

Original Article

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Thalamocortical connectivity and its relationship with symptoms and cognition across the psychosis continuum

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Abstract

Background. Coordination between the thalamus and cortex is necessary for efficient processing of sensory information and appears disrupted in schizophrenia. The significance of this disrupted coordination (i.e. thalamocortical dysconnectivity) to the symptoms and cognitive deficits of schizophrenia is unclear. It is also unknown whether similar dysconnectivity is observed in other forms of psychotic psychopathology and associated with familial risk for psychosis. Here we examine the relevance of thalamocortical connectivity to the clinical symptoms and cognition of patients with psychotic psychopathology, their first-degree biological relatives, and a group of healthy controls.

Method. Patients with a schizophrenia-spectrum diagnosis ($N = 100$) or bipolar disorder with a history of psychosis ($N = 33$), their first-degree relatives ($N = 73$), and a group of healthy controls ($N = 43$) underwent resting functional MRI in addition to clinical and cognitive assessments as part of the Psychosis Human Connectome Project. A bilateral mediodorsal thalamus seed-based analysis was used to measure thalamocortical connectivity and test for group differences, as well as associations with symptomatology and cognition.

Results. Reduced connectivity from mediodorsal thalamus to insular, orbitofrontal, and cerebellar regions was seen in schizophrenia. Across groups, greater symptomatology was related to less thalamocortical connectivity to the left middle frontal gyrus, anterior cingulate, right insula, and cerebellum. Poorer cognition was related to less thalamocortical connectivity to bilateral insula. Analyses revealed similar patterns of dysconnectivity across patient groups and their relatives.

Conclusions. Reduced thalamo-prefrontal-cerebellar and thalamo-insular connectivity may contribute to clinical symptomatology and cognitive deficits in patients with psychosis as well as individuals with familial risk for psychotic psychopathology.

Introduction

The thalamus holds rich connections to the cortex and cerebellum, and supports sensory perception and higher order cognitive functions (Sherman, 2016; Sherman & Guillery, 2002). Disruptions in thalamic circuitry are consequential and result in neurological disorders (Esmaeeli et al., 2019; Whitwell et al., 2011), psychiatric illness (Modell, Mountz, Curtis, & Greden, 1989; Tu et al., 2019; Woodward, Giraldo-Chica, Rogers, & Cascio, 2017), and disorders of consciousness (Yao et al., 2015). Evidence suggests that thalamic pathology is prominent in schizophrenia (Pergola, Selvaggi, Trizio, Bertolino, & Blasi, 2015) and bipolar disorder (Ng, Lau, Graham, & Sim, 2009), where abnormal thalamocortical connections may underlie aspects of the psychopathology including clinical symptoms and cognitive deficits (Steullet, 2020). But it is unclear which specific aspects of severe psychopathology are most related to thalamic pathology.

Prominent thalamic abnormalities have been observed in task-based functional MRI (fMRI) in psychosis (Andrews, Wang, Csernansky, Gado, & Barch, 2006; Çetin et al., 2014; Huang, Rogers, & Woodward, 2019), but recent work has shifted focus toward thalamocortical connectivity measured during rest. Seed-based resting-state thalamocortical connectivity has been extensively used to study the psychosis spectrum, and has revealed consistent patterns of thalamo-prefrontal hypoconnectivity (reflecting reduced connectivity from the thalamus to regions including the middle frontal and anterior cingulate cortex) and thalamo-sensory hyperconnectivity (characterized by increased thalamic connections to sensory areas including motor, temporal, and occipital regions) (Giraldo-Chica & Woodward, 2017; Ramsay, 2019). Interestingly, patients with stronger thalamo-sensory hyper-connections are found to have hypo-connected thalamo-prefrontal and thalamo-cerebellar connections, suggesting that

these thalamocortical abnormalities may arise from a common neural mechanism (Ramsay, 2019).

In comparisons with healthy control subjects, patterns of aberrant thalamocortical hyper/hypo-connectivity appear to be shared across schizophrenia (Anticevic et al., 2014a; Ferri et al., 2018) and bipolar disorder with psychosis (Anticevic et al., 2014a; Tu et al., 2019), as well as early-onset psychosis (Zhang et al., 2021), first-episode psychosis (Bergé, Lesh, Smucny, & Carter, 2020; Huang et al., 2021; Kwak et al., 2021; Penner et al., 2016; Woodward & Heckers, 2016), and chronic phases of the illness (Woodward, Karbasforoushan, & Heckers, 2012). In individuals affected by significant psychopathology, thalamocortical dysconnectivity patterns may reflect the severity of psychosis. For instance, patients with bipolar disorder I compared to bipolar disorder II show a pattern of hyper- and hypo-connectivity differences closer to that of schizophrenia patients (Tu et al., 2019).

Similar connectivity abnormalities have been observed in individuals at clinical high risk for developing psychosis (Anticevic et al., 2015; Fryer et al., 2021), as well as unaffected first-degree relatives of schizophrenia patients (Cho et al., 2019; Xi et al., 2020; Yao, Neggers, Kahn, & Thakkar, 2020), suggesting that thalamocortical dysconnectivity may reflect familial risk for psychosis and possibly serve as an endophenotype. Unaffected siblings of people with schizophrenia have been found to have an intermediate connectivity pattern between healthy controls and their affected siblings both during rest (Xi et al., 2020) and during an attentional control task (Antonucci et al., 2016). Similarly, individuals at clinical high risk for developing psychosis (with subthreshold psychosis symptoms) were found to have an intermediate resting connectivity pattern between healthy and early psychosis patients (Fryer et al., 2021). But while it appears that abnormalities in thalamocortical connectivity could reflect both risk for psychotic psychopathology and severity of psychopathology in affected individuals, it remains to be directly investigated within a single study sample whether thalamocortical dysconnectivity is central to the symptoms and cognitive deficits manifested in psychotic psychopathology, and whether a common pattern emerges across probands and first-degree biological relatives with elevated genetic liability.

