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Functional connectivity studies in migraine: what have we learned?

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Abstract

Background: Resting-state functional connectivity (FC) MRI has widely been used to understand migraine pathophysiology and to identify an imaging marker of the disorder. Here, we review what we have learned from FC studies.

Methods: We performed a literature search on the PubMed website for original articles reporting data obtained from conventional resting-state FC recording in migraine patients compared with healthy controls or during and outside of migraine attacks in the same patients.

Results: We found 219 articles and included 28 in this review after screening for inclusion and exclusion criteria. Twenty-five studies compared migraine patients with healthy controls, whereas three studies investigated migraine patients during and outside of attacks. In the studies of interictal migraine more alterations of more than 20 FC networks (including amygdala, caudate nucleus, central executive, cerebellum, cuneus, dorsal attention network, default mode, executive control, fronto-parietal, hypothalamus, insula, neostriatum, nucleus accumbens, occipital lobe, periaqueductal grey, prefrontal cortex, salience, somatosensory cortex I, thalamus and visual) were reported. We found a poor level of reproducibility and no migraine specific pattern across these studies.

Conclusion: Based on the findings in the present review, it seems very difficult to extract knowledge of migraine pathophysiology or to identify a biomarker of migraine. There is an unmet need of guidelines for resting-state FC studies in migraine, which promote the use of homogenous terminology, public availability of protocol and the a priori hypothesis in line with for instance randomized clinical trial guidelines.

Keywords: Resting-state fMRI, Functional connectivity, Neuroimaging, Migraine, Headache

Introduction

Pathophysiology of migraine is complex and, so far, no biomarker for any of the phases of this cyclic disease exists. During the last decade, advanced neuroimaging modalities are increasingly used to understand migraine pathophysiology and disease mechanisms in the search for imaging markers of migraine. An often-used imaging technique is the resting-state or the so-called functional connectivity (FC) magnetic resonance imaging (fMRI), which has been applied in increasing number of migraine studies, since the first paper was published in 2011 [1]. Ideally, resting-state FC studies may be used to unveil migraine mechanisms.

The migraine resting-state literature is often analyzed and presented in several different ways, which makes it hard to compare results across studies, and findings are at times difficult to understand and are rarely reproduced. Thus, definitive imaging biomarkers for migraine have still not been identified limiting the usefulness and applicability of FC data.

Still, several well-performed resting-state FC studies and reviews [2] are available but a systematic review of the consistency of findings is missing. In the present
review, we wish to provide an overview of all published conventional resting-state FC studies and discuss what we have learned so far based on FC findings.

Methods

Literature search
Two authors (JMH and FMA) performed search on the PubMed.com website to identify all original articles with resting-state FC data in migraine patients. The literature search was finalized on Pubmed.com September 20th, 2018. We used the following search terms: #1 resting state fMRI and migraine, #2 functional connectivity and migraine, and #3 functional connectivity fMRI and migraine. The search was restricted to human studies published in English language within 10 years, up to September 20th, 2018. Reviews, pediatric studies, case-reports, all other headache diagnoses and letters were excluded. We also assessed reference lists of the found articles for additional relevant studies. Moreover, we excluded all studies that did not use conventional resting-state analysis but other modalities, e.g. functional connectivity density, Granger causality, amplitude of low-frequency fluctuations, and regional homogeneity. Articles, in which the method was not properly described or if data on the comparison to a non-headache control group was not available were also excluded (expect if migraine attacks were compared to an interictal phase). Finally, studies testing treatment effect were also excluded. These exclusion criteria were chosen to include comparable studies in this review.

Data extraction
To screen for inclusion and exclusion criteria, the senior authors (JMH and FMA) assessed all abstracts found in the initial search. The selected studies were then sent to the co-authors (KS, WSVH, DD, AP, AS, BMI, EB, IS, LDA, and LF) who then read the text and extracted further information, i.e. origin of study, study population, method and main findings.

