# MIGRAINE IN MULTIPLE SCLEROSIS PATIENTS AFFECTS FUNCTIONAL CONNECTIVITY OF THE BRAIN CIRCUITRY INVOLVED IN PAIN PROCESSING

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## \*Corrispondence:

Migraine is particularly common in patients with multiple sclerosis (MS), and has been linked to the dysfunction of the brain circuitry modulating the peripheral nociceptive stimuli. Using MRI, we explored whether changes in the resting statefunctional connectivity (RS-FC) may characterize the occurrence of migraine in patients with MS.

The RS-FC characteristics in concerned brain regions were explored in 20 MS patients with migraine (MS+M) during the interictal phase, and compared with 19 MS patients without migraine (MS-M) which served as a control group. Functional differences were correlated to the frequency and severity of previous migraine attacks, and with the resulting impact on daily activities.

In MS+M, the loss of periaqueductal gray matter (PAG) positive connectivity with the default mode network and the left posterior cranial pons was associated with an increase of migraine attacks frequency. In contrast, the loss of PAG negative connectivity with sensorimotor and visual network was linked to migraine symptom severity and related daily activities impact. Finally, a PAG negative connection was established with the prefrontal executive control network. in Migraine in MS+M patients and its impact on daily activities, underlies RS-FC rearrangements between brain regions involved in pain perception and modulation.

**Keywords:** multiple sclerosis, migraine, pain, functional magnetic resonance, functional connectivity

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#### **Contribution to the field**

Migraine is particularly common in patients with multiple sclerosis (MS), and has been linked to the dysfunction of the brain circuitry modulating the peripheral nociceptive stimuli. Using Magnetic resonance imaging, we explored whether changes in the resting state-functional connectivity (RS-FC) may characterize the occurrence of migraine in patients with MS. Our findings provide potential fMRI markers for connectivity abnormalities affecting MS patients with migraine outside pain episodes. The breakdown of physiologically diverging patterns of periaqueductal gray matter (PAG) connectivity are associated

with migraine attack frequency and severity and may be useful to design anatomofunctional targets for emerging treatment strategies in MS patients with migraine such as non-invasive cerebral transcranial stimulation.

## **INTRODUCTION**

Migraine affects up to 43% of patients with multiple sclerosis (MS), with a significantly higher prevalence than in the general population<sup>1</sup>. In MS-unrelated migraine, clinical and electrophysiology studies have shown that the development of attacks is linked to the dysfunctions in the interaction between areas of the brain network deputed to pain stimuli palliation and processing<sup>2, 3</sup>. In this circuit, the periaqueductal gray matter (PAG) has a pivotal role in the modulation of peripheral hyperexcitability developing along the trigemino-vascular system<sup>2, 3</sup>. Understanding neurophysiological changes occurring between the PAG and its connected brain regions in patients with MS, could be important to develop future specific pain intervention strategies, such as non-invasive transcranial stimulation<sup>4, 5</sup>. To the best of our knowledge, there are few previous studies in the literature which specifically

assessed the occurrence of PAG demyelinating lesions in MS patients with migraine, and the relationship between such lesions and patients' symptoms severity remains controversial. Indeed, whereas a previous study showed an increased risk of lesion occurrence in migraineurs MS patients [*Gee at al, Headache 2005*], two others did not find any relationship with migraine symptoms [*Tortorella et al, J Neurol Sci 2006; Papadopoulou, Mult Scler Rel Dis 2014*] (see also [*Seixas et al, Neuroim Clinical, 2014*] for a review). The spontaneous functional MRI dynamics occurring *between* brain regions can be assessed using the resting-state functional connectivity (RS-FC)<sup>6</sup> technique. In healthy subjects, RS-FC identified the brain regions exhibiting significant connectivity with the PAG<sup>7, 8</sup>. These regions encompassed the so-called pain modulatory network (PMN)<sup>8</sup>. Notably, the PAG exhibited either positive or negative connectivity with other brain regions<sup>7, 8</sup>, respectively indicating functional integration or segregation<sup>9, 10</sup>.

