

**A peer-reviewed version of this preprint was published in PeerJ on 1 May 2014.**

[View the peer-reviewed version](https://peerj.com/articles/367) (peerj.com/articles/367), which is the preferred citable publication unless you specifically need to cite this preprint.

Di X, Biswal BB. 2014. Modulatory interactions between the default mode network and task positive networks in resting-state. PeerJ 2:e367 <https://doi.org/10.7717/peerj.367>

# Modulatory Interactions between the Default Mode Network and Task Positive Networks in Resting-State

Communications between different brain systems are critical to support complex brain functions. Unlike generally high functional connectivity between brain regions from same system, functional connectivity between regions from different systems are more variable. In the present study, we examined whether the connectivity between different brain networks were modulated by other regions by using physiophysiological interaction (PPI) on resting-state functional magnetic resonance imaging data. Spatial independent component analysis was first conducted to identify the default mode network (DMN) and several task positive networks, including the salience, dorsal attention, left and right executive networks. PPI analysis was conducted between pairs of these networks to identify networks or regions that showed modulatory interactions with the two networks. Network-wise analysis revealed reciprocal modulatory interactions between the DMN, salience, and executive networks. Together with the anatomical properties of the salience network regions, the results suggest that the salience network may modulate the relationship between the DMN and executive networks. In addition, voxel-wise analysis demonstrated that the basal ganglia and thalamus positively interacted with the salience network and the dorsal attention network, and negatively interacted with the salience network and the DMN. The results demonstrated complex relationships among brain networks in resting-state, and suggested that between network communications of these networks may be modulated by some critical brain structures such as the salience network, basal ganglia, and thalamus.

1 **Modulatory Interactions between the Default Mode Network and Task Positive Networks in**  
2 **Resting-State**

3 Xin Di, Bharat B. Biswal\*

4 Department of Biomedical Engineering, New Jersey Institute of Technology, Newark, NJ, 07102,  
5 USA.

6 \*Corresponding author:

7 Bharat B. Biswal, PhD

8 607 Fenster Hall, University Height

9 Newark, NJ, 07102, USA

10 bbiswal@yahoo.com

## 11 **Introduction**

12 The human brain is intrinsically organized as different networks as generally revealed by resting-  
13 state functional magnetic resonance imaging (fMRI) (Beckmann et al. 2005; Golland et al. 2008;  
14 Yeo et al. 2011). Brain regions within a network generally convey relatively higher connectivity  
15 than regions from different networks (Biswal et al. 1995; Cordes et al. 2000; Greicius et al.  
16 2003), thus constitute modular organizations of brain functions (Doucet et al. 2011; Meunier et al.  
17 2009; Salvador et al. 2005). On the other hand, brain regions that belonged to different networks  
18 generally have smaller connectivity, however, between network communications are considered  
19 to be critical to support complex brain functions which need to integrate resources from different  
20 brain systems (Bullmore and Sporns 2012; Cole et al. 2013).

21       There are roughly two big systems in the brain, one showed consistent activation across  
22 different tasks (i.e. task positive network, (Shulman et al. 1997a)), while the other showed  
23 consistent deactivation (i.e. default mode network, DMN, (Shulman et al. 1997b)). These two  
24 systems revealed moment to moment anticorrelation even when one wasn't performing explicit  
25 tasks (Fox et al. 2005). The negative correlation between the DMN and the task positive network  
26 is developed in adolescence (Chai et al. 2013), and may serve as a suppression mechanism that  
27 inhibits unwanted noises, thus make behavior responses more reliable (Anticevic et al. 2012;  
28 Kelly et al. 2008; Spreng et al. 2010; Wen et al. 2013). Although the original paper of  
29 anticorrelation has been questioned because of global regression in data processing (Murphy et  
30 al. 2009), further studies have shown that the negative correlation between the DMN and the task  
31 positive network still presents without global regression (Chai et al. 2012; Fox et al. 2009), and  
32 has its neuronal origins (Keller et al. 2013). However, the controversies of negative correlation  
33 may partially due to the fact that the connectivity between the DMN and the task positive  
34 network is highly variable (Chang and Glover 2010; Kang et al. 2011).

35           The negative connectivity between the task positive network and DMN has been shown to  
36 be modulated or mediated by other networks, which may provide hints on the variability of the  
37 negative correlation. Sridharan and colleagues showed that the salience network (Seeley et al.  
38 2007) activated the executive network which is part of the task positive network, and deactivated  
39 the DMN during both task performing conditions and resting-state (Sridharan et al. 2008). In  
40 addition, Spreng and colleagues suggested that the relationship between the DMN and dorsal  
41 attention network was mediated by the nodes of the frontoparietal control network (Spreng et al.  
42 2013). Thus, the relationship between the DMN and different component of the task positive  
43 network, e.g. the salience, dorsal attention, (left and right) executive networks may convey  
44 complex interactions among each others. In the present study, we aimed to study whether the  
45 relationship between two networks is modulated by other networks or regions by using  
46 physiophysiological interaction (PPI) (Di and Biswal 2013a; Friston et al. 1997), which may  
47 provide a novel revenue to characterize the complex relationships among these networks.

48           Specifically, we sought to systematically investigate the modulatory interaction between  
49 the DMN and other task positive networks using PPI analysis on resting-state fMRI data. Spatial  
50 independent component analysis (ICA) was first performed to identify the networks of interest,  
51 including the DMN, salience, dorsal attention, left executive, and right executive networks. PPI  
52 analysis was then performed between each two of networks with other networks or with all other  
53 brain regions. This between network PPI analysis aimed to identify networks or regions that  
54 modulate the dynamic relationship between the two predefined networks. Based on notion that  
55 the salience network played an important role in switching of large scale brain networks (Menon  
56 and Uddin 2010; Sridharan et al. 2008), we predict that the salience network may show  
57 interaction effects with the DMN and executive networks.

## 58 **Methods**

## 59 **Subjects**

60 The resting-state fMRI data was derived from the Beijing\_Zang dataset of the 1000 functional  
61 connectomes project ([http://fcon\\_1000.projects.nitrc.org/](http://fcon_1000.projects.nitrc.org/)) (Biswal et al. 2010). This dataset  
62 organically contains 198 subjects. The first 64 subjects without large head motion were included  
63 in the current analysis (40 female/ 24 male). The mean age of these subjects was 21.1 years  
64 (range from 18 to 26 years).

## 65 **Scanning parameters**

66 The MRI data were acquired using a SIEMENS Trio 3-Tesla scanner from Beijing Normal  
67 University. 230 resting-state functional data were acquired for each subject using TR of 2 s. The  
68 resolution of the fMRI images was 3.125 x 3.125 x 3 mm with 64 x 64 x 36 voxels. The T1-  
69 weighted sagittal three-dimensional magnetization-prepared rapid gradient echo (MP-RAGE)  
70 sequence was acquired using the following parameters: 128 slices, TR = 2530 ms, TE = 3.39 ms,  
71 slice thickness = 1.33 mm, flip angle = 7°, inversion time = 1100 ms, FOV = 256 × 256 mm<sup>2</sup>.

## 72 **Functional MRI data analysis**

### 73 **Preprocessing**

74 The fMRI image preprocessing and analysis were conducted using SPM8 package  
75 (<http://www.fil.ion.ucl.ac.uk/spm/>) under MATLAB 7.6 environment  
76 (<http://www.mathworks.com>). For each subject, the first two functional images were discarded,  
77 resulting in 228 images for each subject. The functional images were motion corrected, and  
78 coregistered to subject's own high resolution anatomical image. Next, subject's anatomical  
79 images were normalized to the T1 template provided by SPM package in MNI space (Montreal  
80 Neurological Institute). Then, the normalization parameters were used to normalize all the  
81 functional images into MNI space, and the functional images were resampled into 3 x 3 x 3 mm<sup>3</sup>  
82 voxels. Finally, all the functional images were smoothed using a Gaussian kernel with 8 mm full  
83 width at half maximum (FWHM).

