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ORIGINAL ARTICLE Inflammation is associated with decreased functional connectivity within corticostriatal reward circuitry in depression

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Depression is associated with alterations in corticostriatal reward circuitry. One pathophysiological pathway that may drive these changes is inflammation. Biomarkers of inflammation (for example, cytokines and C-reactive protein (CRP)) are reliably elevated in depressed patients. Moreover, administration of inflammatory stimuli reduces neural activity and dopamine release in rewardrelated brain regions in association with reduced motivation and anhedonia. Accordingly, we examined whether increased inflammation in depression affects corticostriatal reward circuitry to lead to deficits in motivation and goal-directed motor behavior. Resting-state functional magnetic resonance imaging was conducted on 48 medically stable, unmedicated outpatients with major depression. Whole-brain, voxel-wise functional connectivity was examined as a function of CRP using seeds for subdivisions of the ventral and dorsal striatum associated with motivation and motor control. Increased CRP was associated with decreased connectivity between ventral striatum and ventromedial prefrontal cortex (vmPFC) (corrected P < 0.05), which in turn correlated with increased anhedonia (R = -0.47, P = 0.001). Increased CRP similarly predicted decreased dorsal striatal to vmPFC and presupplementary motor area connectivity, which correlated with decreased motor speed (R = 0.31 to 0.45, P < 0.05) and increased psychomotor slowing (R = -0.35, P = 0.015). Of note, mediation analyses revealed that these effects of CRP on connectivity mediated significant relationships between CRP and anhedonia and motor slowing. Finally, connectivity between striatum and vmPFC was associated with increased plasma interleukin (IL)-6, IL-1beta and IL-1 receptor antagonist (R = -0.33 to -0.36, P < 0.05). These findings suggest that decreased corticostriatal connectivity may serve as a target for anti-inflammatory or pro-dopaminergic treatment strategies to improve motivational and motor deficits in patients with increased inflammation, including depression.

Molecular Psychiatry (2016) 21, 1358–1365; doi:10.1038/mp.2015.168; published online 10 November 2015

INTRODUCTION

Patients with major depression exhibit altered functional connectivity between ventral striatal and prefrontal cortical circuits that regulate motivation.^{1–4} These alterations in functional connectivity have been associated with anhedonia, a core symptom of depression that reflects decreased motivation.⁵ One pathway that may contribute to alterations in corticostriatal reward circuitry and anhedonia within depression is inflammation.

Neuroimaging work by our group and others has revealed that exogenous administration of inflammatory cytokines or cytokine inducers (for example, endotoxin or vaccination) alters activation of reward-related brain regions,^{6–10} including reduced responses of the ventral striatum to hedonic reward.^{6,10} Moreover, our preclinical data in non-human primates suggest that the effects of inflammation on reward circuitry are mediated by cytokine-induced reductions in striatal dopamine release, as measured by *in vivo* microdialysis, which can be reversed by administration of the dopamine precursor levodopa.^{11,12} These cytokine-induced alterations in activation of reward circuitry and reductions in dopamine in humans and monkeys have in turn been associated with decreased motivation and anhedonia.^{6,10}

A significant proportion of patients with depression exhibit increased inflammation, as measured by peripheral inflammatory cytokines and acute-phase reactants, such as C-reactive protein (CRP).^{13,14} However, whether increased inflammation alters reward circuitry leading to anhedonia and other depressive symptoms in patients with depression has yet to be examined.^{2,15,16} Herein we conducted a whole-brain analysis using blood oxygen level-dependent (BOLD) functional magnetic resonance imaging (fMRI) to determine whether increased inflammation (plasma CRP) in depressed patients is associated with altered functional connectivity of subdivisions of the ventral and dorsal striatum with other subcortical or cortical brain regions that subserve reward processing and other goal-directed behaviors, such as motor control.^{17,18} This technique has been shown to reveal a distinct pattern of functional connectivity with whole-brain for each striatal sub-region,^{3,17} and corticostriatal functional connectivity assessed by this method has been found to be sensitive to pharmacological manipulation of the dopamine system.¹⁹⁻²¹ We hypothesized that increased inflammation in depression would disrupt functional connectivity within reward-relevant corticostriatal neurocircuitry in association with reduced motivation and motor slowing.

⁵These authors contributed equally to this work.