The aim of the present work was to investigate the neural based of the occurrence of migraine in MS patients. Specifically, we tested whether RS-FC modifications of the PAG, and the connected pain processing circuitry regions, may characterize the occurrence of migraine in patients with MS. Because MS disease exerts *per se* a large and widespread impact on the brain functional organization {Pantano, 2015 #287;Rocca, 2015 #288}, in order to specifically capture the effect of migraine occurrence, we assessed functional differences in MS patients with migraine (MS+M) against a group of MS patients without migraine (MS-M) who were matched for their demographic, neurological, neuropsychological, education and treatment characteristics. We tested whether: 1) the presence of migraine affects the connectivity between the PAG and regions that are either positively and/or

negatively connected, and 2) whether migraine symptoms are associated with any of the encountered changes.

## **MATERIALS AND METHODS**

#### **Participants**

Twenty MS+M and 19 matched MS-M patients were consecutively enrolled at the MS center of Civic Hospital in Lugano (Ticino, Switzerland). All patients were right-handed, between 20 and 55 years old, with relapsing-remitting MS according to McDonald criteria<sup>11</sup>. They were relapse- and steroid-free for at least three months and were not on any analgesic medication at the time of the study.

Patients with migraine had to fulfil additional inclusion criteria: 1) diagnosis of episodic migraine with at least 1 attack per month or chronic migraine according to the International Headache Society criteria (ICHD 2013). 2) no acute migraine attacks within the 72 hours prior to the scanning session. 3) no treatment with psychotropic medications, like antidepressant and/or antiepileptic agents. 4) no migraine prophylactic treatments. Patients with significant medical illness or substance abuse that could have interfered with cognitive functioning, other major systemic, psychiatric or neurological diseases, and history of alcohol/drug abuse, were excluded.

#### **Clinical assessment**

On the day of MRI acquisition all patients underwent Expand Disability Status Scale (EDSS) assessment. In MS+M, migraine disease duration and the number of monthly migraine days (MMD) during the last month according to patient's migraine diary were captured. The patients were asked to indicate average pain intensity

during migraine attacks of the last two months on a 10-cm visual analogue scale (VAS-P) (0 no pain, 10 maximum unbearable pain). They completed the six-item Headache Impact Test (HIT-6)<sup>12</sup> to assess grade of impact on daily life activity. Within 48 hours after MRI acquisition, all patients attended a semi-structured interview investigating depression and anxiety symptoms using the Hamilton depression rating scale (HDRS)<sup>13</sup> and Hamilton anxiety rating scale (HAM-A)<sup>14</sup>. All patients were relapse- and steroid-free for at least three months, with unchanged MS modifying treatment during 6 months before MRI acquisition.

#### MRI data acquisition

All data were acquired on a single 3.0T scanner (Siemens Skyra, Erlangen, Germany), using a 20-channel head coil. Anatomical images consisted of Magnetization-Prepared-Rapid- Gradient-Echo (MPRAGE) 3D T1-weighted (TR= TI=900ms;  $FOV=240mm^2$ ; matrix=256x256; 1900ms; TE=2.1ms;voxel size=0.9x0.9x0.9 mm<sup>3</sup>), and 3D Dark-Fluid T2-weighted (TR=5000ms; TE=394ms; TI=1800ms; FOV=240x240mm<sup>2</sup>; matrix=256x256; voxel size=0.9x0.9x0.9mm<sup>3</sup>) sequences. RS-FC data were obtained by using a BOLD single-shot echo-planar sequence (TR=1800ms; TE=30ms; flip angle=90°; FOV=240mm<sup>2</sup>; matrix=64x64; slices number=32; slice thickness=4mm; gap=0; voxel size = 3.75 x 3.75 x 4 mm; volumes=230; acceleration factor=2; scan duration=6'54''). During rs-fMRI data acquisition, participants were asked to keep their eyes closed. As we used a multichannel coil and focused our analyses on the PAG, a deeply-located brainstem structure, pre-scan signal intensity normalization was applied to optimize signal homogeneity $^{15}$ .