Resting-state functional connectivity MRI
The imaging method is based on blood-oxygen-level dependent (BOLD) recordings of the resting brain (i.e. the person lying in the MRI scanner is relaxing with closed eyes, not sleeping). Every voxel in the obtained image of the brain emits a signal with a specific frequency. The higher the degree of synchronization of signal frequency between two different voxels, the more functional connected are these voxels, and vice versa. Brain areas displaying a particular level of similarity represent a functional connectivity network. Thus, all areas in the brain are more or less functionally connected to each other. The use of this method depends on the change in the functional connectivity between areas in a network, when measured in two different conditions or population samples.

Results
Our search strategy was finalized September 20th, 2018 and resulted in a total of 219 results, including 94 unique results, from which following were excluded: 15 reviews, 12 stimulation studies, nine non-conventional FC modalities, six examining effect of treatment (acupuncture), five non-migraine studies, five non-FC studies, four non-original articles, one pediatric study, and one study was retracted. Further eight studies were excluded because the method was not properly described or lack of a non-headache control group. One study was subsequently included from the reference lists. We ended up with a total of 28 studies, including 25 during the interictal phase (Table 1) and three during the ictal phase (Table 2) of migraine (Fig. 1). The studies were published between 2011 and 2017 and originated from five different countries, including China = 11; USA = 6; Italy = 6; Denmark = 4; Taiwan = 1.

Intercital migraine versus non-headache controls
Twenty-five published studies reported data comparing interictal migraine with non-migraine controls. In 12 studies a migraine without aura (MO) population was examined, while pure migraine with aura (MA) was only investigated in a single study. In four studies, data for both MA and MO groups were reported separately, whereas mixed results were reported in the remaining eight studies.

When comparing migraine patient to controls, the functional connectivity was changed within or with a number of different networks or seed areas: periaqueductal gray network [1, 23], left [3, 7] dorsal [5] and right [3, 25] anterior cingulate cortex, fronto-parietal-network [4], right occipital lobe [5], left medial [5] and bilateral [7] prefrontal cortex, right cerebellum [5], brainstem [5], bilateral central executive network [6, 20], left [16] salience network [6, 20], default mode network [6, 8, 14, 15, 20, 21], right thalamus [7], right [7] and anterior [9] insula, amygdala [9, 10, 24], bilateral caudate [11], right nucleus accumbens [11], hypothalamus [12], right executive control network [13], left dorsal attention network [16], right cuneus [16], visual network [17], marginal division of neostriatum [18], primary visual cortex [19], primary auditory cortex [19] and bilateral primary somatosensory cortex [26]. All areas with abnormal connectivity to the above-mentioned networks are shown in Table 1 and Additional file 1 and Fig. 2.

Ictal migraine versus non-headache controls
Three conventional resting-state FC studies (one MA and two MO) have been published during compared to outside of migraine attacks. Following networks or areas
Table 1 Functional connectivity MRI during the interictal phase of migraine compared with non-migraine controls