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Received 10 July 2015; revised 22 September 2015; accepted 28 September 2015; published online 10 November 2015

METHODS AND MATERIALS

Participants

Forty-eight participants (18-65 years) with a primary diagnosis of major depressive disorder or bipolar disorder, current episode depressed as determined by Structured Clinical Interview for Diagnostic and Statistical Manual-IV-TR were enrolled.²² Subjects were free of psychotropic medications (for example, antidepressants, mood stabilizers, antipsychotics, stimulants, sedative hypnotics and benzodiazepines) for at least 4 weeks (8 weeks for fluoxetine). Participants were also free of medications known to affect the immune system, including nonsteroidal or steroidal anti-inflammatories, statins or angiotensin 2 receptor inhibitors, and were tested for drugs of abuse at screening and on the day of the scan. Medications for other medical conditions were allowed as dictated by the patients' treating physicians, although patients were required to be medically stable as determined by medical history, physical exam and laboratory testing (see Supplementary Information). CRP was assessed over 2-4 screening visits spaced 1-4 weeks apart to ensure stable levels of inflammatory markers (values within 25% of each other on two occasions). Participants with evidence of active infections were excluded until medically stable. Subjects were recruited from a parent study on phenotyping depressed patients with increased inflammation (ClinicalTrials.gov NCT01426997). All procedures were approved a priori by the Institutional Review Board of Emory University. All participants provided written informed consent.

BOLD fMRI data acquisition and preprocessing

Data was acquired on a 3 T Magnetom Trio scanner (Siemens, Malvern, PA, USA) with a 20-channel head coil at the Emory-GaTech BME Biomedical Imaging Technology Center in the afternoon (1500 hours ± 2 h). Anatomic images were obtained using a T1-weighted, magnetization prepared rapid gradient echo sequence.²³ Wakeful resting-state fMRI images were acquired using a Z-saga pulse sequence for recovering ventral–frontal signal losses regularly seen in gradient-echo BOLD fMRI²⁴ (See Supplementary Information). Analysis of functional connectivity was conducted with AFNI (http://afni.nimh.nih.gov/). Preprocessing^{25,26} included slice timing correction, volume alignment, anatomy-to-EPI co-registration,²⁷ nuisance signal (head motion, cerebral spinal fluid and white matter) regression, band pass filtering (0.009 < f < 0.08 Hz) and 5 mm full-width half-maximum spatial smoothing. No participant had movement > 3.4 mm degree⁻¹ in translation/rotation, consistent with previous studies^{28,29} (see Supplementary Information). Individual's 4D fMRI data were spatially normalized into a standard stereotaxic space, Montreal Neurological Institute (MNI) template with 1 mm³ resolution.

BOLD fMRI data analysis

Seed-to-whole-brain connectivity analysis. Whole-brain resting-state connectivity was examined using 3-mm radius spherical seeds centered on ventral and dorsal striatal regions of interest (ROIs) (Supplementary Table S1). Inferior ventral striatum (iVS) (including nucleus accumbens) was defined from coordinates demonstrating maximal decreases in response to hedonic reward (gambling task) in subjects administered the inflammatory cytokine interferon-alpha.¹⁰ Additionally, ventral rostral putamen (vrP) and two dorsal striatal ROIs encompassing dorsal caudate (dC) and dorsal caudal putamen (dcP) were examined. These seeds are consistent with previously determined functional subregions of striatum^{3,10,17,19} and allowed identification of distinct patterns of functional connectivity for each ROI that parallel motivational and motor striatal subdivisions.^{18,30} Hemispheres were assessed separately consistent with previous studies using similar methods and because inflammation has been reported to have greater effects on neural activation and glucose or neurotransmitter metabolism in left striatum.^{6,17,19,31,32} Voxel-wise whole-brain correlations were computed as a function of plasma CRP (mg I^{-1}) to identify brain regions for which functional connectivity with each bilateral striatal ROI was associated with inflammation. To correct for multiple comparisons, resulting statistical maps were cluster corrected (P < 0.01 per voxel plus 1392 mm³ cluster, corrected P < 0.05) using AFNI's 3dClustSim. Subjectlevel functional connectivity correlations for identified ROIs were Fisher's Z-transformed $\{Z(R) = 0.5 \ln[(1+R)/(1-R)]\}$ for use in regression models. For illustrative purposes, Z-score maps were generated to visualize patterns of positive functional connectivity with iVS separately for patients with 'low' versus 'high' inflammation (plasma CRP concentrations, < 1 and > 3 mg l⁻¹, respectively, as defined by the American Heart Association).³³ For correlations with inflammatory cytokines and their receptors, the mean 1359

time series from all eight striatal ROIs was calculated (as the overall striatal seed), and Z-scores from brain regions that showed altered connectivity with this 'overall striatal seed' as a function of CRP were extracted.

