## Failed cooperative, but not competitive, interaction between large-scale brain networks impairs working memory in schizophrenia

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**Background.** A large-scale network named the default mode network (DMN) dynamically cooperates and competes with an external attention system (EAS) to facilitate various cognitive functioning that is prominently impaired in schizophrenia. However, it is unclear whether the cognitive deficit in schizophrenia is related to the disrupted competition and/or cooperation between these two networks.

**Method.** A total of 35 schizophrenia patients and 30 healthy controls were scanned using gradient-echo echo-planar imaging during *n*-back working memory (WM) processing. Brain activities of the DMN and EAS were measured using general linear modelling of the functional magnetic resonance imaging data. Dynamic interaction between the DMN and EAS was decomposed into two directions using Granger causality analysis.

Results. We observed a significant failure of DMN suppression in patients with schizophrenia, which was significantly related to WM/attentional deficit. Granger causality modelling showed that in healthy controls, while the EAS inhibitorily influenced the DMN, the DMN exerted an 'excitatory' or cooperative influence back on the EAS, especially in those with lower WM accuracy. In schizophrenia, this 'excitatory' DMN→EAS influence within the reciprocal EAS–DMN loop was significantly reduced, especially in patients with WM/attentional deficit.

**Conclusions.** The dynamic interaction between the DMN and EAS is likely to be comprised of both competitive and cooperative influences. In healthy controls, both the 'inhibitory' EAS→DMN interaction and 'excitatory' DMN→EAS interaction are correlated with WM performance. In schizophrenia, reduced 'cooperative' influence from the DMN to dorsal nodes of the EAS occurs in the context of non-suppression of the DMN and may form a possible pathophysiological substrate of WM deficit and attention disorder.

Received 29 April 2015; Revised 10 November 2015; Accepted 16 November 2015

Key words: Default mode network, dynamic interaction, external attention system, schizophrenia, working memory.

#### Introduction

Working memory (WM) deficit, a core feature of cognitive impairment in schizophrenia, appears to be a persistent phenomenon that is closely related to poor

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the activation of local brain regions responsible for high-order cognitive functions (e.g. prefrontal cortex; PFC), but also critically depends on the integration of large-scale brain networks (Sala-Llonch *et al.* 2012; Liang *et al.* 2015). Thus, investigation on the dynamic interaction of large-scale brain networks during WM processing in schizophrenia may help to provide further insight into the mechanism of WM deficits in this severe mental disorder.

Of the major brain networks regarding to WM deficits in schizophrenia, an external attention system (EAS) and a default mode network (DMN) have drawn the most intensive attention in this field (Whitfield-Gabrieli et al. 2009; Metzak et al. 2012; Anticevic et al. 2013; Fryer et al. 2013). The EAS, encompassing the dorsal prefrontal and parietal cortex, dorsal cingulate cortex and anterior insula, is often activated when performing external attention-demanding tasks, and has been directly related to top-down attentional and cognitive control (Fornito et al. 2012). In contrast, the DMN, mainly anchored at the midline brain regions, typically shows decreased activation during external cognitive processing, but increased activation during internal cognitive processing (e.g. self-referential thinking and autobiographical memory) (Buckner et al. 2008). In schizophrenia, robust evidence exists for both abnormal activation and functional dysconnectivity within the EAS during WM tasks (Kim et al. 2010; Barch & Ceaser, 2012; Kyriakopoulos et al. 2012; Anticevic et al. 2013), providing an important lead to the neural basis of WM deficits. Recently, hyperactivity (i.e. non-suppression) and hypo-connectivity in the DMN have also been observed in patients with schizophrenia during WM tasks (Whitfield-Gabrieli et al. 2009; Anticevic et al. 2013; de Leeuw et al. 2013). This hyperactivity of the DMN is proposed to reflect an inability of patients to reallocate the attentional resources away from introspectively oriented mental activity and towards the demands posed by external stimuli when performing cognitive tasks (Whitfield-Gabrieli et al. 2009). Considering the specific roles of both networks in attention control related to WM performance, one might anticipate that an abnormal dynamic interaction between the EAS and DMN could be a crucial neuropathological mechanism underlying WM deficits in schizophrenia.

Traditionally, resting-state fMRI studies indicate that the default network is anticorrelated with the task-positive network (i.e. EAS) (Fox et al. 2009). Recent evidence, however, suggests that these two networks may not always 'compete' (negatively correlated), but indeed 'cooperate' (positively correlated), during certain cognitive processes including attention (Spreng et al. 2010), WM (Bluhm et al. 2011) and recollection tasks (Fornito et al. 2012). This suggests that certain task

demands may reconfigure the dynamic interactions between these networks from an intrinsic state of competition into a task-dependent cooperation. Most importantly, both the negative and positive correlations between the EAS-DMN networks relate to better cognitive performance in healthy subjects (Eichele et al. 2008; Kelly et al. 2008; Leech et al. 2011; Fornito et al. 2012; Sala-Llonch et al. 2012; Wen et al. 2013). Thus on one hand, the greater anti-correlation between the two networks facilitates the attention to be shifted effectively from the introspective mental activity to extrospective processing (Fox et al. 2009; Sala-Llonch et al. 2012). On the other hand, the DMN (especially the posterior cingulate cortex; PCC) functions as a transitional module (or 'hub') in the brain (Margulies et al. 2009; Fornito et al. 2012; Leech et al. 2012), to integrate with other modules such as the EAS to support goaldirected cognitive processing. Therefore, optimal cognitive performance may rely on both 'competition' and 'cooperation' between the DMN and EAS, depending on the demands placed. In schizophrenia, despite the consistent demonstration of disrupted interaction between large-scale brain networks during resting state (Mannell et al. 2010; Liu et al. 2012), it is unclear whether and how this disruption influences the WM deficits seen in patients.

Recently, fMRI studies applying Granger causality analysis (GCA) in healthy subjects found that the DMN, in particular the PCC node, influences EAS activity during both resting-state (Uddin et al. 2009) and unconscious information processing (De Pisapia et al. 2012). Our prior work adopting GCA has revealed a breakdown of the salience-execution loop at rest (disrupted reciprocal causal connectivity between insula and dorsal PFC) in schizophrenia (Palaniyappan et al. 2013). Employing a well-established preprocessing pipeline for GCA in fMRI data, we studied the putative 'competitive' and 'cooperative' interactions between the EAS and DMN during an n-back WM task in patients with schizophrenia (SCZ) and healthy controls (HC). We expected to see reduced DMN suppression during the WM task in SCZ, and hypothesized that: (1) the dynamic interactions between the EAS and DMN would be disrupted in patients; (2) and both DMN suppression and disrupted EAS-DMN interaction would relate to WM performance in both groups and to clinically observed attention impairment in SCZ.

