

## Structural Covariance Networks in Post-Traumatic Stress Disorder: A Multisite ENIGMA-PGC Study

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CGA has served as a consultant, speaker and/or on advisory boards for FSV7, Lundbeck, Psilocybin Labs, Guidepoint, Genentech and Janssen, and editor of Chronic Stress for Sage Publications, Inc.; he has filed a patent for using mTOR inhibitors to augment the effects of antidepressants (filed on August 20, 2018).

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### Abstract

**Introduction** - Cortical thickness (CT) and surface area (SA) are established biomarkers of brain pathology in posttraumatic stress disorder (PTSD). Structural covariance networks (SCN) constructed from CT and SA may represent developmental associations, or unique interactions between brain regions, possibly influenced by a common causal antecedent. The ENIGMA-PGC PTSD Working Group aggregated PTSD and control subjects' data from 29 cohorts in five countries (n=3439). **Methods** - Using Destrieux Atlas, we built SCNs and compared centrality measures between PTSD subjects and controls. Centrality is a graph theory measure derived using SCN. **Results** - Notable nodes with higher CT-based centrality in PTSD compared to controls were left fusiform gyrus, left superior temporal gyrus, and right inferior temporal gyrus. We found sex-based centrality differences in bilateral frontal lobe regions, left anterior cingulate, left superior occipital cortex and right ventromedial prefrontal cortex (vmPFC). Comorbid PTSD and MDD showed higher CT-based centrality in the right anterior cingulate gyrus, right parahippocampal gyrus and lower SA-based centrality in left insular gyrus. **Conclusion** - Unlike previous studies with smaller sample sizes ( $\leq 318$ ), our study found differences in centrality measures using a sample size of 3439 subjects. This is the first cross-sectional study to examine SCN interactions with age, sex, and comorbid MDD. Although limited to group level inferences, centrality measures offer insights into a node's relationship to the entire functional connectome unlike approaches like seed-based connectivity or independent component analysis. Nodes having higher centrality have greater structural or functional connections, lending them invaluable for translational treatments like neuromodulation.

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### 1. INTRODUCTION

Post-traumatic stress disorder (PTSD) has a lifetime prevalence of 9.4% among adults in the US (Kessler et al., 2005) and 4% globally (Liu et al., 2017). Cross-sectional and longitudinal studies show structural changes to specific brain regions and structural and functional connectivity differences between regions in PTSD (Akiki, Averill, & Abdallah, 2017; Hughes & Shin, 2011; Mueller et al., 2015; Philip, Carpenter, & Sweet, 2014; Tursich et al., 2015). Cortical thickness (CT) and surface area (SA) are reliable biomarkers of pathology across psychiatric illnesses including PTSD. Interregional relationships in cortical thickness (Yun et al., 2020) are referred to as *structural covariance networks* (SCN). Features of a SCN, such as centrality, may be used to characterize regional and network pathology associated with neuropsychiatric disorders. Centrality is a concept from graph theory, which measures the importance of a particular region within a network. In graph theory, a network is made up of connections (edges) between brain regions (nodes) (Rubinov & Sporns, 2010b). Cortical volume, CT, and SA have been used to generate centrality measures using all possible pairwise correlations between cortical regions as edges in a group of subjects (He & Evans, 2010; Rubinov & Sporns, 2010a; Sun, Haswell, Morey, & De Bellis, 2018; Sun, Peverill, Swanson, McLaughlin, & Morey, 2018). SCNs that characterize interregional correlations of CT or SA in group of subjects may represent underlying functional associations (Gong, He, Chen, & Evans, 2012; He, Chen, & Evans, 2007). Positive interregional correlations based on CT are consistent with diffusion imaging derived structural connections (Gong et al., 2012) and genome co-expression (Romero-Garcia et al., 2018).

Studies have investigated PTSD-associated differences in cortical measures (Bromis, Calem, Reinders, Williams, & Kempton, 2018; Wang et al., 2020), task-based functional connectivity (Hughes & Shin, 2011), and resting-state functional connectivity (Koch et al., 2016). Thus far, meta-analyses of structural neuroimaging in PTSD have applied voxel-based morphometry (VBM) and volume estimates of cortical regions to reveal gray matter volume differences in anterior cingulate cortex, insula, medial and ventromedial prefrontal cortex, orbitofrontal cortex, left temporal pole, rostral middle frontal gyrus, and superior frontal gyrus (Kuhn & Gallinat, 2013; Meng et al., 2016). However, there has been sparse literature on SCN in PTSD, consisting of two studies in adults with PTSD (Mueller et al., 2015; Sun, Davis, et al., 2018), two studies examining SCN in children or youth with PTSD (Sun, Haswell, et al., 2018; Sun, Peverill, et al., 2018), one study focused on SCN derived from diffusion tensor imaging (DTI) measures (Long et al., 2013), and finally one longitudinal study focused on SCN features predicting symptom onset following acute exposure to trauma (Harnett NG, Available online 7 August 2020). Findings were not consistent across studies, areas highlighted included bilateral anterior cingulate, bilateral superior frontal gyrus, right insula and occipital cortex. The sample sizes of the

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aforementioned studies were relatively small (~300) in relation to the 148 cortical regions under consideration, which involves 10,878 inter-regional relationships.