## 84 **Spatial ICA**

85 Spatial ICA was conducted to define networks for the PPI analysis using the Group ICA of fMRI  
86 Toolbox (GIFT) (<http://icatb.sourceforge.net/>) (Calhoun et al. 2001). Twenty components were  
87 extracted. The DMN, salience, dorsal attention, left executive, and right executive networks were  
88 visually identified according to Cole and colleagues (Cole et al. 2010) (Figure 1). Time series  
89 associated with these five components were obtained for each subject for following PPI analysis.  
90 To aid interpretation of the PPI results, simple correlations among the five networks were  
91 calculated for each subject. The correlation values were transformed into Fisher's z, and  
92 statistical significance were tested across subjects using one sample t-test.

93 [Insert Figure 1 here]

## 94 **PPI analysis**

95 Physiophysiological interaction analysis, along with its variant psychophysiological interaction,  
96 were first proposed by Friston and colleagues to characterize modulated connectivity by another  
97 region or a psychological manipulation (Friston et al. 1997). The present analysis focused on the  
98 modulation of connectivity by other regions or networks. Specifically, time series of two  
99 networks were used to define an interaction model using a linear regression framework.

$$y = \beta_{N1} \cdot x_{N1} + \beta_{N2} \cdot x_{N2} + \beta_{PPI} \cdot x_{N1} \cdot x_{N2} + \varepsilon$$

100 Where  $x_{N1}$  and  $x_{N2}$  represent the time series of two networks. Critically, we are interested in  
101 whether the interaction term of the two time series is correlated with the time series of a given

102 voxel or region  $y$  (the effect of  $\beta_{PPI}$ ). A positive interaction effect implies that the connectivity  
103 between the resultant region and one of the network is positively modulated by the other network.

104 While a negative interaction effect implies that the connectivity between the resultant region and

105 one of the network is negatively modulated by the other network. In practice, the time series of  
106 the two networks were deconvolved with hemodynamic response function (hrf), so that the PPI  
107 term was calculated in the neuronal level but not hemodynamic level (Gitelman et al. 2003).

108 Before PPI analysis, the time series of each network were preprocessed in following steps.  
109 Six rigid-body motion parameters, the first principle component time series of white matter  
110 (WM) signal, and the first principle component time series of cerebrospinal fluid (CSF) signal  
111 were regressed out from the original time series by using linear regression model. The subject  
112 specific WM and CSF masks were derived from their own segmented WM and CSF images, with  
113 a threshold of 0.99 to make sure that GM voxels were excluded from the masks. Next, a high-  
114 pass filter of 0.01 Hz was applied on the time series to minimize low frequency scanner drift.  
115 The preprocessed time series of two networks were first deconvolved with the hrf using a simple  
116 empirical Bayes procedure, so that the resulting time course represented an approximation to  
117 neural activity (Gitelman et al. 2003). Next, the two neural time series were detrended and point  
118 multiplied, so that the resulting time series represented the interaction of neural activity between  
119 two networks. And lastly, the interaction time series was convolved with the hrf, resulting in an  
120 interaction variable in BOLD level. The PPI terms were calculated for each pair of the five  
121 networks.

122 Network-wise PPI analysis was first conducted to directly examine the relationships  
123 among networks, which is similar to von Kriegstein and Giraud (von Kriegstein and Giraud  
124 2006). In the network-wise analysis, the dependent variable is the time series of a network rather  
125 than the time series of every voxel in the brain. In the PPI linear regression model, the main  
126 effects of the two networks, and the PPI effects between them were added as independent  
127 variables along with a constant regressor. After model estimation, the beta values corresponding  
128 to the PPI effects were used to perform statistics against zero by using one-sample t-test. Critical



129 p values were set as  $p < 0.05$  after Bonferroni correction (corresponding to a raw p value of  
130 0.0017 after correcting for totally 30 comparisons).

131 In addition, voxel-wise PPI analysis was also performed to identify regions across the  
132 whole brain that were associated with the PPI effect. The PPI terms were calculated for each  
133 pairs of the five networks, resulting in ten separate PPI effects. Then separate PPI models were  
134 built for each subject using general linear model (GLM) framework. The GLM model contained  
135 two regressors representing the main effects of two ROIs time series, one regressor representing  
136 the PPI effect, two regressors representing WM and CSF signals, and six regressors representing  
137 head motion effects. An implicit high pass filter of 1/100 Hz was used. For each PPI effect, 2nd-  
138 level one sample t-test was conducted to make group-level inference. Simple t contrast of 1 or -1  
139 was defined to reveal positive or negative PPI effects, respectively. The resulting clusters were  
140 first height thresholded at  $p < 0.001$ , and cluster-level false discovery rate (FDR) corrected at  $p <$   
141 0.05 based on random field theory (Chumbley and Friston 2009).

## 142 **Results**

### 143 **Simple correlations among networks**

144 As expected, the DMN showed negative correlations with the salience network (mean Fisher's z  
145 -0.299) and the dorsal attention network (mean Fisher's z -0.530). However, the DMN revealed  
146 positive correlations with the left executive network (mean Fisher's z 0.184) and the right  
147 executive network (mean Fisher's z 0.247). Mean correlations among other networks are listed in  
148 Table 1.

149 [Insert Table 1 here]

### 150 **Network-wise PPI analysis**

151 All significant network-wise PPI effects were positive (Figure 2). Firstly, positive PPI effects  
152 were observed among the salience, DMN, and right executive networks in all of the three ways.

153 The time series of salience network were correlated with the interaction of the DMN and right  
154 executive network ( $M_{beta} = 0.054; t = 4.09, p = 1.25 \times 10^{-4}$ ). The time series of DMN were  
155 correlated with the interaction of the salience and right executive network ( $M_{beta} = 0.060; t =$   
156  $4.77, p = 1.14 \times 10^{-5}$ ). And the time series of the right executive network were correlated with the  
157 interaction of the salience network and DMN ( $M_{beta} = 0.109; t = 8.27, p = 1.19 \times 10^{-11}$ ). In  
158 addition, the left executive time series were also correlated with the interaction of the salience  
159 network and DMN ( $M_{beta} = 0.048; t = 3.67, p = 4.98 \times 10^{-4}$ ). Secondly, positive PPI effects were  
160 also observed among the salience and bilateral executive networks. The left executive network  
161 time series were correlated with the interaction of the salience and right executive network ( $M_{beta}$   
162  $= 0.046; t = 4.01, p = 1.65 \times 10^{-4}$ ), and the right executive network times series were correlated  
163 with the interaction of the salience and left executive network ( $M_{beta} = 0.053; t = 3.94, p = 2.06 \times$   
164  $10^{-4}$ ). Lastly, positive PPI effects were also observed among the dorsal attention, and bilateral  
165 executive networks, i.e. the right executive network time series were correlated with the  
166 interaction effects of the dorsal attention and left executive networks ( $M_{beta} = 0.058; t = 4.31, p =$   
167  $5.91 \times 10^{-5}$ ).

168 [Insert Figure 2 here]

### 169 **Voxel-wise PPI analysis**

170 As shown in Figure 3 and Table S1, regions that revealed positive modulatory interaction with the  
171 DMN and the salience network resemble a typical task positive network. These regions included  
172 the bilateral dorsolateral prefrontal cortex, bilateral parietal lobule, bilateral middle temporal  
173 gyrus, and two small clusters in the precuneus and posterior cingulate cortex. In contrast, several  
174 regions showed negative modulatory interaction, including the cingulate gyrus, bilateral putamen,  
175 right insula, precuneus, and paracentral lobule.