| Study                          | Population and method                                                                 | Findings                                                                                                                                 |
|--------------------------------|---------------------------------------------------------------------------------------|----------------------------------------------------------------------------------------------------------------------------------------|
| Mainero, 2011 Ann Neurol [1]   | 17 migraine (8 MA and 9 MO) patients were compared to 17 age- and sex-matched controls. Seed-based approach using FSL. Seeds were used for PAG. | Migraine versus controls: PAG: increased FC with right ventrolateral prefrontal cortex, right supramarginal gyrus, right anterior insula, right postcentral gyrus (S1), right thalamus, left angular gyrus, left supramarginal gyrus/parietal operculum (S2), and bilateral precentral gyrus (M1). Decreased FC with right dorsolateral prefrontal cortex, right lateral prefrontal cortex, right anterior cingulate, left dorsomedial prefrontal cortex, left medial prefrontal cortex, and left anterior insula. |
| Yuan K, 2012 PLoS One [3]      | 21 MO patients were compared to 21 age- and sex-matched controls. Seed-based approach using FSL. Seed were bilaterally placed in anterior cingulate cortex (ACC). | MO versus controls: Right ACC: increased FC with bilateral orbitofrontal cortex. Left ACC: increased FC with bilateral orbitofrontal cortex and right dorsolateral prefrontal cortex. |
| Russo A, 2012 Cephalalgia [4]  | 14 MO patients were compared to 14 age- and sex-matched controls. ICA-based approach using MATLAB to examine fronto-parietal network (FPN). | MO versus controls: FPN: decreased FC with right middle frontal gyrus and right dorsal ACC. |
| Jin C, 2012 NMR Biomed [5]     | 21 MO were compared with 21 age- and sex-matched controls. Seed-based approach using FSL. Seeds were used for left medial prefrontal cortex (PFC), left dorsal, right occipital lobe, cerebellum and brainstem. | MO versus controls: Dorsal ACC: increased FC of bilateral middle temporal lobe, orbitofrontal cortex, and left dorsolateral prefrontal cortex. Right occipital lobe: increased FC of left dorsolateral prefrontal cortex and right middle cingulate cortex. Left medial PFC: increased FC of bilateral dorsolateral prefrontal cortex. Right cerebellum: increased FC with the right medial PFC. Brainstem: no changes were detected. |
| Xue T, 2012 PLoS One [6]       | 23 MO patients were compared with 23 age- and sex-matched controls. ICA-based and seed-based approach using FSL. Seed were used for default mode network (DMN), central executive network (CEN) and salience network (SN). | MO versus controls: Right CEN: increased FC with right middle frontal gyrus and right anterior insula. Left CEN: increased FC with left inferior frontal gyrus. SN: decreased FC with right supplementary motor area. DMN: increased FC with right anterior insula. |
| Xue T, 2013 NMR Biomed [7]     | 18 MO patients were compared with 18 age- and sex-matched controls. Seed-based approach using MATLAB. Seeds were used for left ACC, right thalamus, bilateral PFC and right insula. | MO versus controls: Left ACC: increased FC with bilateral frontal lobe and left parietal lobe. Right thalamus: increased FC with bilateral caudate, left temporal lobe and right putamen. Left PFC: increased FC with bilateral parietal lobe and left temporal lobe. Right PFC: increased FC with right precuneus and bilateral parietal lobe. Right insula: increased FC with left temporal pole, right frontal lobe, and left parietal lobe. |
| Tessitore A, 2013 J Headache Pain [8] | 20 MO patients were compared with 20 age- and sex-matched controls. ICA-based approach using FSL to identify DMN among a total of 40 networks. | MO versus controls: DMN: decreased FC with left superior prefrontal gyrus and left temporal pole. |
| Schwedt TJ, 2013 Headache [9]  | 20 chronic migraine patients were compared with 20 controls. Seed-based approach using in-house developed software. Seeds were placed in ACC and bilaterally anterior insula and amygdala. | Chronic migraine versus controls: Anterior insula: atypical FC with pulvinar, middle temporal cortex, mediiodorsal thalamus, precuneus, PAG, cingulate cortex, and inferior parietal cortex. Amygdala: atypical FC with superior frontal cortex and occipital cortex. |
| Hadijkhani, 2013 Cephalalgia [10] | 22 migraine (11 MA and 11 MO) patients were compared to 20 healthy controls. Seed-based approach using FSL. Seeds were placed in right and left amygdala. | Migraine versus controls: Amygdala: increased FC with anterior insula, secondary somatosensory cortex (S2) and thalamus. |