#### Method

#### **Participants**

Using the Structured Clinical Interview for DSM-IV – patient version (SCID-P) (First *et al.* 1996), 35 first-episode SCZ patients were recruited from in-

**Table 1.** Sociodemographic and behavioural variables of healthy controls and schizophrenia patients

Variables	Healthy controls $(n=30)$	Schizophrenia patients (n = 35)	
Female subjects, n (%)	15 (50)		
Age, years	21.2 (4.5)	21.8 (1.6)	
Education, years	13.4 (1.8)	12.5 (2.3)	
Course, months	-	7.7 (4.5)	
2-Back target accuracy**	0.80 (0.12)	0.56 (0.24)	
2-Back target response time, ms*	624 (127)	716 (147)	
2-Back non-target accuracy*	0.91 (0.08)	0.77 (0.31)	
2-Back non-target response time, ms	624 (118)	675 (232)	
SAPS total score	_	15.0 (8.7)	
SANS total score	-	27.6 (22.5)	
Attention disorder score	_	0.9 (1.2)	
Medication doses, mg	_	269.5 (204.3)	

Data are given as mean (standard deviation) unless otherwise indicated.

patient and out-patient units of the Department of Psychiatry, the Second Xiangya Hospital of Central South University, Changsha, Hunan province, People's Republic of China. The inclusion criteria were: (a) age between 18 and 45 years; (b) Han Chinese ethnicity; (c) 9 years of education or above; (d) right-handed by a determination of hand preference; (e) meeting DSM-IV criteria for schizophrenia; (f) total duration of illness  $\leq 18$  months. The exclusion criteria were: (a) any contra-indications to MRI scanning; (b) substance-related disorders; (c) recorded loss of consciousness (duration >5 min); (d) chronic neurological disorders or severe physical diseases. All the patients were receiving second-generation antipsychotic drugs, and all the medication doses were converted to chlorpromazine equivalence (50-1000 mg/day; Table 1). The clinical symptoms of the SCZ patients were evaluated by two experienced psychiatrists using the Scale for the Assessment of Positive Symptoms (Andreasen, 1984) and Scale for the Assessment of Negative Symptoms (Andreasen, 1983), in which the attention disorder subscale of the SANS was used to evaluate the attentional impairment in SCZ patients (Table 1).

We recruited 30 HC from a community sample in Changsha city. The inclusion and exclusion criteria were the same as those of the patient group except that the HC did not meet the DSM-IV diagnostic criteria of any psychiatric disorders when interviewed using the SCID non-patient version. All participants gave voluntary informed consent for participation in the study, with procedures approved by the ethics committee of the Second Xiangya Hospital of Central South University.

## Experimental design, fMRI data acquisition and analysis

The details of the task design, image acquisition protocol, preprocessing steps for the image data, and general linear model for brain activity analysis are presented in the online Supplementary Text, section S.1, S.2 and S.3, and also described elsewhere (Wu et al. 2014).

## Behavioural correlation analysis for brain activities

The task-related brain activity was calculated by averaging the statistical parameters of the contrast map (2-back v. resting state) in the seed regions across blocks and subjects. Then the brain activities in the above-defined seed regions were related to the 2-back target accuracy scores in the SCZ patients and the HC separately and to the SANS attention disorder scores in SCZ patients.

#### GCA

GCA has been employed in neuroscience to decompose the dynamic interaction between brain regions into directed causal influences (Ding et al. 2006; Friston et al. 2013). GCA is based on the notion that if including the historical information of one time series improves the prediction of the future states of another time series, then the first time series Granger-causes the second one. To test our hypothesis in the present study, Granger causalities were estimated in two directions both from the seed region (region of interest; ROI) to the whole brain and the opposite direction. By using the 'ROI to whole-brain

<sup>\*</sup> *p* < 0.05, \*\* *p* < 0.01.

and whole-brain to ROI' approach, instead of the 'ROI to ROI' method, we were able to establish that the brain networks of *a priori* interest had a robust effect that was not seen in other networks/regions, after stringent correction for the whole-brain analysis, thus establishing spatial specificity of the results.

The seed regions for the brain-wide GCA were defined by the clusters in DMN and EAS regions showing significantly altered activity in the SCZ patient group compared with that in the HC during the 2-back blocks. The DMN is often described to be comprised of the medial PFC (mPFC), PCC/precuneus (PCUN) and inferior parietal lobe (Buckner et al. 2008). The EAS, also called the task-positive or extrinsic network, consists of three divergent subsystems (Fornito et al. 2012), namely the fronto-parietal network (FPN) anchored at the dorsolateral PFC (DLPFC) and intra-parietal lobule (IPL) (Vincent et al. 2008), the dorsal attention network (DAN) (Fox et al. 2005; Corbetta et al. 2008) composed of the frontal eye field (FEF) and intra-parietal sulcus (IPS), and the salience network (SN) (Dosenbach et al. 2006; Seeley et al. 2007) mainly including the dorsal anterior cingulate cortex (dACC) and anterior insula. The FPN and DAN have been associated with top-down executive control and focusing attention on external stimuli respectively, and the SN has been implicated in processing salient stimuli and introspective awareness (Dosenbach et al. 2006; Corbetta et al. 2008; Sridharan et al. 2008; Vincent et al. 2008; Fornito et al. 2012). As reported in the Results section, our task activation analysis found abnormal activity in the DMN (i.e. reduced suppression of the bilateral mPFC and PCC/PCUN) in the SCZ group (online Supplementary Table S1), but not in the EAS regions. Thus, the bilateral clusters in the mPFC and PCC/PCUN, observed as reduced suppression in the 2-back WM task, were defined as the seed regions for the further GCA analysis. Then Granger causality was calculated in two directions both from the bilateral mPFC and PCC/PCUN to the whole brain and the opposite direction. Since no cluster with significantly abnormal activity was detected in the current study, we did not have any seed regions in the EAS.

In line with our prior fMRI studies (Palaniyappan et al. 2013), we used first-order GCA with the time lag of one repetition time (TR) (2000 ms) to study the directional effects and signed-path coefficients as the index of Granger causality. This signed path coefficient has been used in both rest (Chen et al. 2009; Palaniyappan et al. 2013) and task fMRI data analysis (Voon et al. 2010; Wu et al. 2012). A path coefficient of 0 indicates the absence of any directional Granger causal influence between two brain regions. The positive/negative path coefficients suggest that the change in the blood oxygen level-dependent (BOLD) signal

of the 'causal' region leads to the change in the BOLD signal of the 'effect' region in the same/opposite direction. We refer to the positive path as an 'excitatory' effect and the negative path as an 'inhibitory' effect (Palaniyappan et al. 2013) but this must be differentiated from the terms excitation/inhibition used in neurochemical models. To improve the reliability of the estimation of the causal coefficient, we averaged the estimated causal coefficients across the repeating four 2-back task blocks (Luo et al. 2013). Before carrying out GCA, we regressed out the six head movement parameters from the BOLD time series, and removed the first-order time trend together with the temporal mean from the time series in each block, to avoid the possible confounding effects (Ding et al. 2006). Using bivariate Granger causality (Hamilton et al. 2011), we established the path coefficient map for each subject. One-sample t tests were performed separately in SCZ patient and HC groups, to identify the brain regions with the most significant directional influences to and from the seed regions. The GCA maps of SCZ patients and HC were compared by two-sample t test [false discovery rate (FDR) correction, p < 0.05]. The results reported by GCA were systematically compared with the results in the literature, to make sure that the new insight of WM deficit in schizophrenia revealed by GCA is rooted in the published literature.

Since recent studies (Power et al. 2012; Van Dijk et al. 2012) have suggested that subtle head movement is an important confounding factor for fMRI functional connectivity (FC) analysis, we also performed 'scrubbing' to ensure that head-motion artifacts are not driving the observed effects. An estimate of head motion at each time-point was calculated as the frame-wise displacement (FD). Following previous studies as reported by Power et al. (2012), any image with FD>0.5 was removed and replaced by a linear interpolation. The mean absolute FD between HC and SCZ patients did not differ significantly (mean HC: 0.16 (s.p. = 0.06), mean SCZ: 0.19 (s.d. = 0.07), N.s.). After that, we repeated the calculation of GCA maps, which further entered into a contrast between HC and SCZ patients in a two-sample t test. The results were very similar with and without motion scrubbing.