176 [Insert Figure 3 here]

177 The PPI results of the DMN and other task positive networks are shown in Figure 4. A  
178 typical fronto-parietal network regions showed positive modulatory interactions with the DMN  
179 and the dorsal attention network (Figure 4A), including the left middle frontal gyrus, bilateral  
180 parietal lobule, bilateral superior frontal gyrus, and left superior temporal gyrus (see also Table  
181 S2). In contrast, one region in the inferior parietal lobule revealed negative modulatory  
182 interaction with the DMN and the dorsal attention network. Only one region located in the right  
183 inferior parietal lobule revealed negative modulatory interaction with the DMN and the left  
184 executive network (Figure 4B and Table S3). No positive effects were observed. For the  
185 modulatory interactions of the DMN and right executive network (Figure 4C), positive effects  
186 were observed in the bilateral insula, cingulate gyrus, right inferior parietal lobule, bilateral  
187 middle frontal gyrus, anterior cingulate cortex, and right thalamus (see also Table S4). Negative  
188 effects were observed in the right superior and middle frontal gyrus.

189 [Insert Figure 4 here]

190 The PPI results of the salience and other task positive networks are illustrated in Figure 5.  
191 For the modulatory interactions of the salience network and the dorsal attention network (Figure  
192 5A), positive effects were observed in the medial frontal gyrus, subcortical nucleus including  
193 right thalamus, bilateral caudate, and right lentiform nucleus, and bilateral parietal lobule (see  
194 also Table S5). Negative effects were observed in the left middle and inferior frontal gyrus. For  
195 the modulatory interactions of the salience network and the left executive network (Figure 5B),  
196 positive PPI effects were observed in the medial frontal gyrus, left superior temporal gyrus, left  
197 middle frontal gyrus, and left middle temporal gyrus (see also Table S6). Negative effects were  
198 observed in the left insula. For the modulatory interactions of the salience network and the right  
199 executive network (Figure 5C), positive effects were observed in the superior frontal gyrus,  
200 bilateral inferior frontal gyrus, bilateral superior temporal gyrus, right precentral and postcentral  
201 gyrus (see also Table S7). No negative PPI effects were observed.

202

[Insert Figure 5 here]

203

The PPI results among other positive networks were shown in Figure 6. For the

204

modulatory interactions of the dorsal attention network and the left executive network (Figure

205

6A), positive effects were observed in the left inferior parietal lobule, left middle frontal gyrus,

206

and right cerebellum (see also Table S8). No negative effects were observed. For the modulatory

207

interactions of the dorsal attention network and the right executive network (Figure 6B), positive

208

effects were observed in the right middle temporal gyrus and right precuneus (see also Table S9).

209

No negative effects were observed. Lastly, for the modulatory interactions of the left and right

210

executive networks (Figure 6C), positive PPI effects were observed in the bilateral precuneus,

211

right inferior parietal lobule, left cerebellum (see also Table S10). Negative effects were

212

observed in the left superior frontal gyrus.

213

[Insert Figure 6 here]

## 214 **Discussion**

215

Similar to previous studies, we observed negative correlations between the DMN and some task

216

positive networks, for example the salience and dorsal attention networks. However, the DMN

217

revealed small but consistent positive correlations with both the left and right executive networks.

218

These results suggested that the DMN revealed complex relationships with different components

219

of task positive networks. It should be noted that the correlation values are subjective to

220

preprocessing steps and level of noises (Fox et al. 2009; Saad et al. 2012; Weissenbacher et al.

221

2009), so that the absolute values of correlations cannot be treated seriously. Instead, we focused

222

on modulatory interactions which are less likely to be affected by noises, and observed positive

223

modulatory interactions between the DMN, the salience network and the executive networks.

224

Specifically, network-wise analysis revealed reciprocally positive modulatory interactions among

225

the DMN, the salience, and the right executive networks. These effects can also be observed in

226 the voxel-wise analysis. For example, the analysis of the DMN and the salience network  
227 revealed clusters that assemble the bilateral executive network (Figure 3). The analysis of the  
228 DMN and right executive network revealed clusters that assemble the salience network (Figure  
229 4C). Lastly, the analysis of the salience network and the right executive network revealed  
230 clusters that were part of the DMN (Figure 5C). The left executive network also showed  
231 association with the interaction of the DMN and the salience network in both PPI-wise and voxel-  
232 wise analysis (Figure 2 and 3). These results are consistent with our recent findings that the  
233 connectivity between the DMN and frontoparietal regions is positively modulated by the salience  
234 network activity (Di and Biswal 2013b). The convergent results suggested complex modulatory  
235 effects among the DMN, salience, and executive networks.

236         Among the DMN, salience, and executive networks, the salience network may play a  
237 critical role due to its anatomical connections and causal influences. Anatomically, the salience  
238 network contains a special type of neuron termed von Economo neuron (Allman et al. 2010),  
239 which are spindle like bipolar neurons with thick axons. These properties enable von Economo  
240 neurons to rapidly pass information from the salience network regions to other brain regions,  
241 which might be vital for the emergence of social behaviors (Butti et al. 2009). A recent study has  
242 demonstrated that the regions containing von Economo neurons had functional connectivity with  
243 both the DMN and frontoparietal networks (Cauda et al. 2013). In terms of causal influence,  
244 studies using Granger causality analysis suggested that the salience network sent information to  
245 both the DMN and executive networks (Deshpande et al. 2011; Liao et al. 2010; Sridharan et al.  
246 2008; Yan and He 2011). Taken together, it is possible that the salience network, in addition to  
247 activate the executive network and deactivate the DMN (Sridharan et al. 2008), directly modulate  
248 the relationship between the executive network and DMN.

249         The modulation may reflect that saliency signals conveyed by the salience network  
250 increase the communication between the executive system and internal oriented system.

251 Alternatively, because the absolute connectivity between the executive network and the DMN is  
252 subject to preprocessing steps, and these two networks are generally considered as anticorrelated  
253 (Chai et al. 2012; Fox et al. 2005; Keller et al. 2013), it is also possible that the modulation may  
254 reflect decreased anticorrelation between the DMN and executive networks. The decreased  
255 anticorrelation might suggest an absence of modulation of top-down signals from the DMN to  
256 central executive regions (Anticevic et al. 2012). In line with this notion, impaired salience  
257 network functions in patients of schizophrenia is coincidentally associated with altered  
258 connectivity between the executive network and DMN (Manoliu et al. 2013a; Manoliu et al.  
259 2013b). The modulatory model of the salience network on the executive network and DMN may  
260 provide novel avenue to understand dysfunctions of network communications in patients with  
261 schizophrenia (Menon 2011).

262 In addition to the modulatory interactions between the DMN and task positive networks,  
263 we also observed modulatory interactions among different task positive networks. These  
264 interactions were mainly among the salience network and bilateral executive networks, and  
265 among the dorsal attention network and bilateral executive networks. The frontoparietal  
266 executive network is generally identified bilaterally when using seed-based correlations and  
267 cluster analysis (Dosenbach et al. 2007; Yeo et al. 2011), however, separate left and right  
268 lateralized frontoparietal networks can be reliably identified when using ICA (Beckmann et al.  
269 2005; Biswal et al. 2010). The current analysis revealed a moderate correlation between the left  
270 and right executive networks (mean Fisher's  $z$  0.43), which was the largest correlation among  
271 task positive networks. In addition, the modulatory interactions results suggested that the  
272 relationship between the left and right frontoparietal networks may be modulated by the salience  
273 network and the dorsal attention network. Even though the left and right frontoparietal networks  
274 are symmetrically aligned, these two networks are associated with different cognitive functions,  
275 with the left executive network more associated with language cognition, and the right

276 counterpart more related to action inhibition and pain perception (Smith et al. 2009). The  
277 increased connectivity between the bilateral networks may reflect the increased communication  
278 of resources from different executive systems.

