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Recent advances in the noninvasive detection of high-frequency oscillations in the human brain

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Abstract: In recent decades, a significant body of evidence based on invasive clinical research has showed that high-frequency oscillations (HFOs) are a promising biomarker for localization of the seizure onset zone (SOZ), and therefore, have the potential to improve postsurgical outcomes in patients with epilepsy. Emerging clinical literature has demonstrated that HFOs can be recorded noninvasively using methods such as scalp electroencephalography (EEG) and magnetoencephalography (MEG). Not only are HFOs considered to be a useful biomarker of the SOZ, they also have the potential to gauge disease severity, monitor treatment, and evaluate prognostic outcomes. In this article, we review recent clinical research on noninvasively detected HFOs in the human brain, with a focus on epilepsy. Noninvasively detected scalp HFOs have been investigated in various types of epilepsy. HFOs have also been studied noninvasively in other pathologic brain disorders, such as migraine and autism. Herein, we discuss the challenges reported in noninvasive HFO studies, including the scarcity of MEG and high-density EEG equipment in clinical settings, low signal-to-noise ratio, lack of clinically approved automated detection methods, and the difficulty in differentiating between physiologic and pathologic HFOs. Additional studies on noninvasive recording methods for HFOs are needed, especially prospective multicenter studies. Further research is fundamental, and extensive work is needed before HFOs can routinely be assessed in clinical settings; however, the future appears promising.

Keywords: electroencephalography; high-frequency brain oscillations; magnetoencephalography; noninvasive.

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Introduction

High-frequency oscillations (HFOs) were first discovered and investigated using microelectrode arrays in the 1990s (Bragin et al. 1999b,c; Fisher et al. 1992; Huang and White 1989). In recent decades, there have been rapid advances in clinical research on HFOs. In 2006, Gotman and colleagues at the Montreal Neurological Institute published a milestone study in clinical HFO research, showing that HFOs could be recorded using ordinary clinical intracranial macroelectrodes (Jirsch et al. 2006). Following this breakthrough with macroelectrodes, rapidly growing numbers of studies on HFOs have been reported worldwide.

HFOs are defined as spontaneous brain activity that clearly stands out from the background signal that consist of at least four consecutive oscillations and frequencies >80 Hz (Frauscher et al. 2017; Jacobs et al. 2012; Zijlmans et al. 2017). HFOs have been subdivided into ripples (80–250 Hz), fast ripples (250–500 Hz), and very fast ripples (>500 Hz) (Bragin et al. 1999a; Brazdil et al. 2017; Usui et al. 2010; Usui et al. 2015). The majority of the current research on HFOs has used invasive intracranial electroencephalography (EEG), and only few prospective studies have been published (Hussain et al. 2016; Leung et al. 2018; Modur et al. 2011; Nevalainen et al. 2020; van 't Klooster et al. 2015). Evidence from these prospective studies suggests that fast ripple HFOs, in particular, are the primary biomarker of the seizure onset zone (SOZ). Many retrospective studies have corroborated that the resection of areas with high rates of HFOs is associated with favorable postsurgical outcomes (Fujiwara et al. 2016; Grinenko et al. 2018; Iimura et al. 2017; Leung et al. 2015; Liu et al. 2016; Pail et al. 2017). It has been reported that very fast ripples could be better predictors of epilepsy surgery outcomes than ripples or fast ripples; however, the fast ripples are detected only in a small percentage of patients (Brazdil et al. 2017; Usui et al. 2015). It has also been reported that disconnecting the high-frequency oscillation (HFO) networks could result in better seizure outcomes (Peng et al. 2018; van 't Klooster et al. 2017). It is important that HFOs are investigated using intracranial electroencephalography (EEG). However, this has limited the application of HFOs in patients with epilepsy, since intracranial EEG is an invasive procedure and in general, more expensive than scalp EEG.

