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Reward function as an outcome predictor in youth with mood and anxiety symptoms

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Abstract

Background: Adolescent depression varies considerably in the course. However, there are no biobehavioral predictors of illness trajectories, and follow-up studies in depressed youth are sparse. Here we sought to examine whether reward function would predict future clinical outcomes in adolescents with depressive symptoms. We utilized the reward flanker fMRI task to assess brain function during distinct reward processes of anticipation, attainment and positive prediction error (PPE, i.e. receiving uncertain rewards).

Methods: Subjects were 29 psychotropic-medication-free participants with mood and anxiety symptoms and 14 healthy controls (HC). All had psychiatric evaluations at baseline and approximately 24-month follow-up. Thirty-two adolescents (10 HC) had usable fMRI data. Correlation and hierarchical regression models examined symptom severity as predictors for follow-up clinical outcomes. Whole-brain analyses examined the relationships between neural reward processes and follow-up outcomes.

Results: Clinically, anhedonia, but not irritability, predicted future depression and suicidal ideations. Among reward processes, only neural activation during PPE was correlated with future depression and anhedonia severity. Specifically, activation in the left angular gyrus—a component of default mode network—was associated with future depression, while activation in the dorsal anterior cingulate, operculum and left insula—key regions within the salience and pain networks—was associated with future anhedonia, even when controlling baseline anhedonia.

Author Contributions

QL performed data processing, statistical analyses, interpreted results, and prepared the manuscript. BAE assisted with data processing, result interpretation and manuscript preparation. JJS assisted with manuscript preparation. CMA conducted clinical evaluations of participants. ERS designed the RFT task. VG designed and executed the study, interpreted results, and prepared the manuscript. All authors contributed to and have approved the final manuscript.

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Declaration of Competing Interest

The authors declare no conflict of interests.

Limitations: Small sample size and variability in follow-up intervals limit the generalizability of conclusions.

Conclusions: This research suggests the anhedonia and reward dysfunction may predict a worse course in adolescent depression. The adolescents with anhedonia should be monitored more carefully for a longer period.

Keywords

adolescent depression; anhedonia; reward function; fMRI

Introduction

Adolescent depression is a devastating illness associated with significant morbidity, particularly suicide, the second leading cause of death in this age group (Heron, 2018; Whiteford et al., 2013). Importantly, adolescent depression varies considerably in course and severity, wherein some depressed youths fully recover, while others have a more severe and persistent illness or relapse in adulthood despite successful initial treatment (Andersen and Teicher, 2008; Birmaher and Axelson, 2006). For example, the multisite longitudinal NIMH “Treatment for Adolescents with Depression Study (TADS)” documented depression recurrence in 47% of remitted patients and 67% of non-responders among 196 participants (Curry et al., 2011). Other longitudinal studies have also found that only 37% of depressed adolescents will not experience a relapse in adulthood (Weissman et al., 1999). At present, there are no reliable bio-behavioral predictors of illness trajectory for adolescent depression.

One challenge is the heterogeneity of depression, which has impeded the development of reliable biomarkers. To address this obstacle, our laboratory and others have examined dimensions of behavioral symptoms instead of solely investigating outcomes based on categorical DSM diagnoses such as depression. We previously found that adolescents with moderate-to-severe depression exhibited a wide severity range of anhedonia and irritability, core symptoms of adolescent depression, emphasizing the importance of studying inter-individual differences in symptom severity (Gabbay et al., 2015). Additionally, only anhedonia, but not irritability, was associated with worse outcomes, including suicidality and chronicity (Gabbay et al., 2015). As anhedonia reflects deficits in reward function, these findings suggest that impaired neural reward activity may contribute to the maintenance of depression in youth. Indeed, a recent meta-analysis of fMRI and EEG studies in depression documented that reward system alterations preceded the onset of depression in adolescents (Keren et al., 2018b). Importantly, reward function is a complex construct involving reward anticipation, attainment and valuation phases (Lambert et al., 2018; Rømer Thomsen et al., 2015). Though longitudinal imaging studies remain sparse, a handful have suggested reduced fMRI brain activation during both reward expectation and reward attainment as predictors for future depression in non-depressed adolescents (Morgan et al., 2013; Stringaris et al., 2015). Moreover, a pair of recent EEG studies based on a large sample of 444 healthy 13–15 year old girls reported that blunted reward positivity and reduced delta band amplitude during reward attainment predicted future depressive symptoms (Nelson et al., 2018; Nelson et al., 2016). However, to date, no longitudinal studies have attempted to

investigate multiple reward processes as predictors of outcomes in adolescents with depressive symptoms at baseline.

Building upon these observations, we sought to examine whether neural activation during the distinct reward processes would predict future clinical outcomes in depressed adolescents and healthy controls. To probe reward circuitry, we utilized the Reward Flanker Task (RFT; Bradley et al., 2017), which is a combination of the Monetary Incentive Delay (Knutson et al., 2000) and Flanker (Eriksen and Eriksen, 1974) tasks that allows the assessment of brain function during reward expectancy (i.e. anticipation of a reward), reward attainment (i.e. receiving a reward) and positive prediction error (i.e. receiving an unexpected/uncertain reward). The primary outcome measure was overall depression severity, while anhedonia severity was a secondary outcome that more directly reflects reward deficits. As reward function is highly relevant to many psychiatric conditions (Sharma et al., 2017), we adopted a Research Domain Criteria (RDoC) approach (Insel et al., 2010) in this pilot study and recruited a diverse sample of adolescents with mood and anxiety symptoms, as well as healthy controls. The inclusion of healthy controls was not for the purpose of group comparison, but rather allowing us to examine a full range of symptom severity and a larger variability of reward functions. As anhedonia has been associated with suicidal behavior, we further explored measures of reward function as predictors for future suicidal ideations. In line with our previous work (Gabbay et al., 2015), irritability severity was also examined as a predictor for clinical outcomes as it represents another core symptom of depression in youth. Based on prior findings, we hypothesized that anhedonia severity and all three RFT-derived measures of neural reward processes at baseline would predict anhedonia severity as well as clinical outcomes of depression, and suicidality severity at follow-up.

