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## ORIGINAL

### Clinical Utility of Automated Structural Brain Volume Analysis in MRI for Evaluating Temporal Lobe Epilepsy in Fitness Athletes

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#### ABSTRACT

**Background:** Investigating alterations in brain volumes among individuals with magnetic resonance-negative temporal lobe epilepsy (MRIn-MTLE) is of particular interest in the context of athletes and fitness enthusiasts. In this study, we aimed to examine these brain volume changes and their potential implications. **Methods:** We conducted a retrospective analysis of T1-weighted brain images from MRIn-MTLE patients and healthy controls (HC) who were actively engaged in athletics or fitness activities. Brain regions were segmented and quantified using Free Surfer software, and we compared the volumes of ipsilateral brain regions between patients and controls. We employed Feature Explorer software, based on Pyradiomics, to construct a classification model using volume parameters and assessed its effectiveness in distinguishing between MRIn-MTLE patients and controls. **Results:** Significant differences in brain volumes were observed in various regions of the brain, both on the left and right sides, among both HC and MRIn-MTLE patients. Notably, these differences varied by gender. In males, the estimated total intracranial volume (eTIV) and the volumes of specific regions in the left hemisphere were larger in the HC group than in the MRIn-MTLE group. In females, certain brain regions in the right hemisphere were smaller in MRIn-MTLE patients compared to the HC group. The classification model achieved an area under the curve (AUC) of 0.780 and an accuracy of 0.721. **Conclusions:** Our study identified notable reductions in brain volumes among MRIn-MTLE patients who are athletes or

fitness enthusiasts. Further investigations are needed to understand the underlying physiological and anatomical factors contributing to these differences. The findings suggest that brain volume measurements can serve as valuable features for constructing classification models to differentiate MRIn-MTLE patients from healthy individuals in the athletic and fitness community.

**KEYWORDS:** Athletes, Fitness Enthusiasts, Gender Differences, Neural Alterations, Neurological Studies

## INTRODUCTION

Temporal lobe epilepsy (TLE) is a well-studied neurological condition that affects a substantial number of individuals, including athletes and fitness enthusiasts. In some cases, TLE can become medically refractory, prompting the need for diagnostic interventions and potential surgical treatments to manage seizures effectively (Balter, Lin, Leyden, Paul, & McDonald, 2019; Cendes, 2005). When diagnostic methods, like EEG (Electroencephalogram), identify abnormal discharges primarily originating from the mesial temporal lobe, individuals are often categorized as having mesial temporal lobe epilepsy (MTLE).

In these cases, surgical teams leverage cortical EEG for precise localization of abnormal discharges during resection surgery, allowing for extended resections when necessary to prevent residual epileptic activity. Collaborative decision-making teams frequently involve experts in MRI, PET-CT (Positron Emission Tomography Computer Tomography), and EEG to assess the extent of epileptogenic foci before surgery and provide real-time guidance during the procedure (Alvim et al., 2016; Berg et al., 2010).

However, approximately 25% of individuals with TLE, including athletes and fitness enthusiasts, present with no identifiable cause or clear epileptogenic focus through neuroimaging. This subgroup is categorized as having focal epilepsy of unknown origin, with those exhibiting mesial temporal lobe abnormal discharges termed magnetic resonance imaging-negative mesial temporal lobe epilepsy (MRIn-MTLE).

Unlike cases with identifiable epileptogenic foci on conventional MRI scans, MRIn-MTLE individuals lack specific regions that can be directly pinpointed. While PET and EEG may help identify affected brain lobes, they often fail to provide sufficient spatial resolution before surgery. Consequently, MRIn-MTLE individuals, including athletes and fitness enthusiasts, have fewer opportunities for surgical intervention, resulting in inadequate seizure control and limited clinical relief. (Englot, Konrad, & Morgan, 2016).

To address this diagnostic challenge within the athlete and fitness enthusiast population, the study explores alterations in brain volumes

associated with MRIn-MTLE. Using T1-weighted magnetization prepared rapid gradient echo imaging (T1W-MPRAGE) scans of MRIn-MTLE individuals from this demographic and matched healthy controls, the study employs FreeSurfer software for automated segmentation of brain areas and structures. The study objectives include obtaining precise structural data for brain regions in MRIn-MTLE athletes and fitness enthusiasts as well as healthy individuals (Fischl, 2012).

Additionally, the study aims to analyze differences in brain structure between these groups and evaluate the utility of volumetric parameters for classification and diagnosis, ultimately enhancing our understanding of MRIn-MTLE within the athlete and fitness community. (Sáiz-Manzanares, Casanova, Lencastre, & Almeida, 2022).

## **1. Methods**

### **1.1. Subjects**

#### **1.1.1. Patients with temporal lobe epilepsy and negative magnetic resonance imaging (MRIn-MTLE)**

In our investigation, we conducted a retrospective analysis focused on athletes diagnosed with Magnetic Resonance-Negative Temporal Lobe Epilepsy (MRIn-MTLE) using the Picture Archiving and Communication System (PACS). The study encompassed athletes who had been seeking medical attention at our facility between January 2017 and December 2020. During this period, we collected vital data, including T1W-MPRAGE images and comprehensive information pertaining to these athletes.

Within our sports medicine center, we adhere to a standardized protocol when evaluating athletes with epilepsy-related concerns. This protocol encompasses the acquisition of T1W-MPRAGE images, utilization of the T2 CUBE FLAIR (fluid attenuated inversion recovery) protocol for assessing hippocampal signals, implementation of the T2 CUBE protocol for surgical guidance planning, evaluation of the affected brain region using the ASL (arterial spin labeling) protocol, performing PET-CT scans, and conducting long-range video electroencephalography (VEEG) monitoring.

It is worth noting that the identification of epileptogenic foci may occur before or after the MRI scan. As a result, we often integrate the results from PET-CT scans and VEEG monitoring, while simultaneously conducting segmentation and volume evaluation to assist in the interpretation of imaging data.

All athletes who conformed to our predefined inclusion and exclusion criteria were included in the MRIn-MTLE athlete group. The recruitment of

athletes for this study was carried out in collaboration with the Regional Collaborative Innovation Program of the Xinjiang Uygur Autonomous Region (Grant #2020E0275). It is important to note that this research project received approval from the Medical Research Ethics Board of the First Affiliated Hospital of Xinjiang Medical University. Additionally, all participating athletes provided written informed consent.

#### **1.1.1.1. Inclusion criteria**

Patients were included if they (1) met the epilepsy diagnostic criteria of the International League Against Epilepsy (2) underwent VEEG examination and exhibited a clear origin of abnormal discharges in the left temporal lobe, (3) had no clear epileptogenic focus identified by conventional MRI and 3D T2-weighted FLAIR sequences (including SPACE and CUBE) by two imaging physicians with more than 5 years of epilepsy diagnostic experience; and (4) had less than or equal to 2 antiepileptic drugs(AEDs).

#### **1.1.1.2. Exclusion criteria**

Participants were excluded if they (1) had absolute contraindications to MRI; (2) had a mental disorder or other neurological disease; (3) exhibited cognitive impairment; and (4) reported long-term use of medicines other than antiepileptic drugs. Additionally, (5) MTLE patients whose image quality did not satisfy the criteria were excluded.

#### **1.1.2. Healthy controls**

All healthy controls received information about registering and provided informed consent prior to receiving MRI. Only the following exclusion criteria were applied:

(1) presence of brain lesions, inflammation, hemorrhage, ischemia, or a related medical history; (2) long-term smoking, alcohol consumption, or substance abuse; (3) suspected or confirmed Alzheimer's disease, Parkinson's disease, or psychiatric disease; and (4) long-term medication use.

#### **1.1.3. Participant demography information**

A total of 376 HCs and 279 MRIn-MTLE patients with VEEG-confirmed left temporal lobe discharges and a mean illness duration of 452.5 months were recruited.

To account for the effects of sex and age, participants aged 18-60 years were randomly selected from the HC and MRIn-MTLE groups, resulting in a total of 190 subjects in the HC group (100 males and 90 females), and a total of 190 subjects in the MRIn-MTLE group (100 males and 90 females), as shown in Table 1.

**Table 1.** Age and sex comparison of two groups (years)

SEX	HC GROUP ( $\bar{x} \pm S$ )	MRIn-MTLE GROUP ( $\bar{x} \pm S$ )	T	P
Male	38.06±12.047 (N=100)	39.02±11.602 (N=100)	-0.574	0.567
Female	37.79±9.579 (N=90)	35.64±10.747 (N=90)	1.413	0.159
	37.93±10.92(N=190)	37.42±11.3(N=190)	0.448	0.655

## 1.2 Image capture and computerized analysis

### 1.2.1. MRI equipment and parameters

MRIn-MTLE patient images were acquired using a GE Signa Architect 3.0T (General Electric, United States); the protocol parameters are outlined below. To ensure image quality and reproducibility, the sequence parameters utilized in this study adhered to the sequence quality control process of the Enhancing Neuroimaging Genetics through Meta-Analysis Consortium 2020 initiative and utilized FreeSurfer-based segmentation of brain structures and hippocampal subregions (Fischl et al., 2002), with the following equipment models and parameters.

GE Signa Architect 3.0T scanner settings for T1-MPRAGE images: a 48-channel head coil, voxel size = 1.0 × 1.0 × 1.0 mm (isotropic), field of view = 256 mm (256 × 256 matrix), 156-layer axial position, slice thickness = 1 mm, phase encoding direction: anterior to posterior, readout direction: superior to inferior (3D encoding); repetition time = 6.4 ms (3.0 T), flip time = 1,000 ms (3.0 T).

### 1.2.2. Automated segmentation of brain regions

The preprocessed images were automatically segmented on a computer running Ubuntu 24.0 using FreeSurfer, an open-source software package developed by the Computational Neuroimaging Laboratory of the Athinoula A. Martinos Center for Biomedical Imaging. The program is publicly accessible at <https://surfer.nmr.mgh.harvard.edu> and is used for extensive analysis and display of structural and functional imaging data. The version utilized in this study was 7.1.1. (Released in May 2020). FreeSurfer recommends T1W-MPRAGE as preferred imaging protocol.

The "recon-all" script allows FreeSurfer's segmentation procedure to be executed with a completely automated workflow, it contains more than 29 steps, the major steps are: 1) 2 steps of intensity normalization, to correct for fluctuations in intensity that would otherwise make intensity-based segmentation much more difficult, 2) computing the affine transform from the original volume to the MNI305 atlas using Avi Snyder's 4dfp suite of image registration tools, 3) skull stripping, 4) B1 bias field correction, 5) gray-white matter segmentation, segmentation is performed using image intensity and

probability profiles and local spatial interactions between subcortical structures (Herman et al., 2016; Pitts, 2022), 6) labeling of regions on the cortical and subcortical surface, in this part we used Desikan-Killiany Atlas for labeling.