Overall, research has focused on group differences in thalamocortical connectivity, highlighting the presence of disrupted thalamic circuitry in particular mental disorders, but with limited investigation of the relationship of dysconnectivity to symptoms and cognition. In a large study of schizophrenia ($N = 415$ patients and $N = 405$ healthy controls) examining brain-wise thalamocortical connections, investigators found positive psychotic symptoms to be associated with weaker thalamo-prefrontal connectivity; negative psychotic symptoms and general psychopathology were modestly related to both hyper- and hypo-connected brain areas throughout the cerebral cortex (Cheng et al., 2015). Similarly, a meta-analytic summary of seed-based connectivity studies revealed that thalamocortical hyperconnectivity in sensory regions was associated with both positive and negative symptoms of psychosis (Ramsay, 2019). Fewer studies have examined relationships between thalamocortical dysconnectivity and cognition. One study demonstrated a small, but significant relationship between increased thalamo-prefrontal connectivity and higher scores on a metric of global cognition (Woodward & Heckers, 2016). Another used whole-brain linear models to identify relationships of connectivity with cognitive sub-domains. This study revealed that poorer attention and processing speed related to higher thalamic connectivity in the pre/post-central gyrus, and lower connectivity to the cerebellum (Chen, Ye, Jin, Zhu, & Wang, 2019).

Dimensional rather than categorical characterizations of psychopathology can be an effective means of investigating the neurobiological basis of psychotic symptomatology and cognitive deficits in severe psychopathology (Baker et al., 2019; Barch, 2017; Buckholtz & Meyer-Lindenberg, 2012; Sheffield et al., 2017). Schizophrenia and bipolar disorder with psychosis likely share aspects of their etiologies (Forstner et al., 2017). Neural anomalies such as dysconnectivity that partially account for clinical symptoms and cognitive deficits that span schizophrenia and bipolar disorder with psychosis may reflect overlapping risk for the disorders. It is therefore useful to examine thalamocortical dysconnectivity and its relationship with dimensions of psychopathology by studying people with various psychiatric diagnoses and those with familial risk (i.e. transdiagnostic samples) in order to better understand covariation on neural and clinical phenomenology.

Here we report on an examination of thalamocortical connectivity patterns in relation to symptoms and cognition across the psychosis spectrum and attempt to clarify whether aberrant connectivity patterns are tied to specific aspects of clinical phenomenology. Specifically, we interrogate the mediodorsal thalamus, which is well known to have strong prefrontal connections (Pergola et al., 2018), and is implicated in higher-order cognitive processes (Antonucci et al., 2021). Previous findings indicate that the mediodorsal thalamus may be a locus of prominent thalamocortical dysfunction in both schizophrenia and bipolar disorder (Anticevic et al., 2014b), but is also implicated in transdiagnostic models of psychosis (Szeszko et al., 2022) and broader psychopathology (Gong et al., 2019). Mediodorsal thalamus has also been found to play a prominent role in the cognitive deficits observed in psychosis (Woodward & Heckers, 2016).

The current study used data collected from the Psychosis Human Connectome Project to examine thalamocortical connectivity in a sample of schizophrenia-spectrum subjects (including schizophrenia and schizoaffective disorder), individuals with bipolar disorder with psychotic features, first-degree relatives of individuals with psychosis, and a group of healthy controls. We sought to investigate the relationship of mediodorsal thalamocortical connectivity to clinical symptomatology and cognitive deficits associated with psychotic psychopathology. Given findings of previous investigations in human (Chen et al., 2019; Cheng et al., 2015; Ramsay, 2019; Woodward & Heckers, 2016) and animal models of psychosis (Parnaudeau et al., 2013; Parnaudeau, Bolkan, & Kellendonk, 2018), we hypothesized that increased symptoms (measured by the Brief Psychiatric Rating Scale; BPRS) across individuals regardless of diagnosis would relate to weaker thalamo-prefrontal connections and stronger thalamo-sensory connections, and worse global cognition (measured by the Brief Assessment of Cognition in Schizophrenia; BACS) would also relate to weaker thalamo-prefrontal connections similar to that observed previously (Woodward & Heckers, 2016).

Methods

Full methods related to data collection for the Psychosis Human Connectome Project are described elsewhere (Demro et al., 2021). Methodological considerations for the current study are described below.

Participants

A total of $N = 249$ participants were included in the current study, including psychosis probands with a schizophrenia-spectrum

diagnosis [SCZ; $N = 100$; including schizophrenia ($N = 82$) or schizoaffective disorder ($N = 18$)], psychosis probands with a bipolar-spectrum illness (BP; $N = 33$), first-degree biological relatives of psychosis probands (REL; $N = 73$; schizophrenia relatives: $N = 41$; schizoaffective relatives: $N = 11$; bipolar relatives: $N = 22$), and a sample of healthy controls (CON; $N = 43$). Participants were recruited from the community through advertisements, mental health providers, and mental health advocacy agencies in and around the Minneapolis metropolitan area. All participants were required to speak English as their primary language; have no legal guardian (or otherwise be able to provide informed consent); have an estimated IQ of 70 or greater; and have no history of seizures or other neurologic disorders including head injury with loss of consciousness >30 min, no history of electroconvulsive therapy in the past year, no significant hearing or vision problems, and no condition that would prevent participation in the study tasks or MRI procedures. SCZ, BP and CON participants were required to be between the ages of 18 and 65, while REL participants were required to be between the ages of 18 and 69. All participants underwent informed consent prior to study participation, and all study procedures were approved by the Institutional Review Board at the University of Minnesota.