| Yuan K, 2013 J Pain [11]       | 40 MO patients were compared to 40 age- and sex-matched controls. Seed-based approach using FSL. Seeds were used subregions of | MO versus controls: Right caudate: increased FC with left insula and left putamen. Left caudate: increased FC with bilateral hippocampal gyrus, left amygdala, left insula and left putamen. |
| Study                          | Population and method                                                                                                           | Findings                                                                                                                                                                                                 |
|-------------------------------|--------------------------------------------------------------------------------------------------------------------------------|--------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| Moulton EA, 2014 PLoS One    | 12 MO patients were compared with 12 age- and sex-matched controls. Seed-based approach using FSL. Seeds were used for hypothalamus. | MO versus controls<br>Hypothalamus: increased FC with right precentral gyrus, right middle frontal gyrus, left superior parietal gyrus/supramarginal gyrus, left inferior temporal gyrus, right planum polare, left temporal pole, left middle temporal gyrus, left parahippocampal gyrus, left superior temporal gyrus, bilateral hippocampus, left caudate, right nucleus coeruleus, bilateral pontine nuclei, left cerebellar crus I and II, bilateral cerebellar lobules V, right cerebellar lobules V and VI, left vermal lobules VIIIa and VIIIb and left dentate nucleus.<br>Decreased FC with right precentral gyrus, left frontal pole, left paracingulate gyrus, right superior frontal gyrus, right fusiform gyrus and left lingual gyrus. |
| Tessitore A, 2015 Headache    | 20 MA and 20 MO patients were compared to 20 age- and sex-matched controls. ICA-based approach using FSL to identify executive control network (ECN) among a total of 40 networks. | MA versus controls<br>Right ECN: Decreased FC with right middle frontal gyrus and dorsal ACC.                                                                                                                                 |
| Zhang J, 2016 J Headache Pain | 22 MO patients were compared with 22 healthy matched controls. ICA-based approach using MATLAB to identify DMN among a total of 20 networks. | MO versus controls<br>DMN: increased FC with left posterior cingulate cortex and left precuneus.                                                                                                                                 |
| Coppola G, 2016 J Headache    | 18 MO patients were compared to 19 healthy volunteers. ICA-based approach using MATLAB, where a total of 39 networks were identified. | MO versus controls<br>DMN: decreased FC with a network composed of the visuospatial system and medial visual cortical areas.                                                                                                                                 |
| Niddam DM, 2016 Cephalalgia   | 26 MA and 26 MO patients were compared with 26 age- and sex-matched controls. Seed-based approach using MATLAB. Seeds were used for DMN (posterior cingulate cortex), dorsal attention network (DAN) (middle frontal gyrus), SN (anterior insula) and right cuneus. | MO versus controls<br>Left DAN: increased FC with right orbital gyrus, left rectal gyrus, right fusiform gyrus, right middle temporal gyrus and right parahippocampal gyrus. Left SN: decreased FC with bilateral cuneus, left superior occipital gyrus, right lingual gyrus, left fusiform gyrus and left middle temporal gyrus. Right cuneus: increased FC with left cingulate gyrus, bilateral precuneus and bilateral posterior cingulate. Decreased FC with bilateral insula, bilateral middle frontal gyrus, bilateral claustrum, bilateral lentiform nucleus, right inferior frontal gyrus, bilateral cingulate gyrus and bilateral superior frontal gyrus. |
| Tedeschi G, 2016 Cephalalgia  | 20 MA and 20 MO patients were compared to 20 healthy controls. ICA-based approach using FSL to examine visual network (VN) among a total of 40 networks. | MA versus MO<br>VN: increased FC with right lingual gyrus.                                                                                                                                                                                                            |
| Chen Z, 2016 J Headache Pain  | 18 episodic migraine,16 chronic migraine and 44 medication overuse headache (MOH) + chronic migraine patients were compared to 32 normal controls. | MA versus MO<br>controls<br>VN: no changes were found.                                                                                                                                                                                                 |