# Behavioural correlation analysis for causal influences

Since the DMN-to-EAS influence was found altered in the SCZ patients, then the DMN-to-whole-brain maps were related to 2-back target accuracy scores in the SCZ patients and the HC separately and to the SANS attention disorder scores in the SCZ patients only. For multiple comparison correction for the behavioural

Table 2. Disrupted causal connectivity from bilateral PCC to whole brain in schizophrenia patients compared with healthy controls

Left PCC→			Right PCC→				
Regions	Peak coordinates: <i>x</i> , <i>y</i> , <i>z</i>	T value	Cluster size	Regions	Peak coordinates: <i>x</i> , <i>y</i> , <i>z</i>	T value	Cluster size
Reduced causal co	nnectivity						
Right FEF <sup>a</sup>	45, 6, 42	-4.54	59	Right FEF <sup>a</sup>	51, -6, 45	-4.87	497
dACC <sup>a</sup>	-3, 12, 42	-4.44	80	dACC <sup>a</sup>	3, -24, 45	-4.22	39
Left FEF <sup>a</sup>	-42, 3, 57	-4.15	14	Right IPS <sup>a</sup>	30, -60, 60	-4.16	52
Left IPS <sup>a</sup>	-15, -72, 63	-4.07	12	Left IPS <sup>a</sup>	-30, -72, 51	-4.52	83
Right MOG	45, -81, 6	-3.98	17	Right SFG-orbito	18, 42, -18	-4.43	163
Right MTG	66, -45, 6	-4.41	30	Right SMA	6, 9, 63	-5.53	624
Right PreCG	27, -21, 72	-5.33	85	Left SMG	-51, -42, -30	-4.55	68
Left SMG	-57, -33, 33	-4.28	24	Right fusiform	33, -66, -15	-5.18	518
Right PoCG	45, -24, 36	-4.77	81	Left PoCG	-63, -18, 24	-5.34	438
Calcarine	0, -93, 0	-6.47	230	Calcarine	-3, -96, 3	-6.34	943
Left IFG-orbito	-21, 12, -18	-4.39	21	Left IPL	-51, -36, 57	-4.16	17
				Right PaCL	6, -45, 60	-5.14	173
Increased causal co	onnectivity						
Right DLPFC <sup>a</sup>	45, 27, 48	4.07	8	Right DLPFC <sup>a</sup>	45, 33, 42	4.20	20
Right mPFC <sup>a</sup>	12, 63, 33	4.19	12	Right mPFC <sup>a</sup>	12, 60, 36	3.67	10

PCC, Posterior cingulate cortex; FEF, frontal eye field; dACC, dorsal anterior cingulate cortex; IPS, intra-parietal sulcus; MOG, middle occipital gyrus; SFG-orbito, superior frontal gyrus orbital pars; MTG, middle temporal gyrus; SMA, supplementary motor area; PreCG, precentral gyrus; SMG, supramarginal gyrus; PoCG, post-central gyrus; IFG-orbito, inferior frontal gyrus orbital pars; IPL, inferior parietal gyrus; PaCL, paracentral lobule; DLPFC, dorsal lateral prefrontal cortex; mPFC, medial prefrontal cortex.

correlation, a small volume correction centred at the peak voxels with a 3 mm radius sphere was conducted within the hypothesized EAS regions showing group differences in the GCA second-level analysis (Table 2).

#### Results

The sample characteristics are presented in Table 1, showing no differences in age, sex and years of education between the two groups. Compared with the HC group, the SCZ group showed reduced 2-back WM accuracy both for targets (p < 0.001) and non-targets (p < 0.05), and longer reaction time to targets (p < 0.05).

### Brain activation patterns during the 2-back WM task

During the 2-back WM task, the DMN regions were deactivated and the EAS regions were activated in both the HC and SCZ groups (online Supplementary Fig. S1). A two-sample t test (FDR correction, p < 0.05) showed that patients had significantly increased brain activity (i.e. 'non-suppression') in the DMN regions (Fig. 1b, and online Supplementary Table S1),

including the bilateral mPFC, PCC/PCUN, hippocampus and inferior parietal lobe. Other regions showing increased activity in SCZ included the cuneus, fusiform gyrus and temporal pole (online Supplementary Table S1). We found no areas showing significantly altered activity within the EAS regions in the SCZ patient group relative to the HC group. Averaged across all 2-back blocks, the mean signals detected at the group differential DMN regions are shown in Fig. 1a.

## Behavioural correlations of brain activities in DMN regions

Activity in the bilateral mPFC (left/right mPFC, r = 0.58/0.49, p < 0.001) and left PCC (LPCC) (r = 0.41, p < 0.01, Fig. 1c) was positively correlated with attention impairment in the SCZ patients. In addition, the activity of the right PCC (RPCC) showed a trend of significant correlation with attention impairment in the SCZ patients (r = 0.36, p = 0.059).

Consistent with previous studies, in the SCZ group, activity in the left mPFC was significantly and negatively associated with 2-back target accuracy (r = -0.416, p < 0.05); meanwhile, the activities in the

<sup>&</sup>lt;sup>a</sup> Regions corresponding to Fig. 2b.

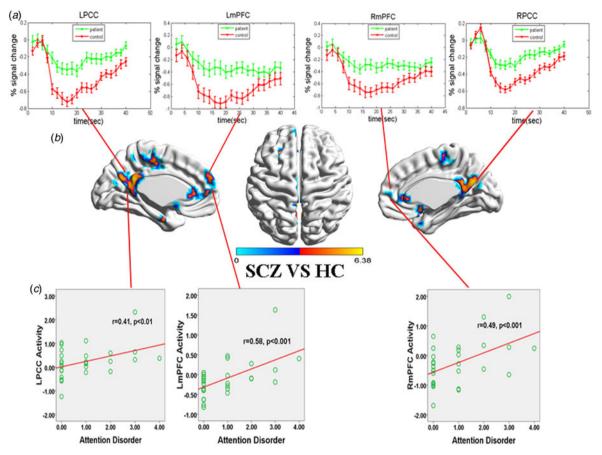


Fig. 1. Group differences in brain activity during the working memory (WM) task between healthy controls (HC) and schizophrenia (SCZ) patients. (a) Comparison of the mean blood oxygen level-dependent (BOLD) signals (percentage of change) averaged across all 2-back blocks in the SCZ group with that in the HC group. The error bars represent the standard error of the mean signal at each time point. LPCC, Left posterior cingulate cortex; LmPFC, left medial prefrontal cortex; RmPFC, right medial prefrontal cortex; RPCC, right posterior cingulate cortex. (b) The brain maps show two-sample t test maps of BOLD differences during the WM task between HC and SCZ (false discovery rate correction, p < 0.05). (c) Significant correlations between attention disorder and brain activity of default mode network regions with group differences during the 2-back task.

right mPFC and LPCC showed a trend of significant correlation with 2-back target accuracy (r = -0.337/-0.312, p = 0.07/0.09). A significant negative correlation between the activity of the left mPFC and 2-back target accuracy (r = -0.424, p < 0.05) was seen in HC.

