Frequency-specific Alterations of Functional Hub in Generalized Tonic-clonic Seizure*

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Abstract

Resting-state functional magnetic resonance imaging (rs-fMRI) has shown aberrant brain functional networks at a conventional low-frequency range (0.01-0.08 Hz) in individuals with generalized tonic-clonic seizure (GTCS). However, it is unclear how functional networks hubs change across different frequency bands in GTCS patients . In this study, we applied a data-driven method called complementary ensemble empirical mode decomposition (CEEMD) to decompose the whole brain blood oxygen level-dependent (BOLD) time series into five frequency-specific bands. Then, we compared alterations of frequency-specific functional hub across five different frequency bands in 21 GTCS patients to 22 normal control (NC) subjects. CTCS patients showed aberrant functional hubs predominately at some particular frequency bands and primary in the default mode network (DMN) and the somatomotor network (SMN). Furthermore, we found these hubs located in the DMN and the SMN at some specific bands (0.015 -0.025 Hz, 0.12 - 0.25 Hz) were associated with disease severity. These findings highlight the role of frequency-specific functional hub, and may helpfully uncover abnormal neuronal activity in patients with GTCS at frequency-specific bands.

Keywords: Resting-state; GTCS; Hub; CEEMD; Frequency-specific.

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1. Introduction

Generalized tonic-clonic seizure(GTCS) is a common type of idiopathic generalized epilepsy (ICE)¹. Generally, epileptic seizures are believed to affect a great number of brain regions and dramatically impair the patient 's state of consciousness². However, our understanding of the mechanisms of seizure initiation, maintenance, and termination during GTCS is still limited.

Resting-state functional magnetic resonance imaging (rs-fMRI) has been popularly applied to investigate spontaneous brain neural activity and has widely been performed to reveal intrinsic functional network abnormalities in various epilepsies^{3,4}. To date, the majority of previous studies have predominately detected abnormal epileptic at a conventional lowfrequency range (0.01-0.08 Hz) because the lowfrequency range was thought to be linked to neuronal intrinsic fluctuations, which may ignore some meaningful information associated with frequencyspecific spontaneous blood oxygen level-dependent (BOLD) fluctuation⁵⁻⁸. Besides, neighboring frequency bands within the same neuronal network may compete or interact with each other, which means that the brain resting-state functional networks intrinsic frequency-dependent^{9,10}. However, few studies have concentrated on the changes in intrinsic activity that occurs across different frequency bands in patients with GTCS¹¹. These studies usually investigated in resting-state functional connectivity by band passing the data into a priori defined frequency intervals.

The hypothesis suggests that brain functional network contains hubs which are important to process cortical information. Meanwhile, lesioning the hub thus result in severe cognitive impairment¹². The existence and nature of hubs have become a major research target in brain functional networks¹³
15. Recently, a resting-state fMRI study has examined the impact of abnormalities in functional hubs in patients with GTCS¹⁶. Importantly, the majority of research on hubs has been carried out under the

assumption that resting-state brain function connectivity is consistent in time¹⁶⁻¹⁸. However, it is unclear how these hubs in brain functional networks change across different frequency bands in GTCS patients.

In the present study, we applied a data driven method called complementary ensemble empirical mode decomposition (CEEMD) to adaptively decompose the whole brain BOLD time series into several intrinsic frequency bands. Thereafter, the significant differences of hub in brain resting-state functional network between the two groups (GTCS and NC groups) at different frequency bands were identified and the severity of epileptic and cognitive function were explored. This study aim to uncover neurophysiological significance of frequency-specific abnormal hub topological connectivity property in GTCS.

2. Materials and Methods

2.1. Participants

Patients with GTCS were recruited at Lanzhou General Hospital of Lanzhou Military Command, Lanzhou, China, between November 2011 and February 2013. We diagnosed patients according to the criteria of the International League Against Epilepsy (2001). A total of 23 patients with GTCS met these inclusion criteria. In the same period, we picked out 22 age- and sex-matched normal controls (NC) volunteers as a control group. No individuals suffer from neurological or psychiatric disorder and no gross abnormalities in brain MRI images. All the participants were given written informed consent. The local medical ethics committee at Lanzhou General Hospital of Lanzhou Military Command approved the study. Two groups handedness. At the end, 2 patients were excluded owing to excessive head motion parameters that exceeding 1.5 mm translation or 1.5° in rotation. The demographic and clinical information of all the participants are detailed in Table 1.