Methods

Participants

Participants consisted of 43 youths (age, $M \pm SD$: 14.91 ± 2.10 , range: 12–20 years; 26 females), of whom 29 participants were with diverse mood and anxiety symptoms and 14 were healthy controls (HC) with no significant presentation of psychiatric symptomatology or history of mental illness at the first visit. Participants were recruited from the New York metropolitan area through the Mount Sinai Child and Adolescent Psychiatry Outpatient Clinic, physician referrals, and advertisements in the community. Clinical follow-up averaged at approximately 2 years ($M \pm SD$: 21.05 ± 10.91 , range: 11–61 months). This follow-up study builds on our earlier cross-sectional studies examining a broad range of psychiatric conditions in youth. We invited back clinical subjects with a primary presentation of mood and/or anxiety symptoms as well as healthy controls (HC); clinical subjects with a primary presentation of externalizing disorder symptoms were not included. Approximately 67% of eligible subjects from our original cross-sectional cohort ($N = 64$) participated in this follow-up study. Depression severity and demographic characteristics did not differ between eligible participants and non-participants.

A subset of 32 youth (age, $M \pm SD$: 14.88 ± 2.08 , range: 12–20 years; 19 females) performed the RFT at baseline with usable MRI data collected. The remaining 11

participants were not included due to incomplete MRI acquisition ($n = 5$) and over 25% unusable runs ($n = 6$). Among the 32 included participants, 22 presented mood and anxiety symptoms and 10 were HC. Clinical data and demographics are compiled in Table 1.

The Institutional Review Board (IRB) at Icahn School of Medicine at Mount Sinai approved the study, and written informed consent was obtained from participants age 18 and older; those under the age of 18 provided signed assent, and a parent or legal guardian provided signed informed consent.

Inclusion and exclusion criteria

Inclusion criteria: Healthy controls did not meet criteria for any lifetime psychiatric disorder at baseline and were psychotropic-medication naive. Subjects within the mood and anxiety group presented with mood and/or anxiety symptoms, either above or sub- threshold, based on clinical diagnosis.

Exclusionary criteria for all subjects included: 1) any physical or neurological conditions; 2) a low IQ (< 80) as assessed by the Kaufman Brief Intelligence Test (KBIT; Kaufman, 1990); 3) For those enrolled at the fMRI study additional exclusionary criteria included MRI contraindications, a positive drug toxicology at the day of the scan, and a positive pregnancy test in females. Mood and Anxiety group: additional exclusionary criteria included 1) current psychosis, pervasive developmental disorder, and substance abuse disorders; 2) use of any psychotropic medications at baseline visit for at least a month (3 months for medications with long half life time). However, psychotropic medication use was allowed at follow-up study.

Clinical assessments

All clinical assessments were conducted both at baseline and follow-up visits.

Clinical diagnostic procedures: All participants were assessed using the Schedule for Affective Disorders and Schizophrenia for School-Age Children–Present and Lifetime Version (KSADS-PL; Kaufman et al., 1997). A board-certified child/adolescent psychiatrist or a licensed clinical psychologist trained in administering the KSADS-PL carried out the diagnostic evaluation, with the final clinical report discussed between the Primary Investigator (a licensed child/adolescent psychiatrist) and the assessor.

Depression severity was measured by the clinician-rated Children’s Depression Rating Scale-Revised (CDRS-R; Poznanski et al., 1985) administered to the participant—as well as a parent when the participant was under the age of 18, with a score range of 17 to 113. The self-rated Beck Depression Inventory-Second Edition (BDI-II; Beck et al., 1996) was also collected but not directly used in analyses.

Anhedonia severity was assessed using the self-rated Snaith-Hamilton Pleasure Scale (SHAPS; Snaith et al., 1995), a 14 item scale constructed to minimize age, sex, and cultural influences, with a total score range of 14 to 56. The SHAPS is widely used and has been validated in children and adults (De Berardis et al., 2013; Farabaugh et al., 2015). In addition, a secondary measure of anhedonia severity was derived from answers to specific

items on the clinician-rated CDRS-R and the self-rated BDI-II in order to have comparable measures for both anhedonia and irritability (see below). This approach has been used by our group and other laboratories (Gabbay et al., 2012a; Gabbay et al., 2013; Gabbay et al., 2015; Gabbay et al., 2012b; Henderson et al., 2013; McMakin et al., 2012). Specifically, anhedonia was measured based on the sum of one item from the CDRS-R (item 2: “Difficulty having fun,” rated 1–7) and two items from the BDI-II (item 4: “Loss of pleasure,” rated 0–3, and item 12: “Loss of interest,” rated 0–3), yielding a total score range of 1 to 13.

Suicidality severity was assessed by the 19 items self-rated Beck Scale for Suicide Ideation (BSSI; Beck et al., 1979) which evaluates suicidal thinking, with a total score range of 0 to 38.

Irritability severity was quantified by summing one item reflecting irritability from CDRS-R (item 8: “Irritability,” rated 1–7) and one from the BDI-II (item 17: “Irritability,” rated 0–3), with a total score range of 1 to 10.

MRI acquisition

Imaging data were acquired during baseline visit at Mount Sinai’s Brain Imaging Center on a 3T Skyra scanner (Siemens, Germany) with a 16+4 head-neck coil. Imaging parameters were similar to those used for the Human Connectome Project (HCP) LifeSpan protocols (Harms et al., 2018). High resolution (0.9mm isotropic) T1-weighted anatomical images were acquired using a MPRAGE sequence with the following parameters: TR = 2400 ms, TI = 1000 ms, TE = 2.06 ms, flip angle = 8°, FOV = 256 mm × 256 mm, 224 sagittal slices, 0.9 mm slice thickness (no gaps). Matched 0.9mm isotropic T2-weighted anatomical images were acquired using a SPACE sequence with the following parameters: TR = 3200 ms; TE = 566ms, flip angle = 120°, FOV = 256 mm × 256 mm, 224 sagittal slices, 0.9 mm slice thickness (no gaps). Functional T2*-weighted gradient echo multiband echo planar images (EPI) were acquired at 2.3mm isotropic resolution with alternating LR/RL phase-encoding directions and the following parameters: TR = 1000 ms, TE = 31.4 ms, flip angle = 60°, FOV = 624 mm × 720 mm, 60 transverse slices 2.3 mm slice thickness (no gaps), in-plane resolution = 2.3 mm × 2.3 mm, multiband factor = 5, 374 volumes in each of 4 runs. Additionally, a pair of spin-echo fieldmap images with LR/RL phase-encoding directions were acquired with the following parameters: TR = 6150 ms, TE = 57 ms, flip angle = 80°, FOV = 624 mm × 720 mm, 60 transverse slices, 2.3 mm slice thickness (no gaps), in-plane resolution = 2.3 mm × 2.3 mm. All participants completed a RFT training session in a mock scanner before the MRI scanning session.

