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Genetic and neural predictors of behavioral weight loss treatment. A preliminary study

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Abstract

Objective—To examine neural mechanisms of action in behavioral weight loss treatment (BWL) and explore neural and genetic predictors of BWL.

Methods—Neural activation to palatable food receipt and genetics were compared in 17 women with obesity who received 12-weeks of BWL and 17 women who received no intervention. Participants were scanned twice using functional magnetic resonance imaging at baseline and 12 weeks. Weight was assessed at baseline, 12, 36, and 60 weeks.

Results—BWL participants lost more weight than controls at 12 weeks (-4.82 vs. -0.70 %). After 12 weeks, BWL had greater reduction in right caudate activation response to milkshake receipt than did controls. Among BWL participants, baseline to 12 weeks reduction in frontostriatal activation to milkshake predicted greater weight loss at 12, 36 and 60 weeks and possessing the A/A or T/A genotype of the fat mass and obesity–associated (FTO) variant rs9939609 predicted greater weight loss at 12 and 36 weeks.

Conclusions—These preliminary data reveal that reduction in right caudate activation may be a neural mechanism of weight loss in BWL and baseline FTO variant and reduction in frontostriatal activation during BWL predict short- and long-term weight loss. These findings require replication in larger samples.

Keywords

fMRI; taste; obesity; behavioral weight loss treatment; FTO

Introduction

There are very few neural and genetic predictive biomarkers of weight loss. We explored two potential biomarkers of response to behavioral weight loss (BWL): neural response to palatable food receipt and a genotype found to predict better outcome in BWL interventions¹.

A weight loss of >5% body weight is associated with clinically significant improvements in cardiovascular and metabolic functioning and adiposity in individuals with overweight and obesity²⁻⁴. BWL results in clinically significant weight loss of up to 10% of initial weight⁵. Despite being the most commonly used intervention for obesity, little is known about the neural changes associated with BWL or whether these neural changes and baseline genetic factors predict BWL response.

The three fMRI studies examining the effects of BWL, have examined anticipatory neural responses using food picture paradigms (excluding cued learning tasks) $6-8$ (Table 1). Greater baseline activation in the putamen, insula, and hippocampus and in visual regions in response to high-calorie food pictures predicted less weight loss at 9-months⁶. To our knowledge there are no studies examining neural responses to palatable food receipt. This is important as food receipt and food anticipation picture paradigms may be associated with

different patterns of neural activation^{9,10}. This study is focused on understanding palatable taste receipt, without anticipatory visual responses to food pictures. In addition, this study controls for the potential confound of sex differences^{11–15} by only using female participants.

Prospective, observational studies examining neural response to palatable food receipt suggest that frontostriatal circuit activation^{16,17} is associated with weight gain over time. The frontostriatal circuit includes the dorsal and ventral striatum, midbrain, amygdala, and orbitofrontal cortex, putamen, insula, precuneus, and thalamus, which are involved in reward processing. The frontostriatal circuit is also comprised of regions implicated in cognitive control, including the ventrolateral prefrontal cortex and inferior frontal gyrus. These studies also suggest that the relationship between weight change and caudate activation response to food pictures may be moderated by the A1 allele of the TaqIA single nucleotide polymorphism (SNP) near the DRD2 gene^{16,18,19}. However, how changes in neural response to food stimuli and genotype predict weight loss in BWL are unclear.

The fat mass and obesity–associated (FTO) gene is among the most robustly associated with BMI, across different ancestries $8,20-23$. FTO may regulate obesity risk through macronutrient intake²² and attenuated satiety response⁴. A recent meta-analysis of 10 BWL trials (total $n=6.951$) found that those possessing the obesity-predisposing A allele (A/A or T/A genotype) of the FTO single nucleotide polymorphism (SNP) rs9939609 show almost twice the amount of weight loss as those with the T/T genotype¹. Although fMRI studies assessing FTO are limited, in European males with a range of BMIs, the A/A vs. T/T genotype at rs9939609 was associated with increased frontostriatal circuit activation to highvs. low- calorie food images²⁴. Together, these data suggest the importance of considering FTO genotype within both fMRI studies assessing response to food stimuli and studies of BWL.