Targeted connectivity analysis with ventromedial prefrontal cortex (vmPFC). To further validate our findings, and to protect against inflation of regression coefficients that may result from extracting functional connectivity Z-scores from vmPFC voxels identified by correlation with CRP in whole-brain analysis, we extracted Z-scores for subject-level connectivity correlations of ventral and dorsal striatal ROIs with a vmPFC region (MNI coordinates x=0, y=44, z=-8 and cluster size=1408 mm³) previously reported to be associated with neural activation in response to receipt of reward versus loss in a meta-analysis of neuroimaging studies.³⁴ These Z-scores were then correlated with inflammatory markers and behavior.

Behavioral assessments

Depression severity was assessed using the 17-item Hamilton Rating Scale for Depression (HAM-D).³⁵ Anhedonia was assessed using the Snaith-Hamilton Pleasure Scale (SHAPS)³⁶ and an anhedonia subscale of the Inventory of Depressive Symptomatology- Self-Report (IDS-SR).³⁷ The IDS-SR anhedonia subscale consists of three items and has been previously demonstrated to highly correlate with the self-administered and clinician-administered versions of the SHAPS,³⁸ which was replicated in our sample (R = 0.63, P < 0.001). Motor speed was determined as the number of taps/trial using the Finger Tapping Test,^{39,40} and psychomotor performance was assessed as the time to compete Trail Making Test Part A⁴¹⁻⁴⁴ (see Supplement Information).

Inflammatory biomarkers

Blood was collected for batched analysis of plasma CRP and the inflammatory cytokines interleukin (IL)-6, IL-1beta and tumor necrosis factor and their soluble receptors, which have been found to be elevated in patients with major depression.^{45,46} The immunoturbidometric method was used to measure high-sensitivity CRP concentrations with a Beckman AU480 chemistry analyzer (Beckman Coulter, Brea, CA, USA) and Ultra WR CRP Kit (Sekisui Diagnostics, San Diego, CA, USA) as described.⁴⁷ Concentrations of cytokines and their soluble receptors were assessed in duplicate using multiplex bead-based assays (R&D Systems, Minneapolis, MN, USA) and analyzed on a MAGPIX CCD imager (Luminex, Austin, TX, USA).^{48,49} Mean inter- and intra-assay coefficients of variation were < 10% (Supplementary Table S2). Consistent with previous analyses, cytokine and cytokine receptor values were natural log transformed to achieve normality for statistical modeling.^{50–52} See Supplementary Information for details of sample collection and cytokine assays.

Statistical analysis

Characteristics of the study sample were summarized using mean and s.d. for continuous variables and percentage for categorical variables. Subjectlevel connectivity Z-scores for relationships between ventral or dorsal striatal ROIs (or overall average striatal activity) with brain regions identified by fMRI connectivity analysis were entered into linear regression models (as the dependent variable) to assess relationships with inflammatory cytokines and their receptors and (as the independent variables) to assess relationships between functional connectivity and behavior. Relationships between ventral and dorsal striatal functional connectivity and symptoms of depression related to motivation and motor function, respectively, were assessed separately. Significant relationships between connectivity Z-scores with inflammatory biomarkers and behaviors were assessed in linear models using backward (significance level stay = 0.05) and forward (significance level entry = 0.05) selection with covariates that may contribute to inflammation and/or influence neural circuitry and behavior,^{52–55} including age, sex, race, smoking status and body mass index (BMI). To identify specific relationships between functional connectivity and inflammatory markers independent of depression severity, we also controlled for HAM-D scores. To assess relationships between functional connectivity and behavior independent of inflammation, we also controlled for CRP. Furthermore, mediation analyses using Sobel tests⁵⁶⁻⁵⁸ were conducted to examine whether functional connectivity mediated the significant relationships observed between CRP and anhedonia and CRP and motor slowing reported in Table 1 (see Supplementary Information). Tests of significance were two-tailed, $\alpha < 0.05$, conducted in SAS (Cary, NC, USA) and IBM SPSS Statistics 23.0 (New York, NY, USA).