Clinical and cognitive assessment

Participants underwent a clinical interview using the Structured Clinical Interview for DSM-IV-TR (First, Spitzer, Gibbon, Williams, & Others, 2002) and the psychosis module of the Diagnostic Interview for Genetics Studies (Nurnberger et al., 1994). In addition to obtaining demographic information, symptom ratings on all participants were collected using the BPRS – 24-item version (Ventura, Nuechterlein, Subotnik, Gutkind, & Gilbert, 2000). Clinical raters, trained to achieve an intraclass agreement of >0.80 with a gold standard, conducted clinical interviews to appraise symptom severity over the prior 30 days. BPRS total scores were additionally broken down into psychotic (positive, negative, and disorganized symptoms), manic, and depressed factor scores (Wilson & Sponheim, 2014). Cognitive assessment involved the paper version of the BACS (Keefe et al., 2004), with composite scores across cognitive domains that included verbal learning and memory, working memory, verbal fluency, motor speed, processing speed, and problem solving (Keefe et al., 2008). Handedness was assessed using the 10-item Edinburgh Handedness Inventory (Oldfield, 1971). Medication status was quantified through the use of defined daily doses to calculate chlorpromazine equivalents (CPZ; Leucht, Samara, Heres, & Davis, 2016).

Image acquisition

All images were collected using a Siemens 3-Tesla Prisma scanner and a 32-Channel head coil. The imaging procedures matched those developed for the Lifespan Human Connectome Projects (Harms et al., 2018). Multi-echo T_1 weighted MPRAGE images were collected with prospective motion correction using the following parameters: matrix = $300 \times 320 \times 208$; field of view (FOV) = $240 \times 256 \times 166$ mm; resolution = 0.8 mm isotropic; flip angle = 8° ; echo time (TE) = 1.81, 3.6, 5.39, 7.18 ms; repetition time (TR) = 2500 ms; inversion time (TI) = 1000 ms; acceleration factor (AF) = 2; length of scan = 8:22. In the same session, two resting-state fMRI scans were collected in opposite phase encoding directions: the first from anterior to posterior and the second

from posterior to anterior. Participants were instructed to keep their eyes open and fixated on a cross presented on a screen, to clear their mind of anything in particular, and to remain awake. Each scan had the following parameters: matrix = 104×104 ; FOV = 208×208 mm; resolution = 2 mm isotropic; flip angle = 52° ; TE = 37 ms; TR = 800 ms; slices/orientation = 72 oblique axial with 2 mm thickness; length of each scan = 6:41 min. Real-time assessment of subject motion was captured using Framewise Integrated Real-time MRI Monitoring (FIRMM), which allowed technicians to visually monitor in-scanner movement as the scan was being collected. A pair of spin echo images with AP and PA phase encoding with matching coverage and voxel size were acquired to correct the fMRI images geometric distortion caused by magnetic field inhomogeneities.

Image processing

Image pre-processing relied on the CONN toolbox's 'default pre-processing pipeline for volume-based analysis'. Functional data were realigned using SPM12, wherein all images were resampled and co-registered to the first scan of the first session. Functional outlier detection used the artifact detection toolbox, where images with a framewise displacement >0.9 mm or BOLD signal change >5 standard deviations above the mean were flagged. Then both structural and functional images underwent a unified non-linear normalization to the MNI template image as well as segmentation into gray matter, white matter, and cerebrospinal fluid (CSF) (Ashburner & Friston, 2005). Last, images underwent spatial smoothing using a Gaussian kernel of 8 mm full-width half-maximum.

Next, all images underwent de-noising using CONN's anatomical component-based noise correction (aCompCor) procedures (Behzadi, Restom, Liau, & Liu, 2007), which have been previously found to identify anticorrelated brain networks that are not the result of global signal regression (Chai, Castañón, Ongür, & Whitfield-Gabrieli, 2012). Linear regression of confounding variables included noise components from white matter and CSF, six realignment (motion) parameters and their derivatives, and outlier scans identified in pre-processing (motion scrubbing). Last, images were band-pass filtered from 0.008 to 0.09 Hz to minimize the influence of physiological noise. Quality control images were generated and individually inspected to ensure that functional connectivity values normally distributed after the completion of de-noising.

Connectivity analysis

Seed-based connectivity was computed first for each subject individually. The BOLD time series was extracted from the average across a structurally defined probabilistic bilateral mediadorsal 'prefrontal' thalamus ROI [Oxford Thalamic Connectivity Atlas; threshold = 25 (Behrens et al., 2003)]; and correlated with every voxel in the brain. The resulting map reflected the bi-variate Fisher's Z -transformed correlation value for each voxel. Analysis of group differences in connectivity was performed using a whole-brain F test (uncorrected voxel threshold of $p < 0.001$ and a FDR cluster threshold of $p < 0.01$); follow-up Tukey tests on connectivity values extracted from significant ROIs determined directionality of the effects.

To examine the relationship of thalamocortical connectivity with symptoms and cognition, we first we examined whole-brain group \times BPRS total/BACS total interactions to identify whether

slope differences were present between groups using an uncorrected voxel threshold of $p < 0.001$ and a FDR cluster threshold of $p < 0.01$. Next, based on our hypotheses, we performed common slope analyses (across all participants regardless of group membership and controlling for age and gender); two tailed significance was defined using an uncorrected voxel threshold of $p < 0.001$ and a FDR cluster threshold of $p < 0.01$. Post-hoc analyses testing for additional confounding factors of group membership, subject motion [mean translational motion displacement (Van Dijk, Sabuncu, & Buckner, 2012)], medications, handedness, and years of education were performed on extracted Fisher's Z -transformed values in R.

Next, to identify whether specific symptoms or cognitive domains were driving the observed effects, we performed post-hoc regressions in significant ROIs to examine the relationships between both BPRS symptom factor scores and cognitive subdomains with thalamocortical connectivity. We also performed common slopes analyses (as described above) examining whole-brain thalamocortical relationships with BPRS symptom subscales and BACS cognitive sub-domains. These results are reported in the online Supplementary material.