279         Voxel-wise analysis also identified subcortical regions that revealed modulatory  
280 interactions with different networks, notably the thalamus and basal ganglia. Specifically, the  
281 basal ganglia revealed a negative modulatory interaction with the DMN and salience network  
282 (Figure 3), while showed a positive modulatory interaction with the salience and dorsal attention  
283 networks (Figure 5A). The basal ganglia is functionally connected to widely distributed cortical  
284 regions (Di Martino et al. 2008) via different white matter fibers (Leh et al. 2007; Lehericy et al.  
285 2004). Models of basal ganglia function have suggested it to be a moderator that modulate  
286 connectivity from frontal regions to posterior visual areas to support task switching and attention  
287 shifting (den Ouden et al. 2010; van Schouwenburg et al. 2010; Stephan et al. 2008). The current  
288 results extended these notion into resting-state, suggesting a general modulating role of the basal  
289 ganglia on connectivity between brain networks. In addition, the thalamus revealed positive  
290 modulatory interactions with the salience network and dorsal attention network. The thalamus is  
291 a critical subcortical structure involving attention (Haynes et al. 2005; O'Connor et al. 2002). It  
292 is possible that the salience signal from the salience network enhance the connectivity from the  
293 thalamus to the dorsal attention network to allocate attention recourses to the specific stimulus  
294 (Fan et al. 2005). Alternatively, the salience signal might modulated top-down connectivity from  
295 the dorsal attention network to the thalamus, that facilitate attentional gating of the salient event  
296 (Fischer and Whitney 2012; McAlonan et al. 2008; McAlonan et al. 2000). Further studies using  
297 causal models are needed to further clarify the dynamic relationships among the thalamus, the  
298 salience network, and the dorsal attention network (Di and Biswal 2013c; Friston et al. 2003).

299         By applying PPI technique to brain networks in resting-state, the current study  
300 demonstrated modulatory interactions among different brain systems. Compared with our

301 previous study that examined PPI effects of two regions within the same network (Di and Biswal  
302 2013a), the current results generally revealed larger spatial extent of significant effects. This  
303 suggests that the modulatory interaction effects may generally take place in modulation of  
304 communications between different brain systems rather than within one system. This notion is in  
305 line with the economic theory of brain organization that between module connectivity are more  
306 likely to be modulated upon task demands to facilitate brain network reconfigurations (Bullmore  
307 and Sporns 2012; Di et al. 2013). However, the spatial distribution of modulatory interaction  
308 effects and their functional significance are still open questions, and warrant further explorations.



309 **References**

- 310 Allman JM, Tetreault NA, Hakeem AY, et al. (2010) The von Economo neurons in fronto-insular  
311 and anterior cingulate cortex in great apes and humans. *Brain Struct Funct* 214:495–517.  
312 doi: 10.1007/s00429-010-0254-0
- 313 Anticevic A, Cole MW, Murray JD, et al. (2012) The Role of Default Network Deactivation in  
314 Cognition and Disease. *Trends Cogn Sci*. doi: 10.1016/j.tics.2012.10.008
- 315 Beckmann CF, DeLuca M, Devlin JT, Smith SM (2005) Investigations into resting-state  
316 connectivity using independent component analysis. *Philos Trans R Soc Lond B Biol Sci*  
317 360:1001–13. doi: 10.1098/rstb.2005.1634
- 318 Biswal B, Yetkin FZ, Haughton VM, Hyde JS (1995) Functional connectivity in the motor cortex  
319 of resting human brain using echo-planar MRI. *Magn Reson Med* 34:537–41. doi:  
320 10.1002/mrm.1910340409
- 321 Biswal BB, Mennes M, Zuo X-N, et al. (2010) Toward discovery science of human brain  
322 function. *Proc Natl Acad Sci U S A* 107:4734–9. doi: 10.1073/pnas.0911855107
- 323 Bullmore E, Sporns O (2012) The economy of brain network organization. *Nat Rev Neurosci*  
324 13:336–349. doi: 10.1038/nrn3214
- 325 Butti C, Sherwood CC, Hakeem AY, et al. (2009) Total number and volume of Von Economo  
326 neurons in the cerebral cortex of cetaceans. *J Comp Neurol* 515:243–59. doi:  
327 10.1002/cne.22055
- 328 Calhoun VD, Adali T, Pearlson GD, Pekar JJ (2001) A method for making group inferences from  
329 functional MRI data using independent component analysis. *Hum Brain Mapp* 14:140–51.
- 330 Cauda F, Torta DME, Sacco K, et al. (2013) Functional anatomy of cortical areas characterized  
331 by Von Economo neurons. *Brain Struct Funct* 218:1–20. doi: 10.1007/s00429-012-0382-9
- 332 Chai XJ, Castañón AN, Ongür D, Whitfield-Gabrieli S (2012) Anticorrelations in resting state  
333 networks without global signal regression. *Neuroimage* 59:1420–8. doi:  
334 10.1016/j.neuroimage.2011.08.048
- 335 Chai XJ, Ofen N, Gabrieli JDE, Whitfield-Gabrieli S (2013) Selective Development of  
336 Anticorrelated Networks in the Intrinsic Functional Organization of the Human Brain.
- 337 Chang C, Glover GH (2010) Time-frequency dynamics of resting-state brain connectivity  
338 measured with fMRI. *Neuroimage* 50:81–98. doi: 10.1016/j.neuroimage.2009.12.011
- 339 Chumbley JR, Friston KJ (2009) False discovery rate revisited: FDR and topological inference  
340 using Gaussian random fields. *Neuroimage* 44:62–70. doi:  
341 10.1016/j.neuroimage.2008.05.021
- 342 Cole DM, Smith SM, Beckmann CF (2010) Advances and pitfalls in the analysis and  
343 interpretation of resting-state FMRI data. *Front Syst Neurosci* 4:8. doi:  
344 10.3389/fnsys.2010.00008
- 345 Cole MW, Reynolds JR, Power JD, et al. (2013) Multi-task connectivity reveals flexible hubs for  
346 adaptive task control. *Nat Neurosci*. doi: 10.1038/nn.3470
- 347 Cordes D, Haughton VM, Arfanakis K, et al. (2000) Mapping functionally related regions of  
348 brain with functional connectivity MR imaging. *AJNR Am J Neuroradiol* 21:1636–44.
- 349 Deshpande G, Santhanam P, Hu X (2011) Instantaneous and causal connectivity in resting state  
350 brain networks derived from functional MRI data. *Neuroimage* 54:1043–52. doi:  
351 10.1016/j.neuroimage.2010.09.024
- 352 Di X, Biswal BB (2013a) Modulatory interactions of resting-state brain functional connectivity.  
353 *PLoS One* 8:e71163. doi: 10.1371/journal.pone.0071163