High data dimensionality in relation to sample size presents a challenge in controlling Type I error (Konietschke, Schwab, & Pauly, 2020). Thus, drawing robust inferences from a high-dimensional feature space containing 148 cortical regions (Destrieux Atlas) requires a sample size that is larger than the number of features. Furthermore, each of the published studies have focused on specific types of trauma and/or populations such as military (Mueller et al., 2015), motor vehicle crash (Harnett NG, Available online 7 August 2020), childhood maltreatment (Sun, Haswell, et al., 2018; Sun, Peverill, et al., 2018), but there is lack of SCN results that capture the heterogeneity of trauma types commonly found in PTSD. Finally, none of these published reports in adults with PTSD examined cortical surface area derived SCNs. Surface area is of particular interest given its strong genetic basis in relation to the weaker genetic basis of cortical thickness. A large GWAS examining the genetic architecture of the human cortex found that surface area was negatively genetically correlated to cortical thickness (Grasby et al., 2020). Given the divergent genetic architectures of surface area and cortical thickness coupled with the role of genetics to PTSD (Nievergelt et al., 2019) means it is essential to dissect the distinct contributions of CT-derived and SA-derived SCNs.

There have been no studies to investigate sex differences in PTSD using SCN. In the present study, we compared CT- and SA-based network centrality measures in 3439 PTSD and trauma-exposed control subjects from the Enhancing Neuroimaging Genetics through Meta-Analysis (ENIGMA) - Psychiatric Genomics Consortium (PGC) Consortium for PTSD. We hypothesized that areas previously implicated in the pathophysiology of PTSD such as the anterior cingulate, insula, ventromedial prefrontal cortex (vMPFC) and occipital regions would show differences in network centrality. Given sex-based difference in salience network connectivity in PTSD, we hypothesized sex-based disruptions in network centrality measures in the salience network comprising dorsal anterior cingulate (dACC), and insula. Consistent with limited previous literature, we also hypothesized centrality differences in the parahippocampal gyrus and salience network based on presence or absence of comorbid major depressive disorder (MDD).

## 2. SUBJECTS AND METHODS

### 2.1 Subjects

The ENIGMA-PGC PTSD Working Group aggregated (Table 1) PTSD patients and control subjects' data with varying levels of trauma exposure from 29 cohorts in five countries. We analyzed CT data from 3439 subjects

Structural Covariance Networks in Post-Traumatic Stress Disorder: A Multisite ENIGMA-PGC Study and SA data from 3436 subjects. The vast majority (92% of subjects with PTSD, 85% of control subjects) of participants were adults, and the remaining sample was a combination of children and adolescents (Table 1). The sample comprised 1348 PTSD subjects (39%) and 2082 healthy controls (61%). Average age and standard deviation (SD) of male PTSD subjects was (38±15) years, (37±17.1) years for male control subjects, (34.5±12.7) years for female PTSD subjects, (32±14.3) years for female control subjects. **Supplemental table 1** shows age by diagnoses and sex at each site. Sixteen out of 29 sites had control subjects with trauma exposure (**Table 1**); the remaining sites had controls who were unexposed to trauma. The percentage of subjects with MDD is also reported in **Table 1**.

**[Insert Table 1- Demographics Across Sites]**

## 2.2 Methods

Rating scales are described in section 2.2.1 of supplementary material.

**[Insert Table 2 – Rating Scales by Site]**

Scanner details and acquisition parameters are in **Supplementary Table 2**. Inclusion and exclusion criteria for each site are in **Supplementary Table 24**. All participating sites obtained approval from local institutional review boards and ethics committees. All participants provided written informed consent.

### 2.2.2 Imaging

Structural MRI (T1) data obtained from cross-sectional case-control studies were analyzed at Duke University with a standardized neuroimaging and QC pipeline developed by the ENIGMA Consortium (<http://enigma.ini.usc.edu/protocols/imaging-protocols/>) (Logue et al., 2018). Cortical parcellation was performed with FreeSurfer 5.3 on 148 regions (74 per hemisphere) that were labeled with the Destrieux atlas (Destrieux, Fischl, Dale, & Halgren, 2010).

### 2.2.3 Network analyses

**Figure 1** and its legend explain the sequential analysis steps of our pipeline.

**[Insert figure 1-SCN Analyses Pipeline]**



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### 2.2.6 Centrality measures

We selected network topology measures that would enable direct comparisons of our results with previous findings (Mueller et al., 2015; Teicher, Anderson, Ohashi, & Polcari, 2014). Using undirected connections for correlation-derived graphs, four centrality measures were calculated with the Brain Connectivity Toolbox (BCT) (Rubinov & Sporns, 2010a): degree centrality, betweenness centrality, closeness centrality, and eigenvector centrality (**Supplementary section 2.2.6**).