To examine the between-group difference of correlation between task-induced activation and WM accuracy, we used the Fisher's r-to-z transform and found that the correlation between WM accuracy and task-induced DMN activation in the HC group was not significantly different from that in the SCZ group (LPCC: Fisher's z = 1.78, p = 0.08, RPCC: Fisher's z = 1.33, p = 0.18, left mPFC: Fisher's z = -0.03, p = 0.98, right mPFC: Fisher's z = 0.27, p = 0.79).

## Causal interactions between EAS and DMN

In the HC group, the EAS regions, including the bilateral DLPFC, FEF, IPS and dACC, exerted a significant

inhibitory influence (negative connectivity) on the four DMN seed regions, while only the bilateral PCC in the DMN exerted an excitatory influence (positive connectivity) on the EAS regions (one-sample t test, family-wise error correction, p < 0.05) (Fig. 2a and online Fig. S2).

## Abnormal causal connectivity between EAS and DMN in SCZ patients

Compared with HC, no significant differences in Granger causal connectivity were found from the whole brain, including the EAS regions, to the four seed DMN regions in the SCZ patients (FDR correction, p < 0.05). As for the DMN-to-whole-brain maps, significantly reduced Granger causal connectivity from the DMN nodes (bilateral PCC) to the FEF and IPS in the DAN, and to the dACC in the SN was seen in patients (Table 2). Moreover, we also observed

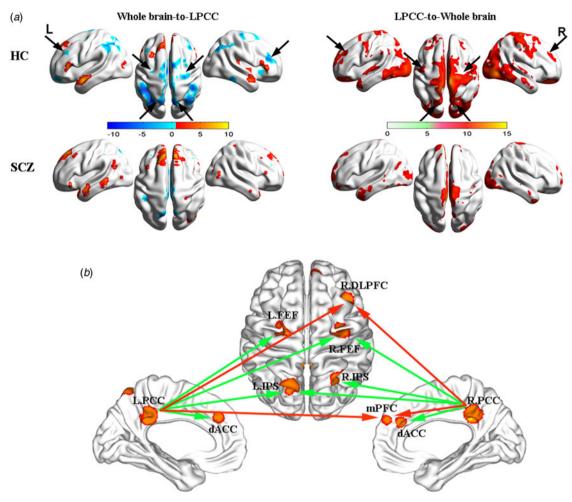


Fig. 2. Causal connectivity patterns involving the default mode network and external attention system (EAS) during the working memory (WM) task. (a) One-sample t test of whole-brain voxels-to-seed and seed-to-voxels causal connectivity of the left posterior cingulate cortex (LPCC) in the healthy control (HC) and schizophrenia (SCZ) groups, respectively [family-wise error correction, p < 0.05; see also online Supplementary Fig. S2 for right PCC (RPCC) and left/right medial prefrontal cortex (mPFC)]; the arrows point to the bilateral EAS regions. Colour bars indicate T values. (b) Path diagram of the abnormal causal connectivity from the bilateral PCC to the EAS regions [including the dorsolateral prefrontal cortex (DLPFC), dorsal anterior cingulated cortex (dACC), frontal eye field (FEF) and intra-parietal sulcus (IPS)] and right mPFC (two-sample t test, false discovery rate correction, p < 0.05; see also Table 2). Blue lines represent paths with reduced connectivity and the red lines represent paths with increased connectivity in SCZ patients compared with HC. L, Left; R, right.

an increase in the Granger causal connectivity from the bilateral PCC to the right DLPFC in the FPN, and to the right mPFC within the DMN network in the SCZ patients (Table 2) (To better visualize the disrupted causal connectivity between the DMN and EAS, see the path diagram; Fig. 2b.) In addition, Granger causal connectivity from the bilateral PCC to the bilateral visual, supplementary motor and temporal pole regions was also reduced in SCZ patients (Table 2). Of note, except for the increased coupling from the PCC to the DLPFC, the results were very similar with and without motion scrubbing (online Supplementary Fig. S3).

## Behavioural correlations with DMN-DAN Granger causal connectivity

In the SCZ group, we only observed significant behavioural correlations in DMN → DAN connectivity (FDR correction, p < 0.05) (Fig. 3a). The reduced Granger causal influence from the bilateral PCC to anterior DAN nodes (aDAN, bilateral FEF) was significantly related to poorer WM accuracy (left/right FEF: r = 0.546/0.437, p = 0.001/0.022) and higher attentional impairment (left/right FEF: r = -0.498/-0.501, p = 0.003/0.003). Surprisingly, the reduced Granger causal influence from the LPCC to posterior DAN nodes (pDAN, left

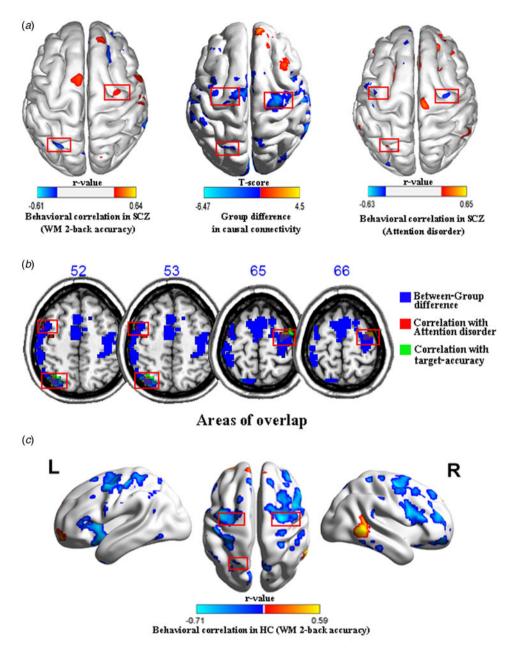


Fig. 3. Behavioural correlations with causal connectivity from the left posterior cingulate cortex (LPCC) to the anterior dorsal attention network (DAN) and posterior DAN. (a) The middle figure shows the t statistics of the between-group differences in the LPCC  $\rightarrow$  whole-brain causal connectivity [blue: schizophrenia (SCZ) < healthy controls (HC); red: SCZ > HC]. Left: correlation statistics of the relationship between 2-back accuracy and the LPCC  $\rightarrow$  whole-brain influence. Right: correlation statistics of the relationship between attention disorder scores and the LPCC  $\rightarrow$  whole-brain influence (red: positive correlation; blue: negative correlation). Anterior DAN (frontal eye field; FEF) and posterior DAN (intra-parietal sulcus; IPS) regions show opposing patterns of correlations. (b) Overlapping areas of between-group difference (blue areas), attention-disorder (red areas) correlation and working memory (WM) accuracy correlation (green areas) of the LPCC  $\rightarrow$  whole-brain effective connectivity. The red rectangles indicate the DAN regions including the FEF and IPS. (c) Behavioural correlation of the LPCC  $\rightarrow$  whole-brain causal connectivity with WM accuracy in the HC group. Anterior DAN (FEF) and posterior DAN (IPS) regions are highlighted within red boxes. L, Left; R, right.

IPS) was significantly related to better WM accuracy (r = -0.523, p = 0.008) and milder attentional impairment (r = 0.491, p = 0.003) (Fig. 3a). This similar pattern of behavioural correlations was noted for RPCC

Granger causal connectivity maps as well (online Supplementary Fig. S4). In addition, medication doses and illness courses had no significant correlations with this disrupted DMN  $\rightarrow$  EAS causal connectivity.