Table 1: Functional connectivity MRI during the interictal phase of migraine compared with non-migraine controls (Continued)
### Table 1: Functional connectivity MRI during the interictal phase of migraine compared with non-migraine controls (Continued)

| Study | Population and method | Findings |
|-------|------------------------|----------|
| Hodkinson DJ, 2016 eNeuro [19] | 40 migraine patients were compared to 40 matched healthy controls. Seed-based approach using MATLAB. Seeds were used for networks of vision (V1), audition (primary auditory cortex) and somatosensation (S1). | Migraine versus controls V1: reduced anticorrelation to precuneus and decreased positive correlations to inferior occipital cortex/middle occipital cortex. Primary auditory cortex: reduced anticorrelation to PFC, dorsolateral PFC, precuneus, posterior cingulate cortex and lateral parietal cortex. Decreased positive correlations to insula, opercular cortex, posterior central sulcus and anterior temporal lobe. S1: No changes were found. |
| Androulakis M, 2017 Neurology [20] | 29 chronic migraine patients were compared to 29 age- and sex-matched controls. Seed-based approach using MATLAB. Seeds were used for SN, CEN and DMN. | Overall connectivity was decreased in all three networks in the chronic migraine group compared to controls. Changes were associated with moderate to severe headache and allodynia. |
| Lo Buono V, 2017 J Headache Pain [21] | 14 MA patients, 14 MO patients and 14 matched controls. ICA-based approach using FSL. DMN was examined. | MA versus MO DMN: Increased FC of bilateral central opercular cortex, right insular cortex, bilateral first and second Heschl’s gyrus, left superior temporal gyrus, bilateral lingual gyrus, right occipital fusiform gyrus, and left occipital pole. MO versus controls DMN: Increased FC of bilateral Heschl’s gyrus, bilateral planum temporale, and left superior temporal gyrus. |
| Hougaard A, 2017 Eur J Neurol [22] | 40 MA patients were compared to 40 age- and sex-matched controls. Seed-based and ICA-based approaches using FSL. Seeds were used for DMN, primary visual cortex, lateral geniculate nucleus, PAG, amygdala, inferior frontal gyrus, superior parietal lobule, in ferior parietal lobule, pars opercularis, visual area V2, V3A, V4 and V5. | Seed-based approach No difference was found in any examined network. ICA-based approach No changes were detected in 30 analysed networks. |
| Chen Z, 2017 J Headache Pain [23] | 18 episodic migraine patients (15 MO, 3 MA) were compared with 18 healthy controls. Seed-based approach using MATLAB. Seeds were used for PAG, incl. Bilateral ventrolateral PAG, lateral PAG, dorsolateral PAG, and dorsomedial PAG. | Episodic migraine versus controls Right ventrolateral PAG: decreased FC with left precentral gyrus. Left ventrolateral PAG: decreased FC with left precentral gyrus, left middle frontal gyrus, left inferior frontal gyrus, bilateral middle temporal gyrus, right superior frontal gyrus and right supplementary motor area. Left dorsolateral PAG: decreased FC with right pars triangularis of inferior frontal gyrus and the medial superior frontal gyrus. |
| Chen Z, 2017 J Headache Pain [24] | 18 episodic migraine and 16 chronic migraine patients were compared to 18 normal controls. Seed-based approach using MATLAB. Seed were bilaterally placed in amygdala. | Episodic migraine versus controls Left amygdala: increased FC with left middle cingulate gyrus and left precuneus. Right amygdala: no change. Chronic migraine versus controls Left amygdala: no change. Right amygdala: decreased FC with right inferior occipital lobe and right middle occipital lobe. Chronic versus episodic migraine Left amygdala: inferior temporal gyrus, right orbital part of superior frontal gyrus, left fusiform, right postcentral gyrus, left rectus, right amygdala and left precentral gyrus. Right amygdala: inferior temporal gyrus, left middle cingulate |
### Table 1: Functional connectivity MRI during the interictal phase of migraine compared with non-migraine controls (Continued)

| Study                          | Population and method                          | Findings                                                                 |
|--------------------------------|------------------------------------------------|--------------------------------------------------------------------------|
| Yu D, 2017 Mol Pain [25]       | 31 MO patients were compared with 31 age- and education-matched controls. | MO versus controls Right ACC: decreased FC with PFC and posterior cingulate cortex. Left PFC: decreased FC with left insula and posterior parietal cortex. No increased FC was found. |
| Zhang J, 2017 J Neurol [26]    | 30 MO patients were compared to 31 healthy controls. Seed-based approach using MATLAB. Seeds were bilaterally placed in primary somatosensory cortex (S1). |