Results

Group differences

Groups differed on the basis of age, gender, and years of education, in addition to expected differences in medication status, on clinical measures of symptom severity (BPRS total and symptom factor scores), and on cognition (BACS total and sub-domain scores; Table 1). F tests (covarying for age and gender) examining group differences in connectivity identified four distinct clusters in the cerebellum, and bilateral insula/orbitofrontal cortex (Table 2; Fig. 1). Post-hoc Tukey's tests revealed that group differences in all cases were driven by reduced connectivity in the SCZ group.

Thalamocortical relationships with psychiatric symptoms

First we examined whole-brain group \times symptoms (BPRS) interactions (covarying for age and gender) to identify brain regions where the relationship between symptoms and connectivity differed by group. No voxels survived the FDR $p < 0.01$ cluster correction. Next we examined the relationship between symptoms and whole-brain thalamocortical connectivity across subjects (covarying for age and gender). Higher psychiatric symptoms corresponded to decreased thalamocortical connectivity in five clusters including the left middle frontal gyrus (LMFG), anterior cingulate cortex (ACC), right insula, and two clusters in the right cerebellum (Fig. 2; Table 3a). To determine whether the associations between symptoms and connectivity were driven by diagnosis/group, subject motion, medication status, or other potential confounds, we extracted connectivity values from each individual cluster for further analysis. In all five clusters when we re-ran the regression analysis covarying for group, mean motion, handedness, and years of education, the relationship between symptoms and connectivity remained significant (all p 's < 0.05). Similarly, in the subset of subjects taking antipsychotic medications, we found no relationships between CPZ equivalents and connectivity for any cluster (all Spearman's rho p 's > 0.14). We also performed post-hoc regression analyses between symptoms and ROI connectivity within each diagnostic group

individually (online Supplementary Table S1a). LMFG showed a significant relationship in the SCZ group ($t = -2.60$; $p = 0.03$) and a trend in the REL group ($t = -1.96$; $p = 0.05$), while the ACC showed a significant relationship in the REL group ($t = -2.31$; $p = 0.02$) and a trend in the SCZ group ($t = -1.98$; $p = 0.05$; full descriptions are available in the online Supplementary material).

Next, we performed follow-up regression analyses of BPRS factor scores for each extracted cluster to determine whether a particular symptom domain was the basis for association with overall symptomatology (online Supplementary Table S2). In all five ROIs, greater positive and negative psychotic symptomatology, as well as disorganized and depressive symptoms were all predictive of lower thalamocortical connectivity (all p 's < 0.04). Manic symptoms were unrelated to all ROIs (all p 's > 0.14) except for one in the cerebellum which revealed higher manic symptoms relating to reduced thalamo-cerebellar connectivity ($t = -2.47$; $p = 0.01$). These findings indicate that thalamocortical connectivity to prefrontal, cerebellar, and insular areas was related to all domains of psychotic symptomatology as well as depressive symptoms, but were generally unrelated to manic symptoms that are central to bipolar disorder. We also examined post-hoc symptom domain associations with brainwise thalamocortical connectivity. Higher positive symptoms (e.g. hallucinations/delusions) showed a relationship with reduced thalamocortical connectivity to bilateral insula and increased connectivity in right parahippocampal gyrus (see online Supplementary Fig. S1a and Table S4a). Increased depressed symptoms revealed a relationship with reduced left frontal pole and cerebellar connectivity (online Supplementary Fig. S1b and Table S4b).

Thalamocortical relationships with global cognition

We performed a whole-brain group \times cognition (BACS total) interaction analysis (covarying for age and gender) to determine if the relationship between thalamocortical connectivity and cognition differed by group. No voxels survived the FDR $p < 0.01$ cluster correction. Next, we examined the relationship between global cognition and whole-brain thalamocortical connectivity of subjects disregarding diagnosis (covarying for age and gender). Higher global cognitive scores on the BACS corresponded to greater thalamocortical connectivity in bilateral insula (Fig. 3; Table 3b). Again we determined whether significant results were better accounted for by effects of diagnosis, subject motion, medication status, or other potential confounds. We extracted connectivity values from the significant clusters and re-ran regressions in both clusters covarying for group, mean motion, handedness, and years of education. The relationship between global cognition and connectivity in both clusters remained significant (all p 's < 0.001). We examined the subset of subjects taking antipsychotic medications and found CPZ equivalents to be unrelated to connectivity for either cluster (all Spearman's rho p 's > 0.38). We also performed follow-up analyses to examine the relationships between cognition and ROI connectivity within each group individually (online Supplementary Table S1b). Significant relationships were observed in both the SCZ ($t = 2.82$; $p = 0.006$) and REL groups ($t = 2.31$; $p = 0.02$) in the right insula ROI, indicative of a putative endophenotype pattern (full descriptions are provided in the online Supplementary material).

We sought to determine whether a particular cognitive domain accounted for the association with the overall measure of cognition and carried out post-hoc regression analysis of the