This pilot trial examines changes in frontostriatal circuit response to palatable food receipt among women with obesity before and after 12 weeks of BWL compared to a control group who did not receive BWL. All participants were scanned at baseline and at 12 weeks. We anticipated greater weight loss in the BWL group at 12 weeks and that BWL participants would show greater reductions in frontostriatal activation in response to palatable food receipt at 12 weeks compared to controls. Finally, we explored the contribution of both neural response to palatable food receipt and possession of the A allele of the FTO SNP rs9939609 within BWL participants on weight loss from baseline to 12, 36, and 60 weeks; 12 to 60 weeks, 12 to 36 weeks and 36 to 60 weeks.

Materials and methods

Participants

Participants were recruited using flyers and local newspaper advertisements. Exclusion criteria were: tobacco or drug use in the last year, current Axis I or II disorder²⁵; diabetes, blood pressure>140/9026, kidney or liver disease, history of serious neurological event; use of psychotropic or asthma medication or appetite suppressant or weight loss medication within the last year; pregnancy, breastfeeding or specific dietary needs; or contraindications to the fMRI protocol such as claustrophobia and metal implants. No participants met criteria

for any obesity-related endocrine disorders. Control participants were required to agree to not participate in any weight loss program during the study. Initially 22 women with obesity or overweight were recruited for BWL and 19 female controls. Three BWL participants dropped out of the study and two BWL participants and two control participants were excluded from analysis due to excessive head motion. Thus, 17 BWL and 17 control participants completed two scans. The average age of the sample was 41 years. The majority of participants were African-American, single, professional with at least a college education (Table 2). There was a significant difference in BMI between the BWL and the control group $(m=32.2 \text{ vs. } m=28.5, p=0.04)$. There was no difference between groups in race and ethnicity status or age.

Procedure

Participants were phone-screened for eligibility. After giving informed consent participants completed a clinical diagnostic interview, a medical health screen review and their weight and height was measured. At a second session, participants completed further interviews, underwent a mock scan and donated saliva for DNA testing. Participants were scheduled for an fMRI session within the two weeks before starting BWL and within two weeks after ending BWL. There were no differences in the days between scans for the BWL and control groups $(t/32)=0.21$, $p\lt 0.83$, control: $m=85$ sd=17; BWL $m=81$, sd=46). The weights of BWL and control participants were assessed at baseline, end of treatment or after 12-, 36- and 60 weeks post-baseline. All procedures were reviewed and approved by the Temple University Institutional Review Board.

Behavioral weight loss treatment (BWL)

BWL sessions were 90 minutes and led by a registered dietitian or a clinical psychologist. Groups of ten to twelve met weekly for 12 weeks. BWL involved goal setting, cognitive restructuring, self-monitoring, stimulus control, and physical activity⁵. Dietary intake goals were 1200–1500 kcal/day. Physical activity goals were four 20-minute sessions per week starting at week 4, progressing to four 40-minute sessions by week 12.

Genetic assessment and analysis

Saliva specimens were collected at baseline using Oragene Discover collection kits. Samples were genotyped through Oragene GenoFind Services. The SNPs were analyzed using a TaqMan single tube genotyping assay. The TaqMan assay is an allele discrimination assay using PCR amplification and a pair of fluorescent dye detectors that target the SNP. One fluorescent dye is attached to the detector that is a perfect match to the first allele (e.g. an "A" nucleotide) and a different fluorescent dye is attached to the detector that is a perfect match to the second allele (e.g. a "C" nucleotide). During PCR, the polymerase releases the fluorescent probe into solution where it is detected using endpoint analysis in an Applied Biosystems, Inc. (Foster City, CA) 7900HT Real-Time instruments. Primers and probes were also obtained through Applied Biosystems. The triallelic haplotype for rs9939609, rs1421085, and rs17817449 were determined using the TaqMan single tube genotyping assay results in conjunction with "Haploview" and additional haplotyping bioinformatics software.

fMRI assessment

All participants fasted 8 hours prior to their scans at baseline and 12 weeks. Immediately prior to the scan, participants were screened for pregnancy (HCG Pregnancy Midstream Test) and breathalyzed for recent use of alcohol (BACtrack Special S70), and saliva-tested for use of cocaine, cannabis, opioids and amphetamines (Discover 4 Panel Oral Fluid Cassette). Fasting blood glucose levels were assessed to document fasting.

