage future studies to examine FTO's impact on food 414 craving in a broader sample.

415

416

- 417 **Conflict of interest**
- 418 All authors report no conflict of interest.

419

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- 424
- 425

426 Figure captions

427

428	Fig 1. [18F]fallypride BP_{ND} images reflecting DRD2 availability. A) Shown are
429	regions of interest from which mean BP_{ND} were extracted for analyses: caudate
430	(blue), putamen (green), ventral striatum (yellow), and midbrain (red). B)
431	Example of a [18F]fallypride BP_{ND} image showing high BP_{ND} in the striatum (top)
432	and midbrain (bottom).
433	
434	Fig 2. FTO, food cravings, and BMI. A) Compared to TT homozygotes, A carriers
435	had higher total food cravings (t_{76} =3.02, p<0.01). B) Food cravings were
436	positively associated with BMI (t ₇₄ =2.236, p<0.05).
437	
438	Fig 3. FTO-age interaction on food cravings. A) Food cravings declined with age
439	across all subjects (r ₇₆ =-0.28, p<0.05). B) Among TT homozygotes, food cravings
440	declined with age (r_{26} =-0.51, p<0.01) (red), but among A carriers, there was no
441	significant correlation between food cravings and age (r_{48} =-0.13, p>0.3) (blue).
442	
443	Fig 4. FTO and DRD2 availability. No significant difference between TT
444	homozygotes and A carriers in [18F]fallypride BP_{ND} in the A) caudate (t ₇₆ =0.33,
445	p>0.5), B) putamen (t ₇₆ =0.51, p>0.5), C) ventral striatum (t ₇₆ =-0.07, p>0.5), or D)
446	midbrain (t ₇₆ =0.62, p>0.5).

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581

	A carriers	TT homozygotes	t ₇₆	p-value	95% CI
Ν	50	28			
Age (yrs)	49.0 ± 18.5	51.6 ± 17.2	0.60	0.551	-5.94, 11.04
Gender	29F	17F	0.23	0.818	
Total craving score	95.3 ± 19.5	80.2 ± 23.8	3.02	0.003**	5.11, 24.98
Planning	8.4 ± 2.3	6.7 ± 2.3	3.10	0.003**	0.60, 2.77
Pos Reinforcement	13.4 ± 3.6	11.2 ± 3.4	2.63	0.010*	0.53, 3.84
Neg Relief	7.2 ± 2.1	5.6 ± 2.1	3.13	0.003**	0.57, 2.58
Lack Control	12.9 ± 4.4	11.1 ± 4.2	1.73	0.088	-0.27, 3.81
Thoughts	13.2 ± 4.4	10.9 ± 4.0	2.31	0.024*	0.32, 4.36
Hunger	11.4 ± 2.8	10.7 ± 2.7	0.98	0.331	-0.67, 1.96
Emotion	9.6 ± 3.4	7.3 ± 3.2	2.88	0.005**	0.70, 3.85
Environment	11.5 ± 3.7	10.1 ± 4.0	1.54	0.127	-0.41, 3.20
Guilt	7.7 ± 2.6	6.6 ± 2.6	1.94	0.056	-0.03, 2.37
Caudate BP _{ND}	13.8 ± 3.6	13.5 ± 3.6	0.33	0.743	-1.42, 1.97
Putamen BP _{ND}	23.2 ± 3.5	22.7 ± 3.8	0.51	0.613	-1.27, 2.13
Ventral striatal BP _{ND}	14.0 ± 2.5	14.0 ± 2.8	-0.07	0.941	-1.25, 1.16
Midbrain BP _{ND}	1.2 ± 0.2	1.2 ± 0.2	0.62	0.540	-0.07, 0.13

Table 1: Demographics, food cravings scores, and [18F]fallypride BP_{ND}

of positive reinforcement that may result from eating; Neg Relief = anticipation of relief from negative states and feelings as a result of eating; Lack Control = lack of control over eating; Thoughts = thoughts or preoccupation with food; Hunger = craving as a physiological state; Emotion = emotions that may be experienced before or during food cravings or eating; Environment = cues that may trigger food cravings; Guilt = guilt from cravings and/or for giving into them

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