#### **Structural data analysis:**

T<sub>2</sub>-visible lesions were automatically segmented on the 3D-Dark-Fluid images using Lesion Segmentation Toolbox (LST) (http://www.statistical-modelling.de/lst.html). Subsequent manual refinement was performed by an experienced Neuroradiologist (E.P.) using MRIcron (https://www.nitrc.org/projects/mricron). The resulting volume (T<sub>2</sub>-LV) was recorded for each patient. The corresponding segmentations were used to refill T1-weighted images with voxels of similar signal intensity to that of the adjacent white matter (WM) before these were submitted to further analyses, in order to reduce tissue segmentation bias. Normalized brain volume (NBV), grey matter (GM) volume (NGMV) and WM volume (NWMV) were estimated on 3D-MPRAGE images, using Structural Imaging Evaluation of Normalized Atrophy cross-sectional (SIENAx), part of FSL. Finally, T2-lesion probability maps (T<sub>2</sub>-LPM) were generated by voxel-wise comparison of the lesions spatial frequency, using the non-parametric Liebermeister test with 'non parametric mapping' (NPM-<u>www.mricro.com</u>).

#### **Functional data preparation**

All BOLD analyses were conducted with the Functional Connectivity toolbox (CONN) v17f (<u>https://www.nitrc.org/projects/conn</u>)<sup>17</sup>. Because the standard regression of the whole brain signal, a preprocessing option used to remove noise, may bias the estimation of the negative correlations<sup>18</sup>, we employed the software embedded CompCor tool instead<sup>19</sup>. This corrects for physiological noise by regressing out the principal components from the white matter and cerebral spinal fluid, where the signal is unlikely related to neural activity. Time-series images were realigned, slice timing corrected, normalized into the Montreal Neurological Institute (MNI) standard space, and spatially-smoothed with a 6mm-FWHM filter to improve

between-subjects comparability. GM, WM and cerebrospinal fluid segmentations maps were obtained. Subject head motion confound was accounted using functional outlier detection. by running the Artifact Detection Tools (ART, https://www.nitrc.org/projects/artifact\_detect) based algorithm in CONN. Outlier volumes were identified via framewise displacement using default parameters (>0.9mm frame-wise displacement), and then regressed out. Furthermore, by using CompCor, the estimated subject-motion parameters (3 translation, 3 rotation plus their associated first-order derivatives) were regressed out from the BOLD time series. Time courses were de-trended and filtered (0.01-0.08 Hz) to retain the low frequency fluctuations (LFF) range.

#### PAG connectivity analysis

All RS bold signal analyses were restricted to the GM by employing the previously generated tissue masks. By employing previously described anatomical and functional descriptions of the PAG as references [*Ezra*, *HBM 2015; Linnman*, *Neuroimage 2012*], a 3-mm radius spherical ROI was visually drawn at the level of the PAG on the high-resolution T1-weighted image of each patient (Figure S1). Seeds were subsequently transferred into the MNI standard space and served as origins for the seed-to-voxel analyses Seed-based connectivity maps were calculated using Fisher-transformed bivariate correlation coefficients, with time series being centered to zero mean. All cluster-level inferences were conducted with parametric statistics performed using CONN. One-sample t-test statistics are then performed, with the positive and negative directionality reflecting the positive and negative correlation sign against zero. Differences between groups were assessed with two-

sample t-tests, with positive and negative contrasts conducted separately corresponding to one-side comparison. Analyses were adjusted for age and gender. The employed cluster height significance threshold was P<0.01 uncorrected, with a cluster-size level threshold of P<0.05 corrected with false discovery rate (FDR).

In order to combine the voxel-wise analysis performed in our specific groups of patients with a regions-of-interest approach using ROIs taken from the literature, we used the regions identified by Shirer at Al. *[Shirer et al]* because: i. they derive from a data-driven approach, ii they are freely available, and iii. they have been employed in several previous studies *[Chen et al. Neuroimage: clinical 2021; Luo, et al, HBM 2021; Zarifkar, Parkinson and Rel Dis. 2021]*. While we initially performed analyses in ROIs from all the available networks, we subsequently decided to focus on those networks that overlap with clusters of PAG connectivity. In order to determine the PAG connectivity relationships with respect to the main intrinsic connectivity brain networks (ICNs), the resulting clusters were overlaid on the ICNs anatomical maps provided in<sup>20</sup>. These include the default mode network (DMN), the basal ganglia network (BGN), sensorimotor network (SMN), higher visual network (HVN), auditory network (AN), executive control network (ECN), posterior salience network (PSN) (Figure S2).