Detection of HFOs using noninvasive scalp EEG and Magnetoencephalography (MEG) was another milestone in human HFO research, providing a new way to investigate this brain activity in larger populations. In 2004, ictal high frequency activities (up to 100 Hz) were first recorded using noninvasive scalp EEG in children with West syndrome experiencing epileptic spasms (Kobayashi et al. 2004). Similar findings were obtained for tonic seizure in Lennox-Gastaut syndrome (LGS) (Kobayashi et al. 2009). In 2010 and 2011, detection of interictal HFOs (ripple activity) was reported using scalp EEG in epileptic children and adults, respectively (Andrade-Valenca et al. 2011; Kobayashi et al. 2010). The first study that used MEG to detect HFOs in children with epilepsy was published in 2009 (Xiang et al. 2009). In the last 10 years, an increasing number of studies has been published on HFOs recorded using non-invasive methods. The clinical value of HFOs not only includes preoperative localization of epileptogenic regions, but also the assessment of disease severity, predicting seizures, evaluating treatment effects, and assessing epileptic susceptibility after brain injury. HFOs have been playing an increasingly important role in epilepsy, as well as in other disorders, such as migraine and autism. This article reviews the advances in noninvasive EEG and MEG research of HFOs in the human brain with an emphasis on pathologic HFOs in epilepsy. We also discuss the challenges in HFO research using non-invasive methods.

Noninvasive HFO recording in epilepsy

The ‘standard’ for noninvasive brain recordings depends on the desired temporal and spatial resolutions, as well as goal of recording (e.g. function or network mapping). EEG and MEG have high temporal resolutions. Functional magnetic resonance imaging (fMRI), with its low temporal resolution and high spatial resolution, has excellent utility in language/cognitive network mapping. Previously, it was commonly believed that HFOs could not be recorded using scalp EEG, owing to the thickness of the skull and the high electrical resistance that reduces intracranial electrical signal conduction. However, presently, it is generally accepted that HFOs can be recorded by scalp EEG provided the sampling rate is at least four times higher than the frequency band being analyzed (Worrell et al. 2008).

Most studies have reported only ripples, since the sampling rates (typically 512 Hz) used were insufficient for fast ripple detection. Only a few studies have reported the

recording of fast ripples (Bernardo et al. 2018; Pizzo et al. 2016). Studies have shown that HFOs recorded using scalp EEG originate from limited cortical regions (Cuello-Oderiz et al. 2017; Zelmann et al. 2014). Fast ripples may be generated from regions smaller than regions that generate ripples; thus, fast ripples are less likely to be recorded on scalp EEG (Ortiz et al. 2018). In the current literature, most studies on the evaluation of HFOs in epilepsy using scalp EEG have been conducted in children, with only a few conducted in adults. One mechanism that explains the noninvasive detection of scalp HFOs is that scalp HFOs may represent multiple, small generators activating asynchronously with temporal overlap (von Ellenrieder et al. 2016). The detection of scalp HFOs may also be possible because children have thinner skulls than adults (Wendel et al. 2010). Studies have shown that the rates of scalp HFOs were considerably higher in children with epilepsy than in adults; however, there was no difference in the rate of intracranial HFOs between children and adults (Kerber et al. 2013; Kobayashi et al. 2015).

It has been established that EEG is sensitive to both tangential and radial dipolar sources when recording electrical brain activity, whereas MEG is sensitive to only tangential dipolar sources when recording neuromagnetic signals (Ahlfors et al. 2010). As the skull, scalp, and brain tissue have no effect on the penetration of magnetic field lines, MEG can theoretically record neural activity without reduction of signal conduction. MEG has been reported to have a much better spatial resolution in HFO research than scalp EEG (Hedrich et al. 2017). A survey of recent publications revealed that noninvasive HFO studies in patients with epilepsy were much more focused on the interictal state than the ictal state (Thomschewski et al. 2019). It remains a long-established fact that HFOs show variations during ictal and interictal states. Ictal HFOs are distributed in smaller areas than interictal HFOs in epilepsy, and better outcomes are achieved after the resection of the epileptogenic regions associated with ictal HFOs (Liu et al. 2015; Modur et al. 2011; Usui et al. 2011). HFOs have been investigated noninvasively in different conditions involving epilepsy, including West syndrome, LGS, childhood absence epilepsy (CAE), benign childhood epilepsy with centrotemporal spikes (BECTS), myoclonic epilepsy, Panayiotopoulos syndrome (PS), continuous spike-waves during slow-wave sleep (CSWS), insular epilepsy and tuberous sclerosis complex (TSC)

(Frauscher et al. 2017; Thomschewski et al. 2019). In the next sections, we present detailed findings of noninvasive HFOs obtained during ictal (See Table 1 and Table 2) and interictal states (see Tables 3 and 4).