Table 1. Demographic characteristics of the participants.

	CTCS (n=21)	Controls (n=22)	t value	p value	
Sex (male/female)	11/10	11/11	-	-	
Age (years)	18.58±6.49	17.47±6.12	0.449	0.675	
Handedness(right/left)	21/0	22/0	-	-	
Years of education (years)	8.53±2.15	8.35±2.23	0.201	0.842	
NHS3 scores	12.59±3.08	-	-	-	

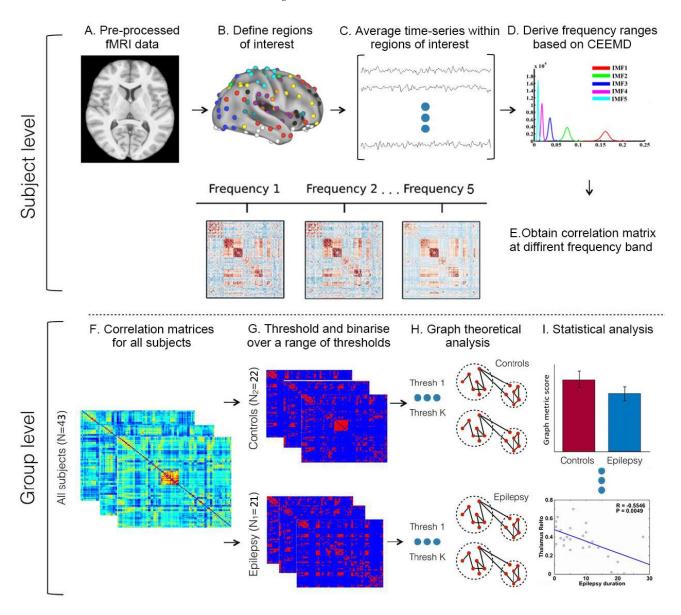


Fig. 1. A schematic overview of the analysis steps in this study.

2.2. Data Acquisition

All resting-state fMRI data were collected using a 3.0 T Siemens Trio scanner (Erlangen, Germany) with a 16 - channel phased array head coil. During the data acquisition, participants were instructed to relax with their eyes closed, not think of anything in particular, keep their heads not moving in the scanner, and not fall asleep. The scan images were acquired using a GRE-EPI sequence (repetition time = 2000 ms, echo time =

30 ms, slice thickness = 3.8 mm, slice gap = 0.38 mm, field of view = 240×240 mm², in-plane matrix = 64×64 , flip angle = 90° , and 34 slices covered the whole brain) to measure 200 functional volumes for each participant, resulting in a total scan time of 400 seconds.

2.3. Data Preprocessing

The functional data preprocessing was performed using DPARSF (http://www.restfmri.net). Firstly, the first 10 functional images volumes were removed to stabilize

the signal and adapt to inherent scanner noise. Secondly, we corrected the functional images by slice-timing calibrating and realigning head motion. Next, functional images were normalized into standard three-dimensional space at a resolution of $3\times3\times3$ mm³ using the Montreal Neurological Institute (MNI) template. Moreover, several sources of spurious variances were discard by regression processes. Finally, any linear trends within the voxels were removed so as to discard signal drifts caused by scanner instability or other sources.

2.4. Definition of Frequency-specific Band

We adopted a data-driven method called complementary ensemble empirical mode decomposition (CEEMD) which was originally derived in Qian et al¹⁹ to separate the time series of each voxel into several intrinsic oscillation rhythms with distinct frequency bands. CEEMD is modified from a noise assisted ensemble empirical mode decomposition (EEMD), which produces an ensemble of data sets by adding different realizations of a white noise with finite amplitude ε to the original data. The averaging impact of the assisted white noise ε f decrease as:

$$\varepsilon f = \varepsilon \cdot std(y)/NE$$

Where ε is the input noise level, y represents the input signal and NE is ensemble number.

Based on the CEEMD method, five distinct frequency bands were derived to cover a frequency range from 0 to 0.25 Hz, with each interval range. This identified five frequency-specific bands including 0-0.016 Hz, 0.015-0.025 Hz, 0.025-0.055 Hz, 0.055-0.12 Hz, and 0.12-0.25 Hz.