For each comparison, all clusters overlapping on one single ICN were averaged together and the resulting functionally defined region-of-interest (fROI) was named with that particular ICN.

Clusters without ICN overlap were named according to their specific anatomical peak. For each of the resulting fROI, average RS-FC values were extracted using REX (<u>https://www.nitrc.org/projects/rex/</u>) for regional analyses.

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Finally, patients' migraine VAS, HIT-6 and MMD scores were correlated with the average RS-FC values extracted from the clusters obtained in the seed-to-voxel between-groups comparison map

#### Additional statistical analysis

The Shapiro-Wilk test was used to verify normal distribution of demographic data, clinical variables and structural MRI measurements. Chi-square test or Fisher's exact test and Mann–Whitney U-test were applied to investigate between-group differences, Spearman's Rank-Order Correlation to test associations between clinical and RS-FC measurements. Significance level was set at P<0.05 after Bonferroni correction for multiple comparisons. Data were analyzed using the statistical software package SPSS (version 25.0).

#### RESULTS

#### **Demographic, clinical and structural MRI characteristics**

Table 1 summarizes the main demographic, clinical and MRI structural characteristics of the patients. The two study groups were matched for gender, age, disability and MS-related disease duration. The proportion of patients on MS disease modifying treatment (p= 0.65) as well as anxiety and depression symptoms severity were similar between groups (respectively p=0.38 and p=0.36).

Also, no significant between-group difference was detected for normalized brain, GM, WM, overall T<sub>2</sub> lesion volume and spatial distribution (images not shown).

MS+M patients had an average migraine disease duration of 4.5 (IQR=2-17) years, six (30%) had migraine with aura who did not differ for demographic, clinical and structural parameters with respect to patients without aura; p=0.74. The median HIT-6 score was 62 (IQR=57-68), MMD 6 (IQR=3-8) days, and VAS-P score 7 (IQR=6-

8). MMD was not significantly correlated with HIT-6 (rho=-0.246, P=0.148) and VAS-P scores (rho=-0.232, p=0.162), whereas the HIT-6 scores were significantly correlated with VAS-P scores (rho=0.374, p=0.05). No patient had any migraine attack the day following MRI.

## **RS-FC**

Head movements (along the 3 translation and 3 rotation axes) did not significantly differ between groups (FDR-corrected P=0.19-0.80, two-sample t-test). Both groups exhibited positive and negative correlations with the PAG (P<0.05, cluster-size FDR-corrected - Figure 1, Table S1). Figure S2 further illustrates the clusters with spatial overlap with the principal ICNs. No cluster exhibited spatial overlap with two or more different ICNs.

In MS-M patients, positive connections were present between PAG and the default mode network (DMN), and between the PAG and basal ganglia network (BGN) (T range=4.01-8.02). PAG positively-correlated areas outside the main ICNs were present in the cerebellum hemisphere (T=5.78), vermis (T=5.96) and in the Left Posterior caudal pons (L-PoCP) (T=3.46). Negative connections were present between PAG, the sensorimotor (right-SMN T=-6.17; left-SMN T=-5.57), extrastriate high visual (right-HVN T=-6.05; left-HVN T=-5.61) and auditory networks (right-AuN T=-4.89; left-AuN T=-4.62) (Table S1, Figure 1). In MS+M patients a relatively smaller number of clusters with positive connectivity was present, specifically at the level of the vermis (T=7.43), right cerebellar hemisphere (T=5.58), DMN regions (T range=2.9-4.43) and BGN regions (T range=2.96-6.37). Negatively-correlated clusters were detected at the level of the executive control (left-ECN T=-5.64; right-ECN T=-5.08) and posterior salience (left-pSN T=-5.19;

right-pSN T=-4.68) networks, in the left (T=-5.56) and right (T=-3.62) inferior temporal gyrus, and left gyrus rectus (T=-5.11) (Figure 1)