### 2.2.7 Statistical Analysis

Analyses were performed with MATLAB scripts that we reported previously (Sun, Haswell, et al., 2018; Sun, Peverill, et al., 2018). Our method is similar to, but far more stringent than, methods for controlling Type 1 error used in earlier reports (Teicher et al., 2014). Further details are available in the **Supplementary material 2.2.7**.

## 3. RESULTS

Key demographic and clinical characteristics of each cohort are reported in **Table 1**. Wiring costs obtained from CT-based positive correlation coefficients were 0.06 and 0.07 for PTSD and control groups respectively, and SA-based wiring costs were 0.1 and 0.007 in PTSD and control groups respectively. These minimum wiring costs were calculated using supra-threshold positive correlation and ensured that nodes in the network were well connected (Teicher et al., 2014). **Table 3** shows wiring costs for each diagnostic group.

**[Insert Table 3 - Wiring Costs]**

### 3.1 CT SCN Results

#### 3.1.1 Graph Centrality Based on Pearson's Correlation Coefficients

**[Insert Figure 2 - SCN Differences between PTSD and Controls]**

**[Insert Table 4 - CT Positive Correlations]**

The PTSD group showed higher centrality compared to controls in the left fusiform gyrus, left precentral gyrus, lateral aspect of left superior temporal gyrus, left inferior frontal sulcus, right paracentral gyrus and sulcus, right

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inferior temporal gyrus. The PTSD group showed lower centrality compared to controls in right posterior transverse collateral sulcus and right anterior occipital sulcus (**Table 4 and figure 2**).

**Supplemental Table 4** provides comparisons of centrality between PTSD and control groups based on negative correlation coefficients.

### 3.1.2 Interactions

Brain regions with a significant interaction of age and diagnosis on centrality that are based on positive correlation coefficients are displayed in Figure 3 and listed in **Supplemental Tables 5 to 12** for age ranges (in years) <10, 10-15, 15-20, 20-30, 30-40, 40-50, 50-60, and >60 respectively. **Supplemental figure 1** shows the number of subjects in each age group for PTSD subjects versus controls.

**[Insert Figure 3- CT SCN across Age Groups in PTSD Subjects and Controls]**

Regions with significant interactions of diagnoses and sex are listed in **Table 5**. **Table 6** shows the main effect of sex (males versus females regardless of diagnoses); **tables 7 and 8** show how males and females compare in PTSD subjects and control subjects respectively. **Tables 9 and 10** shows results comparing centrality of PTSD and control groups in males and females respectively. We show all these comparisons in **Figure 4**.

**[Insert Figure 4- Sex Based Differences across PTSD Subjects and Controls]**

**[Insert Table 5 - Diagnoses X Sex Interactions]**

**[Insert Table 6 - Main Effect of sex]**

**[Insert Table 7 – PTSD Male versus PTSD Female]**

**[Insert Table 8 –Male Controls versus Female Controls]**

**[Insert Table 9 - Male PTSD versus Male Controls]**

**[Insert Table 10 – CT - Female PTSD versus Female Controls]**

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Nodes that showed a significant interaction of PTSD and MDD are listed in **Table 11**, while the main effect of comorbid MDD is provided in **Table 12**. **Table 13** compares PTSD with comorbid MDD to PTSD alone, and **Table 14** compares PTSD with comorbid MDD to controls.

**[Insert Table 11 - PTSD Diagnosis X MDD Interaction]**

**[Insert Table 12 - Main effect of comorbid MDD]**

**[Insert Table 13 - PTSD and MDD vs PTSD]**

**[Insert Table 14 - PTSD and MDD VS Controls]**

### 3.2 SA SCN Results

#### 3.2.1 Graph Centrality Based on Pearson's Correlation Coefficients

Compared to control subjects, PTSD subjects showed higher centrality in the left superior temporal sulcus and middle posterior part of the right cingulate gyrus and sulcus. Compared to PTSD subjects, controls showed higher centrality in the left pericallosal sulcus (**Figure 2 and Table 15**).

**[Insert Table 15 - SA Positive Correlations]**

**Supplemental Table 13** provides results comparing centrality measures between PTSD and control subjects using negative correlation coefficients as connections.

#### 3.2.2 Interactions

Brain regions with significantly different centrality between PTSD subjects and controls are listed in **Figure 3** and **Supplemental Tables 14 to 21** for age groups <10, 10-15, 15-20, 20-30, 30-40, 40-50, 50-60, and >60 respectively.

Nodes showing a significant interaction between diagnoses and sex are listed in **Table 16**. **Table 17** shows main effect of sex. **Tables 18 and 19** show comparisons between males and females in PTSD and control groups respectively. **Tables 20 and 21** show comparisons between PTSD and control groups in males and females respectively. We show all of these results in **Figure 4** as well.