Reward Flanker Task

During the RFT, participants were presented with a monetary cue, then made button presses and earned the cued reward amount if they correctly identified a target letter surrounded by four flanking letters during an allotted response interval (Bradley et al., 2017). During each trial, the monetary cue was presented for 4–6 s. Four cues were used: low reward (“10¢”), high reward (“50¢”), no reward (“0¢”), and uncertain reward (“?”). Uncertain reward cues (“?”) led to high (50¢), low (10¢) or no (0¢) reward with equal probability. After the cue,

flanker stimulus was presented for 300 ms, followed by a response interval that was calibrated for each participant based on performance during the pre-scan training session (maximum 1700 ms). Participants then received feedback for 2 s informing them of the value of the obtained or unobtained reward. A total of 120 trials were presented in a pseudo-random event-related design over four runs, with 30 trials per run. After each run, participants were told how much money they had earned. Participants were informed of the performance-based bonus prior to RFT in order to increase motivation.

Statistical analysis for clinical measurements

All statistical analyses for clinical measures were performed in Matlab 2018b (The MathWorks, Inc.). To investigate the relationship between baseline anhedonia and clinical outcomes, we calculated the Pearson partial correlation coefficients between baseline SHAPS and follow-up CDRS-R, SHAPS, and BSSI while controlling for sex and baseline age. As suicidality is minimal in healthy adolescents (all BSSI = 0 in the current sample), predictors for suicidality were only examined in the clinical cohort.

Hierarchical regression was also used to study the unique contribution of anhedonia and irritability to long-term illness progression. For each regression analysis, the dependent variable was the follow-up CDRS-R score. There were three hierarchical models in each analysis: Model 1 only included the covariates of age and sex as predictors; Model 2 included one additional symptom, either irritability or anhedonia; and Model 3 included all predictors: age, sex, and both symptoms (anhedonia and irritability). Thus the improvement in R^2 (i.e. the proportion of explained variance) from Model 2 to Model 3 reflected the unique contribution of the recently added anhedonia or irritability predictor, and its statistical significance was examined. Within the clinical cohort, additional hierarchical regression models were constructed to examine effect of baseline anhedonia and irritability on follow-up depression severity and suicidality ideation.

To evaluate the effect of variable follow-up interval, follow-up interval was also included as an additional covariates in both correlation analyses and hierarchical regression model with results detailed in supplementary materials.

RFT behavioral data analysis

Methods and results were detailed in supplementary materials.

MRI data analysis

MRI analyses followed the standard Human Connectome Project (HCP) minimal preprocessing pipeline (Glasser et al., 2013), including gradient non-linearity and fieldmap-based EPI distortion correction, realignment, and template normalization to standard Montreal Neurological Institute (MNI) space. Then, structured noise components were identified and removed using an automated independent components analysis classifier, ICA-FIX (Griffanti et al., 2014; Salimi-Khorshidi et al., 2014), which we verified as having high denoising sensitivity (>95%) and specificity (>99%) for our locally-acquired fMRI data. ICA-FIX was run on the concatenated RFT scans plus a 10 minute (600 volumes) resting-state fMRI scan collected immediately prior to RFT. All components identified as

“unknown” were reviewed and, where appropriate, reclassified as “noise”; all final “noise” components were then regressed out of the concatenated timeseries, with all final “signal” and “unknown” components were retained. Runs with excessive motion (both RFT and resting-state), defined as more than 3% of frames with relative motion greater than 1 mm, were excluded from ICA-FIX and further analyses. Runs with empty response-dependent regressors (see below) were also eliminated from further analyses.

Spatial smoothing (4mm FWHM) and first-level (subject-level) analysis were performed in Statistical Parametric Mapping (SPM) version 12 (Wellcome Trust Centre for Neuroimaging, London, UK) running on Matlab 2015a. Eleven task-based regressors were specified: four for cues (high, low, no reward, and uncertain reward cues), six for feedback (high, low, and no reward feedback on correct trials, separately for certain and uncertain cues), and one for error feedback (incorrect trials, if applicable). Each regressor was convolved with the canonical hemodynamic response function using the general linear model (GLM). First-level contrasts examined: a) Reward Expectancy, defined as differential neural activation during reward cues (10¢ + 50¢) versus no reward cues (0¢); b) Reward Attainment, defined as differential neural activation while receiving reward feedback (10¢ + 50¢) versus no reward feedback (0¢) regardless of cue, and; c) positive prediction error (PPE), defined as neural activation receiving reward feedback (10¢ + 50¢) after uncertain cues (?) versus reward feedback (10¢ + 50¢) after certain cue.

For the group-level analyses, relationship between whole-brain activation during reward expectancy, reward attainment, and PPE at baseline and follow-up illness severity (CDRS-R) and anhedonia severity (SHAPS) were examined, including sex and baseline age as covariates of no interest. The associations between baseline neural reward activity and follow-up suicidality severity (BSSI) in the clinical cohort were also examined. Findings were repeated controlling baseline CDRS-R and SHAPS and are presented in supplementary materials. To evaluate the effect of variable follow-up interval, it was also included as an additional covariate, with results detailed in the supplementary materials. All group-level analyses were performed in FSL PALM (Winkler et al., 2014) using Threshold-Free Cluster Enhancement (TFCE) and permutation-based non-parametric statistics to control the family-wise error (FWE) rate. Results for main analyses were considered significant at the two-tailed $p_{TFCE-FWE} < 0.05$ level; the exploratory suicidality analysis used a less stringent single-tailed $p_{TFCE-FWE} < 0.05$ threshold. Significant clusters over 10 voxels and local peaks with minimum distance 15 mm were identified with the FSL cluster command. The brain regions were reported according to Harvard-Oxford atlases.

Results

Demographic and clinical features

Demographic and clinical characteristics of the whole group ($N = 43$) and fMRI RFT subgroup ($n = 32$) during both baseline and follow-up evaluations are presented in Table 1. As noted in the Methods, all participants were psychotropic-medication-free at baseline; 9 subjects started psychotropic medications after the baseline visit, of whom 4 subjects remained on medications while 5 subjects discontinued. Of the 4 patients who were taking medications, 3 had significant depressive symptoms while the fourth subject had CDRS-R

score under 28 at both baseline and follow-up. See Supplementary Table 1 for medication details at follow-up. We also detail the breakdown of the clinical group into mood and anxiety subgroups in Supplementary Table 2, including baseline and follow-up assessment scores.