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Variable Mean (s.d.) (n = 48) Association with CRP (R) P-value P-value (n = 48) Demographic Age (years) 38.3 (10.9) $- 0.12$ 0.400 Sex, Male (n, %) 14 (29.2) 0.17 0.236 Race Caucasian (n, %) 18 (37.5) $- 0.10$ 0.482 African American (n, %) 30 (62.5) 0.64 $< 0.01^*$ Smoking status, yes (n, %) 8 (16.7) $- 0.06$ 0.641 BMI (kg m ⁻²) 31.2 (7.6) 0.64 $< 0.001^*$ Clinical HAM-D Depression Score 23.2 (3.2) 0.25 0.091 IDS-SR Anhedonia Score 5.6 (3.0) 0.26 0.073 Finger Tapping Test, Dominant Hand (mean number taps/10 s) 40.0 (9.9) $- 0.29$ 0.049* Trail Making Test A (s) 32.6 (14.5) 0.27 0.066 Inflammatory CRP (mg l ⁻¹) 2.2 (2.4) NA NA IL-6 (pg ml ⁻¹) 5.52 (2.23) 0.06 0.708 IL-1beta (pg ml ⁻¹) 0.42 (0.23) 0.17 0.249	Table 1. Demographic, clinical and inflammatory variables of thestudy sample and their relationship to the primary variable ofinflammation (plasma CRP)				
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IL-1beta (pg ml ⁻¹) $0.42 (0.23)$ 0.17 0.249 IL 6cc (ng ml ⁻¹) $15.75 (3.45)$ 0.17 0.269	TNF $(pg ml^{-1})$	5.52 (2.23)	0.06	0.708	
$ 6cr (ncm)^{-1} 1575 (245) 016 0260$	IL-1beta (pg ml ^{-1})	0.42 (0.23)	0.17	0.249	
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sTNFR2 (ng ml ⁻¹) 2.50 (0.89) 0.09 0.554	sTNFR2 (ng ml ^{-1})	2.50 (0.89)	0.09	0.554	
IL-1ra (ng ml ⁻¹) 1.61 (2.22) 0.41 0.004**	IL-1ra (ng ml ^{-1})	1.61 (2.22)	0.41	0.004**	

Abbreviations: BMI, body mass index; CRP, C-reactive protein; HAM-D, Hamilton Depression Rating Scale; IDS-SR, Inventory of Depressive Symptomatology, Self-Report; IL, interleukin; IL-1ra, IL-1 receptor antagonist; IL-6sr, IL-6 soluble receptor; NA, not applicable; SHAPS, Snaith-Hamilton Pleasure Scale; sTNFR2, soluble tumor necrosis factor receptor 2. *P < 0.05, **P < 0.01, ***P < 0.01. *P-value for the correlation with CRP.

RESULTS

Patient characteristics

Characteristic of the study sample and their relationship to plasma CRP are summarized in Table 1. BMI was significantly correlated with CRP (R=0.64, P < 0.001) and was therefore included as a covariate in statistical models along with other indicated covariates. In addition, plasma CRP was correlated with IL-6 (R=0.55, P < 0.001) and IL-1 receptor antagonist (IL-1ra) (R=0.41, P=0.004). Finally, CRP was significantly associated with anhedonia (R=0.34, P=0.020), as measured by the subscale of the IDS-SR, and motor slowing (R=-0.29, P=0.049), as measured by the Finger Tapping Test, whereas trends were observed for SHAPS and Trail Making Test (R=0.26-0.27, P < 0.075).

Association between plasma CRP and functional connectivity: whole-brain analysis

Increasing plasma CRP (mgI^{-1}) was associated with reduced connectivity between left iVS and a cluster in vmPFC (cluster centroid BA32, R = -0.56, cluster = 4327 mm³; Figures 1a and b; Table 2). Consistent with this relationship, *Z*-score maps demonstrated that patients with high inflammation (CRP > 3 mgI⁻¹) exhibited no significant connectivity between left iVS and vmPFC, whereas subjects with low inflammation (CRP < 1 mgI⁻¹) exhibited robust connectivity between these regions (as well as other cortical and subcortical regions; Figure 1c). This pattern of