Further description of recon-all script was enumerated elsewhere. The processing of all T1W-MPRAGE brain volumes yielded a comprehensive morphometric description, and all volumes were utilized in training and testing of the classification model. FreeSurfer (version 7.1.1) image analysis software was used to perform cortical reconstruction and volume segmentation in the normalized space for each participant.

### **1.3. Volume-based diagnostic classification model**

All HC and MRIn-MTLE patients' age, and volume of Freesurfer volume segmentation results were used as classification variables for model training. Since the patients could not tolerate too long scans, the patients' scans were mainly T1-MPRAGE, and also the volume segmentation results were interpretable and helped the interpretation of the results of the classification model outputs, only the segmentation results of T1W-MPRAGE were included as classification variables.

For the classification model based on all participants, the training dataset consisted of 393 cases (167 positive/226 negative), an additional 262 cases were chosen as an independent validation dataset (112 positive/150 negative). For the classification model based on male participants, the training dataset consisted of 120 cases (60 positive/60 negative), an additional 80 cases were chosen as an independent validation dataset (40 positive/40 negative).

For the classification model based on female participants, the training dataset consisted of 108 cases (54 positive/54 negative), an additional 72 cases were chosen as an independent validation dataset (36 positive/36 negative). Each case had 70 features including age and brain subregion volumes of both hemispheres. The model based on different classifier was trained and tested with follow steps.

#### **1.3.1 Data balancing**

We repeatedly entered positive and negative samples out of datasets into randomly selected cases, to alleviate data imbalance.

#### **1.3.2 Matric normalization**

As the mean and standard deviation for each feature vector were determined before training, each feature vector was subtracted from the mean and then divided by the standard deviation. Each vector was centered at zero after normalization, and the standard deviation is expressed in units. Due to the



high dimensionality of the feature space, only each pair of features was compared. If the classification accuracy (Pearson correlation coefficient value, PCC) of a pair of features was above the threshold, one of them was eliminated. Following this procedure, the dimensionality of the feature space was reduced, resulting in a set of distinct features.

### **1.3.3. Feature selection**

Recursive feature elimination (RFE) was used to select features prior to model construction. The RFE approach selects features based on the classifier by iteratively evaluating a reduced set of features.

### **1.3.4. Cross-validation and Classifier evaluation**

In the training dataset, five-fold cross-validations were carried out to identify the model's hyper parameters (e.g., the number of features). We divided the training set into 5 subsets randomly and equally and used each subset as the validation set and the other 4 subsets as the training set, respectively, and run the modeling process 5 times. The hyper parameters were determined based on the model's performance on the validation dataset. We employed support vector machine, logistic regression, random forest for model training and testing, the evaluation of the performance of models on the classification task based on each classifier was according to the receiver operating characteristic (ROC) curve. For quantification, the area under the ROC curve (the AUC) was computed.

At the cutoff value that optimized, the Youden index, the accuracy, sensitivity, specificity, positive predictive value (PPV), and negative predictive value (NPV) were computed. A total of 1,000 bootstrap samples were used to calculate 95% confidence intervals. All of the aforementioned procedures were implemented using Python (3.7.6) and the Feature Explorer Pro (FAEPro, version 0.4.3) program (Jones & Cascino, 2016).

## **1.4. Statistical analysis**

Since the differences in brain structure volumes between MRIn-MTLE patients and healthy controls have been little reported in previous studies, we conducted an exploratory comparative analysis of structural brain volumes in patients and healthy controls by gender. In order to understand the differences in structural brain volumes between genders in the healthy population, we also performed a comparative analysis of structural brain volumes in healthy controls by gender. In addition, our pretest suggested that the changes in brain structural volume were different between male and female MRIn-MTLE patients, so we also performed a comparative analysis of brain structural volume in patients of different genders. All comparison above used independent samples t-tests on SPSS 19.0.

## 2. Results

### 2.1 Analysis of sub regional brain volume differences

Desikan-Killiany Atlas-based segmentation of brain structures was used to obtain the volumes of 33 brain regions in each of the bilateral hemispheres. After comparison and statistical analysis, we determined that the mean estimated total intracranial volume (eTIV) of the HC group was larger than MRIn-MTLE group ( $1469993.59 \pm 169968.81 \text{ mm}^3$  vs  $1411306.37 \pm 198446.73 \text{ mm}^3$ ,  $P=0.002$ ). Volumes of left caudal middle frontal gyrus, left pars opercularis gyrus, left superior frontal gyrus, left precentral gyrus, right caudal middle frontal gyrus, right precentral gyrus, right cuneus, right posterior cingulate gyrus, right entorhinal cortex was larger in HC group than MRIn-MTLE group ( $P<0.05$ ) (Table 2).

**Table2(a):** Brain structure volume comparison between HC group and MRIn-MTLE group( $\text{mm}^3$ )

STRUCTURE	HC GROUP ( $\bar{x} \pm S$ )	MRIN-MTLE GROUP ( $\bar{x} \pm S$ )	T	P	STRUCTURE	HC GROUP ( $\bar{x} \pm S$ )	MRIN-MTLE GROUP ( $\bar{x} \pm S$ )	T	P
*lh_caudal	6211.26±1	5777.2	3.4	0.00	**rh_caud	6042.31±	5691.9	2.6	0.0
middlefront	213.25	4±125	27	1	almiddlefr	1300.68	7±129	29	09
al		4.99			ontal**		7.28		
lh_parsoper	4600.46±9	4364.9	2.4	0.01	rh_prece	13148.97	12596.	2.4	0.0
cularis	11.06	3±937.	84	3	ntral	±2070.06	15±22	71	14
		01					86.09		
lh_superiorf	22435.82±	21598.	2.3	0.01	rh_cuneu	3446.98±	3270.5	2.4	0.0
rontal	3153.85	4±364	96	7	s	655.28	3±754.	34	15
		2.69					69		
lh_precentr	13377.17±	12884.	2.1	0.03	rh_poster	3094.11±6	2938.5	2.2	0.0
al	1854.21	21±24	85		iorcingula	83.58	6±685.	15	27
		96.43			te		3		
lh_rostralmi	15597.85±	15104.	1.8	0.06	rh_entorh	1829.95±	1720±	2.1	0.0
ddlefrontal	2559.49	47±26	49	5	inal	498.31	479.38	92	29
		41.75							
lh_inferiorte	11516.53±	11129.	1.6	0.09	rh_precu	9868.81±	9511.8	1.9	0.0
mporal	2134	86±23	95	1	neus	1710.48	1±182	67	5
		08.53					5.51		
lh_parstriar	3641.04±6	3526.8	1.6	0.10	rh_fusifor	9083.78±	8776.7	1.7	0.0
gularis	92.53	1±679.	23	5	m	1660.99	8±183	12	88
		57					0.52		



**Table2(b):** Brain structure volume comparison between HC group and MRIn-MTLE group(mm<sup>3</sup>)

STRUCTURE	HC GROUP ( $\bar{x} \pm S$ )	MRIN-MTLE GROUP ( $\bar{x} \pm S$ )	T	P	STRUCTURE	HC GROUP ( $\bar{x} \pm S$ )	MRIN-MTLE GROUP ( $\bar{x} \pm S$ )	T	P
lh_posteriorcingulate	3089.24±602.18	2982.53±769.57	1.505	0.133	rh_lateralorbitofrontal	7298.63±1005.56	7487.2±1225.13	-1.64	0.102
lh_rostralanteriorcingulate	2462.91±588	2554.93±624.27	-1.479	0.141	rh_superiorfrontal	21406.01±3080.16	20859.43±3576.52	1.596	0.111
lh_lateraloccipital	12194.55±1928.57	12509.45±2401.67	-1.409	0.161	rh_frontalpole	1308.01±248.29	1345.3±300.82	-1.32	0.188
lh_frontalpole	1085.81±91.36	1115.11±232.8	-1.34	0.181	rh_lateraloccipital	12302.72±2055.08	12590.24±2433.11	-1.244	0.214
lh_superiorparietal	12994.68±1946.99	13217.77±2415.94	-0.991	0.322	rh_isthmuscingulate	2417.99±539.89	2339.98±680.5	1.238	0.217
lh_postcentral	9669.83±440.19	9512.25±1710.02	0.972	0.332	rh_parsopercularis	3824.82±681.5	3728.1±877.31	1.21	0.231
lh_inferiorparietal	12161.1±964.76	12369.44±2490.25	-0.905	0.366	rh_temporalpole	2612.39±513.18	2543.6±620.36	1.178	0.244
lh_fusiform	9293.92±598.86	9158.71±1796.83	0.775	0.439	rh_lingual	6849.39±1455.03	6669.99±1579.06	1.152	0.255
lh_superiortemporal	12107.49±2116.36	11929.59±2610.2	0.736	0.466	rh_parsorbitalis	2815.97±454.6	2862.69±536.77	-0.916	0.366
lh_paracentral	3492.09±539.41	3450.46±657.56	0.675	0.505	rh_inferiortemporal	11080.82±1977.54	10895.41±2211.52	0.861	0.399
lh_medialorbitofrontal	5491.34±713.13	5438.64±839.54	0.66	0.516	rh parahippocampal	1820.42±347.95	1785.32±465.93	0.832	0.406
lh_isthmuscingulate	2595.64±522.97	2552.76±743.78	0.65	0.516	rh_transversetemporal	893.38±90.95	875.91±230.66	0.804	0.422