Clinical follow-up predictors

In the entire group of youths, depression severity was relatively stable across time. Baseline CDRS-R scores were highly correlated with follow-up CDRS-R scores ($\rho = 0.813$, $p = 1.096 \times 10^{-10}$). In addition, baseline SHAPS scores were significantly correlated with follow-up CDRS-R scores (Figure 1 left, $\rho = 0.410$, $p = 0.008$), as well as with follow-up SHAPS scores (Figure 1 center, $\rho = 0.662$, $p = 3.332 \times 10^{-6}$) and, in the clinical cohort, BSSI scores (Figure 1 right, $\rho = 0.748$, $p = 4.656 \times 10^{-6}$). Baseline SHAPS and follow-up CDRS-R scores remained correlated significantly after excluding the anhedonia-related question in the CDRS-R (item 2; see Methods) from the CDRS-R ($\rho = 0.417$, $p = 0.007$).

Hierarchical regression analysis of baseline anhedonia and irritability for follow-up illness and suicidality severity

We used hierarchical regression to study the unique contribution of each baseline symptom to depression progression in youth (findings are presented in Table 2). In the whole sample, irritability scores alone could predict follow-up CDRS-R (compared to demographic variables sex and baseline age, $R^2 = 43.77\%$, $p = 4.747 \times 10^{-7}$), and the model was significantly improved after adding anhedonia scores ($R^2 = 16.46\%$, $p = 7.432 \times 10^{-5}$). When examining anhedonia alone as a predictor, anhedonia scores were more predictive of follow-up CDRS-R compared to demographic variables ($R^2 = 59.02\%$, $p = 2.985 \times 10^{-10}$). Importantly, when irritability was added as an additional variable, the model was not significantly better ($R^2 = 0.12\%$, $p = 0.241$). These results indicate that, although baseline anhedonia and irritability levels both significantly predicted follow-up depression severity in youth, anhedonia provided unique predictive power beyond what was captured by irritability, whereas nearly all the predictive power of irritability was encompassed by anhedonia.

In light of the significantly different distribution ranges of follow-up CDRS-R in clinical subjects ($n = 28$, Median = 40) vs. HC ($n = 14$, Median = 19, Wilcoxon Rank-Sum Test $Z = 4.625$, $p = 3.754 \times 10^{-6}$), hierarchical regression analyses were repeated within the psychiatric group only (Table 2 middle). The results remained the same, such that the addition of baseline anhedonia scores significantly improved prediction of follow-up CDRS-R compared to irritability scores and demographics ($R^2 = 24.89\%$, $p = 5.657 \times 10^{-4}$), whereas the addition of irritability scores did not appreciably change CDRS-R prediction relative to anhedonia scores and demographics ($R^2 = 0.03\%$, $p = 0.903$).

Findings were similar for follow-up BSSI in the clinical cohort (Table 2 lower, $N = 28$) as baseline anhedonia significantly improved prediction of follow-up BSSI compared to irritability and demographic variables ($R^2 = 37.93\%$, $p = 2.083 \times 10^{-6}$), while baseline irritability did not affect significance of BSSI prediction compared to anhedonia and demographic variables ($R^2 = 0.08\%$, $p = 0.790$).

Neural reward processes as predictors for follow-up clinical outcomes

Whole group (combined clinical and HC subjects): Whole-brain analyses identified that several activation clusters at baseline during PPE (i.e. contrast of uncertain > certain reward feedback) were significantly (two-tailed $p_{TFCE-FWE} < 0.05$) correlated with both depression and anhedonia severity at follow-up. Specifically, CDRS- R scores were positively correlated with activation in the left angular gyrus (AG, Figure 2, Table 3), and SHAPS scores positively correlated with activation in the bilateral dorsal anterior cingulate cortex (dACC), supplementary motor area, operculum; left anterior insula and frontal pole; and right planum temporale (Figure 2, Table 3). No significant correlation was observed between brain activation during reward expectancy (i.e. contrast of reward cues > no reward cues) or reward attainment (i.e. contrast of reward > no reward feedback) at baseline and follow-up clinical outcomes.

Clinical cohort: The same whole-brain analyses were repeated in the psychiatric group ($n = 22$). Results were similar to those obtained in the whole cohort but less significant (Supplementary Figure 1), with only the positive correlation between dACC activation during PPE and follow-up SHAPS scores surviving FWE correction (Figure 2, Table 3). Clinical outcome correlations with neural activation during reward expectancy and reward attainment were again non-significant.

As suicidality is not present in healthy controls and to avoid a floor effect, the BSSI analyses were limited to the clinical cohort. At the slightly relaxed threshold (single-tailed $p_{TFCE-FWE} < 0.05$) used for our exploratory suicidality analysis, bilateral precuneus activation during reward attainment was found to correlate positively with follow-up BSSI scores (Figure 2, Table 3).

Discussion

The current pilot study investigated reward functions as neural and behavioral predictors of adolescent depression outcome. As hypothesized, we demonstrated that decreased hedonic capacity at baseline predicted future depression, anhedonia and suicidality severity in youth. When we examined both baseline anhedonia and irritability in the same hierarchical regression model, only anhedonia predicted future depression and suicidality severity outcomes. When we probed reward circuitry using the RFT fMRI task, we found that neural activation to uncertain rewards (PPE) was also predictive of future depression and anhedonia severity. Specifically, activation in the left angular gyrus (AG) predicted depression severity, while activation in dACC, bilateral operculum and left insula predicted anhedonia severity. Importantly, activation in the dorsal ACC remained a significant predictor for anhedonia severity even when HC subjects were excluded from the analysis. Exploratory analysis within the clinical sample further suggested that precuneus activation during reward attainment might be related to the development of suicidality ideation.

Anhedonia, but not irritability, predicted depression persistence in youth

In an effort to overcome the inherent heterogeneity of psychiatric disorders like adolescent depression, which are typically defined based on clusters of potentially disparate symptoms,

researchers have increasingly turned to study more specific clinical features such as anhedonia and irritability rather than limiting the research to categorical DSM disorders (Gabbay et al., 2012a; Gabbay et al., 2013; Gabbay et al., 2012b; Henderson et al., 2013; Sanislow et al., 2019). Our current longitudinal finding that anhedonia, compared to irritability, uniquely predicted subsequent depression and suicidality severity fits with our prior cross-sectional work showing that anhedonia, but not irritability, was associated with chronicity, illness severity, and suicidality in depressed youths (Gabbay et al., 2015). These results are also consistent with independent research documenting that depressed youths with or without significant irritability did not significantly differ in illness severity, number of depressive episodes, anhedonia severity, or suicidality (Stringaris et al., 2013). Anhedonia was also suggested as a predictor for worse outcome by the multisite Treatment of Resistant Depression in Adolescents (TORDIA) study, which examined longitudinal treatment outcomes for 334 adolescents with selective serotonin reuptake inhibitor (SSRI) treatment-resistant depression for 24 weeks. They found that, of the five CDRS-R symptom dimensions (i.e. depressed mood, anhedonia, somatic symptoms, morbid thoughts, and observed depression), only anhedonia predicted longer time to remission and fewer depression-free days (McMakin et al., 2012). Thus, our findings support the overall hypothesis that reward dysfunction, reflected by anhedonia, plays a particularly important role the development and persistence of depression in adolescents. However, despite our findings, interpretation of anhedonia as a predictor needs to be cautious, as anhedonia is not a pre-morbid trait.