2.5. Graph Theoretical Analysis

Network Construction. In this study, we used the node template described by Power et al²⁰. This template contains the subgraphs based on the known spatial structure of resting state fMRI network. We used a altered version where the 13 derived subgraphs were reduced to 5 subgraphs so that we could abtained hubs clearly. Throughout the paper, we used five subgraphs as follows: default mode network (DMN, 58 nodes), frontal-parietal network (FPN, 44 nodes), cingulo-opercular network (CON, 32 nodes), somatomotor

network (SMN, 35 nodes), visual-auditory network (VAN, 37 nodes). Fifty-one nodes were not assigned to any particular subgraph. Two hundred sixty-four 10 mm spherical nodes were defined along the cortex as well as in subcortical nuclei. Each node time series was extracted from each subject across five frequencies by averaging the BOLD signal intensity timecourse over all voxels in each of the 264 nodes. Pearson correlation coefficient was applied to estimate the correlation between any two nodes. We calculate the correlation among all of the 264 nodes, deducing 34848 correlation coefficients in every frequency band. Thus, we obtained a set of five (264 × 264) inter-regional Pearson correlation matrices for each subject. False discovery rate (FDR) correction was applied to regulate the expected FDR at the statistical significance threshold at 0.05 in individual level. Thus, five frequency dependent population based functional connectivity networks were constructed by capturing the underlying common connectivity pattern of the brain in each group.

Betweenness Centrality. We investigated the frequency dependency of node centrality by computing the node betweenness centrality (BC). BC is a sum of the shortest paths in the network that pass through a given node, which captures the effect of a node over information flow among other nodes in the network¹⁶. A high degree of BC is a hallmark property for nodes that are strong candidates to act as network hubs that are vital for the flow of information throughout the network BC of node i is defined as:

$$BC = \frac{1}{(n-1)(n-2)} \sum_{\substack{h,j \subset N \\ h \neq j, h \neq i, j \neq i}} \frac{p_{hj}(i)}{p_{hj}}$$

Where p_{hj} is the number of shortest paths between h and j, and $p_{hj}(i)$ is the number of shortest paths between h and j that pass through i.

For the comparison between frequency-specific bands, each subjects BC were normalized over the frequency-specific band. Due to lack of a formal consensus regarding selection of thresholds, here a range of sparsity threshold (s_{\min} (0.1) \leq sparsity \leq 0.4) were selected for functional connectivity networks, where min s represented a minimum network sparsity where all nodes would become fully connected in the five frequency-specific bands brain networks.

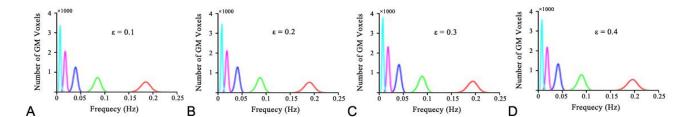


Fig. 2. Frequency distribution using CEEMD. From Fig. 2A to Fig. 2D, each figure represents the frequency distribution histogram determined from gray matter voxels in the whole brain across the entire group of subjects (n = 43), with an input noise level ϵ of 0.1, 0.2, 0.3 and 0.4 using CEEMD. The heights of the histograms represent the number of voxels whose histograms of frequency distribution equals to the frequency on the horizontal axis. The histograms of frequency distribution of the five frequency bands were colored by red, green, blue, magenta and cyan respectively. GM: gray matter.

2.6. Statistical Analysis

Two independent sample t-tests and Chi-squared tests were used to compare demographic performance (p < 0.05). For the BC measures used in this study, a subjectdependent value was obtained by averaging the measure over all graph nodes. Two-sample permutation t-tests assuming unequal variances between the two groups (epilepsy vs. controls) with 1000 non-parametric permutations were performed to quantify group differences at a specific threshold. For each permutation, group labels were randomly assigned to all subjects and the shuffled population was divided into two random groups. To further estimate the reliability of group effects, standardised effect sizes and the corresponding 95% confidence intervals (CI) were calculated for all metrics. Finally, using SPSS 18.0 software (SPSS, Inc., Chicago, IL), correlative analysis between mean BC value and disease severity was then performed on the GTCS groups by extracting of the most significant different frequency between groups. A schematic overview of the analysis steps can see in Fig. 1