- 354 Di X, Biswal BB (2013b) Dynamic brain functional connectivity modulated by resting-state  
355 networks. *Brain Struct Funct*. doi: 10.1007/s00429-013-0634-3
- 356 Di X, Biswal BB (2013c) Identifying the default mode network structure using dynamic causal  
357 modeling on resting-state functional magnetic resonance imaging. *Neuroimage*. doi:  
358 10.1016/j.neuroimage.2013.07.071
- 359 Di X, Gohel S, Kim EH, Biswal BB (2013) Task vs. rest-different network configurations  
360 between the coactivation and the resting-state brain networks. *Front Hum Neurosci* 7:493.  
361 doi: 10.3389/fnhum.2013.00493
- 362 Dosenbach NUF, Fair DA, Miezin FM, et al. (2007) Distinct brain networks for adaptive and  
363 stable task control in humans. *Proc Natl Acad Sci U S A* 104:11073–8. doi:  
364 10.1073/pnas.0704320104
- 365 Doucet G, Naveau M, Petit L, et al. (2011) Brain activity at rest: a multiscale hierarchical  
366 functional organization. *J Neurophysiol* 105:2753–63. doi: 10.1152/jn.00895.2010
- 367 Fan J, McCandliss BD, Fossella J, et al. (2005) The activation of attentional networks.  
368 *Neuroimage* 26:471–9. doi: 10.1016/j.neuroimage.2005.02.004
- 369 Fischer J, Whitney D (2012) Attention gates visual coding in the human pulvinar. *Nat Commun*  
370 3:1051. doi: 10.1038/ncomms2054
- 371 Fox MD, Snyder AZ, Vincent JL, et al. (2005) The human brain is intrinsically organized into  
372 dynamic, anticorrelated functional networks. *Proc Natl Acad Sci U S A* 102:9673–8.
- 373 Fox MD, Zhang D, Snyder AZ, Raichle ME (2009) The global signal and observed anticorrelated  
374 resting state brain networks. *J Neurophysiol* 101:3270–83. doi: 10.1152/jn.90777.2008
- 375 Friston KJ, Buechel C, Fink GR, et al. (1997) Psychophysiological and modulatory interactions  
376 in neuroimaging. *Neuroimage* 6:218–29.
- 377 Friston KJ, Harrison L, Penny W (2003) Dynamic causal modelling. *Neuroimage* 19:1273–302.
- 378 Gitelman DR, Penny WD, Ashburner J, Friston KJ (2003) Modeling regional and  
379 psychophysiological interactions in fMRI: the importance of hemodynamic deconvolution.  
380 *Neuroimage* 19:200–7.
- 381 Golland Y, Golland P, Bentin S, Malach R (2008) Data-driven clustering reveals a fundamental  
382 subdivision of the human cortex into two global systems. *Neuropsychologia* 46:540–53. doi:  
383 10.1016/j.neuropsychologia.2007.10.003
- 384 Greicius MD, Krasnow B, Reiss AL, Menon V (2003) Functional connectivity in the resting  
385 brain: a network analysis of the default mode hypothesis. *Proc Natl Acad Sci U S A*  
386 100:253–8.
- 387 Haynes J-D, Deichmann R, Rees G (2005) Eye-specific effects of binocular rivalry in the human  
388 lateral geniculate nucleus. *Nature* 438:496–9. doi: 10.1038/nature04169
- 389 Kang J, Wang L, Yan C, et al. (2011) Characterizing dynamic functional connectivity in the  
390 resting brain using variable parameter regression and Kalman filtering approaches.  
391 *Neuroimage* 56:1222–34. doi: 10.1016/j.neuroimage.2011.03.033
- 392 Keller CJ, Bickel S, Honey CJ, et al. (2013) Neurophysiological investigation of spontaneous  
393 correlated and anticorrelated fluctuations of the BOLD signal. *J Neurosci* 33:6333–42. doi:  
394 10.1523/JNEUROSCI.4837-12.2013
- 395 Kelly AMC, Uddin LQ, Biswal BB, et al. (2008) Competition between functional brain networks  
396 mediates behavioral variability. *Neuroimage* 39:527–37. doi:  
397 10.1016/j.neuroimage.2007.08.008
- 398 Von Kriegstein K, Giraud A-L (2006) Implicit multisensory associations influence voice  
399 recognition. *PLoS Biol* 4:e326. doi: 10.1371/journal.pbio.0040326

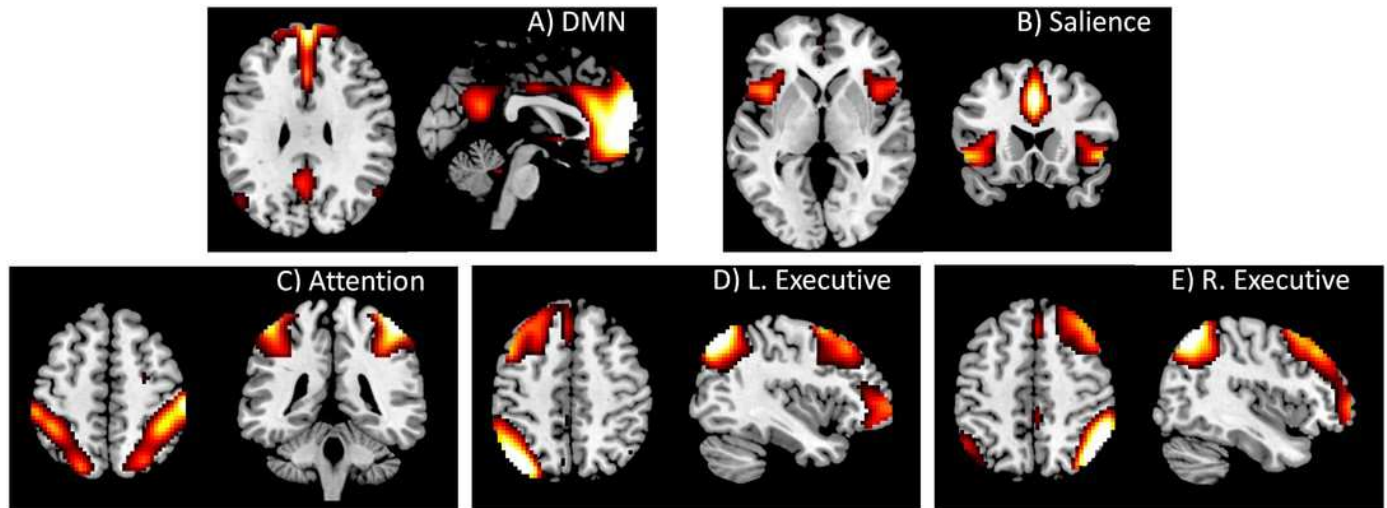
- 400 Leh SE, Ptito A, Chakravarty MM, Strafella AP (2007) Fronto-striatal connections in the human  
401 brain: A probabilistic diffusion tractography study. *Neurosci Lett* 419:113–118.
- 402 Lehéricy S, Ducros M, Van de Moortele P-F, et al. (2004) Diffusion tensor fiber tracking shows  
403 distinct corticostriatal circuits in humans. *Ann Neurol* 55:522–9. doi: 10.1002/ana.20030
- 404 Liao W, Mantini D, Zhang Z, et al. (2010) Evaluating the effective connectivity of resting state  
405 networks using conditional Granger causality. *Biol Cybern* 102:57–69.
- 406 Manoliu A, Riedl V, Doll A, et al. (2013a) Insular Dysfunction Reflects Altered Between-  
407 Network Connectivity and Severity of Negative Symptoms in Schizophrenia during  
408 Psychotic Remission. *Front Hum Neurosci*. doi: 10.3389/fnhum.2013.00216
- 409 Manoliu A, Riedl V, Zherdin A, et al. (2013b) Aberrant Dependence of Default Mode/Central  
410 Executive Network Interactions on Anterior Insular Salience Network Activity in  
411 Schizophrenia. *Schizophr Bull* sbt037–. doi: 10.1093/schbul/sbt037
- 412 Di Martino a, Scheres a, Margulies DS, et al. (2008) Functional connectivity of human striatum: a  
413 resting state fMRI study. *Cereb Cortex* 18:2735–47. doi: 10.1093/cercor/bhn041
- 414 McAlonan K, Brown VJ, Bowman EM (2000) Thalamic reticular nucleus activation reflects  
415 attentional gating during classical conditioning. *J Neurosci* 20:8897–901.
- 416 McAlonan K, Cavanaugh J, Wurtz RH (2008) Guarding the gateway to cortex with attention in  
417 visual thalamus. *Nature* 456:391–4. doi: 10.1038/nature07382
- 418 Menon V (2011) Large-scale brain networks and psychopathology: a unifying triple network  
419 model. *Trends Cogn Sci* 15:483–506. doi: 10.1016/j.tics.2011.08.003
- 420 Menon V, Uddin LQ (2010) Saliency, switching, attention and control: a network model of insula  
421 function. *Brain Struct Funct* 214:655–67. doi: 10.1007/s00429-010-0262-0
- 422 Meunier D, Achard S, Morcom A, Bullmore E (2009) Age-related changes in modular  
423 organization of human brain functional networks. *Neuroimage* 44:715–23. doi:  
424 10.1016/j.neuroimage.2008.09.062
- 425 Murphy K, Birn RM, Handwerker DA, et al. (2009) The impact of global signal regression on  
426 resting state correlations: are anti-correlated networks introduced? *Neuroimage* 44:893–905.  
427 doi: 10.1016/j.neuroimage.2008.09.036
- 428 O'Connor DH, Fukui MM, Pinski MA, Kastner S (2002) Attention modulates responses in the  
429 human lateral geniculate nucleus. *Nat Neurosci* 5:1203–9. doi: 10.1038/nn957
- 430 Den Ouden HEM, Daunizeau J, Roiser J, et al. (2010) Striatal prediction error modulates cortical  
431 coupling. *J Neurosci* 30:3210–9. doi: 10.1523/JNEUROSCI.4458-09.2010
- 432 Saad ZS, Gotts SJ, Murphy K, et al. (2012) Trouble at rest: how correlation patterns and group  
433 differences become distorted after global signal regression. *Brain Connect* 2:25–32. doi:  
434 10.1089/brain.2012.0080
- 435 Salvador R, Suckling J, Coleman MR, et al. (2005) Neurophysiological architecture of functional  
436 magnetic resonance images of human brain. *Cereb Cortex* 15:1332–42. doi:  
437 10.1093/cercor/bhi016
- 438 Van Schouwenburg MR, den Ouden HEM, Cools R (2010) The human basal ganglia modulate  
439 frontal-posterior connectivity during attention shifting. *J Neurosci* 30:9910–8. doi:  
440 10.1523/JNEUROSCI.1111-10.2010
- 441 Seeley WW, Menon V, Schatzberg AF, et al. (2007) Dissociable intrinsic connectivity networks  
442 for salience processing and executive control. *J Neurosci* 27:2349–56. doi:  
443 10.1523/JNEUROSCI.5587-06.2007
- 444 Shulman GL, Corbetta M, Buckner RL, et al. (1997a) Common Blood Flow Changes across  
445 Visual Tasks: I. Increases in Subcortical Structures and Cerebellum but Not in Nonvisual  
446 Cortex. *J Cogn Neurosci* 9:624–647. doi: 10.1162/jocn.1997.9.5.624