Stimuli Presentation

During the scan, participants were presented with a food receipt task. Chocolate milkshake, tasteless solution, and wash were administered via programmable syringe pumps (Braintree Scientific BS-8000) to participants while in the scanner using teflon tubing inserted through a wave guide into the scanning room. Stimuli¹⁸ consisted of the presentation of two runs of six conditions, each presented four times per run in a mixed event-related block design. The six conditions were (1) milkshake picture, (2) water picture, (3) milkshake picture concurrent to milkshake taste, (4) water picture concurrent to tasteless solution, (5) milkshake taste, and (6) tasteless solution. Participants received wash after each taste administration. Any liquid administration alone occurred at the same time a crosshairs was presented to avoid conflation of visual with food receipt response. During intervals between conditions, a crosshair was presented for a random period ranging from 2–10 sec.

MRI Data Acquisition

Structural and functional MRI data were collected using a Siemens 3-Tesla Verio (Siemens, A G, Erlangen, Germany) scanner using a standard 12-channel head coil, at Temple University Magnetic Resonance Imaging Center. Scanning parameters optimized the BOLD signal while maintaining a sufficient number of slices to acquire whole-brain data. Data was acquired using a two-shot z-shim EPI sequence¹ that enables compensation of local magnetic field inhomogeneities in high susceptibility regions^{27,28}. Calibration of the z-shim settings were determined as described previously²⁹. Prior to functional scanning, a highresolution T1-weighted 3D structural volume was collected from each participant (MPRAGE, TR=1,600ms, TE=2.46ms, flip angle= 9° , matrix size= $256 \times 256 \times 176$ mm, field of view=252mm², slice thickness=1mm, 176 slices gathered in ascending order) for accurate slice prescription. Next, BOLD functional images were acquired with a T2* weighted double-shot z-shim echo planar imaging sequence and covered 52 descending axial slices (TR=3,020ms, TE=20ms; flip angle=90°, bandwidth=2,232 Hz/pixel, matrix size= $80 \times 80 \times 52$ mm, field-of-view= 240 mm², slice thickness= 2.5 mm, distance factor=20%, 188 volumes).

fMRI Data Analysis

Data were preprocessed using SPM12 <http://www.fil.ion.ucl.ac.uk/spm/software/spm12/>. After using a field map, functional images were realigned and unwarped. Functional images were coregistered to the high-resolution T1-weighted images, then segmented and spatially normalized to standard Montreal Neurological Institute brain space and spatially smoothed

¹The EPI pulse sequence provided by the Functional Neuroimaging Laboratory at Brigham and Women's Hospital

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using a three-dimensional Gaussian kernel of $6 \times 6 \times 5$ mm full-width at half-maximum, resulting in a resampled in-plane resolution of $3 \times 3 \times 3$ mm voxels. We utilized Artifact Detection Tools (ART; [https://www.nitrc.org/projects/artifact_detect/\)](https://www.nitrc.org/projects/artifact_detect/) to create motion outlier and movement regressors for the first-level analyses. Any participant was removed if the data were revealed excess motion, defined as >20% of the data being outliers (i.e., global signal exceeded 9.0 and scan-to-scan movement exceeded 2mm and/or rotation exceeded 1 radians).

Participant-level analyses were performed using general linear modelling implemented in SPM12. For each participant, the regression model consisted of regressors representing the stimulus condition, convolved with the canonical hemodynamic response function six motion parameters to account for motion and regressors to account for outliers detected with ART.