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[Insert Table 16 - Diagnoses X Sex Interactions]

[Insert Table 17 - Main effect of sex]

[Insert Table 18 – PTSD Male vs PTSD Female]

[Insert Table 19 – Male Controls vs Female Controls]

[Insert Table 20 – Male PTSD v Male Controls]

[Insert Table 21 – Female PTSD vs Female Controls]

Nodes with significant centrality interactions of PTSD diagnoses and MDD diagnosis are listed in **Table 22**. **Table 23** shows the main effect of MDD (i.e. MDD with and without PTSD vs. no MDD with and without PTSD). **Tables 24** and **25** show how subjects with PTSD and comorbid MDD compare to those with only PTSD as well as how subjects with PTSD and comorbid MDD compare to controls.

[Insert Table 22 - PTSD Diagnosis X MDD Interactions]

[Insert Table 23 - Main effect of MDD]

[Insert Table 24 - PTSD and MDD vs PTSD]

[Insert Table 25 - PTSD and MDD vs controls]

#### 4. DISCUSSION

To the best of our knowledge, our study is larger than prior SCN studies of PTSD by an order of magnitude and is the first cross-sectional study to examine SCN interactions between PTSD diagnosis and age (**Figure 3**), diagnosis and sex (**Figure 4**), and diagnosis and MDD. Although CT and SA revealed contrasting results (**Figure 2**), both measures pointed to frontal, temporal and occipital involvement, which falls in line with results from previous structural neuroimaging studies in PTSD (Akiki et al., 2017; Fenster, Lebois, Ressler, & Suh, 2018). Supplementary Tables 22 and 23 display regions with overlapping results across age bins in the present study, compared with results from previous studies.

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In our analyses, positive correlations with cortical thickness showed higher centrality in left inferior frontal gyrus and left fusiform gyrus, both of which are areas that mediate fear conditioning (Fenster et al., 2018; Morey et al., 2015). This analysis also showed centrality measure differences in anterior occipital sulcus and posterior transverse collateral sulcus. There is sparse literature on how occipital brain regions are affected in PTSD, mainly in the context of visual processing (Neumeister et al., 2017) and flashbacks (Whalley et al., 2013). CT-based SCN showed PTSD to be associated with higher centrality of the right inferior temporal gyrus and left superior temporal gyrus. These regions form a part of the default network (DMN) dorsomedial subsystem (Andrews-Hanna, Smallwood, & Spreng, 2014). With SA, the left superior temporal sulcus (parts of DMN dorsomedial subsystem (Andrews-Hanna et al., 2014)) and right cingulate gyrus and sulcus (part of salience network) showed increased centrality.

Nodes with significantly higher centrality measures represent focal points of communication and could be considered overall drivers of brain activity due to their structural and/or functional connectivity (Lerch et al., 2006; Mechelli, Friston, Frackowiak, & Price, 2005). Since our results show only positive correlations between involved regions, discerning whether all the relevant regions are increasing or decreasing in CT/SA would need further investigation (Zuo et al., 2012). For functional connectivity data, centrality measures offer insights into a given node's relationship to the entire functional connectome unlike other approaches like seed-based connectivity or independent component analysis (Zuo et al., 2012). Centrality derived from cortical measures comports with white matter tracts (Gong et al., 2012) as well as with gene expression (Romero-Garcia et al., 2018), but such converging evidence is not available for other graph theory measures like efficiency.

In a study that used SCN to investigate 300 children with normal development trajectories who were into four age groups (Zielinski, Gennatas, Zhou, & Seeley, 2010), salience and executive control networks matured earlier in females across all age groups, these networks were less distributed in the first two age groups compared to the latter two (Zielinski et al., 2010). At baseline, females have more pronounced amygdala activation and connectivity to prefrontal cortex compared to males (Helpman et al., 2017). Increased connectivity in the salience network is seen in males with PTSD, with reversal of this pattern seen in females with PTSD (Helpman et al., 2017). In our study, males with PTSD showed higher CT-based centrality than females with PTSD in bilateral central sulci, left temporal lobe, and right straight gyrus (part of vmPFC) as well as higher SA-based centrality in left anterior cingulate and left superior occipital gyrus. Males with PTSD showed higher CT-based centrality than male controls mainly in bilateral frontal lobes. By contrast, female subjects with PTSD showed higher centrality than female controls in bilateral frontal and temporal lobes, including the bilateral insula. Areas like the vmPFC (Kuhn & Gallinat, 2013), anterior cingulate (Clausen et al., 2020) and superior occipital gyrus (Crombie, Ross, Letkiewicz, Sartin-Tarm, & Cisler, 2021) have been

Structural Covariance Networks in Post-Traumatic Stress Disorder: A Multisite ENIGMA-PGC Study implicated in pathophysiology of PTSD. However, they have not shown sex differences in previous studies but showed differences in our SCN analyses. This could be explained by the relatively sparse literature on sex differences in PTSD. Thus, linking sex-specific structural findings of the vmPFC, anterior cingulate, and superior occipital gyrus to PTSD represents a unique contribution of the present study to the literature.