**MA** Migraine with aura, **MO** Migraine without aura, **FSL** FMRIB Software Library, **FC** Functional connectivity, **ACC** Anterior cingulate cortex, **ICA** Independent component analysis, **CEN** Central executive network, **DAN** Dorsal attention network, **DMN** Default mode network, **ECN** Executive control network, **FPN** Fronto-parietal network, **PAG** Periaqueductal gray, **PFC** Prefrontal cortex, **SN** Salience network, **VN** Visual network, **MdNS** Marginal division of neostriatum

### Table 2: Functional connectivity MRI during and outside of the ictal phase of migraine

| Study                          | Population and method                          | Findings                                                                 |
|--------------------------------|------------------------------------------------|--------------------------------------------------------------------------|
| Amin FM, 2016 Neurology [27]   | 16 MO patients were scanned during and before drug provoked attack. Control group consisted of 15 MO patients who were scanned before and after a vasodilator drug which did not provoke migraine attacks. Seed-based approach using MATLAB. Seeds were used for SN, sensorimotor network (SMN) and DMN. | During versus before attack SN: increased FC of bilateral opercular part of inferior frontal gyrus. SMN: increased FC of right premotor cortex and decreased of left visual cortex. DMN: increased FC of left primary auditory, secondary somatosensory, premotor, and visual cortices. Control group No change was seen between before and after attack recordings. |
| Hougaard A, 2017 Hum Brain Mapp [28] | 16 MA patients were scanned during and outside of a natural provoked attack. Seed-based approach and ICA-based approaches using FSL. Seeds were bilaterally placed in cortical visual areas (primary visual cortex, V3, V4, V5), lateral geniculate nucleus, and pons. | Seed-based approach Attack versus non-attack condition Left pons: increased FC of left primary somatosensory cortex (corresponding to the head and face somatotopic areas). Moreover, increased FC of left superior parietal lobule. Aura-side V5: increased FC with lower middle frontal gyrus (flipped analysis). ICA-based approach No changes were detected in 56 analysed networks. |
| Amin FM, 2018 Cephalalgia [29] | 17 MO patients were scanned during and outside of a natural provoked attack. Seed-based approach using FSL. Seed were bilaterally placed in thalamus, pons, cerebellum crus I, and cerebellum lobule VI. | Attack versus non-attack condition Right thalamus: increased FC with left superior parietal lobule, left insular cortex, left primary motor cortex, left supplementary motor area and left orbitofrontal cortex. Moreover, decreased FC with right primary somatosensory cortex and right premotor cortex. No change in FC was detected for the remaining seeds. |
showed altered connectivity during the attack versus outside of the attack: salience network [27], somatosensory network [27], default mode network [27], left pons [28] and right thalamus [29]. All areas with abnormal connectivity to the above-mentioned networks and areas are shown in Table 2.

**Discussion**

Based on this first systematic review of isolated conventional FC studies in migraine, we report that several areas and networks throughout the brain, brainstem and cerebellum showed altered connectivity in interictal and ictal migraine studies.

The findings are very diverse, with change in FC in many area thought to relevant for migraine as well as several other areas. The fact that almost all published studies report changes to some degree in all areas studied makes it difficult to gather the results into a coherent model, of specific activation patterns of activation in migraine.

All included studies (Tables 1 and 2) shared many characteristics; they used a 3T MRI scanner, same type of patients (either MA or MO according to the International Classification of Headache Disorders criteria) and controls and in addition analyzed data using almost similar approaches (ICA or seed-based) in either the FSL or MATLAB-based software packages. Seed-based analysis can be affected by the chosen seed. Alterations in the default mode network (DMN) is most frequently reported. However, selection of different seed coordinates for DMN could potentially be the reason why FC changes in the DMN are different across studies. The strength of ICA is that it is independent of seed selection and more reproducible findings should be expected. The ICA-approach has been used in 10 studies and even in these studies different findings were reported.

Migraine is a heterogeneous disorder (with different disease duration, attack frequency, co-morbidity, effect of treatment, presence of aura), which might cause variation in results between studies. We did, however, only include studies where headache was diagnosed according to strict and uniform International Classification of Headache Disorders criteria.