Table 1. Demographic, clinical, and cognitive data

	CON (N = 43)	REL (N = 73)	BP (N = 33)	SCZ (N = 100)	F/χ^2 value	p value	Directionality
Age	38.72 (13.43)	44.36 (14.15)	32.64 (10.37)	40.15 (12.57)	6.50	0.0003	REL > BP; SCZ > BP
Gender (% female)	51.16	66.22	75.75	33.33	27.21	0.00003	–
Years education	15.88 (2.60)	15.05 (2.30)	15.18 (1.88)	13.48 (1.96)	15.10	4.76×10^{-9}	BP > SCZ; CON > SCZ; REL > SCZ
Handedness (% right)	93%	88%	87%	87%	3.09	0.31	–
Antipsychotic medication (%)	–	1.36%	69.70%	79.80%	–	–	–
Antipsychotic dosage (CPZ 100 mg/day)	–	1.50 (–)	1.99 (2.16)	5.12 (5.33)	4.26	0.02	SCZ > BP = REL
MRI motion (mean translation in mm)	0.048 (0.015)	0.050 (0.017)	0.054 (0.022)	0.064 (0.029)	7.74	0.00006	SCZ > CON; SCZ > REL
Clinical symptomatology (BPRS) total score	27.33 (4.03)	31.59 (5.74)	37.48 (8.46)	47.51 (12.27)	73.41	$<2 \times 10^{-16}$	SCZ > BP > REL = CON
Positive psychotic	5.05 (0.21)	5.40 (0.85)	6.03 (1.86)	12.51 (6.20)	61.55	$<2 \times 10^{-16}$	SCZ > CON; SCZ > REL; SCZ > BP
Negative psychotic	3.19 (0.76)	3.40 (1.02)	4.30 (1.96)	5.78 (2.61)	30.11	$<2 \times 10^{-16}$	SCZ > CON; SCZ > REL; SCZ > BP
Disorganized	4.51 (1.12)	5.52 (1.38)	6.45 (2.53)	7.98 (2.62)	35.38	$<2 \times 10^{-16}$	SCZ > BP > CON; SCZ > REL
Depression	4.00 (1.38)	5.52 (2.76)	6.70 (3.24)	6.67 (3.22)	12.50	1.25×10^{-7}	SCZ > REL > CON; BP > CON
Mania	3.33 (1.02)	3.33 (0.87)	4.36 (2.21)	4.09 (2.06)	5.44	0.001	BP > CON; BP > REL; SCZ > REL
Cognition (BACS) total	0.26 (0.68)	−0.02 (0.73)	−0.45 (0.61)	−0.92 (0.72)	38.79	$<2 \times 10^{-16}$	CON = REL > BP > SCZ
Verbal learning and memory	0.01 (0.98)	−0.68 (1.19)	−0.56 (1.07)	−1.39 (1.07)	16.54	8.05×10^{-10}	CON > REL > SCZ; BP > SCZ
Verbal working memory	0.27 (0.99)	0.11 (1.06)	−0.02 (0.94)	−0.74 (1.04)	15.13	2.14×10^{-8}	CON > REL; CON > SCZ; BP > SCZ
Verbal fluency	0.67 (1.09)	0.58 (1.22)	−0.03 (1.27)	−0.10 (1.17)	8.09	0.00004	CON > SCZ; REL > SCZ
Processing speed	0.56 (1.33)	0.25 (1.01)	−0.25 (1.07)	−0.97 (1.10)	26.85	4.75×10^{-15}	CON > BP; REL > SCZ; BP > SCZ
Motor speed	−0.25 (0.90)	−0.61 (1.35)	−1.29 (1.33)	−1.54 (1.17)	16.68	6.8×10^{-10}	CON > BP > SCZ; REL > SCZ; REL > BP
Problem solving	0.28 (0.79)	0.35 (0.77)	0.28 (1.01)	−0.36 (1.45)	6.75	0.0002	CON > SCZ; REL > SCZ; BP > SCZ

CON, controls; REL, relatives; SCZ, schizophrenia/schizoaffective disorder; BP, bipolar disorder; CPZ, chlorpromazine equivalents; BPRS, Brief Psychiatric Rating Scale; BACS, Brief Assessment of Cognition in Schizophrenia.

BACS subtests on the extracted connectivity values. In both the right and left insula clusters, higher scores on all subtests except for the Tower of London problem-solving domain were associated with greater connectivity (all p 's < 0.01; online Supplementary Table S3). Though these relationships appeared most strongly for the verbal fluency and verbal learning and memory subdomains, the results suggest that the degree of thalamocortical connectivity involving ACC and right insula accounts for broad variation in cognitive ability and is generally nonspecific with respect to cognitive domain. We also performed post-hoc analyses to examine brainwise relationships between cognitive subdomains and thalamocortical connectivity. Verbal fluency was found to predict increased thalamocortical connectivity to bilateral insula (online Supplementary Fig. S2a and Table S5a),

while motor speed was predictive of increased connectivity to bilateral occipital cortex, left insula, and right middle temporal gyrus (online Supplementary Fig. S2b and Table S5b).