3. Results

3.1. Frequency Distribution and Frequency Dependency of FC

Fig. 2 showed the histograms to demonstrate the first five intrinsic mode functions of the voxels in the whole-

brain gray matter at different input noise level ε using the CEEMD method across all the subjects, and each of them represents the data of the whole-brain gray matter voxels within distinct frequency bands. The frequency band is the best to divide the resting-state fMRI signals. Finally, we derived five frequency-specific ranges including 0-0.016 Hz, 0.015-0.025 Hz, 0.025-0.055 Hz, 0.055-0.12 Hz, and 0.12-0.25 Hz. Moreover, We performed a statistical comparison between the two groups over each of the frequency bands. In both the groups, the FC matrices of each frequency-specific band was presented in Fig. 3 to describe the inter-regional FC subtended by time series components. Across the two groups, the results indicated that the FC matrices continuously fluctuated at different frequency bands.

3.2. Frequency-specific Alternating of Functional Hub

We have investigated whether the existence of functional hubs is consistent to across five frequency bands in both the groups. In order to derive functional hubs, the BC values for all nodes were computed in all brain functional networks for all five frequencies. The spatial layout of the frequency-dependent hubs is shown in Fig. 4A-B. The results suggested that the spatial distribution of functional hubs was not a constant arrangement, but rather re-configured in space that

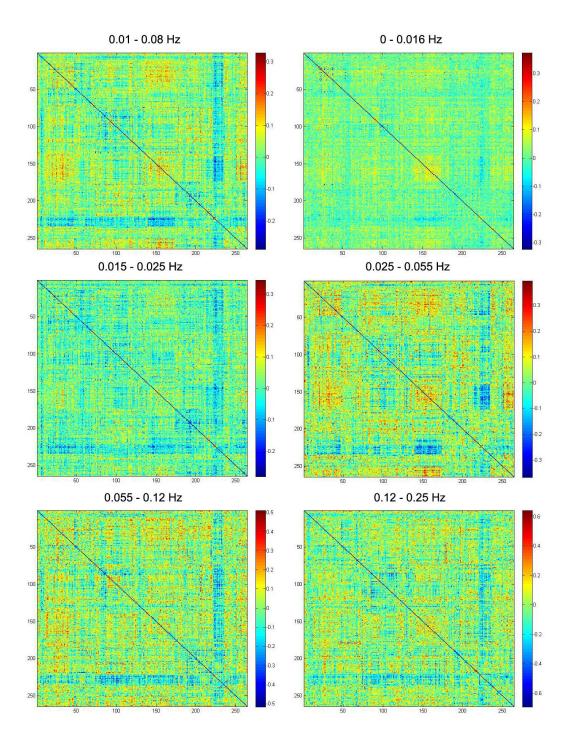


Fig. 3. Frequency-specific alternating of functional connectivity networks between-group. These correlation matrices denote the differences in functional connectivity networks for each specific frequency for both the groups(264×264 correlation matrix, the number from 1 to 264 represents the corresponding ROI in Power's template.), respectively. Hot color denote GTCS > NC, cool color denote GTCS < NC.

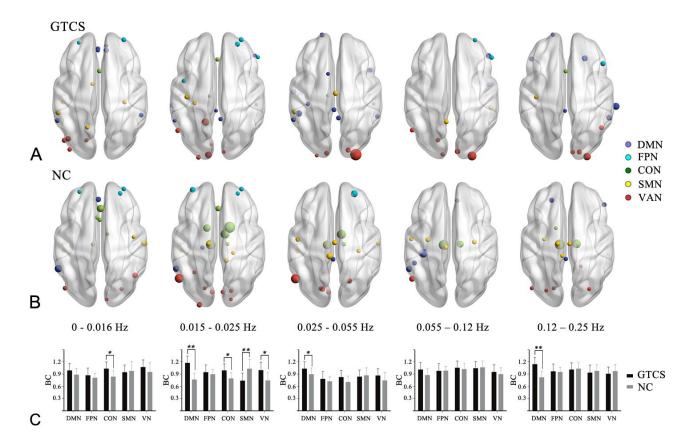


Fig. 4. Frequency-specific alternating of functional hub in within-group and between-group. Three dimensional rendering maps showed hub regions defined by BC in five frequency bands for the GTCS (Fig. 4A) group and the NC (Fig. 4B) group. The hub nodes shown in red, green, yellow,cyan and magenta color donate DMN, SMN, CON, FPN and VN subgraphs respectively as described by Power et al 20 . The size of the hub represents their BC values. The bar graph showed the mean BC values of subgraphs in both the groups with different frequency bands (Fig. 4C). The hubs are presented on three dimensional rendering maps using the BrainNet viewer (www.nitrc.org/projects/bnv/). DMN: Default mode network, FPN: Frontal parietal network, CON: Cingulo-opercular network, SMN: Somatomotor network, VAN: Visual-auditory network. *: p < 0.05; **: p < 0.01.