Noninvasive recording of ictal HFOs in epilepsy

Noninvasive recording of ictal HFOs in refractory epilepsy syndrome

Noninvasive recording of ictal HFOs was reported in two kinds of refractory epilepsy syndrome. Among related studies, most focused on West syndrome, and one was about LGS. As early as in 2004, Kobayashi et al. investigated high frequency activities (HFA) (frequency >80 Hz) during the ictal state of epileptic spasms in West syndrome (Kobayashi et al. 2004). In 2016, they also reported ictal fast oscillations (FOs) (40–150 Hz) during spasms which were associated with positive slow waves (Kobayashi et al.

Table 1: Ictal HFOs with scalp EEG recordings in epilepsy.

Reference	Subjects	Value of HFOs/Findings
Kobayashi et al. 2004	11 patients with West syndrome, 3 months to 4 years	Scalp ictal high frequencies (up to 100 Hz) correlation with the pathophysiology of spasms
Kobayashi et al. 2009	20 patients with LGS, 3–29 years	Scalp high frequencies in some ictal tonic seizures indicating a common generative mechanisms with epileptic spasms
Iwatani et al. 2012	4 patients with symptomatic West syndrome, 9–14 months	Scalp HFOs of source location consistent with neuroimaging findings of cortical lesions in symptomatic West syndrome
Chaitanya et al. 2015	8 children with CAE, 1 child with JAE, 6–10 years	The percentage of HFOs was higher in ictal generalized spike-wave discharges compared to interictal generalized spike-wave discharges
Kobayashi et al. 2016	11 infants with west syndrome, 3–9 months	Ictal FOs related with the generation of epileptic spasms
Kobayashi et al. 2018	21 patients with myoclonic epilepsy, 5 months to 17 years	Ictal fast oscillations (FOs) representing partially the cortical pathophysiological process of myoclonic seizures
Ikemoto et al. 2020	5 patients with ASE, 26 with CAE, 15 with JAE, 5–11 years	Higher and frontal dominant ictal ripples helping to develop novel therapy methods for ASE
Murai et al. 2020	One patient with focal epilepsy, 77 years	Ictal HFOs after ictal DC shifts deriving from the acute focus of acute symptomatic seizures

Table 2: Ictal HFOs with MEG recordings in epilepsy.

Reference	Subjects	Value of HFOs/Findings
Xiang et al. 2010	4 patients with focal epilepsy, 6–26 years	Ictal MEG HFOs localizing the SOZ
Miao et al. 2014	10 children with CAE, 5–11 years	Ictal MEG HFOs localizing the SOZ in CAE
Tenney et al. 2014	12 children with CAE, 6–12 years	Ictal MEG HFOs within the frontal cortical region involved in the networks to generating absence seizures
Tang et al. 2016	12 children with CAE, 5–12 years	Ictal MEG HFOs correlating with seizure severity in CAE
Velmurugan et al. 2018	67 patients with drug-resistant focal epilepsy, 3–44 years	Ictal scalp HFOs able to localize the SOZ
Jiang et al. 2019	15 children with CAE, 5–11 years	The high-frequency-dependent neural network is involved to the neural network dynamics for absence seizure termination in CAE
Shi et al. 2019	25 children with CAE, 5–14 years	Ictal MEG functional network at ripple band as a biomarker of epileptic network in CAE

2016). These findings might suggest that neuronal firing related to FOs is relevant to the generation of epileptic spasms in West syndrome (Kobayashi et al. 2016). Although these two studies by Kobayashi et al. did not specifically study HFOs, brain activities higher than 80 Hz were evaluated. Iwatani et al. (2012) recorded HFOs by scalp EEG at spasm onset and concluded that the spatial source location of scalp ictal HFOs was consistent with the cortical lesions detected on neuroimaging in children with symptomatic West syndrome (Iwatani et al. 2012). Frequencies higher than 80 Hz was also investigated in another study by Kobayashi et al. which showed frequencies ranging from 43 to 101.6 Hz on ictal onset of tonic seizures in children with LGS (Kobayashi et al. 2009). Patients with West syndrome are mostly infants, whose skull bones are thinner, facilitating the recording of scalp HFOs. Spasm onset in West syndrome usually occurs in clusters; thus, ictal data are easily obtained. West syndrome may therefore be the ideal epilepsy syndrome for research on noninvasive detection of ictal HFOs.

Noninvasive recording of ictal HFOs in generalized epilepsy

Noninvasive recording of ictal HFOs was reported in generalized seizures, including childhood absence

Table 3: Interictal HFOs with scalp EEG recordings in epilepsy.