In the HC group, higher WM accuracy was associated with reduced influence from the LPCC to the aDAN (left/right FEF: r = -0.705/-0.698, p = 0.00003/0.00003) and pDAN (left IPS r = -0.604, p = 0.0005) (online Supplementary Fig. 3c). We also found significantly positive correlations between (intact) EAS → DMN negative causal connectivity and WM performance in the HC group (online Supplementary Fig. S5).

We also examined the between-group differences in the relationship between Granger causality connectivity and WM accuracy. The correlation between WM accuracy and PCC → aDAN (FEF) causal connectivity was significantly different between SCZ patients and HC (left FEF: Fisher's z=5.7, p<0.001, right FEF: Fisher's z = 5.1, p < 0.001, left IPS: Fisher's z = -0.42, p = 0.67, right IPS: Fisher's z = -0.14, p = 0.89).

#### Discussion

To our knowledge, this is the first study to decompose the dynamic interactions between large-scale brain networks, particularly the DMN and EAS (including the FPN, DAN and SN), into a pair of directed connections, to investigate a network model of WM deficit in schizophrenia. Beyond the well-known reducedsuppression of the DMN during the WM task in schizophrenia (Garrity et al. 2007; Pomarol-Clotet et al. 2008; Whitfield-Gabrieli et al. 2009; Fryer et al. 2013; Wu et al. 2014), a failure of DMN→EAS cooperative interaction was revealed and associated with WM deficit and attention disorder in patients, while the EAS - DMN interaction was relatively unaffected.

### Reduced DMN suppression in schizophrenia

Reduced DMN suppression during cognitive tasks has been previously observed in schizophrenia (Garrity et al. 2007; Pomarol-Clotet et al. 2008; Whitfield-Gabrieli et al. 2009; Fryer et al. 2013), even when the samples are performance matched (or adjusted) (Pomarol-Clotet et al. 2008; Whitfield-Gabrieli et al. 2009; Anticevic et al. 2013). Efficient DMN suppression has been proposed to be critical when performing attention-demanding tasks, to enable disengaging from distracting stimuli (such as daydreaming) and focusing on goal-related behaviour (Whitfield-Gabrieli et al. 2009; Yaakub et al. 2013). This notion has been supported by the observation that reduced DMN suppression is associated with attentional lapses (Weissman et al. 2006) and mind wandering (Mason et al. 2007) in healthy controls, and with attention impairments in patients with traumatic brain injury (Bonnelle et al. 2011). Our findings offer direct evidence, for the first time, on the involvement of DMN hyperactivity in clinical attentional impairment of schizophrenia.

## Competitive and collaborative DMN-EAS interactions and their functional roles in WM processing

In HC, we observed a reciprocal feedback loop, including a negative EAS -> DMN influence and a positive  $DMN \rightarrow EAS$ influence (Fig. **2**a and online Supplementary Fig. S2). This excitatory and inhibitory feedback loop may offer the substrate enabling both competitive and cooperative dynamism between the default network and attention network observed in previous studies (Fox et al. 2009; Margulies et al. 2009; Leech et al. 2011; Fornito et al. 2012). This lends further support to the emerging notion that the DMN and EAS are not essentially antagonistic systems, but are best viewed as networks that exist in a dynamic stability with reciprocal feedback influence (Cocchi et al. 2013).

The anticorrelation between the DMN and taskpositive networks, including the FPN, DAN and SN, has been consistently observed in healthy subjects (Fox et al. 2009). A healthy competition between these networks has been suggested to promote adaptive and efficient behaviours (Eichele et al. 2008; Kelly et al. 2008; Sala-Llonch et al. 2012). Consistently, the present study also observed that, in the HC, the greater negative EAS -> DMN causal-connectivity was related to better WM accuracy (online Supplementary Fig. S5), providing further insight that the inhibitory influence of the EAS over the DMN, along with DMN suppression, may facilitate goal-directed behaviours.

Recent studies using various fMRI paradigms have indicated the possibility of cooperative interactions between the DMN and EAS (Simons et al. 2008; Margulies et al. 2009; Bluhm et al. 2011; Leech et al. 2011; Fornito et al. 2012). Our results suggest that this cooperative interaction is possibly mediated through excitatory influence from the DMN to the EAS. Of note, the positive influence of the DMN on the EAS was only mediated by the PCC node in our data. Previous structural and functional neuroimaging studies have consistently identified the PCC as a centrality hub in the brain with connectivity to both DMN and EAS subregions (Hagmann et al. 2008; Margulies et al. 2009; Leech et al. 2012), suggesting that the PCC possibly serves as a bridge to support the EAS-DMN dynamic interaction. Consistent with our finding, Uddin et al. (2009) and De Pisapia et al. (2012) also found that the PCC caused the activity of EAS subregions in healthy subjects by using an effective connectivity approach. This observation also concurs with Raichle's hypothesis that the DMN and, in particular, the PCC, acting as an 'orchestra conductor' (Raichle, 2010), issues signals to task-relevant regions to coordinate distributed brain systems in preparation for

future events. Such cooperative interaction between PCC and EAS subregions has been found to be crucial for various cognitive processes including WM (Leech *et al.* 2011), attention (Wen *et al.* 2013), memory recollection (Fornito *et al.* 2012) and planning (Spreng *et al.* 2010).

## Impaired DMN-EAS collaboration in SCZ patients during WM processing and its implications

Of note, in our study the PCC did not efficiently influence EAS activity (in particular the DAN and SN) in patients, and the weakened DMN (PCC)  $\rightarrow$  aDAN (FEF) excitatory influence was associated with WM/attentional deficits (Fig. 3 and online Supplementary Fig. S4). This finding suggests a critical role of the failed DMN–EAS cooperation in the neuropathology of cognitive impairments in schizophrenia.

It is important to note that the proposed linear correlation between the DMN-EAS interaction and cognitive functioning may be an oversimplified model. Consistent with our observations in the HC group, Prado & Weissman (2011) noted that an increased interaction between the DMN and the PFC impeded optimal cognitive performance, suggesting an 'interference effect' of the DMN. However, in our study, in addition to reduced PCC to FEF/IPS influence, we noted that an increase of PCC to right FPN (i.e. DLPFC) in patients with schizophrenia, suggesting the possibility of spatially constrained, and possibly ineffective and/or compensatory, cooperative interaction between the DMN and right FPN in patients with prominent WM/attentional deficits. These seemingly conflicting observations that reduced DMN-EAS cooperation and increased DMN-EAS cooperation are both implicated in poor cognitive performance may be attributed to the multiple functional roles underpinned by the DMN, as the DMN (particularly for the PCC) sends not only coordinating signals to independent brain networks as a coordinator (Raichle, 2010; Leech & Sharp, 2013), but also internal noises as a processor for self-referential information (Buckner et al. 2008). Therefore, too much noise transference from the DMN to the EAS can also lead to poor cognitive performance. As observed in this study, the noise transference from the DMN to the DAN was also implied by the negatively behavioural correlation between WM performance and the DMN (PCC) → pDAN (IPS) causal connectivity in SCZ patients and the DMN  $\rightarrow$  a/pDAN causal connectivity in HC (Fig. 3). However, the increased  $PCC \rightarrow$ DLPFC coupling should be interpreted with caution, as we further showed that this increased coupling may be spurious after 'scrubbing' (Power et al. 2012) (online Supplementary Fig. S3), which suggests that the subtle head motions may confound the between-group effects on this particular causal connectivity in our data. Nevertheless, future studies with elegant design should lend further insight into the role of over-heightened EAS–DMN cooperation in the cognitive deficits of schizophrenia.