**Table2(c):** Brain structure volume comparison between HC group and MRIn-MTLE group(mm<sup>3</sup>)

STRUCTURE	HC GROUP ( $\bar{x} \pm S$ )	MRIN-MTLE GROUP ( $\bar{x} \pm S$ )	T	P	STRUCTURE	HC GROUP ( $\bar{x} \pm S$ )	MRIN-MTLE GROUP ( $\bar{x} \pm S$ )	T	P
lh parahippocampal	2029.06±366.35	2000.5 2±485.73	0.6 47	0.51 8	rh_medial orbitofrontal	5748.45±790.25	5818.6 5±924.13	- 0.7 96	0.4 27
lh middletemporal	10771.78±2294.63	10614. 79±2483.52	0.6 4	0.52 3	rh_postcentral	9309.09±1506.17	9195.6 2±1677.52	0.6 94	0.4 88
lh cuneus	3083.04±611.11	3043.6 4±696.04	0.5 86	0.55 8	rh_rostral anteriorcingulate	1837.59±484.04	1806.0 3±502.96	0.6 23	0.5 33
lh transversetemporal	1202.35±262.02	1185.7 ±315.95	0.5 59	0.57 6	rh_middle temporal	11815.96±2224.82	11668. 03±2639.22	0.5 91	0.5 55
lh lingual	6294.47±1366.68	6364.6 5±1419.69	- 0.4 91	0.62 4	rh_insula	6844.95±929.87	6892.2 2±1095.31	- 0.4 53	0.6 51
lh temporal pole	2583.44±462.97	2559.5 4±542.12	0.4 62	0.64 4	rh_caudal anteriorcingulate	1869.75±562.2	1844.0 4±548.03	0.4 51	0.6 52
lh entorhinal	1838.03±44.33	1859.0 4±499.23	- 0.4 33	0.66 5	rh_paracentral	3858.65±628.27	3840.7 9±750.81	0.2 51	0.8 02
lh insula	6942.18±871.65	6974.0 3±956.81	- 0.3 39	0.73 5	rh_inferior parietal	14711.38±2527.41	14655. 93±2806.45	0.2 02	0.8 4
lh pericalcarine	2040.12±478.37	2024.9 8±505.77	0.3 4	0.76 4	rh_superior parietal	12677.07±1912.08	12642. 49±2337.33	0.1 58	0.8 75
lh parsorbitalis	2346.14±386.23	2353.3 3±401.58	- 0.1 78	0.85 9	rh_pericalcarine	2322.37±519.65	2315.5 3±604.81	0.1 18	0.9 06
lh caudalanteriorcingulate	1555.81±437.98	1550.9 2±518.07	0.0 99	0.92 1	rh_rostral middlefrontal	16001.27±2846.94	15966. 83±3091.21	0.1 13	0.9 1
lh lateralorbitofrontal	7484.83±932.26	7494.8 5±1072.72	- 0.0 97	0.92 3	rh_superior orbitofrontal	11557.65±2033.44	11531. 66±2436.62	0.1 13	0.9 1

**Table2(d):** Brain structure volume comparison between HC group and MRIn-MTLE group(mm<sup>3</sup>)

STRUCTURE	HC GROUP ( $\bar{x} \pm S$ )	MRIN-MTLE GROUP ( $\bar{x} \pm S$ )	T	P	STRUCTURE	HC GROUP ( $\bar{x} \pm S$ )	MRIN-MTLE GROUP ( $\bar{x} \pm S$ )	T	P
lh_supramarginal	11189.78±2102.32	11169.78±2477.48	0.85	0.93	rh_parstriangularis	4308.67±861.76	4310.84±982.33	-	0.92
lh_precuneus	9452.32±1508.67	9446.18±1863.95	0.35	0.97	rh_supramarginal	9606.74±1872.25	9608.64±2184.23	-	0.93
Brain Volume Without Ventricles	1123787.36±123038.06	1112130.07±126810.26	0.09	0.36	Estimated total intracranial volume	1469993.59±169968.81	1411306.37±198446.73	3.96	0.02

\* lh= left hemisphere; \*\* rh=right hemisphere

## 2.2. Comparison of brain subregion volume differences between male and female healthy controls

Female healthy controls eTIV was smaller than male (1399306.99±159346.34 vs 1533611.52±153933.48,  $P<0.001$ ). 25/33 left hemisphere subregions and 21/33 right hemisphere subregions were smaller than male( $P<0.05$ ) (Table 3).

**Table 3(a):** Brain structure volume comparison between males and females in HC group (mm<sup>3</sup>)

Structure	Female	Male	T	P	Structure	Female	Male	T	P
*lh_lateraloccipital	11309.36±1734.54	12991.23±1744.26	-6.654	0	**rh_inferiorparietal	13941.18±2116.25	15404.57±2672.86	-4.153	0
lh_medialorbitofrontal	5200.97±589.81	5752.68±715.9	-5.76	0	rh_lateraloccipital	11468.47±1877.62	13053.55±1921.27	-5.74	0
lh_rostralmiddlefrontal	14634.34±1981.27	16465.01±2715.51	-5.344	0	rh_lateralorbitofrontal	6997.49±782.23	7569.66±1106.2	-4.147	0
lh_insula	6625.83±721.19	7226.9±900.01	-5.043	0	rh_medialorbitofrontal	5472.04±636.64	5997.21±834.2	-4.837	0
lh_parsopercularis	4306.07±736.73	4865.41±973.11	-4.493	0	rh_middletemporal	11127.3±2068.34	12435.75±2187.38	-4.224	0

**Table 3(b):** Brain structure volume comparison between males and females in HC group (mm<sup>3</sup>)

<b>lh_parstriangularis</b>	<b>3424.08 ±541.74</b>	<b>3836.31 ±755.29</b>	- 4.3 54	0	<b>rh_precuneus</b>	<b>9366.6 ±67.73</b>	<b>10320.8 ±1862.3</b>	- 3.9 88	0
<b>lh_inferiortemporal</b>	10853.7 ±1767.85	12113.04 ±2263.96	- 4.2 95	0	<b>rh_rostralanteriorcingulate</b>	1708.4 ±406.81	1953.87 ±519.3	- 3.6 45	0
<b>lh_rostralanteriorcingulate</b>	2281.73 ±488.02	2625.96 ±623.91	- 4.2 57	0	<b>rh_rostralmiddlefrontal</b>	15190.54 ±2323.68	16730.93 ±3079.59	- 3.8 58	0
<b>lh_fusiform</b>	8811.89 ±1369.82	9727.75 ±1670.95	- 4.1 04	0	<b>rh_frontalpole</b>	1235.74 ±208.18	1373.05 ±264.02	- 3.9 5	0
<b>lh_middletemporal</b>	10083.6 ±1978.77	11391.08 ±2390.42	- 4.0 81	0	<b>rh_insula</b>	6572.34 ±770.12	7090.29 ±994.58	- 3.9 81	0
<b>lh_superiorfrontal</b>	21504.7 ±2708.24	23273.74 ±3301.28	- 4.0 53	0	<b>rh_fusiform</b>	8664.69 ±1323.74	9460.97 ±1840.73	- 3.4 47	0 0 1
<b>lh_lateralorbitofrontal</b>	7207.86 ±771.71	7734.11 ±995.65	- 4.0 39	0	<b>rh_parsorbitalis</b>	2702.77 ±359.23	2917.85 ±506.35	- 3.4 02	0 0 1
<b>lh_parsorbitalis</b>	2236.18 ±333.55	2445.1 ±404.82	- 3.8 57	0	<b>rh_superiorfrontal</b>	20656 ±2664.11	22081.01 ±3280.26	-3.3 0 0	0 0 1
<b>lh_inferiorparietal</b>	11629.4 ±1867.98	12639.57 ±1935.09	- 3.6 52	0	<b>rh_cuneus</b>	3299.47 ±628.09	3579.75 ±653.83	- 3.0 06	0 0 3
<b>lh_precuneus</b>	9077.86 ±1258.68	9789.33 ±1636.71	- 3.3 31	0 0 1	<b>rh_inferiortemporal</b>	10630.52 ±1674.13	11486.08 ±2143.82	- 3.0 42	0 0 3
<b>lh_frontalpole</b>	1038.5 ±170.31	1128.38 ±199.92	- 3.3 17	0 0 1	<b>rh_superiortemporal</b>	11092.18 ±1723.34	11976.58 ±2202.2	- 3.0 59	0 0 3

**Table 3(c):** Brain structure volume comparison between males and females in HC group (mm<sup>3</sup>)

Structure	Female	Male	T	P	Structure	Female	Male	T	P
<b>lh_isthmuscingulate</b>	2468.92	2709.68±	-	0.	rh_lingual	6536.11±1	7131.34±	-	0.
	±439.49	566.34	3.2	0		279.53	1549.32	2.8	0
			48	0				69	0
				1					5
<b>lh_cuneus</b>	2939.39	3212.32±	-	0.	rh_parstriangularis	4128.34±7	4470.97±	-	0.
	±567	623.14	3.1	0		05.46	956.12	2.7	0
			45	0				85	0
				2					6
<b>lh_lingual</b>	6003.23	6556.59±	-	0.	rh_postcentral	9028.2±14	9561.9±1	-	0.
	±1259.8	1411.51	2.8	0		61.39	508.2	2.4	0
	9		38	0				71	1
				5					4
<b>lh_superior temporal</b>	11665.3	12505.46	-	0.	rh_caudal anteriorcingulate	1769.07±4	1960.37±	-	0.
	1±1929.	±2205.72	2.7	0		90.08	608.25	2.3	0
	77		8	0				97	1
				6					8
<b>lh_posteriorcingulate</b>	2967.89	3198.46±	-	0.	rh_superior parietal	12334.27±	12985.59	-	0.
	±523.5	648.43	2.6	0		1620.42	±2101.48	2.3	0
			78	0				73	1
				8					9
<b>lh_entorhinal</b>	1754.34	1913.34±	-	0.	rh_parsopercularis	3725.13±5	3914.54±	-	0.
	±357.01	500.23	2.4	0		63.15	764.45	1.9	0
			97	1				57	5
				3					2
<b>lh_supramarginal</b>	10805.4	11535.72	-	0.	rh_parietocentral	3770.19±5	3938.26±	-	0.
	1±1837.	±2268.98	2.4	0		52.61	682.29	1.8	0
	16		21	1				53	6
				6					5
<b>lh_postcentral</b>	9431.94	9883.92±	-	0.	rh_isthmuscingulate	2345.24±3	2483.47±	-	0.
	±1269.9	1553.13	2.1	0		82.39	644.88	1.8	0
			81	3				18	7
									1
<b>lh_caudal middle frontal</b>	6029.09	6375.22±	-	0.	rh_entorhinal	1770.98±4	1883.02±	-	0.
	±1017.4	1349.9	1.9	0		44.16	539.15	1.5	1
	2		79	4				69	1
				9					8
<b>lh_precentral</b>	13127.5	13601.84	-	0.	rh_posteriorcingulate	3015.63±5	3164.73±	-	0.
	4±1859.	±1829.32	1.7	0		79.26	761.44	1.5	1
	83		7	7				06	3
				8					4