- 447 Shulman GL, Fiez JA, Corbetta M, et al. (1997b) Common Blood Flow Changes across Visual  
448 Tasks: II. Decreases in Cerebral Cortex. *J Cogn Neurosci* 9:648–663. doi:  
449 10.1162/jocn.1997.9.5.648
- 450 Smith SM, Fox PT, Miller KL, et al. (2009) Correspondence of the brain’s functional architecture  
451 during activation and rest. *Proc Natl Acad Sci U S A* 106:13040–5. doi:  
452 10.1073/pnas.0905267106
- 453 Spreng RN, Sepulcre J, Turner GR, et al. (2013) Intrinsic architecture underlying the relations  
454 among the default, dorsal attention, and frontoparietal control networks of the human brain.  
455 *J Cogn Neurosci* 25:74–86. doi: 10.1162/jocn\_a\_00281
- 456 Spreng RN, Stevens WD, Chamberlain JP, et al. (2010) Default network activity, coupled with  
457 the frontoparietal control network, supports goal-directed cognition. *Neuroimage* 53:303–17.  
458 doi: 10.1016/j.neuroimage.2010.06.016
- 459 Sridharan D, Levitin DJ, Menon V (2008) A critical role for the right fronto-insular cortex in  
460 switching between central-executive and default-mode networks. *Proc Natl Acad Sci U S A*  
461 105:12569–74. doi: 10.1073/pnas.0800005105
- 462 Stephan KE, Kasper L, Harrison LM, et al. (2008) Nonlinear dynamic causal models for fMRI.  
463 *Neuroimage* 42:649–62. doi: 10.1016/j.neuroimage.2008.04.262
- 464 Weissenbacher A, Kasess C, Gerstl F, et al. (2009) Correlations and anticorrelations in resting-  
465 state functional connectivity MRI: a quantitative comparison of preprocessing strategies.  
466 *Neuroimage* 47:1408–16. doi: 10.1016/j.neuroimage.2009.05.005
- 467 Wen X, Liu Y, Yao L, Ding M (2013) Top-down regulation of default mode activity in spatial  
468 visual attention. *J Neurosci* 33:6444–53. doi: 10.1523/JNEUROSCI.4939-12.2013
- 469 Yan C, He Y (2011) Driving and driven architectures of directed small-world human brain  
470 functional networks. *PLoS One* 6:e23460. doi: 10.1371/journal.pone.0023460
- 471 Yeo BTT, Krienen FM, Sepulcre J, et al. (2011) The organization of the human cerebral cortex  
472 estimated by intrinsic functional connectivity. *J Neurophysiol* 106:1125–65. doi:  
473 10.1152/jn.00338.2011

# Figure 1

Resting-state networks identified by spatial ICA.

The time series associated with these networks were used in subsequent PPI analysis. The IC maps were z transformed, and thresholded at  $z > 1.96$ .



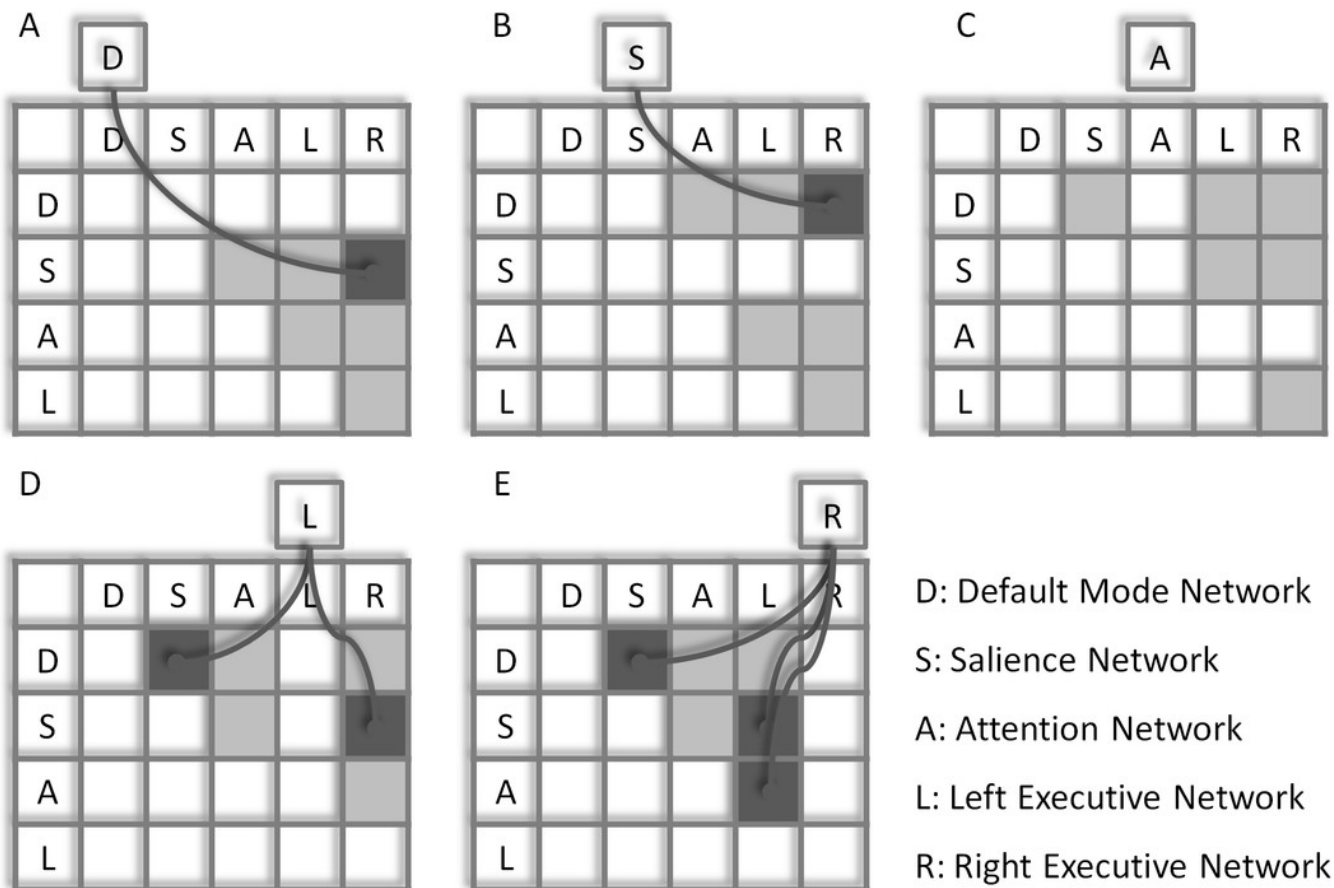


# Figure 2

Network-wise PPI results.