This preliminary study tested if changes in frontostriatal activation to palatable food receipt from baseline to 12 weeks differed between the BWL vs. control group. Given this is the first fMRI study assessing neural changes in response to palatable taste receipt before and after BWL, we first assessed changes in all the regions of the brain (whole-brain analyses) rather than in specific brain regions (region-of-interest analyses). For the group-level analyses, whole-brain effects were examined using a 2×2 ANCOVA model controlling for baseline BMI to reveal any main effects for Treatment (BWL / control), Time (baseline / 12 weeks) and a Treatment group \times Time interaction. To understand any interaction effects yielded, a mask was generated including the clusters where the interaction effect was significant. Post-hoc contrasts were estimated using this mask as a region of interest for evaluating specific contrasts for each Treatment group per Time point.

Given that this was a preliminary study (see Supplementary for the power yielded and the sample estimate for future trials), we used an uncorrected $p<0.001$, with a cluster threshold of 3 for the 2×2 ANCOVA controlling for baseline BMI. For follow-up post-hoc contrasts, we used a family-wise error (FWE) rate corrected $p \lt 0.01$ to correct for multiple comparisons. Our contrast of interest was the milkshake taste vs. crosshairs contrast, which does not conflate the effects of anticipatory visual responses to food and was the most basic contrast assessing palatable food receipt available. Secondary contrasts examined were milkshake taste vs. tasteless; milkshake picture and milkshake taste vs crosshairs; and milkshake picture and milkshake taste vs tasteless.

To explore the prediction of weight loss within the BWL group, we first entered eigenvariates yielded from the 2×2 ANCOVA interaction into a principal components analysis (PCA) to derive fewer components to enter as predictors. Component scores were used as neural predictors of weight loss. For the FTO genotype predictor, A/A and T/A of the FTO rs9939609 were coded 0 while the T/T genotype was coded 1 because a metaanalysis of behavioral weight loss interventions showed that carriers of the FTO A/A and T/A genotypes have greater weight loss than those with the $T/T¹$. The neural and genotype predictors were simultaneously entered into separate hierarchical linear regressions predicting weight loss in BWL from baseline to: 12-, 36- and 60-weeks post-baseline, and

from 12 to 36, 12 to 60 weeks and 36 to 60 weeks. Percentage weight loss was chosen as the dependent variable to allow for control of baseline weight.

Results

Weight loss at 12-, 36-, and 60-weeks

There was significantly greater weight loss in the BWL group compared to the control group after 12 weeks (Table 3). Among the BWL participants, 59% lost $> 5\%$ or more of their body weight by 12 weeks compared to 12% among controls $(\chi^2(1)=8.24, p=.004)$. Although BWL participants had weight losses that exceeded 5% and were double that of controls at 36 and 60 weeks, the differences were not statistically significant possibly due to the small sample size (Table 3).

Neural response to milkshake taste from baseline to 12-weeks in BWL vs. control (N=34)

Controlling for baseline BMI, whole brain analyses of the milkshake taste vs crosshairs contrast showed a significant main effect of Time and a significant Treatment \times Time interactions in the 2×2 ANCOVA (Table 4). When BMI was not controlled for in the same analysis, results were similar.

Post-hoc comparisons were then conducted to assess the direction of the significant interaction effects found in the 2×2 ANCOVA (Table 4). These comparisons showed that there was greater activation in the right caudate, right medial prefrontal cortex and right central sulcus and right orbitofrontal cortex in the BWL group at baseline compared to the control group. From the baseline fMRI scan to the 12-week scan, all these regions showed a reduction in activation in the BWL group relative to the control group, a reduction that occurred during significant weight loss in the BWL group relative to the control group. However, for these four regions, only the results for the right caudate met a more stringent thresholding criteria of $p<0.01$ FWE-corrected. There was greater right caudate activation in the BWL group compared to the control group at baseline in response to milkshake receipt and reduced activation in this region in the BWL group from baseline to 12 weeks where p_{\sim} . 01 FWE-corrected (Figure 1, Table 5). While right medial prefrontal cortex, right central sulcus and right orbitofrontal cortex activation showed similar differences and changes, these were not significant at this threshold, which may have resulted from limited power.