**Table 3(d):** Brain structure volume comparison between males and females in HC group (mm<sup>3</sup>)

Structure	Female	Male	T	P	Structure	Female	Male	T	P
lh_paracentr al	3426.71	3550.93±	-	0.	rh_supram	9399.63±1	9793.13±	-	0.
	±493.36	573.83	1.5	11	arginal	770.86	1949.03	1.4	1
			91	3				51	4
									9
lh_pericalcar ine	1986.61	2088.28±	-	0.	rh_pericalc	2271.1±52	2368.51±	-	0.
	±461.88	490.04	1.4	1	arine	7.56	510.67	1.2	1
			67	4				92	9
									8
lh_temporal pole	2540.12	2622.42±	-	0.	rh_precent	12955.14±	13323.41	-	0.
	±417.13	499.53	1.2	2	ral	1874.09	±2226.76	1.2	2
			25	2				26	2
									2
lh_transvers etemporal	1177.96	1224.31±	-	0.	rh_parahip	1794.66±2	1843.6±3	-	0.
	±229.12	287.82	1.2	2	pocampal	81.7	98.31	0.9	3
			19	2				68	3
									4
lh_superiorp arietal	12894.1	13085.18	-	0.	rh_transve	881.28±16	904.27±2	-	0.
	3±1755.	±2109.06	0.6	5	rsetempor	9.03	08.98	0.8	4
	77		74	0	al			28	0
									9
lh_parahipp ocampal	2013.28	2043.27±	-	0.	rh_caudal	5979±958.	6099.28±	-	0.
	±413.96	318.96	0.5	5	middlefront	6	1548.13	0.6	5
			62	7	al			51	1
									6
lh_caudalant eriorcingulat e	1539.14	1570.8±4	-	0.	rh_tempor	2591.56±4	2631.14±	-	0.
	±410.75	62.67	0.4	6	alpole	09.05	592.95	0.5	5
			96	2				4	9
<b>BrainVolume</b>	107368	1168877.	-	0	Estimated	1399306.9	1533611.	-	0
<b>WithoutVentr icles</b>	7.53±10	2±12368	5.7		TotalIntraC	9±159346.	52±1539	5.9	
	1530.98	4.28	6		ranialVol	34	33.48	06	

\* lh= left hemisphere; \*\* rh=right hemisphere

### 2.3. Comparison of brain subregion volume differences between male and female MRIn-MTLE group

Female healthy controls eTIV was smaller than male (1340873.07±173887.29 vs 1474696.34±198571.91,  $P<0.001$ ). 29/33 left hemisphere subregions and 28/33 right hemisphere subregions were smaller than male ( $P<0.05$ ) (Table 4).

**Table 4(a):** Brain structure volume comparison between males and females in MRIn-MTLE group (mm<sup>3</sup>)

STRUCTURE	FEMALE	MALE	T	P	STRUCTURE	FEMALE	MALE	t	P
lh_cuneus	2811.89±	3252.21±	-	0	rh_fusifor	8278.91±	9224.87	-	0
	599.46	713.5	4.5		m	1729.35	±1811.1	3.6	
			78				5	72	
lh_fusiform	8585.18±	9674.89±	-	0	rh_inferior	13867.58	15365.4	-	0
	1614.02	1803.77	4.3		parietal	±2204.01	4±3097.	3.8	
			69				71	68	
lh_inferiorte mporal	10426.56	11762.83	-	0	rh_inferiort	9965.03±	11732.7	-	0
	±2041.82	±2360.47	4.1		emporal	1893.71	4±2148.	5.9	
			51				96	87	
lh_isthmusci ngulate	2329.27±	2753.9±7	-	0	rh_isthmu	2129.26±	2529.63	-	0
	702.42	25.46	4.0		scingulate	613.96	±684.46	4.2	
			89					26	
lh_lateralocc ipital	11653.64	13279.68	-	0	rh_lateralo	11571.42	13507.1	-	0
	±2192.42	±2329.26	4.9		ccipital	±1887.17	8±2511.	6.0	
			4				44	42	
lh_postcentr al	9031.86±	9944.61±	-	0	rh_lateralo	7101.72±	7834.13	-	0
	1395.52	1852.86	3.8		rbitofrontal	1117.48	±1219.0	4.3	
			58				8	01	
lh_precuneu s	8899.33±	9938.35±	-	0	rh_middlet	10708.57	12531.5	-	0
	1512.01	2015.19	4.0		emporal	±2568.39	4±2403.	5.0	
			44				62	53	
lh_insula	6676.59±	7241.72±	-	0	rh_postce	8753.64±	9593.4±	-	0
	795.73	1012.77	4.2		ntral	1421.65	1793.87	3.5	
			44					93	
lh_entorhina l	1735.49±	1970.23±	-	0.	rh_insula	6575.73±	7179.94	-	0
	497.14	476.71	3.3	00		988.54	±1112.83	3.9	
			21	1				3	
lh_lateralorb itofrontal	7228.41±	7734.65±	-	0.	rh_cuneus	3076.84±	3444.85	-	0.
	878	1175.24	3.3	00		654.93	±798.08	3.4	0
			84	1				52	0
									1
lh_lingual	6012.51±	6681.58±	-	0.	rh_medial	5582.57±	6031.12	-	0.
	1298.79	1455.05	3.3	00	orbitofront	760.21	±1007.2	3.4	0
			29	1	al		7	35	0
									1
lh_pericalca rine	1899.02±	2138.34±	-	0.	rh_posteri	2759.93±	3099.33	-	0.
	435.08	539.24	3.3	00	orcingulat	637.84	±689.71	3.5	0
			81	1	e			09	0
									1



**Table 4(b):** Brain structure volume comparison between males and females in MRIn-MTLE group (mm<sup>3</sup>)

STRUCTURE	FEMALE	MALE	T	P	STRUCTURE	FEMALE	MALE	t	P
<b>lh_rostral anteriorcingulate</b>	2394.81±	2699.04±	-	0.49	rh_lingual	6304.64±	6998.8±	-	0.93
	543.17	659.16	3.4	0.001		1387.27	1673.17	3.0	0.002
<b>lh_superior temporal</b>	11280.78	12513.52	-	0.33	rh_temporal	2399.99±	2672.85	-	0.95
	±2258.52	±2773.83	3.3	0.001	alpole	579.1	±630.56	3.0	0.002
<b>lh_supramarginal</b>	10541.92	11734.86	-	0.06	rh_superior	10982.01	12026.3	-	0.12
	±2120.87	±2644.47	3.4	0.001	rtemporal	±2136.34	4±2590.31	3.0	0.003
<b>lh_temporal pole</b>	2418.3±5	2686.65±	-	0.07	rh_pericalcarine	2181.9±5	2435.8±	-	0.29
	61.82	492.81	3.5	0.001		24.98	647.85	2.9	0.047
<b>lh_medial orbitofrontal</b>	5244.47±	5613.39±	-	0.92	rh_parsorbitalis	2747.33±	2966.51	-	0.63
	710.08	909.48	3.0	0.002		494.82	±554.03	2.8	0.005
<b>lh_middle temporal</b>	10040.1±	11132.01	-	0.94	rh_rostral anteriorcingulate	1700.02±	1901.44	-	0.06
	2346.54	±2500.89	3.0	0.002		449.19	±531.17	2.8	0.006
<b>lh parahippocampal</b>	1894.03±	2096.36±	-	0.24	rh_rostral middlefrontal	15345.51	16526.0	-	0.28
	443.7	503.84	2.9	0.004		±2324.21	2±3566.43	2.7	0.007
<b>lh_inferior parietal</b>	11853.74	12833.56	-	0.04	rh_caudal anteriorcingulate	1734.06±	1943.02	-	0.66
	±1979.85	±2802.81	2.8	0.006		500.62	±571.99	2.6	0.008
<b>lh_precentral</b>	12385.34	13333.19	-	0.55	rh_precuneus	9148.5±1	9838.78	-	0.85
	±2227.02	±2647.5	2.6	0.009		496.96	±2029.6	2.6	0.008
<b>lh_superior parietal</b>	12755.81	13633.54	-	0.76	rh_transverse	830.28±2	916.97±	-	0.27
	±1985.84	±2688.69	2.5	0.001	rsetemporal	21.07	232.46	2.6	0.027

**Table 4(c):** Brain structure volume comparison between males and females in MRIn-MTLE group (mm<sup>3</sup>)

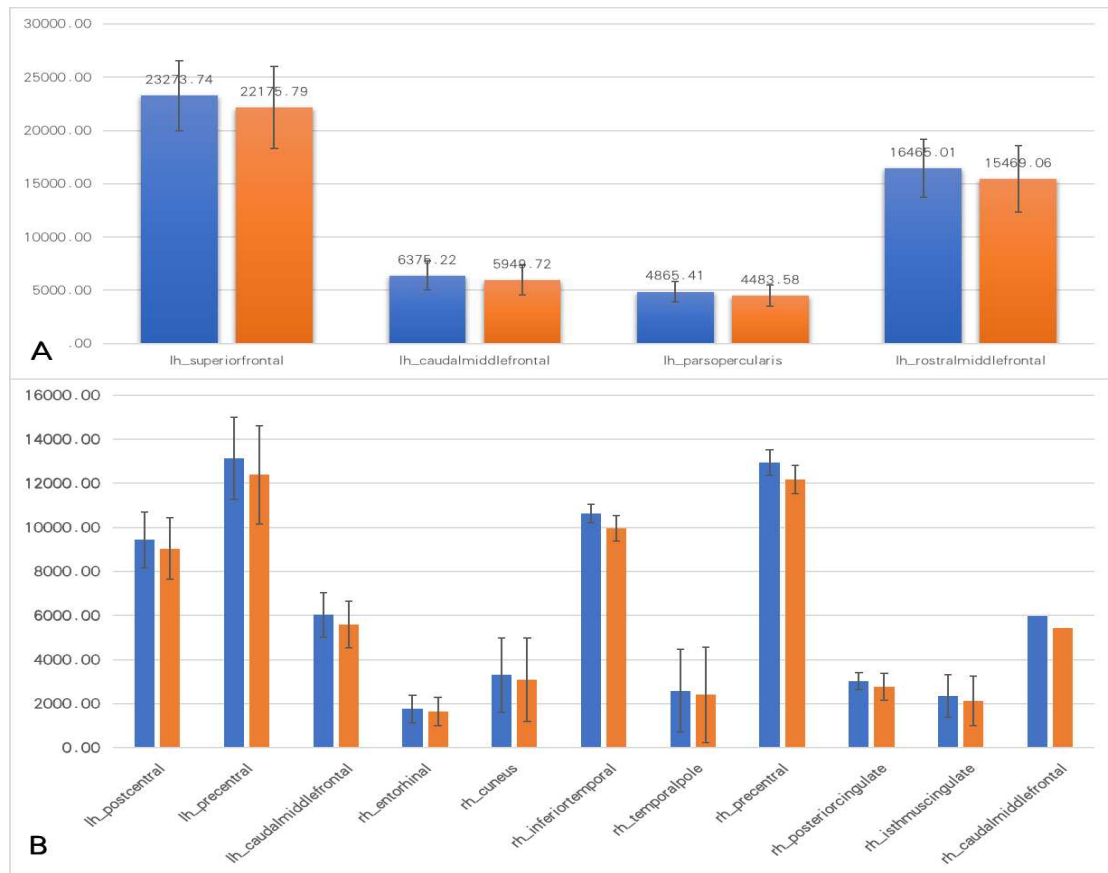
STRUCTURE	FEMALE	MALE	T	P	STRUCTURE	FEMALE	MALE	t	P
lh_parstriangularis	3398.57±579.82	3642.22±742.3	-2.502	0.013	rh_caudalmiddlefrontal	5441.88±1113.23	5917.05±1410.94	-2.58	0.011
lh_transverse temporal	1128.67±270.37	1237.03±345.31	-2.42	0.016	rh_parsopercularis	3562.44±765.9	3877.19±945.85	-2.503	0.013
lh_posteriorcingulate	2842.04±795.01	3108.97±726.88	-2.418	0.017	rh_parstriangularis	4127.79±935.57	4475.59±998.73	-2.69	0.014
lh_superiorfrontal	20956.86±3295.47	22175.79±3854.62	-2.33	0.021	rh_precentral	12178.48±2156.11	12972.05±2344.52	-2.42	0.016
lh_rostralmiddlefrontal	14699.38±1909.21	15469.06±3124.56	-2.071	0.041	rh_entorhinal	1644.94±360.07	1787.55±558.96	-2.11	0.036
lh_caudal anterior cingulate	1470.83±490.64	1622.99±533.76	-2.038	0.043	rh parahippocampal	1711.06±385.98	1852.15±520.56	-2.03	0.037
lh_caudalmiddlefrontal	5585.6±1056.4	5949.72±1392.88	-2.013	0.046	rh superior frontal	20354.34±3221.42	21314.01±3827.55	-1.859	0.066
lh_parsopercularis	4233.1±845.92	4483.58±1001.43	-1.852	0.066	rh supramarginal	9313.26±2030.78	9874.48±2291.24	-1.74	0.077
lh_paracentral	3385.7±599.66	3508.75±703.52	-1.299	0.099	rh frontal pole	1310.51±294.25	1376.73±304.68	-1.52	0.033
lh_frontal pole	1092.61±254.35	1135.36±210.78	-1.266	0.077	rh paracentral	3774.6±865.33	3900.37±628.84	-1.154	0.055