PAG connectivity differed in several brain regions between MS+M and MS-M patients (Table 2, Figure 2). Because such variations could correspond to either RS-FC decrease or increase with respect to areas either positively or negatively connected with the PAG, results were laid over MS-M patients' PAG connectivity maps for reference. Three distinct patterns of connectivity changes emerged, and their values distribution between the groups are presented by the boxplots in Figure 3. Pattern 1 included the fROIs with PAG *positive* connectivity reduction, specifically confined to the L-PoCP, vermis, BGN, and DMN. Pattern 2 encompassed the fROIs with PAG *negative* connectivity reduction located in the SMN and HVN. Pattern 3 was characterized by inversion from positive to negative connectivity in the dorsal prefrontal areas corresponding to the ECN.

#### Association between functional changes and migraine symptoms

Table 3 illustrates the correlations of the PAG RS-FC with the frequency and severity of migraine attacks, and with the HIT-6 score. The corresponding values distribution are reported in Figure 4.

In Pattern 1 fROIs, despite the PAG DMN and L-PoCP connectivity was reduced compared to MS-M, a positive relationship was found between MMD and the L-PoCP (rho=0.56) and between MMD and DMN (rho=0.54), linking higher MMD to a stronger PAG connectivity. In Pattern 2 fROIs a positive correlation was observed between the SMN connectivity strength and the HIT-6 (rho=0.54) and VAS-P scores (rho=0.57). This reduction of negative connectivity corresponds to a more severe impact and symptoms' perception.

For Pattern 3 fROIs, inverse correlations between the ECN connectivity and MMD (rho=-0.45).

## DISCUSSION

This study provided two main results. First, concurring with findings in healthy subjects<sup>7, 8</sup>, the intrinsic PAG connectivity organization in MS-M was characterized by positive connectivity with brainstem, thalamic, BGN and DMN regions, as well as negative connectivity with unimodal (sensorimotor, visual, auditory) ICN regions, putative markers of network integration and segregation. Secondly, the occurrence of migraine in MS patients was not related to the T<sub>2</sub>-visible lesion load and/or spatial frequency, but was associated with the loss of *positive* and *negative* connectivity, respectively linked to the frequency and severity of the attacks.

In line with findings in healthy subjects<sup>7, 8</sup>, in MS-M patients the PAG displayed *positive* connectivity with cortical areas belonging to the DMN, but also deep structures such as the basal ganglia and the brainstem, the so-called "PMN"<sup>8, 21</sup>. Additionally, the PAG was *negatively* connected with unimodal sensory (i.e. sensorimotor, visual, auditory) regions. The presence of RS-FC negative correlation (or anti-correlation) has been widely documented<sup>9, 22, 23</sup> and further supported by magnetoencephalography recordings of the spontaneous brain activity<sup>24</sup>. Whereas positive correlations are thought to reflect synchronization and integration of neuronal activity and information processing, negative correlations were hypothesized to represent segregation of neuronal activity between areas involved in competing functions<sup>9, 10</sup> mediated by higher level ICNs inhibitory networks<sup>25</sup>. Our interpretation is based on previous evidence about the functional significance of