We also examined if there were main effects for a milkshake picture and milkshake taste vs. crosshairs, milkshake picture and taste vs. tasteless and milkshake taste vs tasteless ($p < 001$) uncorrected, k_F =3 voxels, Supplementary Tables 1–3). Follow-up contrasts for these analyses were not significant where $p<.01$, FWE-corrected.

Exploration of genetic and neural moderators of weight loss outcome in BWL (N=17)

The Treatment by Time interaction was associated with neural activation in seven regions. Bivariate correlations between these regions are presented in Table 6. The PCA identified two components: one which maps onto the frontostriatal circuit^{30–32} comprised of the right orbitofrontal cortex, the right caudate, right insula and the left insula, and the other with

regions less understood but currently not associated with the frontostriatal circuit (left uvula, right central sulcus, right middle temporal gyrus, Table 6).

Within the BWL group, greater frontostriatal and other region activation to milkshake receipt and the A/A or T/A versus the T/T genotype for FTO rs9939609 predicted greater 12-week weight loss (Table 7). Similarly, greater frontostriatal activation to milkshake receipt and A/A or T/A versus the T/T genotype for FTO rs9939609 predicted greater 36 week weight loss. Only greater frontostriatal activation to milkshake receipt predicted greater 60-week weight loss. Neither neural activation nor FTO genotype predicted weight loss between 12 to 36 weeks, 12 and 60 weeks and 36 to 60 weeks in BWL.

Discussion

Our findings suggest that BWL treatment leads to reduced activation of the right caudate in response to palatable food receipt in women with obesity. Using the decoding analysis in Neurosynth²⁴(see Supplementary), the two latent topics most strongly linked to the right caudate are 'reward' and 'eating'. The caudate has been implicated in the development and maintenance of habitual overeating²¹ without pleasure³³. A prospective non-intervention study³⁴ also found activation of the caudate to palatable food receipt was predictive of longterm weight change. BWL may serve to interrupt patterns of overeating marked by a lack of enjoyment.

In addition to the right caudate findings, the right medial prefrontal cortex, right central sulcus and the right orbitofrontal cortex showed reduced activation in response to milkshake receipt in BWL relative to control from baseline to 12 weeks. Using food picture paradigms, a previous study⁶⁷ showed that BWL is associated with greater reductions in right medial prefrontal cortex activation. Reduced orbitofrontal cortex response has been observed in examination of palatable taste receipt after gastric bypass³⁵ suggesting that weight loss may alter the reward value of palatable foods 23 .

Similar to findings with food picture paradigms⁶, we found differential changes in the insula between the BWL group and control group over 12 weeks in response to combined milkshake picture and milkshake taste relative to crosshairs. However, these findings were not significant when we probed the direction of activation.

Unlike previous findings, changes in activation in the putamen or hippocampus did not predict follow-up weight loss⁶. This may be due to methodological and sampling differences. Unlike previous studies, the current study enrolled only female participants^{12–15}. In addition, this study examined neural responses to food receipt rather than food pictures in BWL. Notably there may be differential neural responses to food pictures compared to food receipt have been reported previously^{9,10}.

The current study explored the predictive value of neural and FTO responses to BWL. Greater reductions in frontostriatal circuit activation (right medial prefrontal cortex, right orbitofrontal cortex, right caudate, and left insula) to palatable food receipt from baseline to 12 weeks among BWL participants predicted greater weight loss up to one year after BWL. We also found that possession of the A/A or T/A rather than the T/T genotype of the FTO

rs993960 predicted greater weight loss at 12 weeks and at 36-weeks follow-up. This provides further evidence that this genotype may be important for BWL treatment success. A sizeable amount of the variance in both short- and long-term weight loss was accounted for by both baseline FTO and baseline to 12-week reduction in frontostriatal activation at 12 (73%) and 36 (60%) weeks, and by baseline to 12-week frontostriatal activation at 60 weeks (52%)(Table 7). However, the sample size was too small to test for interactions between genotype and neural response or covary for baseline variables like ancestry. Replication and testing of this interaction with more covariates is needed in larger samples.