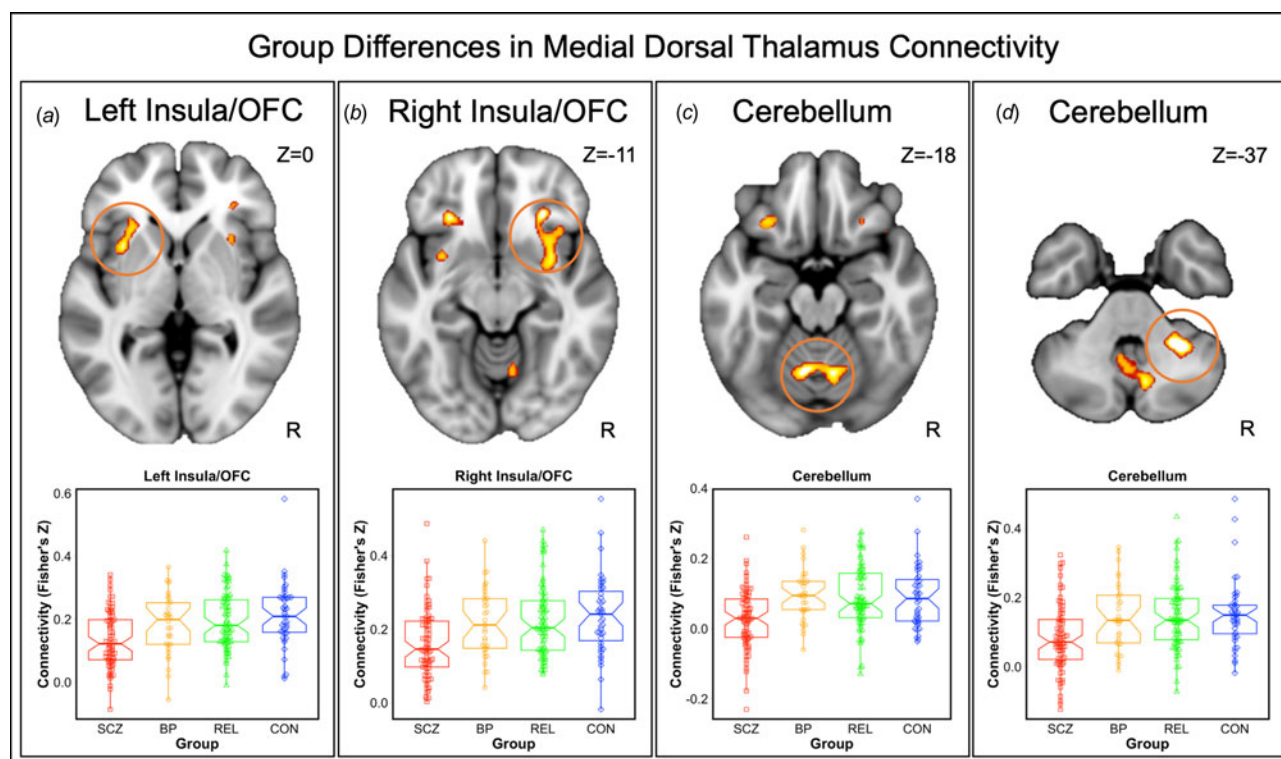
Discussion

To investigate thalamocortical dysconnectivity in psychotic psychopathology without the limitation of diagnostic boundaries, we adopted a transdiagnostic approach to examine associations between core aspects of psychotic psychopathology with connectivity between mediadorsal thalamus and cortex. In addition to observing group differences in thalamocortical connectivity (driven by reduced connectivity to insular, orbitofrontal, and cerebellar regions in the schizophrenia group), we found that variability

Table 2. Group differences in mediadorsal thalamocortical connectivity

Region	N-voxels	x	y	z	p FDR	Directionality
Right cerebellum	505	28	-46	-36	0.0006	SCZ < BP = REL = CON
Right insula/right orbitofrontal cortex	486	32	8	-8	0.0006	SCZ < BP = REL = CON
Left insula/left orbitofrontal cortex	365	-28	32	-6	0.002	SCZ < REL; SCZ < CON
Right cerebellum	310	8	-54	-32	0.004	SCZ < BP = REL = CON

Note: *F* test results comparing CON, REL, BP, and SCZ (uncorrected voxel threshold $p < 0.001$; FDR cluster threshold $p < 0.01$). Directionality is based on post-hoc Tukey tests ($p < 0.05$).

**Fig. 1.** Group differences in mediadorsal thalamocortical connectivity.

Note: *F* tests (covarying for age and gender) examined group differences in mediadorsal thalamocortical connectivity (uncorrected voxel threshold $p < 0.001$; FDR cluster threshold $p < 0.01$). We identified four distinct clusters in the (a) left insular/orbitofrontal cortex, (b) right insular/orbitofrontal cortex, and (c) and (d) and two clusters in the cerebellum. Post-hoc Tukey's tests revealed that group differences in all cases were driven by reduced connectivity in the SCZ group.

in thalamocortical connectivity was related to both symptoms and cognition regardless of psychiatric diagnosis and presence of diagnosable psychotic psychopathology. Similar patterns of dysconnectivity were observed across psychosis probands and first-degree biological relatives of probands (i.e. convergent relationships among probands and relatives between thalamo-insular connectivity and cognition), suggesting that thalamocortical disruptions involving insular brain regions may reflect familial risk for psychotic psychopathology. This interpretation is bolstered by the observation that first-degree relatives showed intermediate connectivity patterns between psychosis probands and healthy controls.

Overall, we found greater psychotic symptomatology and poorer cognition related to weaker thalamocortical connections. Higher scores on a clinician-rated measure of psychopathology (BPRS) were tied to reduced thalamocortical connectivity with frontal regions including the LMFG and the ACC, as well as the right insula and the cerebellum. This effect was driven most

strongly by positive psychotic symptoms including hallucinations and delusions, but similar patterns appeared with negative psychotic, disorganized, and depressive symptoms. Lower scores on a measure of global cognition corresponded to reduced thalamocortical connectivity in bilateral insula. These relationships were strongest for scores reflecting verbal fluency and verbal learning and memory, though most higher-order cognitive domains showed a similar pattern (with the exception of the problem-solving subdomain).

Previous work has also examined relationships between symptomatology and thalamocortical connectivity, typically yielding small positive relationships between thalamo-sensory hyperconnectivity and symptoms (Anticevic et al., 2014a; Ferri et al., 2018; Ramsay, 2019). Such patterns are also evident during ketamine modeling of psychosis (Abram et al., 2022). Unexpectedly, we observed that symptoms were related to hypo-connectivity between mediadorsal thalamus and both prefrontal and cerebellar areas. Yet, this pattern has been previously observed, where