To the best of our knowledge, there are no studies that have investigated brain changes in PTSD across the lifespan. Available evidence in pediatric PTSD points to aberrant activity in hippocampus, amygdala and vmPFC (Herrington, 2017). In our analyses with CT, we found children (<10 years) and adolescents (10-15 years) to have centrality differences in frontal, temporal and parietal nodes. Starting with emerging adults (15-20 years and 20-30 years) and other age groups, we saw multiple nodes having centrality differences in all brain lobes with heavy conglomeration in the occipital regions. This advocates for disrupted frontolimbic circuitry in pediatric PTSD, consistent with previous studies (Herrington, 2017) and disproportionately heavy occipital involvement in adult PTSD (Chao, Lenoci, & Neylan, 2012; Crombie et al., 2021).

Despite high comorbidity rate of 48% (Flory & Yehuda, 2015; Kessler, Sonnega, Bromet, Hughes, & Nelson, 1995), there has also been scant literature investigating impact of comorbid MDD on brain changes in PTSD. Comorbid PTSD and MDD showed higher CT-based centrality in the right anterior cingulate gyrus, right parahippocampal gyrus, left sulcus intermedius primus, and right anterior transverse temporal gyrus; corresponding differences were not identified for SA-based centrality. However, the left insular gyrus was found to have lower SA centrality in subjects with PTSD and comorbid MDD compared to subjects with only PTSD. Our present results show left insula and right anterior cingulate regions having centrality differences between comorbid PTSD and MDD versus PTSD alone. This result is consistent with a study that compared network resting state connectivity between 27 subjects with PTSD and MDD and 23 subjects with only PTSD. In this study, connectivity between the subgenual ACC and perigenual parts of the ACC was increased in PTSD subjects with comorbid MDD compared to those without. Those with comorbid MDD group showed reduced functional connectivity between insula and hippocampus compared to the those without (Kennis, Rademaker, van Rooij, Kahn, & Geuze, 2013).

### **Strengths and Limitations**

This study has several strengths including a large sample size and multiple cohorts representing diverse trauma types, race, geography, demography, and chronicity by virtue of an extensive network of consortium contributors. However, this strength also represents an inherent weakness in so far as each site had different recruitment practices, different methods for clinical assessment even when using the same instruments was

Structural Covariance Networks in Post-Traumatic Stress Disorder: A Multisite ENIGMA-PGC Study used, and differing inclusion/exclusion criteria. Another strength was our strategy for addressing scanner-specific effects on cortical thickness and surface area with *ComBat* harmonization. *ComBat* applies empirical Bayes to improve the estimation of site parameters and has been shown to effectively remove unwanted sources of scanner and/or site variability (Fortin et al., 2018). We entered PTSD diagnosis, age, and sex as “biological variables” during *ComBat* harmonization to preserve their associated variability while removing variability associated with site and scanner. Among other limitations, firstly, we were not able to examine thickness in subcortical brain regions. Second, the present method does not allow for examining the effects of individual differences (e.g. PTSD symptom severity) on network characteristics; only a single network and associated network features are available for a particular group (e.g. PTSD males). Inter-regional correlations in network analyses resting-state functional magnetic resonance imaging, provide connectivity information for each subject, whereas SCN inter-regional relationships are available only at the group-level (Sun, Peverill, et al., 2018). Third, our study utilized a cross-sectional design, which limits inferences about the causal relationships between childhood or adult trauma exposure, PTSD status and severity, and CT-based SCN characteristics. Fourth, we did not include the effects of medication, due to inconsistent methods of collecting this information at many sites.

## Conclusions

We compared SCNs using CT and SA between PTSD subjects and controls, including interactions with age, sex and comorbid MDD. Compared to previous studies with sample sizes (~300), we had a large sample, and our study is the first to look at SCN interactions. We demonstrated altered centrality at areas forming parts of dorsomedial DMN and salience networks. We found sex-based centrality differences in left anterior cingulate, left superior occipital cortex and right vmPFC and this represents a unique contribution of our study. We also found comorbid MDD based centrality differences in right anterior cingulate and left insular gyrus. Nodes with significantly altered centrality measures could be translational targets for precision neuromodulation in PTSD, based on sex, illness severity and comorbid MDD if present.

## Data Availability Statement

Data available on request from the authors

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### Figure Legends

#### Legend for Figure 1

We harmonized CT and SA values with *ComBat* to minimize sources of variance related to study site and scanner while preserving signal associated with the parameters of interest such as diagnostic grouping and other clinical covariates of interest (Fortin et al., 2018). as detailed in supplementary section 2.2.4. Subsequently, age, age<sup>2</sup>, sex, site and mean whole-brain CT or SA estimates were regressed from the CT and SA estimates with a linear model (He et al., 2007) as explained in supplementary section 2.2.5. We performed SCN analyses by representing brain regions as nodes and CT/SA correlation coefficients as edges (He & Evans, 2010; Rubinov & Sporns, 2010a; Sun, Haswell, et al., 2018). Positive and negative coefficients were used to generate separate networks. Wiring cost was used to generate binary graphs for each group and is defined as the number of edges present divided by maximum possible number of edges (Bassett et al., 2008; Teicher et al., 2014). Previous publications considered only positive correlations between regions in centrality analyses as substantiated by evidence that they are largely mediated by direct fiber pathways (Gong et al., 2012). We focused on positive correlations in this report but results of negative correlations are available in the **Supplementary Material**. We assessed the reliability (99% confidence interval) of between-group comparisons using jackknife resampling. Permutation testing generated the probability of significant between-group differences in centrality measures based on the between-group difference of nodal centrality based on a distribution 10,000 random assignments of group. We tested interactions with permutation testing with some modifications of the procedure.