Limitations of the current study include small sample size. The relatively small cluster sizes of the regions (e.g., right caudate), discovered to change differentially over time with treatment, may have resulted from the lack of power. The design would have been improved by randomizing participants to treatment or control to minimize any baseline differences between groups. Strengths of the study include a socio-economically diverse sample, eliminating confounding of sex, and examining long-term follow-up. The study is also notably diverse, including nearly 60% African American, a group disproportionately affected by obesity³⁶ and for whom current interventions including $BWL^{37,38}$ appear less effective.

To our knowledge, this is the first trial to examine neural response to food receipt in the context of BWL treatment and the first to examine both neural and genetic predictors of weight loss and maintenance. Additional long-term examination of the FTO gene and neural responses to palatable food receipt is needed in larger samples and across ancestries. Given the cluster sizes found in this preliminary study, there is a risk of Type 1 error and future studies may use whole-brain multiple comparisons correction based on cluster size such as AlphaSim or ClusterSim or FDR. Examination of predictors of weight loss at longer followup periods is also needed³⁹.

There are few biomarkers of weight loss for BWL interventions. However, the current study suggests BWL may be particularly effective for individuals with the FTO A allele and those with greater frontostriatal reduction in response to food receipt during treatment. This preliminary finding requires replication but may add to our understanding of how precisionbased medicine strategies⁴⁰ may be useful in the treatment of obesity.

Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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What is already known about this subject?

• Previous studies suggest that increased frontostriatal response to food pictures predict weight loss outcome in behavioral weight loss treatment and a metaanalysis showed that possession of the A/A or T/A genotype of the FTO variant rs9939609 may be associated with better outcome in behavioral weight loss interventions.

What does your study add?

- **•** We found that greater reduction in right caudate activation in response to palatable food receipt occurred over 12-weeks of behavioral weight loss treatment compared to control.
- **•** Reduction in frontostriatal activation from baseline to 12-weeks of behavioral weight loss treatment predicted weight loss at 12, 36 and 60 weeks.
- **•** Presence of the A/A or T/A genotype of the FTO variant rs9939609 predicted weight loss in behavioral weight loss treatment at 12 and 36 weeks.

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Figure 1.

Regions associated with differential fMRI BOLD response to milkshake taste in Behavior Weight Loss (BWL) compared to control from baseline to 12-weeks post-baseline ($N = 34$). a: Regions associated with differential change between the BWL and Control groups over time where $p < .01$ FWE-corrected. Colored bar represents Z score values. Areas are as described in Table 5.

b: Right caudate response comparing BWL and control groups at baseline and 12 weeks. Eigenvariate values show greater activation at baseline in BWL at baseline compared to control and greater activation in BWL at baseline compared to BWL at 12 weeks. Error bars represent +/− 1 standard error.

c and d: Cohen's d and 90th percentile CI of the size of the effect of right caudate activation in BWL at baseline compared to control (Figure 1c) and between baseline BWL and 12 weeks BWL (*Figure 1d*).

Table 1

Behavioral weight loss intervention studies using pre-post fMRI and food stimuli^a

 ${}^{\text{a}}$ Whole brain analyses only

 b
ACC = anterior cingulate cortex, mPFC = medial prefrontal cortex, and IPL = inferior parietal lobule

Demographic and clinical characteristics of participants $(N = 34)$ at baseline. $N = 34$) at baseline. Demographic and clinical characteristics of participants (

 2 Note that no participant self-identified as American-Indian / Alaska Native, Native Hawaiian / Other Pacific Islander or other. Note that no participant self-identified as American-Indian / Alaska Native, Native Hawaiian / Other Pacific Islander or other.

 $\boldsymbol{b}_{\text{Controlled by medication for at least one year}}$ Controlled by medication for at least one year

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 $c_{\mbox{\footnotesize\sc Pet}}$ Rank Percentile Rank

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Table 3

Changes in weight from baseline to 12, 36, and 60 weeks in behavioral weight loss (BWL) and control groups

^a Four participants weights could not be assessed in person at 36 weeks and one participant's weight could not be assessed at 60 weeks.