Brain activation during uncertain reward predicted follow-up depression and anhedonia severity

While anhedonia predict future clinical depression and suicidality, it is also clear that not all anhedonic patients will experience the same course of illness or become suicidal. In this study, we adopted fMRI RFT task to identify neuroimaging signatures that differentiate adolescents who will go on to become depressive and suicidal from those who will not. Our fMRI analysis provided complimentary evidence that localized neural activation during the receipt of uncertain vs. certain rewards (i.e. PPE) predicted future depression and anhedonia severity. Neural activation during PPE that significantly predicted future depression severity was highly specific to the left AG, a cross-modal hub within the default mode network (DMN) which is usually deactivated by external, goal-oriented tasks (Fox et al., 2005). The AG is also involved in a wide variety of cognitive functions including language, memory retrieval, attention, spatial cognition, and social cognition (Seghier, 2012). In adolescents, lack of deactivation in the temporoparietal junction (comprising the AG and Wernicke's area) is associated with impaired fear extinction (Ganella et al., 2018). The association between failure to deactivate the AG during RFT performance and future depression severity in the current study suggests possible impairment in fear extinction in future depressive youth.

Our findings differ somewhat from prior longitudinal studies of reward processing in non-depressed youths, which have reported that brain activity during reward anticipation and reward attainment predicted future depression symptomatology (Morgan et al., 2013; Nelson et al., 2018; Nelson et al., 2016; Stringaris et al., 2015). By contrast, in our study neural

responses to reward expectancy and reward attainment were not found to significantly predict future depression outcomes. A key methodological difference is that these studies were carried out in healthy cohorts, whereas our sample primarily consisted of clinical subjects with modest depressive symptoms at baseline (CDRS-R: $M \pm SD = 37.32 \pm 15.45$). Our task design also differed from these prior studies in several regards: although it is similar to the monetary incentive delay task (Stringaris et al., 2015), the RFT also includes additional, explicitly uncertain cues (i.e. ? as well as 0¢, 10¢, and 50¢), and trial success was based on flanker task performance rather than entirely probabilistic card guessing (Morgan et al., 2013) or door guessing (Nelson et al., 2018; Nelson et al., 2016). In the context of prior literature, our results therefore suggest that the neural mechanisms contributing to depression persistence are likely distinct from those underlying initial disease onset in youth.

Notably, PPE was also the only reward process that predicted future anhedonia severity. Predictive neural activation during PPE was more widespread for anhedonia than depression severity, including the dACC within the medial prefrontal cortex (mPFC), the posterior operculum, and the anterior insula. The dACC plays a key role in reward-based decision-making and learning (Bush et al., 2002; Taylor et al., 2006), error detection and conflict monitoring (Botvinick et al., 1999), as well as pain processing (Jahn et al., 2016; Lieberman and Eisenberger, 2015). Increased dACC and mPFC activity is also among the most consistently reported findings in fMRI studies of depression (Nejad et al., 2013; Rive et al., 2013), including a recent report of enhanced connectivity between the mPFC and nucleus accumbens, a core subcortical reward structure within the ventral striatum, during reward attainment in adolescent boys with a history of depression (Morgan et al., 2016). Moreover, we also found that anterior insula activation during PPE predicted downstream anhedonia levels, consistent with the close functional relationship between the dACC and anterior insula as the primary structures of the salience network responsible for evaluating and directing attention toward important stimuli (Medford and Critchley, 2010). The anterior insula supports subjective emotional awareness (Craig, 2009), reliably represents negative reward prediction error signals in youth (Keren et al., 2018a), and is involved in the memory consolidation phase of inhibitory avoidance (Fornari et al., 2012). Finally, we observed that the anhedonia-predictive brain regions activated during PPE are also closely associated with pain processing. In particular, the posterior operculum has been identified as critical for the perception of painful stimuli (Garcia-Larrea, 2012), which also elicit strong activation throughout the salience network (Borsook et al., 2013; Legrain et al., 2011). Importantly, this area remained significant when controlling baseline anhedonia severity (Supplementary Figure 2; Supplementary Table 3), emphasizing its possible importance in anhedonia maintenance. Clinical studies consistently report comorbid depression and pain symptoms that respond similarly to treatment (Bair et al., 2003; Goesling et al., 2013), while the presence of pain predicted worse treatment outcomes and slower remission in depressed adults (Karp et al., 2005). Our study similarly found that hyper-activation in pain processing regions predicted more severe anhedonia in medication-free youth. Although uncertain RFT rewards elicit widespread neural activation in healthy and depressed adolescents (Bradley et al., 2017), only activation in areas that are also involved in aversion processing predicted future anhedonia severity. These findings suggest a potential link between early negative

valence system (NVS, particularly pain) activity and later positive valence system (PVS) deficits such as anhedonia.

Importantly, dACC activity remained predictive for anhedonia even when HC were excluded from the analysis, the only predictive result that still met significance. As anhedonia predicted depression severity, we expected that the neural predictors of anhedonia would also predict depression severity, which were not supported by our data. One explanation may be that depression is a heterogeneous disorder comprised of multiple discrete behavioral constructs, which may have limited our ability to identify the same neural predictors for anhedonia and depression severity particularly in a small sample. Another possible explanation for not predicting depression severity when HC were excluded was the reduced statistical power in the smaller cohort, as the unthresholded Z-map pattern was quite similar to the full sample (Supplementary Figure 1). An additional reason might be that AG activity was more related to baseline diagnosis, as most of our clinical subjects persisted their symptoms at follow-up. Additionally, depression encompasses a constellation of various PVS and NVS abnormalities, while anhedonia more specifically reflects PVS deficiencies. This might also be the reason distinct brain regions were predictive of depression and anhedonia: the dACC, which is heavily involved in reward processing, predicted anhedonia; while the AG, a cross-modal hub, predicted general depression severity. A previous study looking into depression symptoms in a large-scale community sample of healthy adolescents found that disruptions in neural reward system were associated with anhedonia but not low mood (Stringaris et al., 2015). The current work extends this conclusion to psychiatric youths and suggests that the relationship of reward system disturbances with future anhedonia is stronger and more stable than with future depression as a whole.