**Table 4(d):** Brain structure volume comparison between males and females in MRIn-MTLE group (mm<sup>3</sup>)

STRUCTURE	FEMALE	MALE	T	P	STRUCTURE	FEMALE	MALE	t	P
lh_parsorbit	2334.27±	2370.49±	-	0.	rh_superio	12555.27	12720.9	-	0.
alis	365.08	432.93	0.6	53	rparietal	±2045.07	9±2580.	0.4	6
			2	6			03	93	2
									3
<b>BrainVolume</b>	1067605.	1152202.	-	0	Estimated	1340873.	1474696	-	0
<b>WithoutVent</b>	02±10111	61±13447	4.9		TotalIntraC	07±17388	.34±198	4.9	
<b>ricles</b>	7.49	5.15	3		ranialVol	7.29	571.91	18	

## 2.4 Comparison of male differences in brain subregion volume between the groups

The eTIV and volumes of left pars opercularis gyrus, left rostral middle frontal gyrus, left caudal middle frontal gyrus, left superior frontal gyrus were larger in HC group than in MRIn-MTLE group ( $P < 0.05$ ), differences of the other brain structure volumes between two groups were statistically insignificant ( $P > 0.05$ ) (Table 5; Figure 1A).



**Figure 1:** Differences in brain region volumes in the two groups: A) in males; B) in females (mm<sup>3</sup>)

**Table 5:** Brain structure volume comparison between males in HC group and MRIn-MTLE group(mm<sup>3</sup>)

STRUCTURE	HC GROUP ( $\bar{x} \pm S$ )	MRIN-MTLE GROUP ( $\bar{x} \pm S$ )	T	P	STRUCTURE	HC GROUP ( $\bar{x} \pm S$ )	MRIN-MTLE GROUP ( $\bar{x} \pm S$ )	T	P
*lh_parsopercularis	4865.41 ±973.11	4483.58±1001.43	2.734	0.007	**rh_precuneus	10320.8 ±1862.3	9838.78±2029.66	1.75	0.008
lh_rostralmiddlefrontal	16465.0 ±2715.51	15469.06±3124.56	2.40	0.016	rh_lateralorbitofrontal	7569.66 ±1106.2	7834.13±1219.08	-1.67	0.101
lh_caudalmiddlefrontal	6375.22 ±1349.9	5949.72±1392.88	2.119	0.049	rh_superiorfrontal	22081.0 ±3280.26	21314.01±3827.55	1.52	0.032
lh_superiorfrontal	23273.7 ±3301.28	22175.79±3854.62	2.113	0.032	rh_lateraloccipital	13053.5 ±1921.27	13507.18±2511.44	-1.45	0.053
lh_parsopercularis	3836.31 ±755.29	3642.22±742.3	1.33	0.038	rh_cuneus	3579.75 ±653.83	3444.85±798.08	1.30	0.091
lh_superiorparietal	13085.1 ±2109.06	13633.54±2688.69	-1.60	0.055	rh_entorhinal	1883.02 ±539.15	1787.55±558.96	1.22	0.022
lh_parsorbitalis	2445.1 ±404.82	2370.49±432.93	1.259	0.021	rh_precentral	13323.4 ±2226.76	12972.05±2344.52	1.08	0.027
lh_medialorbitofrontal	5752.68 ±715.9	5613.39±909.48	1.203	0.023	rh_fusiform	9460.97 ±1840.73	9224.87±1811.15	0.99	0.031
lh_inferiortemporal	12113.0 ±2263.96	11762.83±2360.47	1.071	0.061	rh_caudalmiddlefrontal	6099.28 ±1548.13	5917.05±1410.94	0.87	0.038

**Table 5(b):** Brain structure volume comparison between males in HC group and MRIn-MTLE group(mm<sup>3</sup>)

STRUCTURE	HC GROUP ( $\bar{x} \pm S$ )	MRIN-MTLE GROUP ( $\bar{x} \pm S$ )	T	P	STRUCTURE	HC GROUP ( $\bar{x} \pm S$ )	MRIN-MTLE GROUP ( $\bar{x} \pm S$ )	T	P
lh_lateralo ccipital	12991.2 3±1744. 26	13279.68±2 329.26	-	0.	rh_pericalca	2368.51	2435.8±647.	-	0.
			0.	3	rine	±510.67	85	0.	4
			9	2				8	1
			9	3				1	6
			1				6		
lh_posteri orcingulat e	3198.46 ±648.43	3108.97±72 6.88	0.	0.	rh_inferiorte	11486.0	11732.74±21	-	0.
			9	3	mporal	8±2143.	48.96	0.	4
			1	5		82		8	1
			9	9				1	7
							3		
lh_tempor alpole	2622.42 ±499.53	2686.65±49 2.81	-	0.	rh_superior	12985.5	12720.99±25	0.	0.
			0.	3	parietal	9±2101.	80.03	7	4
			9	6		48		9	2
			1	1				5	8
			5						
lh_parahip pocampal	2043.27 ±318.96	2096.36±50 3.84	-	0.	rh_rostralan	1953.87	1901.44±531	0.	0.
			0.	3	teriorcingula	±519.3	.17	7	4
			8	7	te			0	8
			9	5				6	1
lh_precent ral	13601.8 4±1829. 32	13333.19±2 647.5	0.	0.	rh_parsorbit	2917.85	2966.51±554	-	0.
			8	4	alis	±506.35	.03	0.	5
			3	0				6	1
			5	5				4	8
							8		
lh_entorhi nal	1913.34 ±500.23	1970.23±47 6.71	-	0.	rh_posterior	3164.73	3099.33±689	0.	0.
			0.	4	cingulate	±761.44	.71	6	5
			8	1				3	2
			2	1				7	5
			3						
lh_rostrala nteriorcing ulate	2625.96 ±623.91	2699.04±65 9.16	-	0.	rh_insula	7090.29	7179.94±111	-	0.
			0.	4		±994.58	2.83	0.	5
			8	2				5	5
			0	2				9	
			5				9		
lh_middlet emporal	11391.0 8±2390. 42	11132.01±2 500.89	0.	0.	rh_lingual	7131.34	6998.8±1673	0.	0.
			7	4		±1549.3	.17	5	5
			4	5		2		8	6
			9	5				1	2

**Table 5(c):** Brain structure volume comparison between males in HC group and MRIn-MTLE group(mm<sup>3</sup>)

STRUCTURE	HC GROUP ( $\bar{x} \pm S$ )	MRIN-MTLE GROUP ( $\bar{x} \pm S$ )	T	P	STRUCTURE	HC GROUP ( $\bar{x} \pm S$ )	MRIN-MTLE GROUP ( $\bar{x} \pm S$ )	T	P
lh_caudal anteriorcingulate	1570.8±462.67	1622.99±533.76	-0.73	0.46	rh_isthmuscingulate	2483.47±644.88	2529.63±684.46	-0.42	0.67
lh_pericalcarine	2088.28±490.04	2138.34±539.24	-0.66	0.51	rh_temporopole	2631.14±592.95	2672.85±630.56	-0.43	0.67
lh_lingual	6556.59±1411.51	6681.58±1455.05	-0.61	0.54	rh_rostralmidlinefrontal	16730.93±3079.59	16526.02±3566.43	-0.33	0.74
lh_preuncus	9789.33±1636.71	9938.35±2015.19	-0.55	0.58	rh_paracentralsulcus	3938.26±682.29	3900.37±628.84	-0.4	0.69
lh_supramarginal	11535.72±2268.98	11734.86±2644.47	-0.55	0.58	rh_transversestemporal	904.27±208.98	916.97±232.46	-0.4	0.69
lh_inferiorparietal	12639.57±1935.09	12833.56±2802.81	-0.55	0.58	rh_parsopercularis	3914.54±764.45	3877.19±945.85	-0.37	0.71
lh_isthmuscingulate	2709.68±566.34	2753.9±725.46	-0.43	0.67	rh_middletemporal	12435.75±2187.38	12531.54±2403.62	-0.26	0.79
lh_paracentralsulcus	3550.93±573.83	3508.75±703.52	-0.66	0.51	rh_supramarginal	9793.13±1949.03	9874.48±2291.24	-0.42	0.67