Table 2. The number of hubs for all five frequencies for each of the five subgraphs investigated.

	GTCS				NC					
Frequency bands	DMN	FPN	CON	SMN	VAN	DMN	FPN	CON	SMN	VAN
0 - 0.016 Hz	7	2	1	5	4	2	3	5	3	4
0.015 - 0.025 Hz	7	4	2	2	6	2	3	6	4	8
0.025 - 0.055 Hz	11	0	1	2	4	1	1	3	6	5
0.055 - 0.12 Hz	3	2	0	2	6	4	0	2	4	1
0.12 - 0.25 Hz	5	1	1	1	4	3	0	3	4	5

depends on the underlying frequency range of the BOLD resting-state signal. To further investigate the heteroscedastic dependence on frequency of functional

hubs and their difference between subgraphs, we computed the mean BC values for all subgraphs in each frequency specific brain network of the two groups as

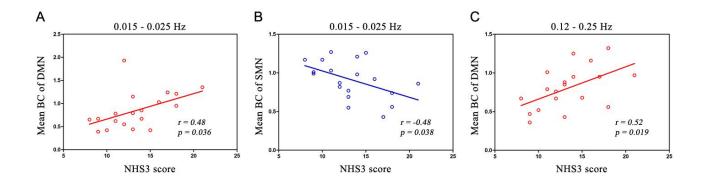


Fig. 5. Relationship between abnormal hub and disease severity. The NHS3 score of the GTCS patient was positively correlated with mean BC value in the DMN at 0.015 - 0.025 Hz (Fig. 5A) and 0.12 - 0.25 Hz (Fig. 5C), whereas negatively correlated with mean BC value in the SMN at 0.015 - 0.025 Hz (Fig. 5B).

shown in Fig. 4C. We found the significant differences of mean BC values mainly concentrated on the default mode network (DMN) and Somatomotor network (SMN). Particularly, to localize the specific frequency that exhibited alterations in hub in GTCS patient, we computed mean BC values of each subgraph in the five frequency bands. The results showed the GTCS patients had significantly higher BC at two specific frequencies (0.015 - 0.025 and 0.12 - 0.25 Hz) in DMN and lower BC at one specific frequency (0.015 - 0.025 Hz) in SMN.

Moreover, we have counted the number of hubs in each of the subgraphs for all five frequencies in both the groups as shown in Table 2. The number of hubs in several subgraphs are continuously changing in some specific frequencies. Interestingly, compared to NC group, the highest number of hubs in the FPN is found at 0.025 - 0.055 Hz, at 0.05 - 0.12 Hz for the DMN subgraph, while the lowest number of hubs in the CON is found at 0.025 - 0.055 Hz, at 0 - 0.016 Hz and at 0.015 - 0.025 Hz for the SMN subgraph in GTCS group. In general, our results suggested that altering functional hubs in GTCS happened at specific frequencies.

3.3. Relationship Between Abnormal Hub and Disease Severity

Clinical relevance analysis indicated that a significant correlation in DMN and SMN at some frequency-specific bands was found. The mean BC values of the node located in posterior portion of the DMN are positively correlated with the NHS3 scores in patients with CTCS at the 0.015 - 0. 025 Hz band (Fig. 5A, r =

0.48, P = 0.036) and at the 0.12 - 0.25 Hz band (Fig. 5C, r = 0.52, P = 0.019), whereas negatively correlated with mean BC value in the SMN at 0.015 - 0.025 Hz (Fig. 5B). We found that for the remaining frequency bands, there was no significant correlation between the BC values and the disease duration, onset age, or seizure frequency.