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Table 4

fMRI BOLD response to milkshake taste vs crosshairs. Main effects and interaction effect of the 2 (Treatment Group) × 2 (Time) ANCOVA controlling fMRI BOLD response to milkshake taste vs crosshairs. Main effects and interaction effect of the 2 (Treatment Group) × 2 (Time) ANCOVA controlling for baseline body mass index ($N=34$) for baseline body mass index (

× \mathbf{x}^a $\mathbf{p}(\mathbf{unc})$ Peak **sphere k F Z p(unc) Hemi Peak Peak Peak** Peak $\overline{\mathbf{N}}$ Peak \mathbf{r} \geq sphere Hemi

 $\overline{}$

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Threshold:

 $p < .001$, k

 $\Xi =$

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 $\mathbf{R} = \text{right}, \, \mathbf{L} = \text{left};$ R = right, L = left;

 $k =$ cluster size in voxels $k =$ cluster size in voxels Note that 5 voxels of the L precuneus and 5 voxels of the L hippocampus were contained within the cluster of 39 voxels of the L thalamus. Four voxels of the R caudate were contained within the cluster of Note that 5 voxels of the L precuneus and 5 voxels of the L hippocampus were contained within the cluster of 39 voxels of the L thalamus. Four voxels of the R caudate were contained within the cluster of 8 voxels of the R Medial Prefrontal Cortex. We used WFUPickAtlas within Xjview (http://www.alivelearn.net/xjview) for neuroanatomical labelling. 8 voxels of the R Medial Prefrontal Cortex. We used WFUPickAtlas within Xjview (<http://www.alivelearn.net/xjview>) for neuroanatomical labelling.

Peak $Z = Z$ value of the peak of the cluster Peak F= F value of the peak of the cluster Peak $Z = Z$ value of the peak of the cluster Peak F= F value of the peak of the cluster

Peak p (unc) = Peak p (uncorrected) Peak p (unc) = Peak p (uncorrected) ax, y, z coordinates are in Montreal Neurological Institute space.

 $b_{\rm O}$ effect met the threshold

No effect met the threshold

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Table 5

Regions associated with differential fMRI BOLD response to milkshake taste in Behavioral weight loss compared to control from baseline to 12-weeks Regions associated with differential fMRI BOLD response to milkshake taste in Behavioral weight loss compared to control from baseline to 12-weeks $(N = 34)$

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The direction of change from baseline to 12 weeks in fMRI BOLD response to milkshake taste vs crosshairs in the regions associated with differential change between the BWL and control groups.

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Table 6

Correlations between regions that changed differentially over time in BWL compared to control and the results of the multivariate principal components Correlations between regions that changed differentially over time in BWL compared to control and the results of the multivariate principal components analysis of these regions $(N=34)$. analysis of these regions (

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Table 7

Hierarchical linear regressions using FTO genotype and right caudate activation response to milkshake taste to predict % weight loss (Kg) after Hierarchical linear regressions using FTO genotype and right caudate activation response to milkshake taste to predict % weight loss (Kg) after Behavioral weight loss (BWL) where N=17. Behavioral weight loss (BWL) where N=17.

 \overline{a}

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Other regions −0.45 2.91 −1.76 0.11

FTO rs9939609. Coded with A/A as the reference group. A/A and T/A = 0, T/T = 1. We report the number of participants with A/A or T/A out of the total number of participants analyzed. FTO rs9939609. Coded with A/A as the reference group. A/A and T/A = 0, T/T = 1. We report the number of participants with A/A or T/A out of the total number of participants analyzed.

% Weight in Kg lost = [(Weight in kg at later assessment time – Weight in Kg at baseline)/ baseline BMI] * 100%.

% Weight in Kg lost = [(Weight in kg at later assessment time – Weight in Kg at baseline)/ baseline BMI] * 100%