This complicated behavioural correlation pattern also suggests that the altered dynamic interactions of the DMN with aDAN and pDAN may involve distinctly neurological mechanisms with respect to the cognitive deficits in schizophrenia. Recently, convergent evidence from fMRI (Geng & Mangun, 2009), electroencephalogram (Li et al. 2010) and primate single cell studies (Buschman & Miller, 2007; Premereur et al. 2011) have revealed that the IPS is more probably implicated in bottom-up attention mechanisms and responsible for detecting salient stimuli that are irrelevant to ongoing processing, whereas the FEF may play a more specialized role in top-down attention control (Buschman & Miller, 2007; Suzuki & Gottlieb, 2013). These observations imply that IPS signals bottom-up capture of attention towards saliently goal-irrelevant stimulus, and that FEF activity brings the resolution of subsequent competition between salient distractor and target. Provided the influence from the PCC to FEF is minimal in the SCZ group compared with that in the HC group (as observed in this study), the top-down attention control system anchored on the FEF may not be driven as much by the internal PCC-based noises, thus enabling task performance.

## Strengths and limitations

To increase the statistical reliability of the results, we used a seed region to whole-brain scheme to assess the group differences in the Granger causal influences between SCZ patients and HC. In this way, all the group differences identified in this study survived the corrections for multiple comparisons in the whole brain rather than a few selected regions. Apart from the main findings, we also found abnormal interactions between the DMN and distributed brain regions including the sensory and visual cortices in patients. However, these reduced couplings did not show any significant associations with WM accuracy or attentional deficits in SCZ patients. The role of the DMN–sensory/visual cortical interaction in WM deficits in schizophrenia remains to be determined.

To exclude the possible confounding effect of the instant interactions on the causal influences between brain regions, we conducted a FC analysis. By comparing the FC maps between the HC and SCZ groups (please see the online Supplementary Fig. S6 and Supplementary Table S2), we found that the FC between the PCC and both the bilateral FEF and left

IPS were significantly reduced in the SCZ group. However, different from the GCA, the FC analysis did not find altered links between the DMN regions to the FPN (i.e. DLPFC) and SN (ACC), but showed reduced connection within the DMN, such as the FC between the PCC and temporal cortex. The above differences suggested that the GCA did bring us new insights beyond the instant interactions between brain regions given by FC analysis. Nevertheless, the partial overlap of findings strengthen the notion that the altered connectivity between the DMN (PCC) and DAN (FEF and IPS) may be seen independent of timelag patterns.

Our work has highlighted the importance of EAS-DMN interaction in cognitive functioning, and thus points to a potential mechanistic target for developing therapeutic interventions for schizophrenia in the future. Despite this promise, several limitations must be borne in mind while interpreting the results of this study. First, most of our patients were medicated. Although we did not find a significant correlation between the medication doses and the disrupted DMN -> EAS causal connectivity in our data, it has been reported that antipsychotics could affect FC among brain regions, at least in the short term (Lui et al. 2010). Second, in this study, based on the prior evidence that both the EAS and DMN are implicated in allocation of attentional resources, we hypothesized that disrupted interaction between the two networks might contribute to the schizophrenic attentional deficits. Although we showed robust evidence in SCZ patients that the DMN hyperactivity and failed EAS-DMN cooperation were both correlated with the attentional deficits measured out of the scanner, we did not apply a task to measure attention in this study. Future studies applying an attention task may provide further insight into the role of large-scale networks in the attentional deficits of schizophrenia. Third, due to the low temporal resolution offered by fMRI, the results from the application of GCA to fMRI data must be interpreted with caution. However, despite the criticism based on simulated data, physiologically meaningful differences have been observed when group comparisons in fMRI-based GCA are carried out on real data in disorders wherein the putative primary defect is not of vascular origin (Demirci et al. 2009; Hamilton et al. 2011; Schippers et al. 2011; Palaniyappan et al. 2013).

#### Conclusion

We reported an association between DMN nonsuppression during a WM task and clinically measured attention impairment in schizophrenia. At network impaired DMN → aDAN influence may level,

contribute to the neuropathology of WM deficits. Our observations underscore the importance of cooperative interaction among large-scale networks in the mechanism of cognitive dysfunction in schizophrenia, and raise the question whether restoring this failed cooperation of large-scale networks should be a treatment target for focused training, neuromodulation or pharmacotherapy approaches that purport to overcome WM deficits - one of the most persistent challenges in treating psychosis.

## Supplementary material

For supplementary material accompanying this paper please visit http://dx.doi.org/10.1017/S0033291715002755

### Acknowledgements

We thank Zhong He, the Second Xiangya Hospital, Central South University, for his assistance in fMRI data acquisition. This research was supported by grants from the National Natural Science Foundation of China (81401125 to W.P., 81271485 and 81071092 and 81561168021 to Z.L., 11101429 and 11471081 to Q.L., 81171287 to Z.X.), the National 973 Program of China (2011CB707800 to Z.L.), Specialized Research Fund for Doctoral Program of Higher Education (20110162110017 to Z.L. and 20114307120019 to Q.L.). J. F. is a Royal Society Wolfson Research Merit Award holder. J.F. is also partially supported by the National High Technology Research and Development Program of China (no. 2015AA020507), the key project of the Shanghai Science & Technology Innovation Plan (no. 15JC1400101), and the Shanghai Soft Science Research Program (no. 15692106604). The research was partially supported by the National Centre for Mathematics and Interdisciplinary Sciences (NCMIS) of the Chinese Academy of Sciences and Key Program of the National Natural Science Foundation of China (no. 91230201). L. P. is supported by a Wellcome Trust Fellowship (WT/ 11/096002).

#### **Declaration of Interest**

None.

#### References

Andreasen NC (1983). Scale for the Assessment of Negative Symptoms. University of Iowa: Iowa City, IA.

Andreasen NC (1984). Scale for the Assessment of Positive Symptoms. University of Iowa: Iowa City, IA.

Anticevic A, Repovs G, Barch DM (2013). Working memory encoding and maintenance deficits in schizophrenia: neural