Figure 1. Plasma C-reactive protein (CRP) was negatively associated with functional connectivity between left inferior ventral striatum (iVS) (green seed) and ventromedial prefrontal cortex (vmPFC; BA32, x = -2, y = 33, z = -6), with increasing CRP predicting decreasing connectivity (cyan-blue intensity, R = -0.40 to -0.70) in patients with depression (**a** and **b**). *Z*-score maps demonstrated that, whereas patients with high inflammation (CRP > 3 mg I⁻¹) exhibited no significant connectivity between left iVS and vmPFC, the subjects with low inflammation (CRP < 1 mg I⁻¹) exhibited robust positive connectivity (yellow-red intensity) between these brain regions (**c**). Clusters are overlaid onto canonical structural brain images in the axial (z = -9: **a** and **c**) and sagittal (x = 4 and 7: **a**) planes, corrected P < 0.05.

corticostriatal connectivity observed in patients with low inflammation is consistent with patterns of ventral striatal functional connectivity observed in healthy controls in numerous studies assessing voxel-wise whole-brain correlations with sub-regions of the striatum.^{3,17,19,59} Negative correlations were also observed between CRP and functional connectivity of the left and right vrP, dcP and dC with clusters in vmPFC (all BA11; R = -0.53 to -0.62, cluster = 3279–16 332 mm³); left and right dC with right fusiform gyrus (BA37; R = -0.59 and -0.53, cluster = 4487 and 1429 mm³); and left dC with left superior frontal gyrus/presupplementary

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Table 2.	Ventral and dorsal striatal connectivity was negatively			
associated with inflammation (plasma CRP) in depression				

Seed ROI	Brain region	mm ³	Cluster centroid (MNI)		BA	R-value ^a	
			x	у	z		
<i>iVS</i> Left	vmPFC/rACC	4327	-2	32	-6	32	- 0.56
<i>vrP</i> Left Right	vmPFC/mOFC vmPFC/mOFC	11 696 10 005	1 2	29 27	- 11 - 12	11 11	- 0.56 - 0.57
<i>dcP</i> Left Right	vmPFC/mOFC vmPFC/mOFC	12 913 16 332	1 2	35 36	- 14 - 13	11 11	- 0.59 - 0.62
dC Left	vmPFC/mOFC Right fusiform gyrus Left superior frontal gyrus/pre-SMA	4190 4487 1403	0 38 - 5	33 -61 17	- 19 - 14 59	11 37 6	- 0.55 - 0.59 - 0.53
Right	Left vmPFC/mOFC Right fusiform gyrus	3279 1429	-6 35	35 - 56	- 16 - 18	11 37	- 0.53 - 0.53

Abbreviations: BA, Brodmann area; CRP, C-reactive protein; dC, dorsal caudate; dcP, dorsal caudal putamen; iVS, inferior ventral striatum; MNI, Montreal Neurological Institute and Hospital coordinate system; mOFC, medial orbitofrontal cortex; rACC, rostral anterior cingulate cortex; ROI, region of interest; SMA, supplementary motor area; vmPFC, ventromedial prefrontal cortex; vrP, ventral rostral putamen. Functional connectivity between ventral and dorsal striatum and cortical brain regions that was negatively associated with plasma CRP as determined by whole-brain analysis, voxel-wise P < 0.01 plus cluster > 1392 mm³: P < 0.05 corrected. ^aAll *R* values remained significant (P < 0.05) after adjusting for covariates, including sex, age, race, smoking status, body mass index and depression severity (Hamilton Depression Rating Scale scores).

motor area (pre-SMA) (BA6; R = -0.53, cluster = 1403 mm³; Figure 2; Table 2). Plasma CRP continued to account for significant variability in these corticostriatal connectivity relationships after controlling for possible effects of age, race, sex, smoking status, BMI and depression severity (adjusted R = -0.32 to -0.49; all P < 0.05). Of note, the cluster threshold was re-estimated using the most recent release of 3dClustSim (May 2015). The updated cluster threshold of 1485 versus 1392 mm³ did not affect the reported results except for association between CRP and connectivity of left dC to pre-SMA and connectivity of right dC to fusiform gyrus (both P < 0.07).

Correlations between connectivity and depressive symptoms: whole-brain analyses

Ventral striatal connectivity and anhedonia. Decreased connectivity (Fisher's Z-scores) between left iVS and the vmPFC, as well as left and right vrP to vmPFC, was negatively correlated with increased anhedonia, as measured by the subscale of IDS-SR (R = -0.29 to -0.48, all P < 0.05). Decreased connectivity between right vrP and vmPFC was significantly correlated with increased SHAPS scores (R = -0.30, P = 0.04), whereas a trend was observed for left iVS to vmPFC connectivity and SHAPS scores (R = -0.28, P = 0.051). Forward and backward linear regression models, including age, sex, race, smoking status, BMI and CRP, demonstrated that functional connectivity between left iVS and vmPFC was the most significant predictor of the anhedonia subscale of IDS-SR (R = -0.47, P = 0.001; Table 3), and right vrP to vmPFC connectivity was a significant predictor of SHAPS scores using forward selection only (R = -0.30, P = 0.039). Of note, mediation

analysis confirmed that connectivity between left iVS and vmPFC significantly mediated the relationship between CRP and anhedonia as reported in Table 1 (Z=2.26, s.e.=0.09, P=0.024; Supplementary Figure S1 and Supplementary Table S3).