#### Legend for Figure 2

Figure 2 shows centrality differences between PTSD subjects and controls using networks, created only with positive correlations as edges. A highlight these differences with cortical thickness (CT) and B highlights these differences with surface area (SA). For CT, areas corresponding to numbered regions are as follows: - 1- left inferior frontal sulcus, 2- left precentral gyrus, 3- anterior aspect of superior temporal gyrus, 4- left fusiform gyrus, 5- right paracentral gyrus and sulcus, 6- right inferior temporal gyrus, 7- right posterior transverse collateral sulcus, 8- right anterior occipital sulcus. For SA, areas corresponding to numbered regions are as

Structural Covariance Networks in Post-Traumatic Stress Disorder: A Multisite ENIGMA-PGC Study follows: - 1- left pericallosal sulcus, 2- left superior temporal sulcus, 3- right middle posterior part of the cingulate gyrus and sulcus.

Regions colored in red showed higher centrality in PTSD subjects compared to controls. Regions colored in blue showed higher centrality in controls compared to PTSD subjects.

### **Legend for Figure 3**

Figure 3 shows a SCN comparison between PTSD subjects and healthy controls across different age groups. A is for cortical thickness (CT) and B is for surface area (SA) measures. Various age groups that are compared include <10 years, 10-15 years, 15-20 years, 20-30 years, 30-40 years, 40-50 years, 50-60 years and > 60 years. Each age group has a different color code as shown in the box below the figure. Views shown at either ends of A and B in the top (first) row depict medial views. Views shown at either ends of A and B in the middle (second) row depict lateral views.

### **Legend for Figure 4**

Figure 4 shows diagnoses sex interaction comparisons between PTSD subjects and healthy controls. A is for cortical thickness and B is for surface area measures. Comparisons highlighted in the figure include the main effect of sex, male versus female subjects with PTSD, male versus female healthy controls, PTSD subjects versus healthy controls among males, PTSD subjects versus healthy controls amongst females and then the interaction effect. For the interaction effect, G1 stands for (male and PTSD or female and no PTSD) and G2 stands for (female & PTSD OR male & no PTSD).