- evidence for activation and deactivation abnormalities. *Schizophrenia Bulletin* **39**, 168–178.
- Barch DM, Carter CS, Braver TS, Sabb FW, MacDonald 3rd, A Noll DC, Cohen JD (2001). Selective deficits in prefrontal cortex function in medication-naive patients with schizophrenia. Archives of General Psychiatry 58, 280–288.
- Barch DM, Ceaser A (2012). Cognition in schizophrenia: core psychological and neural mechanisms. *Trends in Cognitive Sciences* **16**, 27–34.
- Bluhm RL, Clark CR, McFarlane AC, Moores KA, Shaw ME, Lanius RA (2011). Default network connectivity during a working memory task. *Human Brain Mapping* 32, 1029–1035.
- Bonnelle V, Leech R, Kinnunen KM, Ham TE, Beckmann CF, De Boissezon X, Greenwood RJ, Sharp DJ (2011). Default mode network connectivity predicts sustained attention deficits after traumatic brain injury. *Journal of Neuroscience* 31, 13442–13451.
- Buckner RL, Andrews-Hanna JR, Schacter DL (2008). The brain's default network: anatomy, function, and relevance to disease. Annals of the New York Academy of Science 1124, 1–38.
- Buschman TJ, Miller EK (2007). Top-down versus bottom-up control of attention in the prefrontal and posterior parietal cortices. Science 315, 1860–1862.
- Chen G, Hamilton JP, Thomason ME, Gotlib IH, Saad ZS, Cox RW (2009). Granger causality via vector auto-regression tuned for fMRI data analysis. Proceedings of the International Society for Magnetic Resonance in Medicine 17, 1718.
- Cocchi L, Zalesky A, Fornito A, Mattingley JB (2013).
  Dynamic cooperation and competition between brain systems during cognitive control. *Trends in Cognitive Science* 17. 493–501.
- Corbetta M, Patel G, Shulman GL (2008). The reorienting system of the human brain: from environment to theory of mind. *Neuron* 58, 306–324.
- Coyle JT (2006). Glutamate and schizophrenia: beyond the dopamine hypothesis. Cell and Molecular Neurobiology 26, 365–384
- de Leeuw M, Kahn RS, Zandbelt BB, Widschwendter CG, Vink M (2013). Working memory and default mode network abnormalities in unaffected siblings of schizophrenia patients. *Schizophrenia Research* **150**, 555–562.
- Demirci O, Stevens MC, Andreasen NC, Michael A, Liu J, White T, Pearlson GD, Clark VP, Calhoun VD (2009). Investigation of relationships between fMRI brain networks in the spectral domain using ICA and Granger causality reveals distinct differences between schizophrenia patients and healthy controls. *NeuroImage* 46, 419–431.
- De Pisapia N, Turatto M, Lin P, Jovicich J, Caramazza A (2012). Unconscious priming instructions modulate activity in default and executive networks of the human brain. *Cerebral Cortex* **22**, 639–649.
- Ding M, Chen Y, Bressler SL (2006). Granger causality: basic theory and application to neuroscience. In *Handbook of Time Series Analysis: Recent Theoretical Developments and Applications* (ed. B. Schelter, M. Winterhalder and J. Timmer), chapter 17. Wiley-VCH Verlag GmbH & Co. KGaA: Weinheim, Germany.

- Dosenbach NU, Visscher KM, Palmer ED, Miezin FM, Wenger KK, Kang HC, Burgund ED, Grimes AL, Schlaggar BL, Petersen SE (2006). A core system for the implementation of task sets. *Neuron* **50**, 799–812.
- Eichele T, Debener S, Calhoun VD, Specht K, Engel AK, Hugdahl K, von Cramon DY, Ullsperger M (2008).

  Prediction of human errors by maladaptive changes in event-related brain networks. *Proceedings of the National Academy of Sciences USA* **105**, 6173–6178.
- First MB, Spitzer RL, Gibbon M (editors) (1996). Structured Clinical Interview for DSM-IV Axis I Disorder-Patient Edition (SCID-I/P). Biometrics Research Department, New York State Psychiatric Institute: New York.
- Fornito A, Harrison BJ, Zalesky A, Simons JS (2012). Competitive and cooperative dynamics of large-scale brain functional networks supporting recollection. *Proceedings of the National Academy of Sciences USA* **109**, 12788–12793.
- Fox MD, Snyder AZ, Vincent JL, Corbetta M, Van Essen DC, Raichle ME (2005). The human brain is intrinsically organized into dynamic, anticorrelated functional networks. *Proceedings of the National Academy of Sciences USA* **102**, 9673–9678.
- Fox MD, Zhang D, Snyder AZ, Raichle ME (2009). The global signal and observed anticorrelated resting state brain networks. *Journal of Neurophysiology* **101**, 3270–3283.
- Friston K, Moran R, Seth AK (2013). Analysing connectivity with Granger causality and dynamic causal modelling. *Current Opinion in Neurobiology* **23**, 172–178.
- Fryer SL, Woods SW, Kiehl KA, Calhoun VD, Pearlson GD, Roach BJ, Ford JM, Srihari VH, McGlashan TH, Mathalon DH (2013). Deficient suppression of default mode regions during working memory in individuals with early psychosis and at clinical high-risk for psychosis. *Frontiers in Psychiatry* **4**, 92.
- Garrity A, Pearlson G, McKiernan K, Lloyd D, Kiehl K, Calhoun V (2007). Aberrant "default mode" functional connectivity in schizophrenia. American Journal of Psychiatry 164, 450–457.
- Geng JJ, Mangun GR (2009). Anterior intraparietal sulcus is sensitive to bottom-up attention driven by stimulus salience. *Journal of Cognitive Neuroscience* 21, 1584–1601.
- Hagmann P, Cammoun L, Gigandet X, Meuli R, Honey CJ, Wedeen VJ, Sporns O (2008). Mapping the structural core of human cerebral cortex. PLoS Biology 6, e159.
- Hamilton JP, Chen G, Thomason ME, Schwartz ME, Gotlib IH (2011). Investigating neural primacy in major depressive disorder: multivariate Granger causality analysis of resting-state fMRI time-series data. *Molecular Psychiatry* 16, 763–772.
- Kelly AM, Uddin LQ, Biswal BB, Castellanos FX, Milham MP (2008). Competition between functional brain networks mediates behavioral variability. NeuroImage 39, 527–537.
- Kim MA, Tura E, Potkin SG, Fallon JH, Manoach DS, Calhoun VD; FBIRN, Turner JA (2010). Working memory circuitry in schizophrenia shows widespread cortical inefficiency and compensation. Schizophrenia Research 117, 42–51.
- Kyriakopoulos M, Dima D, Roiser JP, Corrigall R, Barker GJ, Frangou S (2012). Abnormal functional activation and connectivity in the working memory network in early-onset