Tables indicate the PPI effects between network pairs (row vs. column ). Cells outside the tables represent the dependent variables of the time series of different networks (A-E).

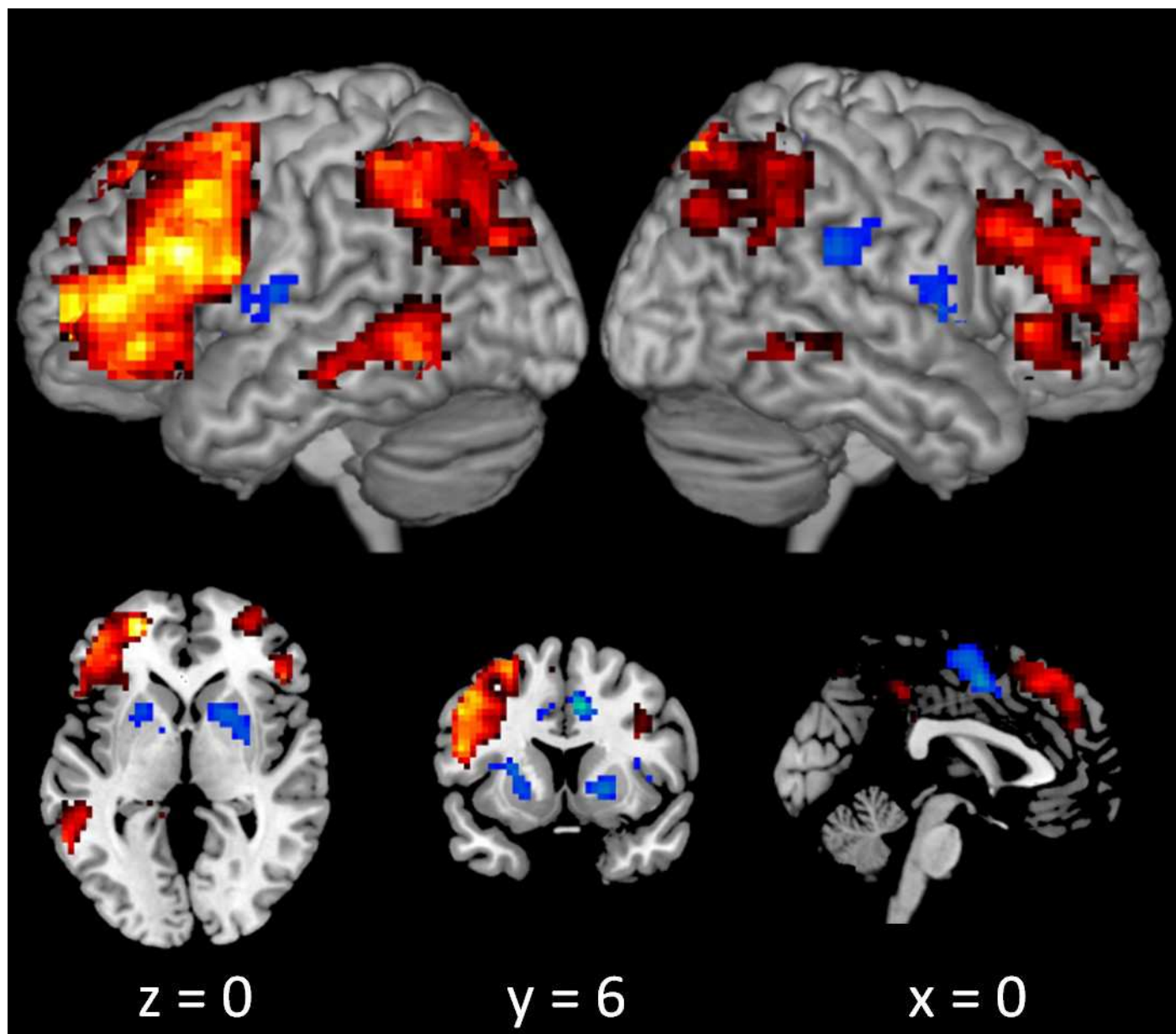
Arrows and dark gray cell indicate significant PPI effects of a given network (outside cell) and the interaction of two ROIs (cells in the tables). All significant PPI effects are positive. Cells in light gray indicate effects tested but not significant. Statistical significance was determined as  $p < 0.05$  after Bonferroni correction of all 30 effects tested.



# Figure 3

PPI results between the DMN and salience network.

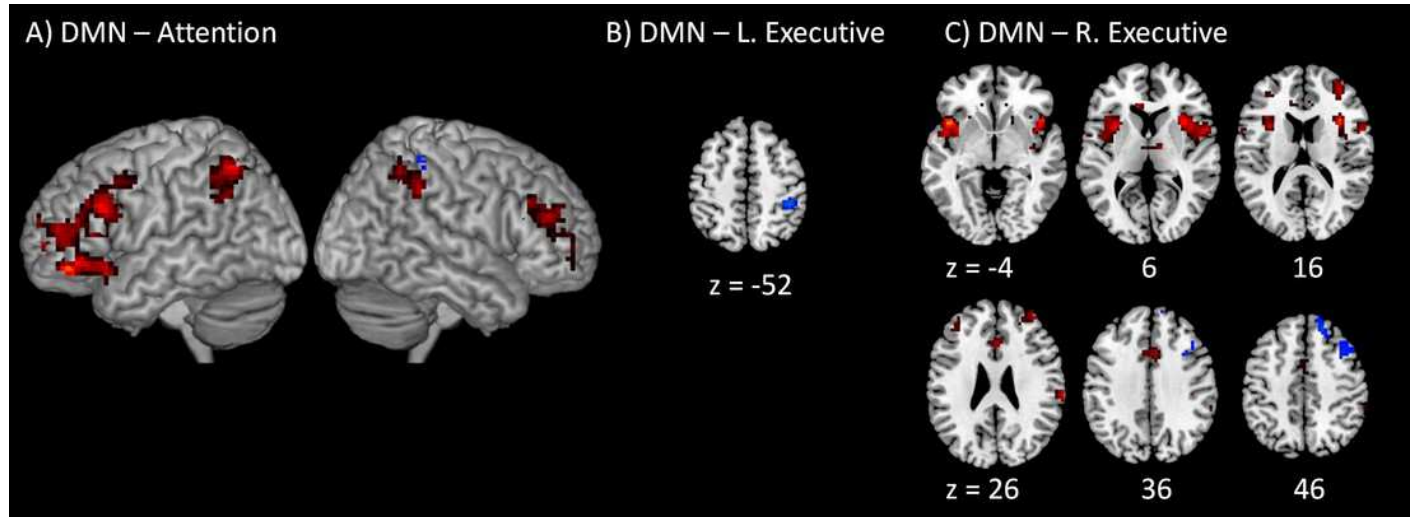
Clusters were thresholded at  $p < 0.001$  with a cluster level FDR correction at  $p < 0.05$ . Hot color encodes positive PPI effects, and winter color encodes negative PPI effects. x, y, and z represent x, y, and z coordinates in the MNI space.



# Figure 4

PPI results between the DMN and other task positive networks.

Clusters were thresholded at  $p < 0.001$  with a cluster level FDR correction at  $p < 0.05$ . Hot color encodes positive PPI effects, and winter color encodes negative PPI effects.  $z$  represents  $z$  coordinates in the MNI space.