negative correlations in healthy subjects (e.g. Kelly, Uddin, Biswal, Castellanos, & Milham, 2008) and neurological patients (e.g. Baldassarre et al., 2014). In particular, a series of studies conducted in stroke patients (reviewed in Baldassarre, Ramsey, Siegel, Shulman, & Corbetta, 2016) have indicated that the behavioral deficits following stroke are associated with both reduced inter-hemispheric functional connectivity and reduced anti-correlation between the fronto-parietal and the default mode networks. In our study group, MS+M showed three distinct patterns of PAG connectivity reorganization between pain episodes. The most extensive rearrangement (Pattern 1) corresponded to the decreased positive RS-FC between the PAG and regions belonging to the DMN, BGN, cerebellum and L-PoCP. Notably, the PoCP corresponds to the anatomical site of the trigeminal nucleus, found to elicit BOLD signal response to facial nociceptive stimuli<sup>26</sup>. Thus, migraine in MS patients implicates an extensive impairment of the functional integration between the main cortical regions supporting spontaneous brain function, the DMN<sup>20</sup>. The DMN and L-PoCP connectivity were also related to patients' MMD. Although the MS+M patients experienced a substantial decrease in the positive RS-FC from the PAG compared to MS-M patients, the residual DMN and L-PoCP connectivity strength was directly correlated to a higher MMD. Because the connectivity between DMN and L-PoCP was reduced in MS+M patients, we argue that its residual strength might represent an adaptive mechanism in response to relatively more frequent attack recurrence. However, dedicated subregional connectivity studies (such as in [Schulte, Neuroimage 2016]) are needed to clarify the specific characteristics of the PAG connectivity with the trigeminal nucleus.Pattern 2 consisted of the functional segregation loss between the PAG and the SMN, and PAG and HVN. SMN and PAG are both activated during nociceptive fMRI tasks<sup>27</sup>, however, these two regions

normally show negative connectivity in healthy subjects<sup>7, 8</sup>, a result replicated in our MS-M patients group. As migraine is known to be associated with increased excitability in the sensorimotor cortex<sup>28, 29</sup>, we speculate that a failure to maintain interictal physiological network segregation may result in an aberrant SMN hyperexcitability within pain processing pathways.

Pattern 3 enclosed the occurrence of negative connectivity with prefrontal regions belonging to the ECN. The prefrontal cortex is considered the main source of cognitive control over pain perception<sup>2, 30</sup>. In non-MS migraineurs, a higher MMD was indeed linked to a decreased connectivity between the PAG and several prefrontal regions, whose interictal dysfunction could promote attack precipitations<sup>21</sup>. A similar inverse relationship between the PAG-to-ECN strength and patients' MMD was observed in our patients, although this correlation did not remain significant after adjusting for multiple comparisons.

The extended *decrease* of PAG connectivity in our MS+M patients appears different from the general *increase* of connectivity between the PAG and other regions<sup>5, 21</sup>. This might be explained by differences in the assessment and interpretation of the negative connectivity changes. Alternatively, one may hypothesize an influence of MS-related demyelination and/or degeneration,<sup>27</sup> but the extent and spatial distribution frequency of demyelinating plaques, and the brain volumes, were similar between MS-M and MS+M patients.

Our study is not without limitations. Our sample size was relatively small, a fact that led to a limited statistical power. Furthermore, we did not investigate whether the functional modifications detected in our patients were specific to the MS-related migraine condition, or share similarities with otherwise healthy migraineurs. Future investigations, including patients with MS-unrelated migraine and healthy subjects, are warranted to clarify this point. In line with the demographic characteristics of the population of MS patients, our study group included more females than males. Importantly, gender-related differences were demonstrated in the RS-FC patterns of several brain areas implicated in pain processing, including the anterior cingulate cortex, the insula, the parahippocampal gyrus, the midcingulate cortex, and the temporal pole [Coulombe, HBM 2016]. Whereas our RS-FC analyses were adjusted for gender as a covariate, future studies assessing the effect of gender are warranted to provide a specific framework of the circuitries underlying pain processing in male and female MS patients with migraine. Finally, we lack pain stimuli evoked data acquired right before, during and immediately after nociceptive stimulation, that may be useful to dynamically assess the causative relationships underlying the PAG connectivity variations.

In conclusion, we showed a breakdown of physiologically diverging patterns of PAG connectivity in MS patients with migraine, which were linked to symptoms severity and impact on daily life activities.

# DATA AVAILABILITY STATMENT

The raw data supporting the conclusions of this article will be made available by the authors, without undue reservation.

# **ETHICS STATEMENT**

The study involving human participants was reviewed and approved by ethics committee (Reference: CE 2843). The patients provided their written informed consent to participate in this study.

# AUTHOR CONTRIBUTIONS

All authors listed have made a substantial, direct and intellectual contribution to the work, and approved it for publication.

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**Table 1.** Main demographic, clinical and structural MRI characteristics in MS+Mand MS-M patients.