Dorsal striatal connectivity and psychomotor slowing. Decreased dcP and dC to vmPFC, and dC to pre-SMA, connectivity was correlated with reduced motor speed as assessed by the Finger Tapping Test (mean number of taps per timed trial; R = 0.31 to 0.45, all P < 0.05). Only decreased connectivity between left and right dC and vmPFC were associated with reduced psychomotor performance (time to complete Trail Making Test A; R = -0.33 and -0.36, P < 0.05). Forward and backward linear regression models controlling for age, sex, race, smoking status, BMI and CRP demonstrated that dcP to vmPFC connectivity was the most significant positive predictor of motor speed (mean taps per trial; R = 0.45, P = 0.002) and right dC to vmPFC connectivity was the most significant negative predictor of psychomotor performance (completion time; R = -0.35, P = 0.015) (Table 3). Of note, connectivity between left and right dC and fusiform gyrus was not significantly correlated with psychomotor behavior. Mediation analysis confirmed that connectivity between right dcP and vmPFC significantly mediated the relationship between CRP and motor slowing as reported in Table 1 (Z = 2.27, s.e. = 0.51, P = 0.023; Supplementary Figure S1 and Supplementary Table S3).

Relationships of inflammatory cytokines and their soluble receptors with functional connectivity

Because CRP was associated with decreased connectivity between all ventral and dorsal striatal ROIs and vmPFC, and to reduce the number of comparisons with multiple other inflammatory markers, whole-brain functional connectivity with an overall striatal seed (that is, the mean time series from all eight striatal ROIs) as a function of CRP was assessed. The resulting Z-scores representing the overall striatal connectivity with vmPFC as a function of CRP were then correlated with inflammatory cytokines and their receptors. Increased plasma IL-6, IL-1beta and IL-1ra predicted decreased connectivity with vmPFC (R = -0.33 to 0.36, all P < 0.05). IL-1ra was found to be the strongest predictor after controlling for age, sex, race, smoking status and BMI (adjusted R = -0.30, P = 0.042). A significant relationship between CRP and overall striatal connectivity with fusiform gyrus was also observed but did not correlate with inflammatory markers when controlling for covariates (P > 0.25).

Corticostriatal connectivity, inflammation and depressive symptoms: targeted analysis

To further validate our findings, functional connectivity between the striatal ROIs (and average overall striatal activity) and a vmPFC cluster previously identified in neuroimaging meta-analyses as being activated by a variety of rewarding stimuli^{34,60,61} was assessed and correlated with inflammatory markers and behavior in exploratory analyses. Decreased connectivity between the left iVS, left and right vrP, left and right dcP and left and right dC and this a priori defined vmPFC region were all associated with increased CRP, consistent with findings from whole-brain analysis (R = -0.29 to -0.56, all P < 0.05). Finally, overall striatal connectivity with this vmPFC region was associated with CRP (adjusted R = -0.42, P = 0.003) and IL-1beta after controlling for covariates, including depression severity (adjusted R = -0.33, P = 0.024). Left iVS, right dcP and right dC connectivity with this a priori vmPFC region also significantly predicted anhedonia (adjusted R = -0.48, P = 0.001), motor speed (adjusted R = 0.41, P = 0.004) and psychomotor processing time (adjusted R = -0.36, P = 0.011), respectively, when controlling for covariates, including CRP. Ventral striatal connectivity did not predict motor speed or psychomotor performance, and dorsal striatal connectivity did not predict



Figure 2. Plasma C-reactive protein (CRP) was negatively associated with functional connectivity between ventral rostral putamen (vrP), dorsal caudal putamen (dcP) and dorsal caudate (dC) subdivisions of the striatum and other cortical brain regions in depressed subjects. Examples from the left hemisphere of functional connectivity between vrP, dcP and dC regions of interest (green seeds) and cortical brain regions that were negatively correlated with CRP (cyan-blue intensity; R = -0.40 to -0.70). Clusters in ventromedial prefrontal cortex (BA11; x = -6 to 2, y = 27 to 36, z = -11 to -19; R = -0.62 to -0.53), right fusiform gyrus (BA37; x = 37 and 35, y = -61 and -56, z = -14 and -16) and left superior frontal gyrus/supplementary motor area (BA6; x = -5, y = 17, z = 59; R = -0.51 to -0.53) are overlaid onto canonical structural brain images in the axial plane (z = -9 and 61), corrected P < 0.05.