**Table 5(d):** Brain structure volume comparison between males in HC group and MRIn-MTLE group(mm<sup>3</sup>)

STRUCTURE	HC GROUP ( $\bar{x} \pm S$ )	MRIN-MTLE GROUP ( $\bar{x} \pm S$ )	T	P	STRUCTURE	HC GROUP ( $\bar{x} \pm S$ )	MRIN-MTLE GROUP ( $\bar{x} \pm S$ )	T	P
lh_cuneus	3212.32 ±623.14	3252.21±71 3.5	-	0.	rh_medialor	5997.21	6031.12±100	-	0.
			0.	6	bitofrontal	±834.2	7.27	0.	7
			4	7				2	9
			2	4				5	6
			1				9		
lh_transverse temporal	1224.31 ±287.82	1237.03±34 5.31	-	0.	rh_caudal	1960.37	1943.02±571	0.	0.
			0.	7	nteriorcingulate	±608.25	.99	2	8
			2	7				0	3
			8	8				8	6
			3						
lh_postcentral	9883.92 ±1553.13	9944.61±18 52.86	-	0.	rh_superior temporal	11976.5	12026.34±25	-	0.
			0.	8		8±2202.	90.31	0.	8
			2	0		2		1	8
			5	2				4	4
			1				6		
lh_frontal pole	1128.38 ±199.92	1135.36±21 0.78	-	0.	rh_postcentral	9561.9±	9593.4±1793	-	0.
			0.	8	ral	1508.2	.87	0.	8
			2	1				1	9
			4					3	3
							4		
lh_fusiform	9727.75 ±1670.95	9674.89±18 03.77	0.	0.	rh parahippocampal	1843.6±	1852.15±520	-	0.
			2	8		398.31	.56	0.	8
			1	3				1	9
			5					3	6
lh_insula	7226.9± 900.01	7241.72±10 12.77	-	0.	rh_inferior parietal	15404.5	15365.44±30	0.	0.
			0.	9		7±2672.	97.71	0	9
			1	1		86		9	2
			0	3				6	4
			9						
lh_superior temporal	12505.4 6±2205. 72	12513.52±2 773.83	-	0.	rh_frontal pole	1373.05	1376.73±304	-	0.
			0.	9		±264.02	.68	0.	9
			0	8				0	2
			2	2				9	7
			3				1		
lh_lateral orbitofrontal	7734.11 ±995.65	7734.65±11 75.24	-	0.	rh parstriangularis	4470.97	4475.59±998	-	0.
			0.	9		±956.12	.73	0.	9
			0	9				0	7
			0	7				3	3
			4				3		



**Table 5(e):** Brain structure volume comparison between males in HC group and MRIn-MTLE group(mm<sup>3</sup>)

STRUCTURE	HC GROUP ( $\bar{x} \pm S$ )	MRIN-MTLE GROUP ( $\bar{x} \pm S$ )	T	P	STRUCTURE	HC GROUP ( $\bar{x} \pm S$ )	MRIN-MTLE GROUP ( $\bar{x} \pm S$ )	T	P
BrainVolumeWithoutVentricles	116887	1152202.61	0.	0.	Estimated total intracranial volume	153361	1474696.34±	2.	0.
	7.2±123	±134475.15	9	3		1.52±15	198571.91	3	0
	684.28		1	6		3933.48		4	2
			3	3				5	

\* lh= left hemisphere; \*\* rh=right hemisphere

## 2.5. Comparison of female differences in brain subregion volume between the groups

The eTIV and volumes of left caudal middle frontal gyrus, left precentral gyrus, left postcentral gyrus, right caudal middle frontal gyrus, right isthmus of cingulate gyrus, right posterior cingulate gyrus, right precentral gyrus, right temporal pole, right inferior temporal gyrus, right cuneus, right entorhinal cortex were larger in HC group than in MRIn-MTLE group, ( $P < 0.05$ ), differences of the other brain structure volumes between two groups were statistically insignificant ( $P > 0.05$ ) (Table 6, Figure 1B).

**Table 6(a):** Brain structure volume comparison between females in HC group and MRIn-MTLE group(mm<sup>3</sup>)

STRUCTURE	HC GROUP	MRIN-MTLE GROUP	T	P	STRUCTURE	HC GROUP	MRIN-MTLE GROUP	T	P
*lh_caudalmiddlefrontal*	6029.09	5585.6±1	2.	0.	**rh_caudalmiddlefrontal**	5979±95	5441.88±	3.	0.
	±1017.4	056.4	86	0		8.6	1113.23	46	0
	2		9	0				9	0
				5					1
lh_precentral	13127.5	12385.34	2.	0.	rh_isthmuscingulate	2345.24±	2129.26±	2.	0.
	4±1859.	±2227.02	42	0		382.39	613.96	83	0
	83		7	1				3	0
				6					5
lh_postcentral	9431.94	9031.86±	2.	0.	rh_posteriorcingulate	3015.63±	2759.93±	2.	0.
	±1269.9	1395.52	01	0		579.26	637.84	81	0
			2	4				5	0
				6					5
lh_parsorbitalis	2236.18	2334.27±	-	0.	rh_precentral	12955.14	12178.48	2.	0.
	±333.55	365.08	1.	0		±1874.09	±2156.11	57	0
			88	6				9	1
			2	1					1

**Table 6(b):** Brain structure volume comparison between females in HC group and MRIn-MTLE group(mm<sup>3</sup>)

STRUCTURE	HC GROUP	MRIN-MTLE GROUP	T	P	STRUCTURE	HC GROUP	MRIN-MTLE GROUP	T	P
lh parahippocampal	2013.28 ±413.96	1894.03 ±443.7	1.86	0.04	rh temporal pole	2591.56 ±409.05	2399.99 ±579.1	2.56	0.03
lh frontalpole	1038.5 ±170.31	1092.61 ±254.35	-1.67	0.09	rh inferior temporal	10630.52 ±1674.13	9965.03 ±1893.71	2.49	0.08
lh temporal pole	2540.12 ±417.13	2418.3 ±61.82	1.65	0.02	rh cuneus	3299.47 ±628.09	3076.84 ±654.93	2.32	0.07
lh isthmuscingulate	2468.92 ±439.49	2329.27 ±702.42	1.59	0.09	rh entorhinal	1770.98 ±444.16	1644.94 ±360.07	2.09	0.01
lh inferior temporal	10853.73 ±1767.85	10426.56 ±2041.82	1.50	0.01	rh frontalpole	1235.74 ±208.18	1310.51 ±294.25	-1.96	0.05
lh cuneus	2939.39 ±567	2811.89 ±599.46	1.46	0.06	rh transverse temporal	881.28 ±69.03	830.28 ±21.07	1.73	0.09
lh rostral anteriorcingulate	2281.73 ±488.02	2394.81 ±543.17	-1.46	0.09	rh fusiform	8664.69 ±1323.74	8278.91 ±1729.35	1.68	0.09
lh transverse temporal	1177.96 ±229.12	1128.67 ±270.37	1.31	0.09	rh parahippocampal	1794.66 ±281.7	1711.06 ±385.98	1.66	0.09
lh pericalcarine	1986.61 ±461.88	1899.02 ±435.08	1.31	0.09	rh pars opercularis	3725.13 ±563.15	3562.44 ±765.9	1.62	0.04

**Table 6(c):** Brain structure volume comparison between females in HC group and MRIn-MTLE group(mm<sup>3</sup>)

STRUCTURE	HC GROUP	MRIN-MTLE GROUP	T	P	STRUCTURE	HC GROUP	MRIN-MTLE GROUP	T	P
lh_posterior cingulate	2967.89 ±523.5	2842.04± 795.01	1. 25 4	0. 2 1	rh_postcentr al	9028.2±1 461.39	8753.64± 1421.65	1. 27 8	0. 2 0
lh_superior temporal	11665.31 ±1929.7 7	11280.78 ±2258.52	1. 22 8	0. 2 2	rh_middletemporal	11127.3± 2068.34	10708.57 ±2568.39	1. 20 5	0. 2 3
lh_superior frontal	21504.7 9±2708. 24	20956.86 ±3295.47	1. 21 9	0. 2 2	rh_lingual	6536.11± 1279.53	6304.64± 1387.27	1. 16 4	0. 2 4
lh_lateral occipital	11309.36 ±1734.5 4	11653.64 ±2192.42	- 1. 16 8	0. 2 4	rh_pericalcarine	2271.1±5 27.56	2181.9±5 24.98	1. 13 7	0. 2 5
lh_fusiform	8811.89± 1369.82	8585.18± 1614.02	1. 01 6	0. 3 1	rh_medial orbitofrontal	5472.04± 636.64	5582.57± 760.21	- 1. 05 7	0. 2 9
lh_caudal anterior cingulate	1539.14 ±410.75	1470.83± 490.64	1. 01 3	0. 3 1	rh_precuneus	9366.6±1 367.73	9148.5±1 496.96	1. 02 3	0. 3 0
lh_supramarginal	10805.4 1±1837. 16	10541.92 ±2120.87	0. 89 1	0. 3 7	rh_superior parietal	12334.27 ±1620.42	12555.27 ±2045.07	- 0. 80 4	0. 4 2
lh_precuneus	9077.86 ±1258.6 8	8899.33± 1512.01	0. 86 1	0. 3 9	rh_lateral orbitofrontal	6997.49± 782.23	7101.72± 1117.48	- 0. 72 5	0. 4 7
lh_inferior parietal	11629.47 ±1867.9 8	11853.74 ±1979.85	- 0. 78 2	0. 4 3 5	rh_parietal	2702.77± 359.23	2747.33± 494.82	- 0. 69 1	0. 4 9

**Table 6(d):** Brain structure volume comparison between females in HC group and MRIn-MTLE group(mm<sup>3</sup>)

STRUCTURE	HC GROUP	MRIN-MTLE GROUP	T	P	STRUCTURE	HC GROUP	MRIN-MTLE GROUP	T	P
lh_parsoper cularis	4306.07 ±736.73	4233.1± 845.92	0.6 17	0.5 38	rh_superiorfr ontal	20656±2 664.11	20354.3 4±3221. 42	0. 68 5	0.4 95
lh_paracentr al	3426.71 ±493.36	3385.7± 599.66	0.5 01	0.6 17	rh_caudalan teriorcingula te	1769.07± 490.08	1734.06 ±500.62	0. 47 4	0.6 36
lh_superior parietal	12894.1 3±1755. 77	12755.8 1±1985. 84	0.4 95	0.6 21	rh_rostralmi ddlefrontal	15190.54 ±2323.68	15345.5 1±2324. 21	- 0. 44 7	0.6 55
lh_insula	6625.83 ±721.19	6676.59 ±795.73	- 0.4 48	0.6 54	rh_superiort emporal	11092.18 ±1723.34	10982.0 1±2136. 34	0. 38 1	0.7 04
lh_medialor bitofrontal	5200.97 ±589.81	5244.47 ±710.08	- 0.4 47	0.6 55	rh_lateraloc cipital	11468.47 ±1877.62	11571.4 2±1887. 17	- 0. 36 7	0.7 14
lh_parstriar gularis	3424.08 ±541.74	3398.57 ±579.82	0.3 05	0.7 61	rh_supramar ginal	9399.63± 1770.86	9313.26 ±2030.7 8	0. 30 4	0.7 61
lh_entorhina l	1754.34 ±357.01	1735.49 ±497.14	0.2 92	0.7 7	rh_inferiorpa rietal	13941.18 ±2116.25	13867.5 8±2204. 01	0. 22 9	0.8 2
lh_rostralmi ddlefrontal	14634.3 4±1981. 27	14699.3 8±1909. 21	- 0.2 24	0.8 23	rh_rostralan teriorcingulat e	1708.4±4 06.81	1700.02 ±449.19	0. 13 1	0.8 96
lh_lateralorb itofrontal	7207.86 ±771.71	7228.41 ±878	- 0.1 67	0.8 68	rh_paracentr al	3770.19± 552.61	3774.6± 865.33	- 0. 04 1	0.9 68
lh_middlete mporal	10083.6 8±1978. 77	10040.1 ±2346.5 4	0.1 35	0.8 93	rh_insula	6572.34± 770.12	6575.73 ±988.54	- 0. 02 6	0.9 8
lh_lingual	6003.23 ±1259.8 9	6012.51 ±1298.7 9	- 0.0 49	0.9 61	rh_parstriar gularis	4128.34± 705.46	4127.79 ±935.57	0. 00 4	0.9 96