	MS+M	MS-M	Р
Ν	20	19	
Men/Women	3/17	3/16	0.27
Median Age (IQR)	39.8 (30-47.3)	43.2 (35-46.9)	0.59 <sup>#</sup>
Median EDSS (IQR)	2.5 (2-3)	2.5 (2-3)	0.77 <sup>#</sup>
Median MS DD (yrs) (IQR)	6.5 (2-9)	8.0 (4-12)	0.21 <sup>#</sup>
Median migraine DD (yrs) (IQR)	4.5 (2-17)	-	-
Frequencies of patients on DMT for MS (oral, injectable, infusion)	20 (30%; 45%; 25%)	19 (42%; 32%; 26%)	0.65*
Median HAM (IQR)	13 (7-18)	11 (3-17)	0.38 <sup>#</sup>
Media HDRS	8 (4-15)	10 (6-15)	0.36
Number of MMD (day /mo.) (IQR)	6 (3-8)	-	-
Median VAS-P (IQR)	7 (6-8)		
Median HIT-6 (IQR)	62 (57-68)	-	-
Median T <sub>2</sub> lesion volume ml (IQR)	3.3 (3.0-3.8)	3.1 (2.8-3.6)	0.66
Median NBV ml (IQR)	1514 (1421-1593)	1501 (1442-1551)	0.31 <sup>#</sup>
Median NWMV ml (IQR)	713 (663-762)	686 (672-716)	0.31#
Median NGMV ml (IQR)	799 (750-840)	802 (739-831)	0.96#

**Abbreviations:** MRI = Magnetic Resonance Imaging; MS+M = Multiple sclerosis

patients with migraine; MS-M =Multiple sclerosis patients without migraine; IQR =

Interquartile range; EDSS = Expand Disability Status Scale; DD = Disease duration; MMD = Monthly migraine days; VAS-P= Visual analogue scale; HIT-6 = Six-item headache impact; HAM-A = Hamilton anxiety symptoms; HDRS = Hamilton depression rating scale; NBV = Normalized brain volume; NWMV = Normalized white matter volume; NGMV = Normalized gray matter volume. <sup>\$</sup>Fisher's exact Test; \*Chi-square Test; <sup>#</sup>Mann-Whitney U Test. **Table 2**. Differences between MS+M and MS-M patients in the PAG connectivity organization. Areas with spatial overlap with principal brain intrinsic connectivity networks (ICNs)<sup>27</sup> were grouped together. Results are presented at P<0.05 cluster size, FDR-corrected for multiple comparisons.

		Deska	BA	Side	MNI coordinates			Peak-
	ICN	Peaks			X	У	Z	T value
MS+M < MS-M	-	Posterior caudal pons	-	L	-17	-39	-38	-3.53
	Executive Control	Middle frontal gyrus	6	L	-23	11	66	-3.52
		Middle frontal gyrus	6	R	41	7	58	-3.31
	-	Vermis	-	-	4	-61	-44	-3.38
	Basal Ganglia	Caudate head	-	L	-12	7	15	-2.73
		Thalamus	-	R	10	-24	10	-2.94
		Thalamus	-	L	-9	-13	-15	-3.27
	Default mode network	Precuneus	23	R	14	-48	16	-3.18
		Angular	39	R	45	-61	26	-3.02
		Medial prefrontal cortex	9	R	12	46	24	-2.96
		Angular	39	L	-46	-69	31	-2.95
MS+M > MS-M	Sensori- motor	Postcentral gyrus	1	L	-61	-18	40	4.37
		Postcentral gyrus	1	R	34	-29	66	3.71
	Higher visual	Inferior occipital gyrus	19	L	-46	-84	-7	3.59
		Middle occipital gyrus	19	R	46	-82	-2	3.35

**Abbreviations:** MS+M = Multiple sclerosis patients with migraine; MS-M = Multiple sclerosis patients without migraine, PAG = periaqueductal gray matter; ICNs = intrinsic connectivity networks; FDR = false discovery rate; RS-FC = resting state-functional connectivity; BA = Brodmann area; MNI = Montreal Neurological Institute.