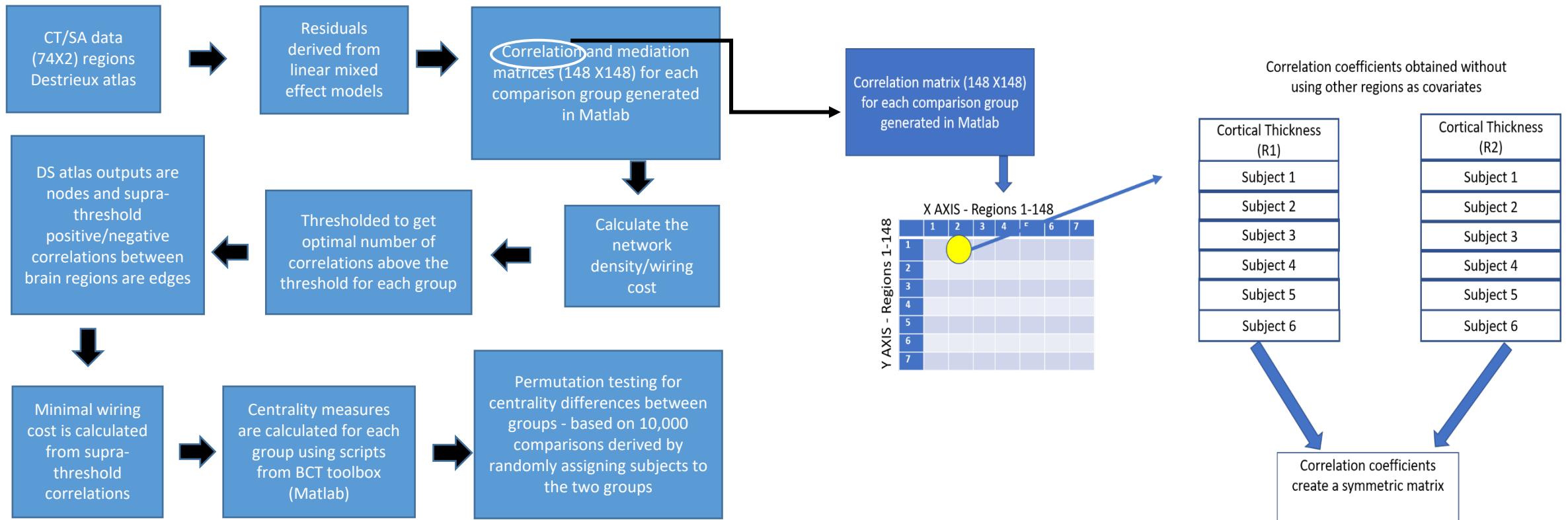


Figure 1 – SCN Analyses Pipeline

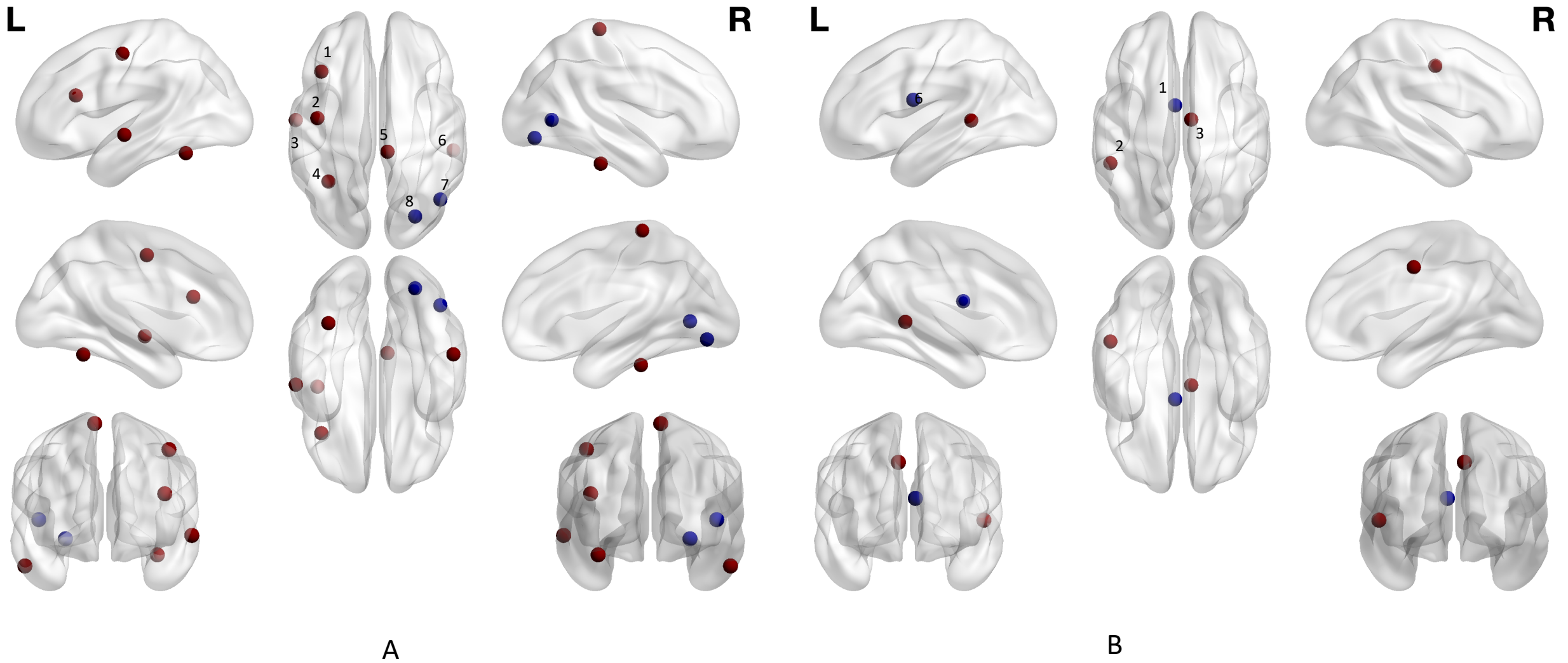
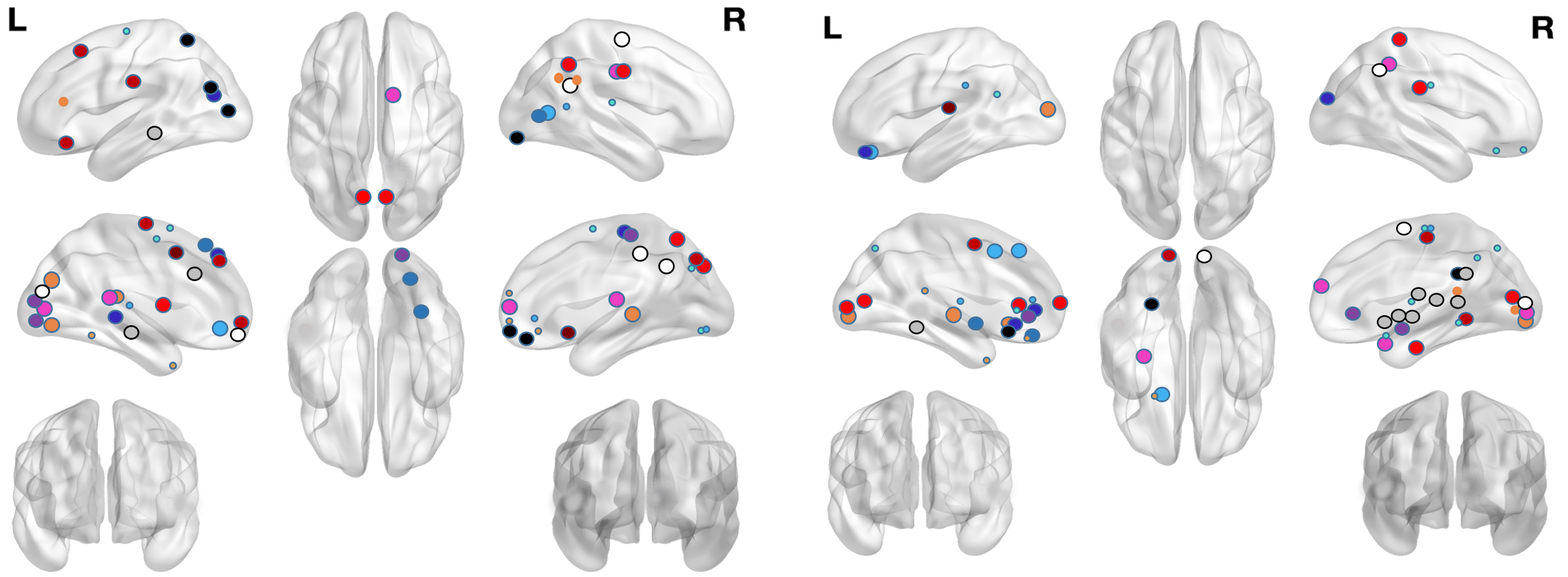