Taken together, the whole brain analysis results suggested a possible role of the AG, dACC, anterior insula and operculum, brain areas involved in reward learning and NVS, as predictors for worse clinical outcome. In particular, stronger neural activation differences between reward receipt after uncertain vs. certain cues were related to more severe future depression and anhedonia. This contrast of uncertain vs. certain rewards is not a classic “prediction error” which is calculated using a computational approach and to our knowledge has not been investigated previously in longitudinal studies on depression. Our task adopted fixed reward valences and excludes possible contamination of outcome unpredictability and other cognitive processes such as decision-making and learning, which may induce anxiety. By avoiding these stresses, our design may provide a cleaner estimate of PPE, especially in the trans-diagnostic psychiatric sample. Clinically, this contrast falls under evaluation of reward possibility, which is characterized by the over-/under-estimation of positive outcome probabilities under uncertain conditions. We found that youths who responded to uncertain rewards with neural activation similar to those for a certain rewards had better outcomes while those who activated the negative valence network during the uncertain conditions had worse outcome. While no studies have examined this construct in fMRI studies, depression is characterized in negative future view, as well as hypersensitivity to punishment and pain (Eshel and Roiser, 2010; Martin-Soelch et al., 2007; Moore and Fresco, 2012; Strunk et al., 2006). Similarly, a recent computational study found that maladaptive features of depression could emerge from negatively biased expectation at evaluation in goal-directed decision making (Huys et al., 2015). While more is needed to generate adequate fMRI data to

investigate this construct, our findings suggest that reward processes during uncertainty may play a role in illness progression.

Neural responses to reward attainment predicted follow-up suicidality in youths with psychiatric symptoms

Finally, we found evidence that future suicidality severity in clinical subjects was associated with stronger activation during reward attainment in the precuneus, a region involved in a range of functions related to episodic memory retrieval and self-referential processing (Kim, 2012; Leech and Sharp, 2014; Maddock et al., 2003). The precuneus is also well-studied as a core component of the DMN (Fox et al., 2005). Although our exploratory suicidality analysis was conducted under a relatively liberal threshold (single-tailed $p_{TFCE-FWE} < 0.05$, equivalent to two-tailed $p_{TFCE-FWE} < 0.1$), accumulating evidence implicates precuneus and DMN dysfunction in a variety of mental disorders that emerge during adolescence, including depression (Leech and Sharp, 2014). Crucially, two recent cross-sectional studies have specifically linked stronger resting-state functional connectivity within the DMN to suicidality in depressed youths (Schreiner et al., 2019; Zhang et al., 2016). Though tentative, our results are highly consistent with these findings, suggesting that alterations in precuneus function during reward processing may also be associated with the development of suicidality symptoms.

Limitations

Several limitations should be noted in this study. Foremost is the relatively small sample size, which limits the generalizability of our conclusions, particularly for the RFT fMRI analysis. Although we had a high participation rate of approximately 67% among subjects eligible for follow-up, our sample size was nevertheless reduced through attrition, and only a subset of participants had useable RFT data at baseline. Another limitation was the variability in interval time from baseline to follow-up visit. Importantly, our clinical predictors remain the same when we controlled for the interval but not all neuroimaging findings remain significant (details in supplementary materials). Another potential limitation is that as the cohort was small, the broad spectrum of mood and anxiety symptom severity might have contributed to Type II error particularly in regard to the fMRI findings not detecting relationship for reward expectancy and attainment. Similarly, a follow-up scan which was not done in this study should also have improved our study. Additionally, although all participants were medication-free at baseline, subsequent use of medication was permitted and varied between subjects which was likely to affect findings. However, such approach allows a better generalization of our findings as depression exacerbation occurs despite successful medication treatment.

Conclusion

In this study, we combined behavioral and neuroimaging techniques to study reward processes as predictors of illness outcomes in adolescent depression. Our results revealed that only anhedonia severity, the most direct clinical measure of reward dysfunction, uniquely predicted future depression and suicidality in youth. Furthermore, we found that neural responses to uncertain reward attainment in brain regions within salience network and NVS predicted anhedonia later on, while the key region of default mode network, angular

gyrus, was associated with more severe depression at follow-up. Clinically, the study suggests that youth who present with anhedonia are at higher risk for illness progression and should be monitored carefully for suicide risk and chronicity. Future studies should expand this focus to examine the closely related construct of reward learning, as well as the interface between NVS and PVS in a larger sample, with the ultimate goal of identifying early targets for therapeutic intervention.

Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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Highlights

- Anhedonia but not irritability predicted follow-up depression and suicidality
- Activation in left angular gyrus during PPE predicted future depression severity
- dACC, right insula & bilateral operculum activation during PPE predicted anhedonia
- Reward dysfunction is a potential biobehavioral predictor for adolescent depression

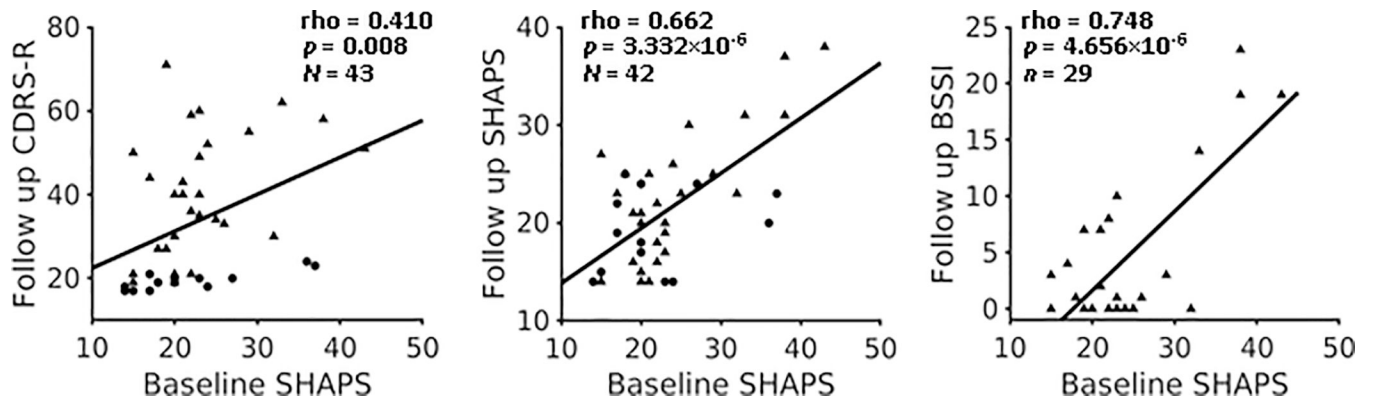


Figure 1. Anhedonia severity at baseline correlated with follow-up depression, anhedonia and suicidality severity. Dots represent healthy subject, and triangles represent subject with mood and anxiety symptoms.