Table 3. Connectivity between ventral and dorsal striatum and vmPFC predicted anhedonia, motor and psychomotor processing speed					
Behavioral assessment	Functional connectivity (Z-scores)	Adjusted R	Adjusted P-value		
Anhedonia: Subscale from IDS-SR Anhedonia: SHAPS scores Motor speed: Finger Tapping Test, Dominant Hand (mean taps per trial) Psychomotor processing time: Trail Making Test A (s)	Left iVS to vmPFC Right vrP to vmPFC Right dcP to vmPFC Right dC to vmPFC	- 0.47 - 0.30 0.45 -0.35	0.001** 0.039* 0.002** 0.015*		
Abbreviations: dC, dorsal caudate; dcP, dorsal caudal putamen; IDS-SR, Inventory of Depressive Symptomatology, Self-Report; iVS, inferior ventral striatum;					

Abbreviations: dC, dorsal caudate; dcP, dorsal caudal putamen; IDS-SR, Inventory of Depressive Symptomatology, Self-Report; iVS, inferior ventral striatum; SHAPS, Snaith–Hamilton Pleasure Scale; vmPFC, ventromedial prefrontal cortex; vrP, ventral rostral putamen. Functional connectivity between the indicated brain regions significantly predicted motivational and motor behavior in linear regression models that included age, sex, race, body mass index, smoking status and C-reactive protein. *P < 0.05; **P < 0.01.

anhedonia (all adjusted P > 0.25), indicating that distinct functional striatal subdivisions were related to motivation or motor behavior. Moreover, associations between iVS to vmPFC connectivity and anhedonia remained significant when controlling for right dC and right dcP to vmPFC connectivity (R = -0.57, P < 0.001). Similar significant relationships were observed between dorsal striatum and motor speed and motor performance when controlling for iVS to vmPFC connectivity (R = 0.35, P = 0.017; and R = -0.39, P = 0.006; respectively).

DISCUSSION

Increased inflammation as reflected by plasma CRP and inflammatory cytokines was associated with decreased connectivity within reward-related brain regions using a whole-brain analysis. Interestingly, we observed that decreased connectivity between ventral striatum and vmPFC was in turn correlated with symptoms of anhedonia, whereas decreased connectivity between dorsal striatum and vmPFC correlated with psychomotor slowing. Although CRP was correlated with both anhedonia and motor slowing, mediation analysis revealed that the effects of CRP on corticostriatal connectivity mediated these relationships between CRP and behavior. The vmPFC regions identified by whole-brain

predicting non-response to transcranial magnetic stimulation in patients with depression who exhibited increased anhedonia.⁶⁰ Furthermore, this vmPFC region is consistent with that previously described in meta-analysis of neuroimaging studies as being activated by a variety of rewarding stimuli.³⁴ Targeted analysis of ventral and dorsal striatal connectivity with this reward-related vmPFC region identified in neuroimaging meta-analysis revealed correlations with anhedonia and psychomotor slowing, respectively, as well as with CRP and inflammatory cytokines. Therefore, decreased functional connectivity between striatum and vmPFC assessed using seeds described in the literature that did not depend on ROI identification by whole-brain analysis was associated with increased inflammation in depression. Based on these data, this unbiased method for assessing reward-related connectivity using *a priori* defined regions from the literature may be used as an objective and efficient way to assess inflammation effects on neurocircuitry across a number of psychiatric or medical illnesses associated with increased inflammation. Moreover, this strategy may be applied to studies investigating pharmacological strategies to reverse inflammation effects on reward neurocircuitry and behavior.

analysis corresponded closely to a region recently identified as



Potential mechanisms of inflammation-related decreases in corticostriatal connectivity