Reference	Subjects	Value of HFOs/findings
Kobayashi et al. 2010	10 children with CSWS, 6–9 years	HFOs co-occurred with spikes
Andrade-Valenca et al. 2011	15 patients with focal epilepsy, 19–63 years	HFOs co-occurred with spikes SOZ localization accuracy for ripples 81%;
Kobayashi et al. 2011	45 BECTS and PS, 2–9 years	Pipple co-occurred with spikes
Melani et al. 2013	32 patients with focal epilepsy, 22–68 years	Ripple co-occurred with spikes, SOZ identification
Fahoum et al. 2014	22 patients with focal epilepsy, 18–43 years	Greater thalamic BOLD changes with high HFO rates
Lu et al. 2014	22 patients with focal epilepsy, 25–53 years	HFA association with SOZ
Zelmann et al. 2014	11 epilepsy patients with FCD, 17–52 years	SOZ identification
Chaitanya et al. 2015	9 children with childhood/juvenile absence epilepsy, 6–10 years	HFOs co-occurred with spike-waves
Kobayashi et al. 2015	17 patients with West-syndrome, 3–9 months	Adrenocorticotrophic hormones response monitoring
Toda et al. 2015	6 infants with early epileptic encephalopathy, 0–17 weeks	HFOs co-occurred with epileptic bursts during suppression-burst patterns
Papadelis et al. 2016	2 patients with epilepsy with encephalomalacia, 11–15 years	SOZ identification
Pizzo et al. 2016	17 patients with genetic generalized and focal epilepsy, 21–60 years	Concordance ripple with clinical lateralization, differential diagnosis
Pizzo et al., 2016	10 patients with focal epilepsy, 21–59 years	Association with SOZ
Qian et al. 2016	14 children with childhood epilepsy with centrotemporal spikes, 4–11 years	Methylprednisolone response monitoring, ripple rates confirmed atypical forms;
van Klink et al. 2016a	31 patients with focal and multifocal epilepsy, 18–76 years	Ripples preceded epileptic spikes
van Klink et al. 2016b	22 patients with CSWS, 3–15 years	Seizure prediction, differentiation of atypical and typical
von Ellenrieder et al. 2016	17 patients with focal epilepsy, 19–68 years	Localization association with clinical data (65% sensitivity)
Cuello-Oderiz et al. 2017	58 patients with lesional epilepsy, 18–71 years	Compared superficial to deep lesions, HFO rates higher
Mooij et al. 2017	23 patients with different types of epilepsy, 11 months to 14 years	Comparison with controls
Gong et al. 2018	21 patients with CSWS, 4–13 years	Concordance with lesions, methylprednisolone response monitoring

Table 3: (continued)

Reference	Subjects	Value of HFOs/findings
van Klink et al. 2018	9 patients with focal epilepsy, 3–42 years	Localization concordance with clinical data (sensitivity: 55.4%, specificity: 72.2%)
Bernardo et al. 2018	11 children with TSC and healthy controls, 2 months to 5 years	Occurrence rates comparing patients with controls
Ikemoto et al. 2018	25 patients with BECTS, 2–9 years	Ripples rates and HFA identified atypical forms
Kuhnke et al. 2018	13 patients with epilepsies of different etiologies, 8–52 years	HD EEG showing higher ripple rates and better concordance with SOZ
Mooij et al. 2018	23 patients with different types of epilepsy, 11 months to 8 years	HFOs co-occurred with sleep specific transients and HFOs rates during sleep
Boran et al. 2019	11 children with drug-resistant focal epilepsy, 1–17 years	Scalp HFOs mirroring seizure frequency and disease severity in epilepsy
Cao et al. 2019	22 children with CSWS, 6 years 9 months to 11 years 2 months	Scalp HFOs as a biomarker of drug treatment response in CSWS
Dirodi et al. 2019	6 children with medically refractory epilepsy, 5.4–16.2 years	Scalp HFOs-on-spikes to be epileptogenic marker
Insola et al. 2019	3 patients with EPC and 2 patients with rolandic lesions without EPC (non-EPC), 47–81 years	Suppression of HF-SEP on scalp EEG helping understand the pathophysiological mechanism of EPC
Kramer et al. 2019	21 children with BECTS, 4.9–14.9 years	Scalp ripples-on-spikes as a predictor for seizure risk in BECTS
Kuhnke et al. 2019	24 children with focal epilepsy(15 of them also with generalized tonic clonic seizure), 14–63 years	Scalp HFOs assessing seizure outcome after surgery
Ohuchi et al. 2019	10 with idiopathic CSWS, 4 with non-idiopathic CSWS, 19 with BECTS, 16 with PS, 23 with other types of focal epilepsies, 22 with focal spikes in EEG without clinical seizures total 94 children, 1.3–12.2 years.	The high density of scalp ripples per spike in CSWS close relation to the pathophysiology of the epileptic encephalopathy
Toole et al. 2019	9 patients with epilepsy	Scalp HFOs recorded by tEEG localizing SOZ
van Klink et al. 2019	30 patients with drug resistant focal epilepsy, 8–54 years.	Scalp HFOs as a biomarker of epileptogenicity
Ferrari-Marinho et al. 2020	15 comatose patients with periodic discharges in the EEG, 23–106 years	Scalp HFOs in comatose patients as a biomarker for the epilepsy risk subsequently developed