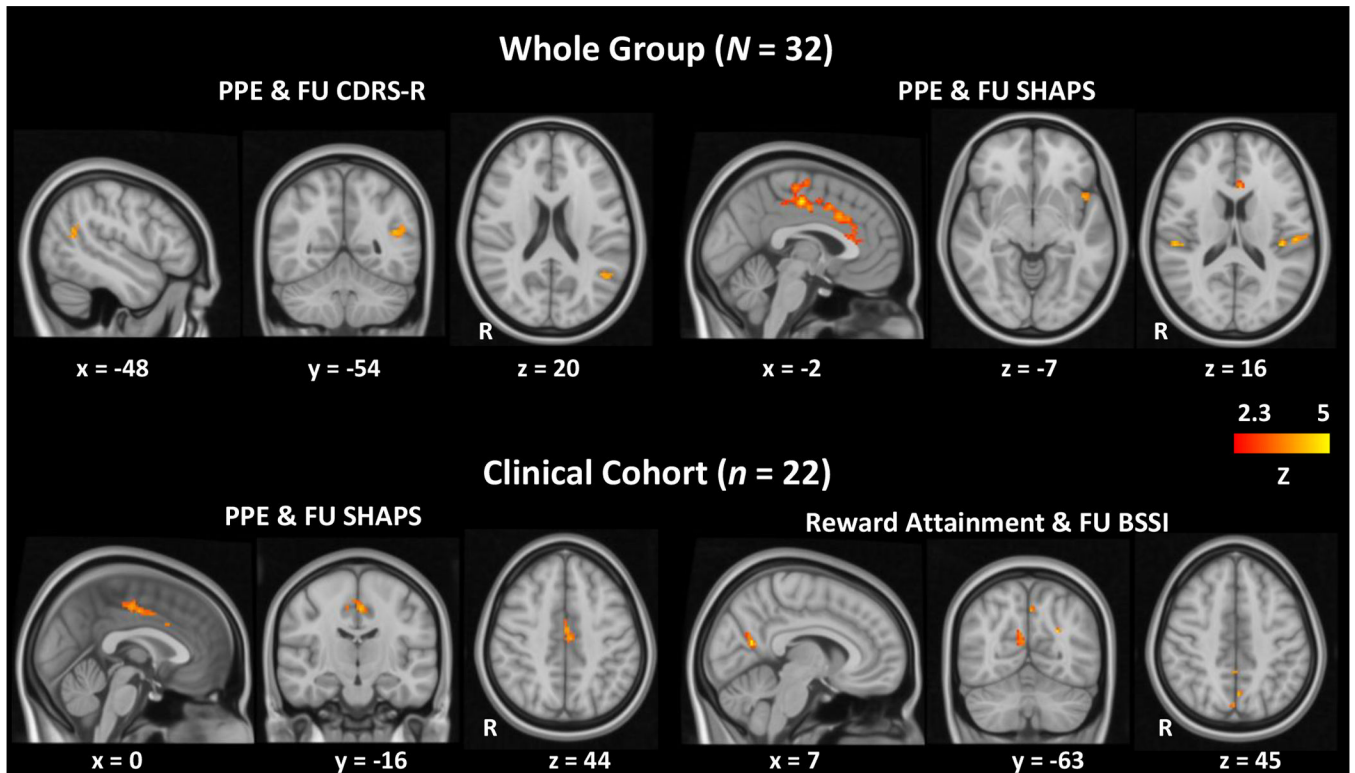


Figure 2. Baseline brain activation during reward processes correlated with follow-up clinical outcomes.

Table 1

Demographic and Clinical Characteristics

Demographics	Whole Group (N = 43)		RFT Group (N = 32)	
	Baseline	Follow-up	Baseline	Follow-up
Age [M ± SD] (Range)	14.91 ± 2.10 (12–20)	16.70 ± 2.21 (13–21)	14.88 ± 2.08 (12–20)	16.72 ± 2.07 (13–21)
Gender [n Female/Male] (%)	26/17 (60.47/39.53)		19/13 (59.38/40.62)	
Ethnicity [n Caucasian/African/Hispanic/Other] (%)	17/17/5/4 (39.53/39.53/11.63/9.3)		12/12/4/4 (37.5/37.5/12.5/12.5)	
Months until follow-up [M ± SD] (Range)	21.05 ± 10.91 (11–61)		21.69 ± 11.79 (12–61)	
Psychiatric Profile [n] (%)				
MDD	16 (37.21)	14 (32.56)	11 (34.38)	11 (34.38)
Dysthymia	4 (9.3)	2 (4.65)	1 (3.13)	1 (3.13)
DDNOS	1 (2.33)	0 (0)	0 (0)	0 (0)
Bipolar Disorder II	1 (2.33)	2 (4.65)	2 (6.25)	3 (9.38)
Anxiety	19 (44.19)	16 (37.21)	15 (46.88)	13 (40.62)
OCD	1 (2.33)	0 (0)	1 (3.13)	0 (0)
ODD	5 (11.63)	4 (9.3)	1 (3.13)	2 (6.25)
ADHD	8 (18.6)	10 (23.26)	3 (9.38)	6 (18.75)
Substance Use	0 (0)	4 (9.30)	0 (0)	2 (6.25)
Other	0 (0)	1 (2.33)	0 (0)	1 (3.13)
HC	14 (32.56)	14 (32.56)	10 (31.25)	10 (31.25)
Clinical Assessments [M ± SD] (Range)				
Med-naïve/Med-free/Medicated [n] (%)	37/6/0 (86.05/13.96/0)	30/9/4 (69.77/20.93/9.3)	29/3/0 (90.62/9.38/0)	22/6/4 (68.75/18.75/12.5)
CDRS-R	32.60 ± 16.33 (17–72)	33.88 ± 15.85 (17–71)	31.31 ± 15.63 (17–72)	34.91 ± 16.09 (17–71)
Anhedonia	3.45 ± 2.88 (1–11) ^a	3.19 ± 2.80 (1–11) ^a	3.42 ± 2.87 (1–11) ^a	3.47 ± 2.86 (1–11)
Irritability	3.24 ± 2.44 (1–9) ^a	2.69 ± 2.25 (1–8) ^a	3.00 ± 2.28 (1–9) ^a	2.88 ± 2.39 (1–8)
SHAPS	22.98 ± 7.15 (14–43)	21.14 ± 6.17 (14–38) ^a	23.19 ± 7.60 (14–43)	22.00 ± 6.34 (14–38)
Clinical Assessments in Mood and Anxiety Disorder Patients [M ± SD] (Range)				
CDRS-R	39.55 ± 15.66 (18–72)	40.86 ± 14.83 (19–71)	37.32 ± 15.45 (18–72)	41.95 ± 14.64 (19–71)
Anhedonia	4.50 ± 2.89 (1–11) ^a	4.18 ± 2.97 (1–11) ^a	4.33 ± 2.92 (1–11) ^a	4.45 ± 2.96 (1–11)
Irritability	4.21 ± 2.41 (1–9) ^a	3.50 ± 2.36 (1–8) ^a	3.76 ± 2.36 (1–9) ^a	3.68 ± 2.50 (1–8)
SHAPS	23.66 ± 7.07 (15–43)	22.32 ± 6.70 (14–38) ^a	24.10 ± 7.89 (15–43)	23.36 ± 6.80 (14–38)
BSSI	3.10 ± 5.52 (0–20)	4.21 ± 6.65 (0–23)	3.64 ± 6.18 (0–20)	5.09 ± 7.31 (0–23)