- schizophrenia. Journal of the American Academy of Child and Adolescent Psychiatry 51, 911-920.e2.
- Leech R, Braga R, Sharp DJ (2012). Echoes of the brain within the posterior cingulate cortex. Journal of Neuroscience 32, 215-222.
- Leech R, Kamourieh S, Beckmann CF, Sharp DJ (2011). Fractionating the default mode network: distinct contributions of the ventral and dorsal posterior cingulate cortex to cognitive control. Journal of Neuroscience 31,
- Leech R, Sharp DJ (2013). The role of the posterior cingulate cortex in cognition and disease. Brain 137, 12-32.
- Lett TA, Voineskos AN, Kennedy JL, Levine B, Daskalakis ZJ (2014). Treating working memory deficits in schizophrenia: a review of the neurobiology. Biological Psychiatry 75, 361-370.
- Li L, Gratton C, Yao D, Knight RT (2010). Role of frontal and parietal cortices in the control of bottom-up and top-down attention in humans. Brain Research 1344, 173-184.
- Liang X, Zou Q, He Y, Yang Y (2015). Topologically reorganized connectivity architecture of default-mode, executive-control, and salience networks across working memory task loads. Cerebral Cortex. Published online 16 January 2015. doi:10.1093/cercor/bhu316.
- Liu H, Kaneko Y, Ouyang X, Li L, Hao Y, Chen EY, Jiang T, Zhou Y, Liu Z (2012). Schizophrenic patients and their unaffected siblings share increased resting-state connectivity in the task-negative network but not its anticorrelated task-positive network. Schizophrenia Bulletin 38, 285-294.
- Lui S, Li T, Deng W, Jiang L, Wu Q, Tang H, Yue Q, Huang X, Chan RC, Collier DA (2010). Short-term effects of antipsychotic treatment on cerebral function in drug-naive first-episode schizophrenia revealed by "resting state" functional magnetic resonance imaging. Archives of General Psychiatry 67, 783-792.
- Luo Q, Ge T, Grabenhorst F, Feng J, Rolls ET (2013). Attention-dependent modulation of cortical taste circuits revealed by Granger causality with signal-dependent noise. PLoS Computational Biology 9, e1003265.
- MacDonald AW, Schulz SC (2009). What we know: findings that every theory of schizophrenia should explain. Schizophrenia Bulletin 3, 493-508.
- Mannell MV, Franco AR, Calhoun VD, Canive JM, Thoma RJ, Mayer AR (2010). Resting state and task-induced deactivation: a methodological comparison in patients with schizophrenia and healthy controls. Human Brain Mapping 31, 424-437.
- Manoach DS, Gollub RL, Benson ES, Searl MM, Goff DC, Halpern E, Saper CB, Rauch SL (2000). Schizophrenic subjects show aberrant fMRI activation of dorsolateral prefrontal cortex and basal ganglia during working memory performance. Biological Psychiatry 48, 99-109.
- Margulies DS, Vincent JL, Kelly C, Lohmann G, Uddin LQ, Biswal BB, Villringer A, Castellanos FX, Milham MP, Petrides M (2009). Precuneus shares intrinsic functional architecture in humans and monkeys. Proceedings of the National Academy of Sciences USA 106, 20069-20074.
- Mason MF, Norton MI, Van Horn JD, Wegner DM, Grafton ST, Macrae CN (2007). Wandering minds: the default

- network and stimulus-independent thought. Science 315, 393-395.
- Metzak PD, Riley JD, Wang L, Whitman JC, Ngan ET, Woodward TS (2012). Decreased efficiency of task-positive and task-negative networks during working memory in schizophrenia. Schizophrenia Bulletin 38, 803-813.
- Minzenberg MJ, Carter CS (2012). Developing treatments for impaired cognition in schizophrenia. Trends in Cognitive Sciences 16, 35-42.
- Palaniyappan L, Simmonite M, White TP, Liddle EB, Liddle PF (2013). Neural primacy of the salience processing system in schizophrenia. Neuron 79, 814-828.
- Pomarol-Clotet E, Salvador R, Sarro S, Gomar J, Vila F, Martinez A, Guerrero A, Ortiz-Gil J, Sans-Sansa B, Capdevila A, Cebamanos JM, McKenna PJ (2008). Failure to deactivate in the prefrontal cortex in schizophrenia: dysfunction of the default mode network? Psychological Medicine 38, 1185-1193.
- Power JD, Barnes KA, Snyder AZ, Schlaggar BL, Petersen SE (2012). Spurious but systematic correlations in functional connectivity MRI networks arise from subject motion. NeuroImage 59, 2142-2154.
- Prado J, Weissman DH (2011). Heightened interactions between a key default-mode region and a key task-positive region are linked to suboptimal current performance but to enhanced future performance. NeuroImage 56, 2276-2282.
- Premereur E, Vanduffel W, Janssen P (2011). Functional heterogeneity of macaque lateral intraparietal neurons. Journal of Neuroscience 31, 12307-12317.
- Raichle ME (2010). The brain's dark energy. Scientific American 302, 44-49.
- Sala-Llonch R, Pena-Gomez C, Arenaza-Urquijo EM, Vidal-Pineiro D, Bargallo N, Junque C, Bartres-Faz D (2012). Brain connectivity during resting state and subsequent working memory task predicts behavioural performance. Cortex 48, 1187-1196.
- Schippers MB, Renken R, Keysers C (2011). The effect of intra- and inter-subject variability of hemodynamic responses on group level Granger causality analyses. NeuroImage 57, 22-36.
- Seeley WW, Menon V, Schatzberg AF, Keller J, Glover GH, Kenna H, Reiss AL, Greicius MD (2007). Dissociable intrinsic connectivity networks for salience processing and executive control. Journal of Neuroscience **27**, 2349–2356.
- Simons JS, Henson RN, Gilbert SJ, Fletcher PC (2008). Separable forms of reality monitoring supported by anterior prefrontal cortex. Journal of Cognitive Neuroscience 20, 447-457.
- Spreng RN, Stevens WD, Chamberlain JP, Gilmore AW, Schacter DL (2010). Default network activity, coupled with the frontoparietal control network, supports goal-directed cognition. NeuroImage 53, 303-317.
- Sridharan D, Levitin DJ, Menon V (2008). A critical role for the right fronto-insular cortex in switching between central-executive and default-mode networks. Proceedings of the National Academy of Sciences USA 105, 12569-12574.

- **Suzuki M, Gottlieb J** (2013). Distinct neural mechanisms of distractor suppression in the frontal and parietal lobe. *Nature Neuroscience* **16**, 98–104.
- Uddin LQ, Kelly AM, Biswal BB, Castellanos FX, Milham MP (2009). Functional connectivity of default mode network components: correlation, anticorrelation, and causality. *Human Brain Mapping* 30, 625–637.
- Van Dijk KR, Sabuncu MR, Buckner RL (2012). The influence of head motion on intrinsic functional connectivity MRI. NeuroImage 59, 431–438.
- Vincent JL, Kahn I, Snyder AZ, Raichle ME, Buckner RL (2008). Evidence for a frontoparietal control system revealed by intrinsic functional connectivity. *Journal of Neurophysiology* **100**, 3328–3342.
- Voon V, Brezing C, Gallea C, Ameli R, Roelofs K, LaFrance Jr. WC, Hallett M (2010). Emotional stimuli and motor conversion disorder. *Brain* 133, 1526–1536.
- Weissman D, Roberts K, Visscher K, Woldorff M (2006). The neural bases of momentary lapses in attention. *Nature Neuroscience* 9, 971–978.

- Wen X, Liu Y, Yao L, Ding M (2013). Top-down regulation of default mode activity in spatial visual attention. *Journal of Neuroscience* 33, 6444–6453.
- Whitfield-Gabrieli S, Thermenos HW, Milanovic S, Tsuang MT, Faraone SV, McCarley RW, Shenton ME, Green AI, Nieto-Castanon A, LaViolette P (2009). Hyperactivity and hyperconnectivity of the default network in schizophrenia and in first-degree relatives of persons with schizophrenia. *Proceedings of the National Academy of Sciences USA* **106**, 1279.
- Wu G, Wang Y, Mwansisya TE, Pu W, Zhang H, Liu C, Yang Q, Chen EY, Xue Z, Liu Z, Shan B (2014). Effective connectivity of the posterior cingulate and medial prefrontal cortices relates to working memory impairment in schizophrenic and bipolar patients. *Schizophrenia Research* **158**, 85–90.
- Wu T, Wang J, Wang C, Hallett M, Zang Y, Wu X, Chan P (2012). Basal ganglia circuits changes in Parkinson's disease patients. *Neuroscience Letters* 524, 55–59.
- Yaakub SN, Dorairaj K, Poh JS, Asplund CL, Krishnan R, Lee J, Keefe RS, Adcock RA, Wood SJ, Chee MW (2013). Preserved working memory and altered brain activation in persons at risk for psychosis. *American Journal of Psychiatry* 170, 1297–1307.