Consistent with decreased activation of ventral striatum to hedonic reward,¹⁰ our non-human primate work has demonstrated that chronic administration of inflammatory cytokines decreases striatal dopamine release, as measured by translational neuroimaging and *in vivo* microdialysis,¹² in a monkey model of cytokine-induced depression.^{62,63} Decreased dopamine release, as measured by in vivo microdialysis, was correlated with reduced effort-based sucrose consumption, a measure of reward sensitivity and anhedonia in monkeys.⁶⁴ Of note, similar decreases in effort-based responses for sucrose reward in the absence of a decrease in consumption of freely available sucrose have been observed in rats administered peripheral IL-1ß and decreased motivation for, but not sensitivity to, reward has been reported in mice following lipopolysaccharide administration.^{65,66} Moreover, anhedonia-related reductions in striatal dopamine release in monkeys were restored by the dopamine precursor, levodopa, administered via reverse microdialysis.¹¹ The primary findings of this study indicate that increased inflammation in depression disrupts connectivity between both ventral and dorsal striatum and vmPFC, a region which, similar to ventral striatum, receives significant mesocorticolimbic dopamine innervation.⁶⁷ Accordingly, inflammation-related decreases in corticostriatal connectivity with vmPFC may involve cytokine-induced decreases in dopamine and have potential for reversal with pharmacological strategies that increase dopamine availability.⁶²

Strengths, limitations and future directions

One strength of the study was the use of a targeted, hypothesisdriven ROI approach based on known functional sub-regions of the striatum that have been associated with specific depressive symptoms as well as inflammation.^{6,10,29,31} Indeed, this approach identified that inflammation-associated connectivity between ventral striatum and vmPFC correlated with anhedonia, whereas inflammation-related connectivity between dorsal striatum and vmPFC correlated with motor slowing, highlighting the specificity of our findings. The striatal seed-to-whole brain method has been used extensively in studies examining functional connectivity with the striatum^{3,19,20,59} and has been shown to be sensitive to increasing brain dopamine, for instance with levodopa.^{19,20} Future studies will include pharmacological challenge paradigms to further understand the mechanisms by which inflammation disrupts connectivity in reward-related brain regions to lead to anhedonia in depression. An important limitation of the study is the lack of a healthy control group. However, patients with low inflammation (CRP < 1 mg l^{-1}) exhibited robust connectivity between ventral striatum and vmPFC that is consistent with patterns of ventral striatal functional connectivity with the whole brain in healthy control subjects reported in numerous studies.^{3,17,19,59} Another limitation was the cross-sectional nature of the study. Longitudinal work will be required to determine causal links between inflammatory markers and alterations in corticostriatal connectivity in depression using anti-inflammatory challenge strategies. It should also be noted that, although similar results were observed for the two measurements of anhedonia (which were highly correlated with each other-see Methods section), there was some fluctuation in the statistical significance in the relationship of these scales to corticostriatal connectivity. These findings may represent nuanced differences in the aspects of anhedonia measured by these scales, for instance SHAPS focuses exclusively on pleasure (liking), whereas the IDS subscale probes interest in people and activities (wanting) in addition to pleasure. Alternatively, these differences may be secondary to a lack of power. Nevertheless, the sample size was sufficient to test the primary outcome of interest (the impact of inflammation on corticostriatal connectivity) with medium-to-large effect sizes and

power >80%. Finally, depression is only one of several psychiatric illnesses that have been associated with increased inflammation, and it is unknown whether these findings in depression are generalizable to other psychiatric illnesses such as anxiety disorders and schizophrenia where high inflammation and motivational and motor deficits are prevalent.^{68–70} Of note, increased inflammation has been associated with non-response to standard antidepressant treatments^{71,72} but is a positive predictor of antidepressant response to therapies that reduce inflammation, such as cytokine antagonists or polyunsaturated fatty acids.^{47,73} Therefore, inflammation-related reductions in corticostriatal connectivity may serve as a potential predictor and target of response for a number of novel therapeutic strategies that inhibit inflammation or reverse its effects on dopamine or other neurotransmitter systems.

CONFLICT OF INTEREST

The authors declare no conflict of interest.

ACKNOWLEDGMENTS

We thank Evanthia Wommack and Robert Smith for technical assistance with laboratory assays and MRI data acquisition. This work was supported by funds from the National Institute of Mental Health to AHM (R01MH087604) and EH (K23MH091254) and by the Brain and Behavioral Research Foundation to JCF (BBRF22296). In addition, the study was supported in part by PHS Grants UL1TR000454 and KL2TR000455 from the Clinical and Translational Science Award program and by the NIH/NCI under award number P30CA138292.

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