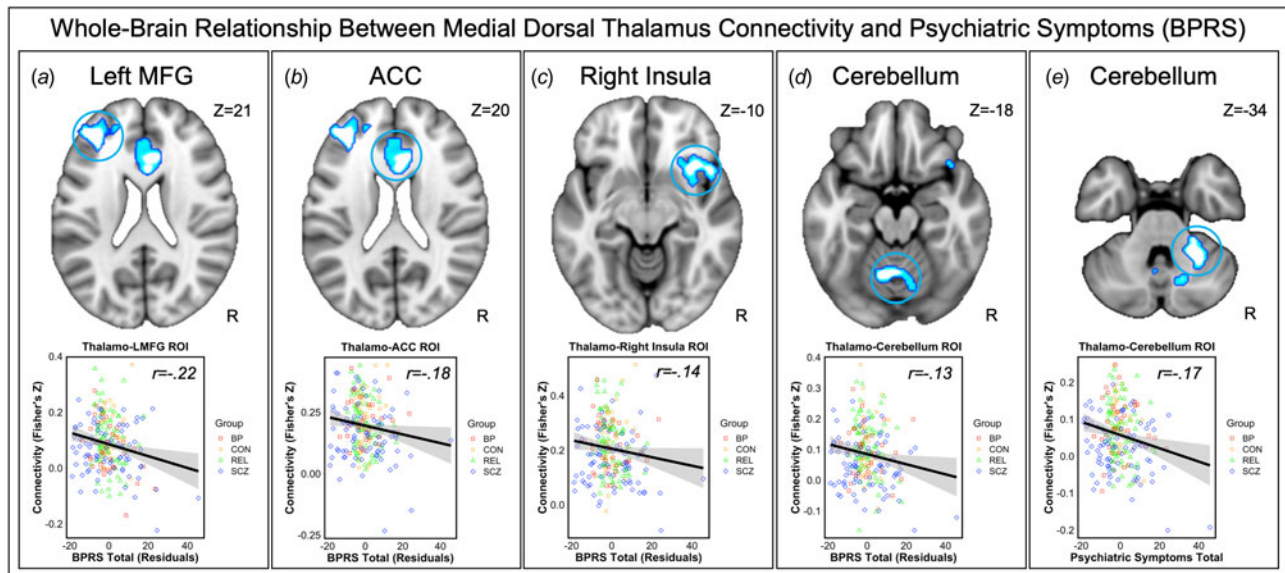


Fig. 2. Clusters significantly related to psychiatric symptoms across groups.

Note: Seeding from bilateral mediadorsal thalamus with covariates for age and gender, significant relationships with psychiatric symptoms (measured using the Brief Psychiatric Rating Scale; BPRS) were observed in (a) left middle frontal gyrus (LMFG), (b) anterior cingulate cortex (ACC), (c) right insula, (d) and (e) and two separate cerebellum clusters. For visualization purposes, the relationships between thalamocortical connectivity and BPRS total score (residualized for group, mean motion, handedness, and years of education) are depicted using a correlation value derived from a leave-one-subject-out analysis.

Table 3. Clusters significantly related to clinical symptomatology and global cognition across groups

	Whole brain analysis					ROI analysis with covariates	
	<i>N</i> -voxels	<i>x</i>	<i>y</i>	<i>z</i>	<i>p</i> FDR	<i>t</i> value	<i>p</i> value
(a) Psychiatric symptoms (BPRS total)							
Left middle frontal gyrus/frontal pole	783	-36	40	22	0.0002	-3.56	0.0005
Anterior cingulate cortex	608	4	16	20	0.0005	-2.96	0.003
Right insula/orbitofrontal cortex	604	36	20	-12	0.0005	-2.25	0.025
Right cerebellum	451	-4	-60	-18	0.002	-2.24	0.026
Right cerebellum	383	28	-46	-38	0.004	-2.95	0.003
(b) Global cognition (BACS total)							
Left insula/temporal cortex	1649	-54	0	-4	<0.0001	3.52	0.0005
Right insula/temporal cortex	2260	50	10	-10	<0.0001	4.00	0.00009

Note: Whole-brain analyses report coordinates observed in linear models across groups (uncorrected voxel threshold $p < 0.001$; FDR cluster threshold $p < 0.01$) for a) Psychiatric symptoms, and b) Global Cognition. Post-hoc analysis examined extracted ROIs with covariates for group, mean motion, handedness, and years of education.

increased positive symptoms (driven by delusions and bizarre behavior) were related to decreased thalamo-cerebellar connectivity (Ferri et al., 2018). Critically, this cerebellar circuitry has been found to be inversely correlated to hyper-connected sensory networks during rest (Ramsay, 2019).

Connectivity in dorsal ACC, anterior insula, and mediadorsal thalamus areas has been previously identified as the cingulo-opercular or 'salience' network (Seeley et al., 2007), and holds critical importance in the pathology associated with psychosis (Palaniyappan & Liddle, 2012). Integrity of this circuitry is hypothesized to support the attribution of significance to incoming stimuli, which when disrupted may result in aberrant salience attribution (manifesting as hallucinations or delusional ideation) or impaired cognitive functioning (Miyata, 2019). In the current

transdiagnostic sample we found that reduced mediadorsal connectivity with the anterior insula and ACC coincides with increased symptomatology. This is consistent with findings from individuals at clinical high risk for developing psychosis who showed relationships between salience network activity and distortions of reality (Wotruba et al., 2014), as well as individuals early on in the illness who were actively experiencing auditory-verbal hallucinations (Mallikarjun et al., 2018).