**Table 6(e):** Brain structure volume comparison between females in HC group and MRIn-MTLE group(mm<sup>3</sup>)

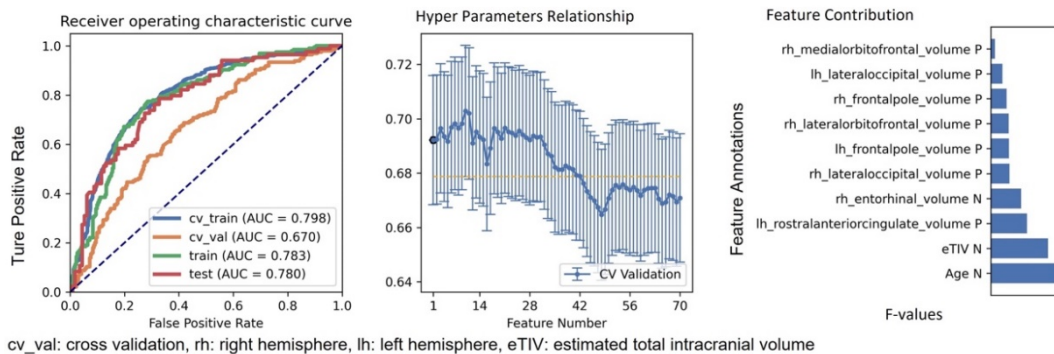
STRUCTURE	HC GROUP	MRIN-MTLE GROUP	T	P	STRUCTURE	HC GROUP	MRIN-MTLE GROUP	T	P
BrainVolumeWithoutVentricles	1073687	106760	0.4	0.6	Estimated total intracranial volume	1399306.	134087	2.	0.0
	.53±101	5.02±10	03	88		99±1593	3.07±17	35	2
	530.98	1117.49				46.34	3887.29		

\* lh= left hemisphere; \*\* rh=right hemisphere

## 2.6. Effectiveness of volumetric feature-based diagnostic classification

### 2.6.1 Classification effectiveness of brain volume as classification features in all participants

On the validation dataset, the SVM model based on 46 features screened by RFE achieved the greatest AUC out of 3 classifiers employed. The AUC in the training dataset reached 0.780. In this point, the AUC and the accuracy of the model in test dataset approached 0.780 and 0.721, respectively (Table 7, Table 8, Figure 2).



**Figure 2:** Classification efficacy of the model constructed on brain volume features in all participants

**Table 7:** Statistics of support vector machine model in all participants' volumetric features

STATISTICS	VALUE
ACCURACY	0.721
*AUC	0.781
AUC 95% CIS	[0.711-0.849]
**NPV	0.809
***PPV	0.641
SENSITIVITY	0.786
SPECIFICITY	0.673

\*AUC: Area Under Curve, \*\*NPV: Negative Predictive Value, \*\*\*PPV: Positive Predictive Value

**Table 8:** Feature coefficients in the classification model based on all participants' brain volumes

FEATURES	INDEX	FEATURES	INDEX
Age	-3.519	lh_supramarginal_volume	0.934
*lh_caudalanteriorcingulate_volume	0.452	lh_frontalpole_volume	1.173
lh_caudalmiddlefrontal_volume	-0.781	lh_temporalpole_volume	-0.177
lh_cuneus_volume	0.639	lh_insula_volume	0.403
lh_entorhinal_volume	0.314	**eTIV	-0.821
lh_inferiorparietal_volume	0.348	rh_cuneus_volume	-1.028
lh_inferiortemporal_volume	-1.199	***rh_entorhinal_volume	-1.077
lh_isthmuscingulate_volume	-0.344	rh_inferiorparietal_volume	-0.27
lh_lateraloccipital_volume	1.116	rh_inferiortemporal_volume	0.832
lh_lateralorbitofrontal_volume	0.017	rh_lateraloccipital_volume	1.157
lh_lingual_volume	0.721	rh_lateralorbitofrontal_volume	1.189
lh_middletemporal_volume	0.888	rh_lingual_volume	-0.409
lh_paracentral_volume	0.649	rh_medialorbitofrontal_volume	0.822
lh_parsopercularis_volume	-0.933	rh parahippocampal_volume	0.618
lh_parsorbitalis_volume	-0.684	rh_paracentral_volume	0.082
lh_parstriangularis_volume	-1.288	rh_parsorbitalis_volume	-0.106
lh_pericalcarine_volume	-0.462	rh_parstriangularis_volume	-0.058
lh_postcentral_volume	-0.173	rh_posteriorcingulate_volume	-1.418
lh_precentral_volume	-1.257	rh_precuneus_volume	-1.73
lh_precuneus_volume	0.912	rh_superiorparietal_volume	0.055
lh_rostralanteriorcingulate_volume	1.206	rh_supramarginal_volume	0.903
lh_rostralmiddlefrontal_volume	-1.527	rh_frontalpole_volume	1.226
lh_superiorparietal_volume	-0.233	rh_temporalpole_volume	-0.56

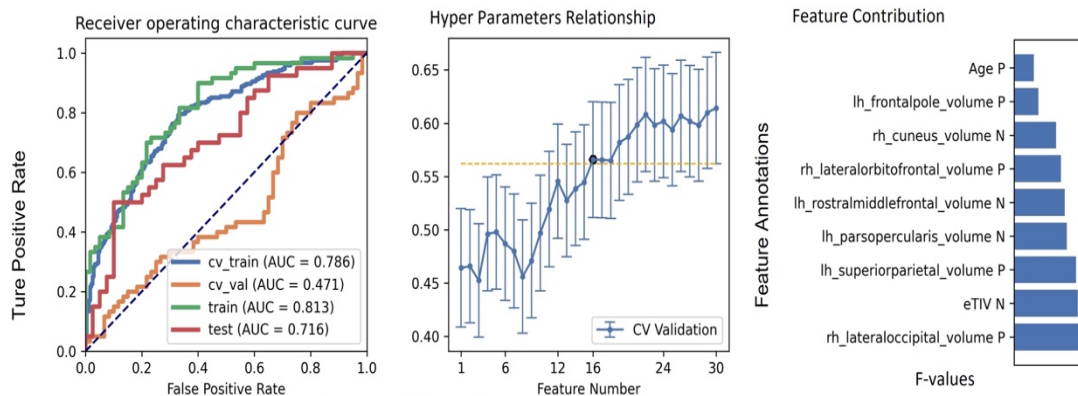
\*lh: left hemisphere, \*\*eTIV: estimated total intracranial volume, \*\*\*rh: right hemisphere

### 2.6.2. Classification effectiveness of brain volume as classification features in male participants

On the validation dataset, the logistic regression model based on the nine features screened by RFE achieved the greatest AUC out of 3 classifiers employed. The AUC in the training dataset reached 0.813. In this point, the AUC and accuracy of the model in test dataset approached 0.716 and 0.700, respectively (Table 9, Table 10, Figure 3). On the test dataset, the AUC is reported to be approximately 0.716, and the accuracy is approximately 0.700. These metrics indicate how well the model generalizes to unseen data.

An AUC of 0.716 and an accuracy of 0.700 suggest that the model maintains good discriminatory power and performs reasonably well on the test

data, although the performance may not be as strong as on the training data.



cv\_val: cross validation, rh: right hemisphere, lh: left hemisphere, eTIV: estimated total intracranial volume

**Figure 3:** Classification efficacy of the model constructed on brain volume features in male participants

**Table 9:** Statistics of logistic regression model in male participants' volumetric features

Statistics	Value
Accuracy	0.7
*Auc	0.716
Auc 95% CIs	[0.598-0.824]
**Npv	0.643
***Ppv	0.833
Sensitivity	0.5
Specificity	0.9

\*AUC: Area Under Curve, \*\*NPV: Negative Predictive Value, \*\*\*PPV: Positive Predictive Value

**Table 10:** Feature coefficients in the classification model based on male participants' brain volumes

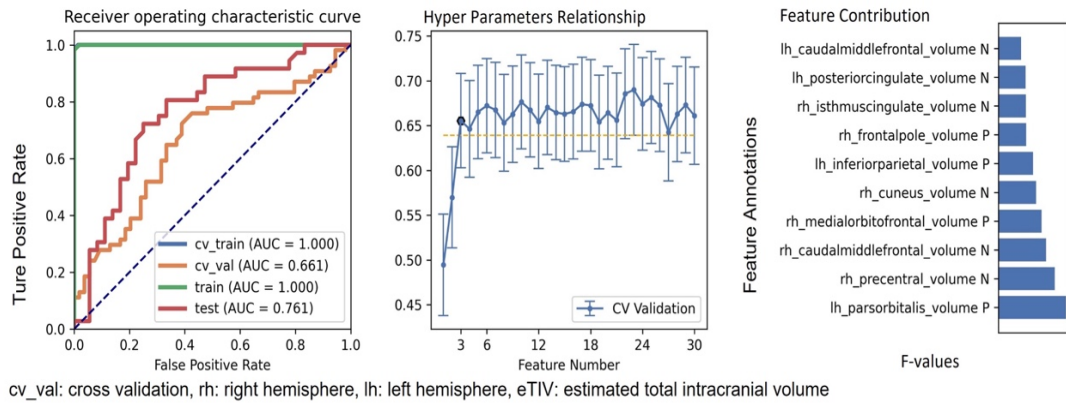
FEATURES	INDEX
Age	1.591
*lh_parsopercularis_volume	-4.274
lh_rostralmiddlefrontal_volume	-4.087
lh_superiorparietal_volume	4.999
lh_frontalpole_volume	1.968
**eTIV	-5.166
***rh_cuneus_volume	-3.407
rh_lateraloccipital_volume	5.588
rh_lateralorbitofrontal_volume	3.8

\*lh: left hemisphere, \*\*eTIV: estimated total intracranial volume, \*\*\*rh: right hemisphere



### 2.6.3. Classification effectiveness of brain volume as classification features in female participant

On the validation dataset, the random forest model with 30 features screened by RFE had the greatest AUC out of 3 classifiers employed. The AUC in the training dataset reached 1.000. In this point, the AUC and accuracy of the model in test dataset approached 0.761 and 0.736, respectively (Table 11, Table 12, Figure 4).