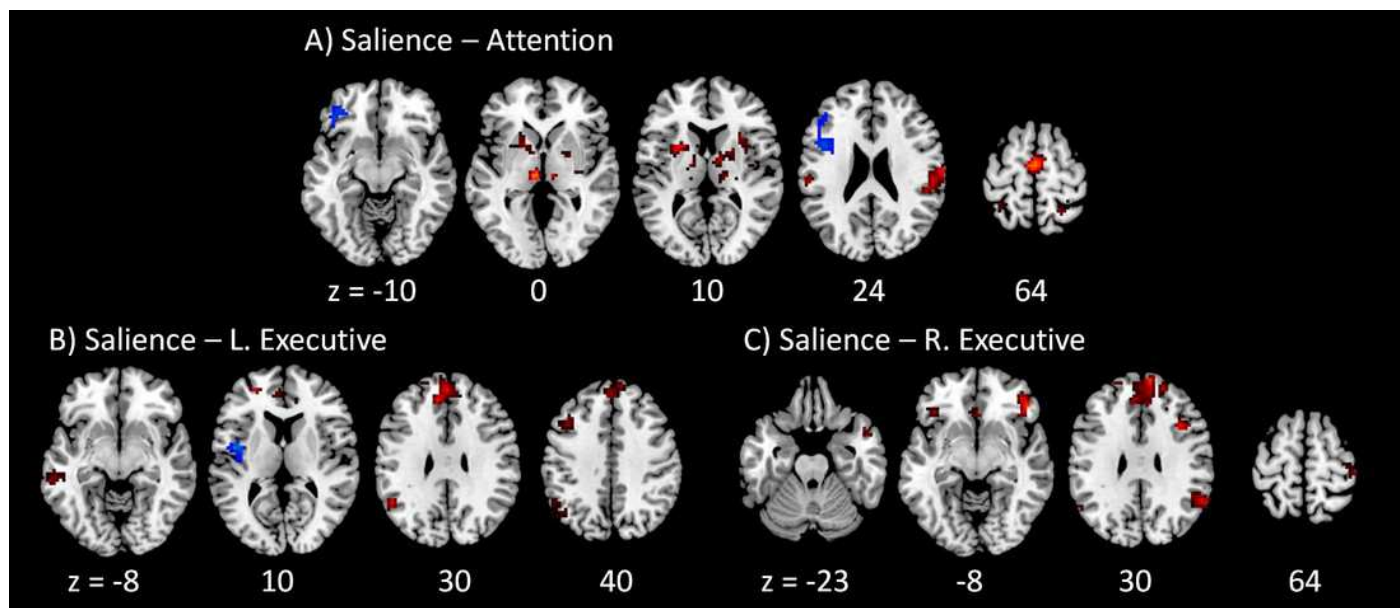




# Figure 5

PPI results between the salience network and other task positive networks.

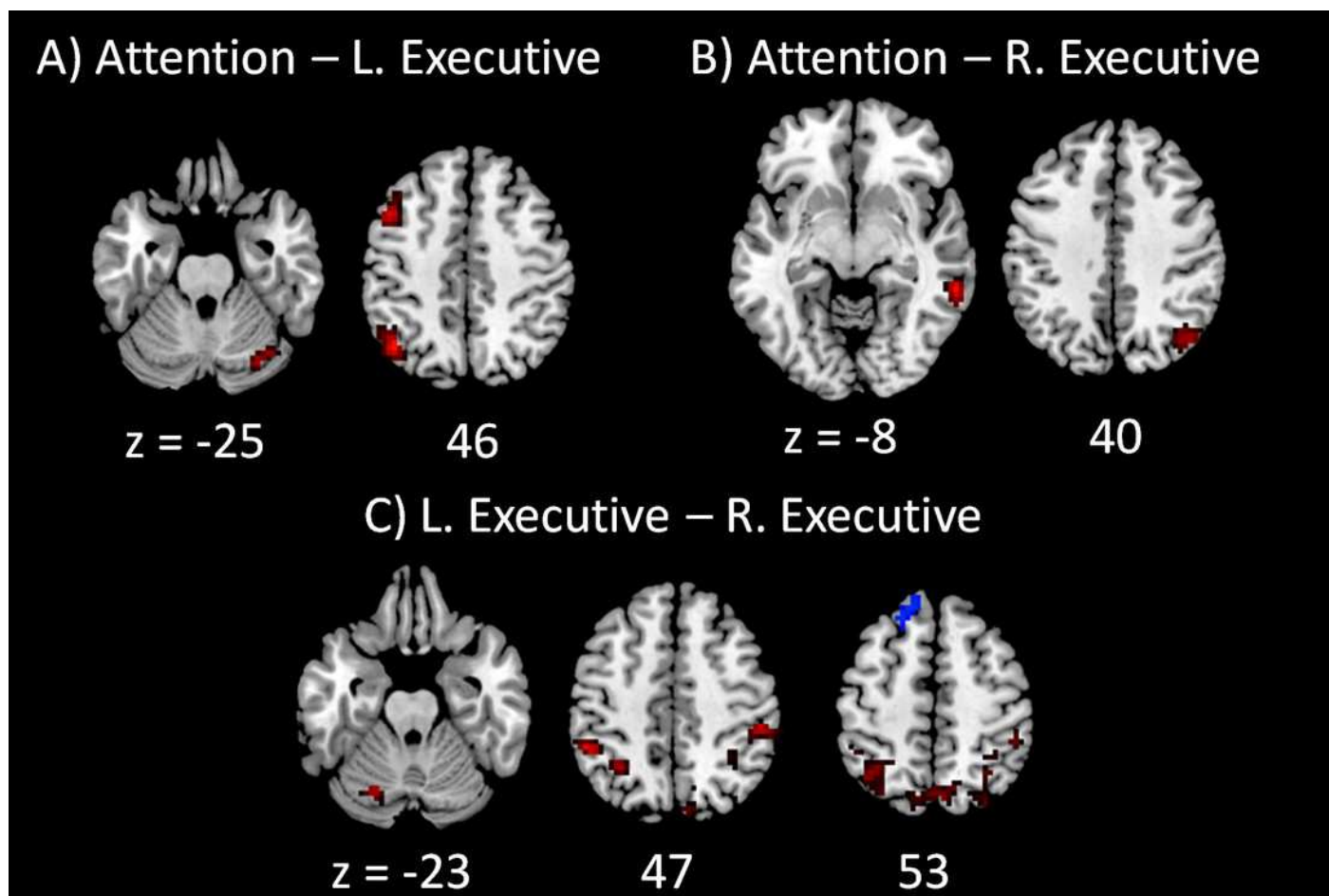
Clusters were thresholded at  $p < 0.001$  with a cluster level FDR correction at  $p < 0.05$ . Hot color encodes positive PPI effects, and winter color encodes negative PPI effects.  $z$  represents  $z$  coordinates in the MNI space.



# Figure 6

PPI results between the dorsal attention and executive networks.

Clusters were thresholded at  $p < 0.001$  with a cluster level FDR correction at  $p < 0.05$ . Hot color encodes positive PPI effects, and negative color encodes negative PPI effects. z represents z coordinates in the MNI space.



## **Table 1** (on next page)

Mean correlations (Fisher's z scores) among the five networks.

Values in brackets represent p values of corresponding cross subject one sample t-test. Bold font indicates statistically significant.

**Table 1** Mean correlations (Fisher's z scores) among the five networks. Values in brackets represent p values of corresponding cross subject one sample t-test. Bold font indicates statistically significant.

	DMN	Saliency	Attention	L Executive
Saliency	<b>-0.299</b> ( $1.34 \times 10^{-16}$ )			
Attention	<b>-0.530</b> ( $1.55 \times 10^{-28}$ )	<b>0.333</b> ( $8.45 \times 10^{-16}$ )		
L Executive	<b>0.184</b> ( $8.25 \times 10^{-10}$ )	<b>0.076</b> ( $4.06 \times 10^{-3}$ )	0.003 (0.87)	
R Executive	<b>0.247</b> ( $2.37 \times 10^{-13}$ )	<b>-0.142</b> ( $1.09 \times 10^{-7}$ )	0.004 (0.87)	<b>0.427</b> ( $3.83 \times 10^{-28}$ )