In recent resting-state fMRI studies supplementary analyses like the Granger causality [30–32] have been introduced to investigate if FC changes can be linked to migraine phenotypes in the examined populations, but even here findings cannot be reproduced. As it is clear from Additional file 1 the findings are scattered and show very little overlap (Additional file 1). Moreover, none of the reported FC changes may be specific for migraine as other studies reported similar or exact same network changes in several other conditions, including fibromyalgia [33], Parkinsonian syndromes [34, 35].
altered consciousness states [36], systemic lupus [37] and chronic hepatitis C virus infection [38]. Thus, it can be suspected that this FC method is at all not reproducible, which may be due to lack of sensitivity and specificity. Furthermore, to the best of our knowledge no sample size or power calculation guidelines are available for resting-state FC, with the consequence that a meaningful sample size for a resting-state FC study remains unknown. To avoid spurious findings, it would be useful to consider either sharing of data or joining patients in multicenter studies to allow for better and more reproducible studies.

As is already the norm for clinical trials, FC studies should be based on publically available protocols. It is also noteworthy that since very few studies report “negative results” or no changes in FC, primary endpoints should be chosen before initiating studies, as is already the case for randomized clinical trials (RCT). The fact that few (if any) results are reproducible, strongly suggest that stricter methodological guidelines for FC studies are warranted.

Almost half of the presented studies included only MO patients which gives a total sum of 348 MO patients, where 120 MA patients can be calculated in our tables. The FC method may be useful for the study of specific sub-types of migraine if these are clearly selected beforehand, preferable based on a calculation of the necessary number of patients, and with a clear hypothesis to be tested.

The FC method is very versatile and may potentially help improve our understanding of underlying disease mechanisms and even define biomarkers or migraine. Based on this systematic review, we suggest that the current lack of uniform study design, a priori hypothesis and diverse analyses and terminology makes it difficult to apply the available data for a coherent understanding of migraine.

Conclusions
Imaging, including FC studies could potentially help improve our understanding of underlying disease mechanisms, but so far no reproducible biomarkers of migraine have been identified. Future FC studies should either pool existing data to extract information about sub-phenotypes of migraine patients or follow guidelines similar to RCT guidelines in case of design of new FC studies.

Supplementary information
Supplementary information accompanies this paper at https://doi.org/10.1186/s10194-019-1047-3.

Additional file 1: Table S2. Schematic overview of regions with an altered functional connectivity to the examined networks throughout 25 studies of interictal migraine patients compared with healthy controls

Abbreviations
ACC: Anterior cingulate cortex; CE: Central executive network; DAN: Dorsal attention network; DMN: Default mode network; ECN: Executive control network; FC: Functional connectivity; fMRI: Functional magnetic resonance imaging; FPN: Fronto-parietal cortex; FSL: FMRIB Software Library; ICA: Independent component analysis; MA: Migraine with aura; MdNS: Marginal division of neostriatum; MO: Migraine without aura; MOH: Medication overuse headache; PAG: Periaqueductal gray; PFC: Prefrontal cortex; RCT: Randomized clinical trials; S1: Primary
somatosensory cortex; SMN: Sensorimotor network; SN: Salience network; VN: Visual network

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Authors' contributions
All authors contributed equally. KS, WSvH, DD, AP, AS, BM, EB, IS, LDA, and LF are junior fellows, while SS, JMH and FMA are senior fellows of EHF-SAS. All authors contributed with data interpretation, drafting, revision of the manuscript and approved the final manuscript.

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Availability of data and materials
All included references in the present review article are available on the Internet.

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Not applicable.

Consent for publication
Not applicable.

Competing interests
KS has received personal fees, honoraria for lecturing or travel grants from TEVA, Novartis, Alder, Roche, and Allergan. SS has received personal fees, honoraria for lecturing or travel grants from Eli Lilly, TEVA, and Novartis. FMA has participated in advisory boards and/or received personal fees, honoraria for lecturing or travel grants from Eli Lilly, TEVA, and Novartis. All authors (WSvH, DD, AP, AS, BM, EB, IS, LDA, LF, and JMH) reports no competing interests.

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