Relatedly, we also observed specific thalamo-insular disruptions that broadly related to impaired cognition. The importance of the anterior insula and its relationship to cognitive performance has been previously highlighted (Sheffield et al., 2015), as it may play a crucial interoceptive role that influences meta-cognitive aspects of cognitive and emotion processing

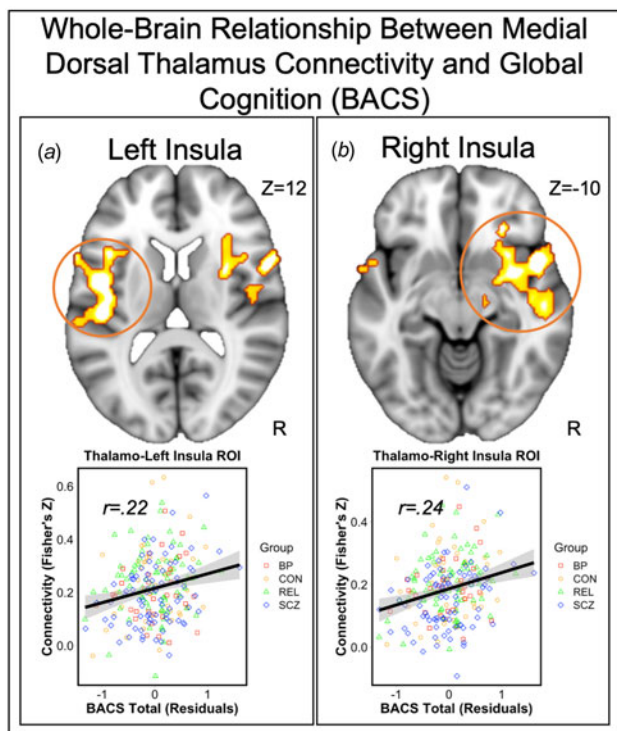


Fig. 3. Clusters significantly related to global cognition across groups. Note: Seeding from bilateral mediadorsal thalamus with covariates for age and gender, significant relationships with global cognition (measured using the Brief Assessment of Cognition in Schizophrenia; BACS) were observed in (a) left insula and (b) right insula regions. For visualization purposes, the relationships between thalamocortical connectivity and BACS score (residualized for group, mean motion, handedness, and years of education) are depicted using a correlation value derived from a leave-one-subject-out analysis.

(Gasquoise, 2014). Taken together, the current thalamo-ACC and thalamo-insular findings are consistent with prior evidence establishing salience network disruptions in relation to cognitive deficits in psychosis. It may also contextualize a lack of previous findings showing relationships between thalamocortical dysconnectivity and cognition, as much of this work examined these relationships in hypo-connected regions of the lateral prefrontal cortex and cerebellum.

Post-hoc analyses examining thalamocortical relationships within each group yielded similar patterns for SCZ and REL subjects in relationships between cognition and thalamo-insular connectivity. To a lesser extent, we also observed trend-level patterns among SCZ and REL subjects in both LMFG and ACC connectivity as they related to psychosis symptoms. Taken with previous findings that demonstrated intermediate thalamo-prefrontal connections in unaffected siblings of patients with schizophrenia (Xi et al., 2020), and similar patterns in bipolar patients (Tu et al., 2019), thalamocortical dysconnectivity may represent a psychosis endophenotype. This is bolstered by task-based findings demonstrating that mediadorsal connectivity to the prefrontal cortex during attentional control was similar between schizophrenia patients and their healthy siblings (Antonucci et al., 2016), and related to polygenic risk for schizophrenia (Antonucci et al., 2019). Together these findings reinforce the need to examine dimensional constructs of psychopathology to fully understand the role of thalamocortical dysconnectivity as it relates to familial and genetic risk for psychosis.

Relationships between psychopathology and thalamocortical connectivity observed across diagnoses may hold promise for identifying novel treatment targets in psychosis. Ongoing work has targeted both the left dorsolateral prefrontal cortex and temporo-parietal junction (adjacent to the insula) using non-invasive neuromodulation (e.g. transcranial electrical stimulation and transcranial magnetic stimulation) to reduce symptoms (Brunelin et al., 2012; Cole, Green Bernacki, Helmer, Pinninti, & O'reardon, 2015) and enhance cognition in psychosis (Gupta, Kelley, Pelletier-Baldelli, & Mittal, 2018). Such interventions may be informed by previous work showing that working memory training in schizophrenia yielded changes in intrinsic thalamo-ACC connectivity that corresponded to improvements in global cognition (Ramsay, Nienow, & MacDonald, 2017). A similar study targeting auditory perception and verbal working memory with cognitive training in first-episode schizophrenia revealed increases in thalamo-temporal connectivity (adjacent to the insula/temporal cortex region observed in the current analysis) that related to global cognitive improvements (Ramsay et al., 2020). Overall, the current findings further indicate that both frontal and temporal connectivity with the thalamus may be viable treatment targets to enhance cognition. Thalamo-prefrontal connectivity may also be a worthwhile neuromodulatory target given the relationship we identified with symptoms.

A major limitation was that the groups were not matched for age and gender, and by controlling for these factors in whole-brain models we may have removed meaningful variance associated with aspects of symptomatology and cognition. Relatedly, additional confounds such as effects of medication or group status were examined in post-hoc tests on data extracted from ROIs; ultimately, these analyses benefited from non-independent selection of voxels where connectivity was already found to be correlated with symptoms and cognition. We were also unable to test whether thalamocortical dysconnectivity fully meets criteria for an endophenotype. While patterns of dysconnectivity appeared to segregate between individuals with and without psychotic symptomatology, we did not formally assess whether these markers are heritable or state dependent (Ross & Freedman, 2015). Last, there are major limitations to brain-wide association studies in fMRI (Marek, Tervo-Clemmens, Calabro, & Montez, 2020), with varying approaches to data pre-processing and denoising that can influence connectivity. As the current study did not use an especially conservative approach in single-site data, multi-site consortium samples will likely be necessary to establish reliable brain-behavior relationships, as well as replication of the current findings in similar transdiagnostic samples.

In conclusion, we demonstrate that connectivity between the thalamus and prefrontal and insular brain areas may underlie symptoms (e.g. positive, negative, disorganized, and mood symptoms) and cognitive deficits that are prominent in individuals with psychotic psychopathology. Clearer understanding of the neural circuitry underlying psychosis in transdiagnostic samples will usher in the next generation of targeted treatments that can alter the neural mechanisms underlying psychotic psychopathology.

Supplementary material. The supplementary material for this article can be found at <https://doi.org/10.1017/S0033291722002793>

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