**Figure 4:** Classification efficacy of the model constructed on brain volume features in female participants

**Table 11:** Statistics of random forest model in female participants' volumetric features

STATISTICS	VALUE
Accuracy	0.7361
*AUC	0.761
AUC 95% CIs	[0.648-0.868]
**NPV	0.730
***PPV	0.743
Sensitivity	0.722
Specificity	0.75

\*AUC: Area Under Curve, \*\*NPV: Negative Predictive Value, \*\*\*PPV: Positive Predictive Value

**Table12(a):** Ranking of features in classification model based on female participants' brain volumes

Features	Rank	Features	Rank
Age	1	rh_cuneus_volume	16
*lh_caudalanteriorcingulate_volume	2	rh_entorhinal_volume	17
lh_caudalmiddlefrontal_volume	3	rh_inferiorparietal_volume	18
lh_cuneus_volume	4	rh_inferiortemporal_volume	19
lh_inferiorparietal_volume	5	rh_isthmuscingulate_volume	20

**Table12(b):** Ranking of features in classification model based on female participants' brain volumes

Features	Rank	Features	Rank
lh_inferiortemporal_volume	6	rh_lateralorbitofrontal_volume	21
lh_isthmuscingulate_volume	7	rh_medialorbitofrontal_volume	22
lh_lateraloccipital_volume	8	rh_middletemporal_volume	23
lh_parsorbitalis_volume	9	rh_postcentral_volume	24
lh_posteriorcingulate_volume	10	rh_posteriorcingulate_volume	25
lh_precentral_volume	11	rh_precentral_volume	26
lh_rostralanteriorcingulate_volume	12	rh rostral anterior cingulate_volume	27
lh_rostralmiddlefrontal_volume	13	rh rostral middle frontal volume	28
lh_transversetemporal_volume	14	rh superior temporal volume	29
**rh_caudal middle frontal volume	15	rh frontal pole volume	30

*\*lh: left hemisphere, \*\* rh: right hemisphere*

### 3. Discussion

TLE is the most prevalent form of drug-resistant chronic epilepsy[5]. Targeted resection procedures, such as selective amygdala resection, are presently regarded as successful surgical approaches, with up to 80% of patients no longer experiencing seizures two years after surgery (Morris, 2006; Natsume, Bernasconi, Andermann, & Bernasconi, 2003). To determine the extent of the MTLE surgery and prognosis, the precise preoperative localization and identification of the epileptogenic focus is highly important. Many recent findings have found the use of accurate brain structure image segmentation and volume calculation to be of great value in preoperative evaluation, and as technology has advanced, the diagnostic accuracy of this technique has grown very much closer to postoperative pathological findings (Sämann et al., 2022). Which provides a noninvasive pre-operative evaluation method to improve surgical outcome and patients' symptoms (Pardoe, Berg, & Jackson, 2013).

Structural MRI provides physiologically valid and objective imaging markers and high reliability; it is thus an objective framework for investigating disease progression. This approach is also more sensitive to gray matter atrophy than visual examination. According to a 2020 review on FreeSurfer hippocampal segmentation methods and applications (Song et al., 2020), previous volumetric research has focused primarily on neurodegenerative conditions, such as AD, and less on epilepsy. We reviewed the literature on volumetric research but found that only 10 (6.2%) of the 162 identified records were epilepsy related. To fully understand the brain regions involved in MRIn-MTLE, the present study conducted structural MRI with healthy adults and epileptic patients. We then segmented and measured the telencephalic volumes of healthy adults and MRIn-MTLE patients using FreeSurfer software

to obtain volume parameters of brain tissue and its subregions with high confidence.

Differences among brain regions in the left and right hemispheres were found in both the HC and MRIn-MTLE groups, suggesting that MRIn-MTLE, despite causing changes in brain region volumes, may be misdiagnosed due to the extent of physiological variability when comparing the volumes of patients' brain regions. Moreover, as neuroimaging methods advance, there is growing evidence that epilepsy is a network illness and that focal epilepsy generalizes to networks other than the epileptogenic focus[14]. In the present study, patients with MRIn-MTLE showed a reduction in the volume of several brain regions, including the temporal lobe; these results are consistent with the literature describing gray matter atrophy in patients with focal epilepsy that also occurs outside the presumed epileptogenic focus (Stefanits et al., 2017). Female MRIn-MTLE patients exhibited changes in volume in the temporal lobe, a portion of the cingulate gyrus, and frontal areas. In contrast, male MRIn-MTLE patients exhibited changes in volume in the frontal, temporal, and cingulate regions.

In the past, less emphasis has been placed on examining sex differences in the effects of MRIn-MTLE on brain structure. Similar alterations have been found in terms of cortical thickness and cortical surface area. To understand these sex related differences, a large number of neuropathological studies are required to characterize the various patterns of neuronal cell loss in the temporal lobe and adjacent temporal lobe structures in surgical specimens (Steve et al., 2020; Thom, 2014) or autopsy brains of epileptic patients. Therefore, the efficacy of imaging and neuropathological categorization methods for distinguishing the pathological forms of TLE in patients of different sexes should be evaluated.

Statistical analysis revealed several brain subregion volumes is smaller in MRIn-MTLE patients. Feature selection results came with features positively or negatively related with the MRIn-MTLE classification, 10 most discriminative features were selected (Figure2, Figure 3). In male participants, the statistical results revealed 12 differences between two groups, within which left rostral middle frontal gyrus was negatively related with classification (1 out of 10 most discriminative features). In female participants, the statistical results revealed 5 differences between two groups, within which left caudal middle frontal gyrus, right caudal middle frontal gyrus, right isthmus of cingulate gyrus, right precentral gyrus, right cuneus were negatively related with classification (5 out of 10 most discriminative features). It should be mentioned that some research have shown that sodium valproate can cause a decrease in parietal cortex thickness and volume (Tondelli, Vaudano, Sisodiya, & Meletti, 2020; Varho, Komu, Sonninen, Lähdetie, & Holopainen, 2005). The patients in the current study used carbamazepine and sodium valproate (carbamazepine N=197,

sodium valproate N=23, and the combination of the two drugs N=59), and due to insufficient sample size, a comparative analysis of brain volumes in patients using sodium valproate was not performed separately in this study, but given that some participants also had a reduction in parietal volume, the effect of the drugs should be considered when making the diagnosis (Wiebe, Blume, Girvin, & Eliasziw, 2001).

Machine learning techniques can improve MRIn-MTLE lesion identification accuracy. Previous neuroimaging studies have used image histology to perform tasks such as tumor grading. Furthermore, one of the main focuses of the machine learning field in recent years has been the development of classification models for neurological diseases without obvious lesions (e.g., Alzheimer's disease and Parkinson's disease) using intrinsic features of brain tissue, and several models have been shown to have good classification efficacy, and the results of these studies have provided valuable information. The findings of these studies can be used to develop classification models based on MRIn-MTLE patient image features, in our case, there were differences between feature selection and statistical results, indicating that only revealing the differences by utilizing univariate analysis was not sufficient for feature selection, multivariate analysis, such as the machine-learning algorithm employed, provided much better effectiveness and classified the features in positive or negative, which is much clearer than statistic outcome alone (Wu et al., 2005).

This study demonstrates that brain volume as a classification feature can be utilized to diagnose and categorize MRIn-MTLE using a whole-brain volume-based classification model. The classification accuracy in the test dataset of male participants was statistically acceptable, but overfitting due to the small sample size (200 male participants and 180 female participants) limited the possibility of the classification models, which required further evaluation by increasing the sample sizes. These findings demonstrated that using structural characteristics as classification features aids in training classification models. In future studies, we would increase the sample size, divide patients into subgroups based on medication usage, and introduce novel network models to improve classification accuracy that meets clinical diagnosis needs.

#### **4. Conclusion**

This investigation sheds light on the alterations in brain volumes associated with Magnetic Resonance-Negative Temporal Lobe Epilepsy (MRIn-MTLE) among athletes and fitness enthusiasts. Epilepsy is a condition that affects individuals across various walks of life, including those actively engaged in sports and fitness activities. For a subset of these individuals, MRIn-MTLE presents a unique challenge as it lacks specific epileptogenic foci that can be identified through traditional neuroimaging techniques.

Through the utilization of T1-weighted magnetization prepared rapid gradient echo imaging (T1W-MPRAGE) scans and FreeSurfer software, we conducted a comprehensive analysis of brain regions and structures in MRIn-MTLE patients within the athlete and fitness enthusiast demographic, comparing them to a control group of healthy individuals. This investigation aimed to provide precise structural data on brain regions and assess differences in brain structure between the two groups.

The results of this study have not only deepened our understanding of MRIn-MTLE but also emphasized the need for tailored diagnostic and therapeutic approaches for athletes and fitness enthusiasts facing this condition. While conventional MRI scans may not reveal epileptogenic foci, automated segmentation tools and volumetric parameters have shown promise in providing valuable insights for classification and diagnosis. These findings open avenues for further research and clinical applications in managing MRIn-MTLE among athletes and fitness enthusiasts.

As our knowledge continues to evolve, a multidisciplinary approach involving neurologists, sports medicine specialists, and imaging experts becomes increasingly important in addressing the unique challenges posed by MRIn-MTLE within this population. By better understanding the structural brain changes associated with MRIn-MTLE, we can enhance diagnostic accuracy and develop more targeted interventions, ultimately improving the quality of life for athletes and fitness enthusiasts affected by this condition

## **Declarations**

## **Ethics approval and consent to participate**

This research was authorized by the Medical Research Ethics Board of First Affiliated Hospital of Xinjiang Medical University, all methods were performed in accordance with the relevant guidelines and regulations, and all subjects provided written informed consent forms.

## **Consent for publication**

All subjects including children's parents provided written informed consent forms, terms regarding publication consent were included in the consent form.

## **Availability of data and materials**

The datasets used and/or analysed during the current study are available from the corresponding author on reasonable request.

## **Competing interests**

The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

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## Authors' contributions

HK wrote the first version of this manuscript. FY and SD carried out the data processing and statistical analysis. HZ was responsible for the data collection. WJ and YW contributed to the conception and design of this manuscript. All authors contributed to the manuscript revision.

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