Figure 2 – SCN Differences between PTSD and Controls

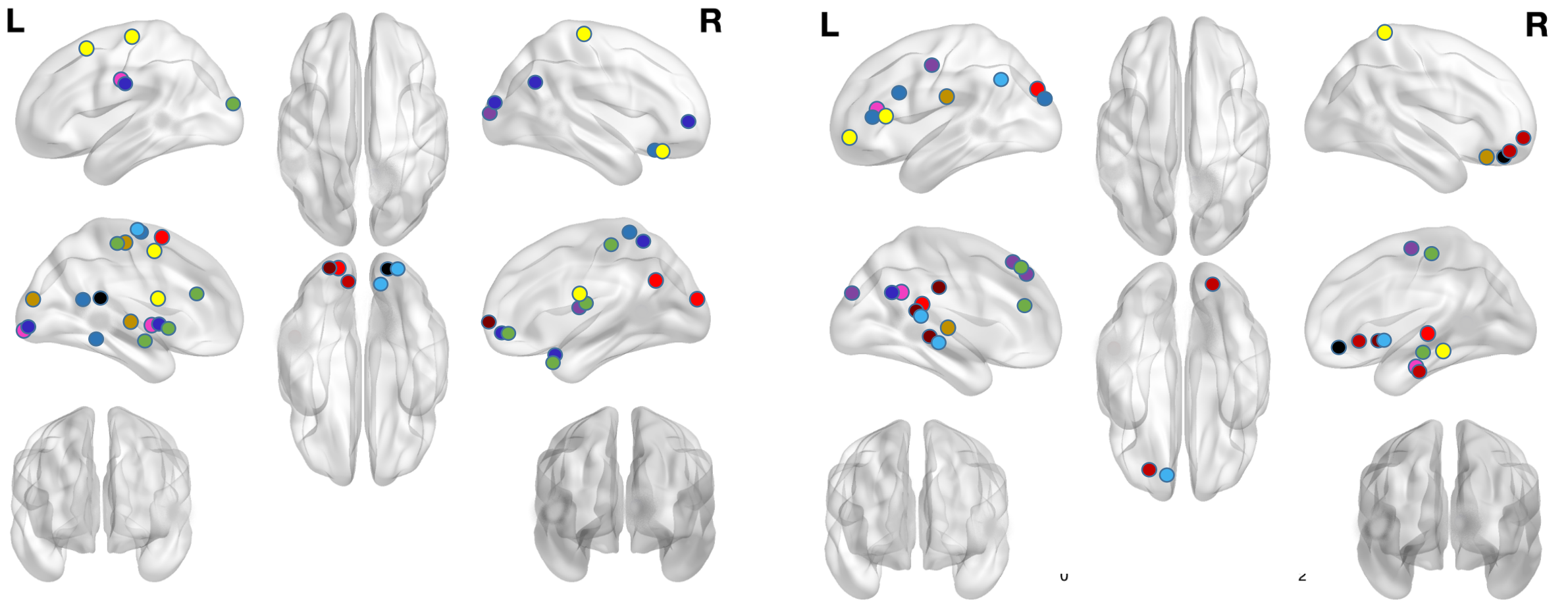


A

B

Age	<10	10-15	15-20	20-30	30-40	40-50	50-60	>60
PTSD>CONT								
CONT>PTSD								

Figure 3- SCN Across Age Groups in PTSD Subjects and Controls



A

B

	Gender	PTSD	CONT
M>F	●	●	●
F>M	●	●	●

	Male	Female
PTSD>CONT	●	●
CONT>PTSD	●	●

	Interaction
G1>G2	●
G2>G1	●

Figure 4 – Sex Based SCN Differences Across PTSD Subjects and Controls