Note: diagnoses and assessments were based on the DSM-IV to keep consistency across all participants over time. As participants could meet criteria for more than one disorder, totals not sum to 100%. *MDD*: major depressive disorder; *DDNOS*: depressive disorder not otherwise specified; *Anxiety*: includes generalized anxiety, social anxiety, phobia, post-traumatic stress disorder, panic, anxiety disorder not otherwise specified; *OCD*: obsessive compulsive disorder; *ODD*: oppositional defiant disorder; *ADHD*: attention-deficit hyperactivity disorder; *HC*: healthy controls, no history of psychiatric illness. *CDRS-R*: Children's Depression Rating Scale-Revised; *Anhedonia*: sum of anhedonia-related items from CDRS-R (item 2) and BDI-II (item 4 and item 12); *Irritability*: sum of irritability-related items from CDRS-R (item 8) and BDI-II (item 17); *SHAPS*: Snaith-Hamilton Pleasure Scale; *BSSI*: Beck Scale for Suicide Ideation.

^adata missing from 1 participant.

Table 2

Predictive power of baseline anhedonia and irritability on follow-up outcome

	Irritability first			Anhedonia first		
	Model 1	Model 2i	Model 3	Model 1	Model 2a	Model 3
Prediction for FU CDRS-R in whole group ($N = 42$)						
Sex (β)	-4.101	-1.729	-1.084	-4.101	-1.201	-1.084
Age (β)	0.940	0.150	-0.376	0.940	-0.402	-0.376
Irritability (β)		4.385 ^{***}	1.142			1.142
Anhedonia (β)			3.618 ^{***}		4.373 ^{***}	3.618 ^{***}
R ² (%)	3.45	47.22	63.68	3.45	62.47	61.68
R ² (%)		43.77 ^{***}	16.46 ^{***}		59.02 ^{***}	1.21
Prediction for FU CDRS-R in clinical cohort ($n = 28$)						
Sex (β)	-6.405	-3.967	-1.033	-6.405	-1.029	-1.033
Age (β)	0.327	-0.059	-0.882	0.327	-0.890	-0.882
Irritability (β)		3.065 ^{**}	0.137			0.137
Anhedonia (β)			3.745 ^{***}		3.825 ^{***}	3.745 ^{***}
R ² (%)	4.74	28.05	52.94	4.74	52.91	52.94
R ² (%)		23.31 ^{**}	24.89 ^{**}		48.17 ^{***}	0.03
Prediction for FU BSSI in clinical cohort ($n = 28$)						
Sex (β)	-2.391	0.019	3.270	-2.391	3.263	3.270
Age (β)	0.992	0.611	-0.301	0.992	-0.288	-0.301
Irritability (β)		3.029 ^{**}	-0.217			-0.217
Anhedonia (β)			4.151 ^{***}		4.023 ^{***}	4.151 ^{***}
R ² (%)	3.12	31.36	69.29	3.12	69.21	69.29
R ² (%)		28.24 ^{**}	37.93 ^{***}		66.09 ^{***}	0.08

* $p < 0.05$;** $p < 0.01$;*** $p < 0.001$.

One subject was not included for irritability and anhedonia score missing.

Table 3

neural reward activity correlated with follow-up clinical outcomes

	cluster size (voxels)	Z	MNI coordinates (peak X, Y, Z)
Baseline PPE & Follow-up CDRS-R (N= 32)			
Left angular gyrus	41	4.84	(-38.8, -59.3, 15.4)
Baseline PPE & Follow-up SHAPS (N= 32)			
Bilateral Anterior Cingulate;	605	5.13	(-2, -17.9, 47.6)
Bilateral Precentral Gyrus;		4.31	(-4.3, 23.5, 15.4)
Bilateral Supplementary Motor Cortex		4.03	(-2, 16.6, 33.8)
		3.87	(0.3, 39.6, 3.9)
		3.63	(-2, -13.3, 63.7)
		3.51	(9.5, -40.9, 56.8)
Left Central and Parietal Opercular Cortex	108	5.64	(-59.5, -6.4, 8.5)
Left anterior Insular Cortex	33	4.24	(-45.7, 7.4, -5.3)
Left Parietal Opercular Cortex	21	4.69	(-41.1, -27.1, 15.4)
Right Planum Temporale	20	4.44	(53.2, -27.1, 15.4)
Left frontal pole	10	5.21	(-25, 39.6, 45.3)
Baseline PPE & Follow-up SHAPS in Clinical Cohort (n = 22)			
Bilateral Anterior Cingulate	78	4.48	(-2, -15.6, 45.3)
Baseline Reward Attainment & Follow-up BSSI in Clinical Cohort (n = 22)^a			
Right Precuneous	90	4.43	(7.2, -61.6, 15.4)
		3.3	(18.7, -68.5, 24.6)
		3.18	(14.1, -47.8, 15.4)
Left Precuneous	14	4.04	(0.3, -68.5, 49.9)

^a single-tailed *p*TFCE-FWE < 0.05.