	fROI	MMD	HIT-6	VAS-P
		rho (P)	rho (P)	rho (P)
	L-PoCP	0.56 (0.005)**	-0.29 (0.104)	-0.28 (0.111)
Pattern 1: Positive connectivity	Default mode network	0.54 (0.007)**	-0.29 (0.109)	-0.32 (0.085)
loss	Basal ganglia ICN	-0.27 (0.128)	0.38 (0.049)*	0.23 (0.166)
	Vermis	-0.24 (0.156)	-0.08 (0.366)	-0.06 (0.399)
Pattern 2:	Sensorimotor ICN	-0.46 (0.162)	0.54 (0.007)**	0.57 (0.005)**
Negative connectivity loss	High Visual ICN	0.014 (0.476)	-0.16 (0.253)	0.23 (0.160)
Pattern 3: Negative connectivity development	Executive Control ICN	-0.45 (0.023)*	0.12 (0.305)	0.25 (0.386)

**Table 3.** Correlations between PAG RS-FC with migraine clinical measures scores in MS+M patients.

**Abbreviations:** PAG = periaqueductal gray matter; RS-FC = resting state-functional connectivity; MS+M = Multiple sclerosis patients with migraine; fROI = functionally defined region-of-interest; MMD = Monthly migraine days; VAS-P= Visual analogue scale; VAS-P= Visual analogue scale; HIT-6 = Six-item headache impact; L-PoCP = Left Posterior caudal pons; ICN = intrinsic connectivity network.

\*Significant at P<0.05; \*\*Significant at P<0.05 after Bonferroni correction for multiple comparisons (three tests).

#### **Figure Legends**

**Figure 1** – The PAG RS-FC organization in MS-M (A) and MS+M (B) patients. Maps illustrate the areas with positive (hot colors clusters) and negative (cold colors clusters) correlation with the PAG, obtained using one-sample t-tests and set at the statistical threshold of P=0.05 after FDR correction. The PAG-positively connected brain areas represent the "pain modulatory network"<sup>8</sup>. Images are presented in radiological convention, overlaid on a standard ICBM-152 template for anatomical reference. Connectivity cluster labels are also provided (circles), and abbreviations are defined in the main text A<sub>1</sub> and B<sub>1</sub> illustrate exemplary time-courses of the spontaneous BOLD LFF extracted from the PAG seed, and from the areas exhibiting the strongest positive correlation (yellow) and negative correlation (blue) with the PAG, respectively in MS-M and MS+M. Negative-correlations are characterized by an out-of-phase time-course with respect to the PAG.

**Figure 2** – Effect of migraine on the PAG functional organization outside pain episodes, in patients with MS. In the upper panel, (A) and (B) show the areas where MS+M patients exhibited reductions and increases of PAG connectivity as compared to MS-M patients, respectively. In the lower panel, A1 and B1 provide white outlines of the clusters respectively shown in A and B, in comparison with the positive and negative PAG RS-FC of MS-M patients. Outlines are overlaid on the same MS-M and MS+M PAG connectivity maps of MS-M patients which were presented in Figure 1-A. In A1, connectivity reductions in MS+M patients (outlines in A1) corresponded to areas where MS-M patients were *positively* connected with the PAG, thus suggesting a loss of functional integration in MS+M. In contrast,

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connectivity increases in MS+M (outlines in B1) developed in areas where MS-M patients were *negatively* connected (underlying blue clusters), possibly suggesting a loss of functional segregation with respect to MS-M. Results are presented at the statistical threshold of P=0.05, FDR-corrected, in radiological convention, and overlaid on a standard MNI template for anatomical reference

**Figure 3** – Patterns of PAG RS-FC changes in MS+M patients. Three dissociable patterns of correlation changes emerged from the PAG-based connectivity analysis (see also Table 3): Pattern 1 includes regions with PAG *positive* connectivity loss (DMN, BGN, left PoCP and cerebellar Vermis); Pattern 2 includes regions with PAG *negative* correlation loss (SMN and HVN); Pattern 3 was characterized by loss of PAG *positive* and development of PAG *negative* connectivity (ECN). The yellow boxes show the RS-FC values distribution, for each region exhibiting significant differences with respect to MS-M (see also Figure 2).