4. Discussion

This study aims to investigate frequency-specific alterations of functional hub in patients with CTCS. The principal finding was that CTCS patients showed aberrant functional hubs predominately at some particular frequency bands and primary in the DMN. Additionally, we found that abnormal brain functional hubs in the DMN at a specific higher frequency band between two groups were associated with the severity of GTCS. In general, these findings highlight a new view of frequency-specific hub in resting-state functional network, and may be helpful to uncover abnormal functional network in GTCS at specific frequency bands.

Previous studies have indicated that some brain rhythms organized many brain oscillations in order to support the complex brain activities within clear frequency bands. And in the same or different brain areas, these rhythms could temporally coexist. Due to specific properties and physiological functions, these rhythms may also interact with each other^{21,22}. CEEMD which is a data driven method was verified an efficient method in the aspect of separating the intrinsic coexisting rhythms that are in distinct frequency bands

because this method has the capability to eliminate mode-mixing effects¹⁹. In the current study, we applied the CEEMD to separate the inherent brain oscillations which were embedded in BOLD signals and the results have suggested that frequency characteristics of FC are strictly related with the corresponding inter-regional physical distance in both the groups.

We surveyed band-specific changes of brain functional hub in full frequency bands (0 - 0.25 Hz) in GTCS. It is not surprising that we observed continuous hub changes across the five frequency bands, and the changes primarily appeared in the DMN and in patients with GTCS, which is consistent with the previous findings^{11,16,23}. We have also observed the amplitude of low-frequency fluctuation (ALFF) and regional homogeneity (ReHo) changes in resting-state brain intrinsic fluctuations at different frequency bands in the GTCS patients^{11,23}. The frequency-specific strategy has been thought to be advantage able because it can provide more overall information about changed BOLD signals in the patients with GTCS. Interestingly, we found that the decreased BC mainly in the lower frequency bands (0. 015-0.025 Hz), while the increased BC predominately in the higher frequency bands (0. 12 -0.25 Hz). This indicates that frequency-specific functional DMN impairment in patients with GTCS is not constant in full frequency bands. Fortunately, this finding has first been reported in a human functional neuroimaging study of epilepsy. It is normally confirmed that the DMN is strictly correlated to human brain consciousness²⁴. GTCS is a remarkable type of convulsive seizure, after which consciousness is deeply damaged. Cerebral blood flow studies are beneficial for the reason of employing an injection of radio tracer during a seizure attempt. Therefore, researchers can identify abnormal activity that possibly contributes to the ictal impairment of consciousness²⁵. Our findings suggest that aberrant functional hubs occurs in the conscious-related network in patients with GTCS at some specific frequency. Although we don't know well the correspondence between the BOLD frequency bands investigated here and EEG rhythms, it seems probable that the different frequency band of BOLD fluctuations may play a particular role, indicating that frequencyspecific selection is useful for clinical therapies for epilepsy.

The findings suggest that the hubs located in the DMN at a higher frequency band (0.12-0.25 Hz)

showed increasing BC as the NHS3 scores in patients with GTCS increased. This altered functional hubs in the DMN may reflect the long-term injurious effects of epileptic activity, suggesting particular defective inhibition of the DMN in GTCS. This finding is consistent with the previous functional connectivity studies^{17,26}. Moreover, the frequency-specific reversal of functional hubs across 5 frequency bands located in the DMN indicates that the DMN is modulated by frequency in the GTCS patients. These findings uncover **DMN** may encompass frequency-specific hierarchical functions, corresponding with frequency-specific local synchronization of BOLD fluctuations. In general, these results illustrate that the DMN in different frequency bands is correlated with disease, which deepens our understanding of frequencyspecific pathology in patients with GTCS.

However, the study still has certain limitations. First, this was a statistic study between two groups with a relatively small sample size, which may contribute to some incorrect results. Second, we aim to study the spontaneous brain activities, but the thoughts of the participants during imaging may be the interference factors. Finally, the participants still have light head movements despite being demanded not to move their heads and being asked to close their eyes during imaging. However, we inspected each image and patients with head movements greater than 1.5 mm translation or 1.5 ° in rotation were excluded. Taking these limitations into consideration, future studies should be well designed and should include larger numbers of participants.

Despite the limitations, this study first observed that the aberrant hub distribution of brain functional networks are frequency-dependent in GTCS patients. Abnormal functional hubs at a specific high-frequency in the DMN can serve as potential clinical biomarker for GTCS.

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