Table 3: (continued)

Reference	Subjects	Value of HFOs/findings
Tamila et al. 2020	Patients with refractory epilepsy, 1.8–17.8 years.	Scalp ripples as a prognostic biomarker for epilepsy surgery
Zhang et al. 2020	61 patients with BECTS, 7–17 years.	Scalp HFOs as a biomarker for cognitive impairment

seizures and juvenile absence seizures. Scalp HFOs (80–250 Hz) recorded by EEG were first studied in patients with absence epilepsy in 2015 (Chaitanya et al. 2015). Chaitanya et al. found that the percentage of ictal HFOs was higher in ictal generalized spike-wave discharges (GSWD) than in interictal GSWD (Chaitanya et al. 2015). Recently, Ikemoto et al. reported the features of HFA with ripple bands during ictal absence seizures in absence status epilepticus (ASE), CAE and juvenile absence epilepsy (JAE) (Ikemoto et al. 2020). This scalp EEG study concluded that ASE patients presented ictal ripples with higher power and frontal dominance compared to CAE and JAE patients, which could help in developing a novel treatment method for ASE (Ikemoto et al. 2020). Using scalp EEG, Kobayashi et al. also studied ictal FOs during myoclonic seizures involving high frequencies (>80 Hz) (Kobayashi et al. 2018). This study suggested that the occurrence of myoclonic seizures was related with FOs, which partially represented the cortical pathophysiological process during myoclonus (Kobayashi et al. 2018).

Besides the analysis of ictal HFOs on scalp EEG, ictal HFOs recorded by MEG have also been investigated. Miao et al. studied ictal HFOs ranging from 80 to 500 Hz to locate seizure onset zones in CAE using MEG (Miao et al. 2014). The results suggested that seizure frequency was positively related to the rate of fast ripples and that compared to spikes, HFOs were focally localized in the medial prefrontal cortex (Miao et al. 2014). Tang et al. reported that ictal HFOs in the 200–1000 Hz range were significantly correlated with the number of daily seizures in CAE, which suggested that the HFOs could mirror the severity of absence seizures (Tang et al. 2016). A study by Tenney et al. on the networks generating absence seizures showed the presence of HFOs in the frontal cortical region in the ictal state (Tenney et al. 2014). Jiang et al. have identified the frequency-dependent neural network dynamics during the termination of absence seizures, with the results suggesting that the neural network dynamics at HFO bands for the termination of absence seizures in CAE involved both the cortices and the thalamus (Jiang et al. 2019). Recently, Shi et al.

Table 4: Interictal HFOs with MEG recordings in epilepsy.

Reference	Subjects	Value of HFOs/findings
Guggisberg et al. 2008	27 patients with focal epilepsy, 17–67 years	HFA location and post-surgical outcome prediction
Xiang et al. 2009	30 patients with lesional epilepsy, 6–17 years	Identification of SOZ
Rampp et al. 2010	6 patients with focal epilepsy, 20–50 years	Identification of SOZ
Xiang et al. 2010	4 patients with focal epilepsy, 6–26 years	Identification of SOZ
Xiang et al. 2015	10 patients with childhood absence epilepsy, 6–10 years	Proof-of-principle; comparison with controls
Nissen et al. 2016	12 patients with focal epilepsy, 6–29 years	Correlation between HFOs and spike sources
Papadelis et al. 2016	2 patients with epilepsy with encephalomalacia, 11–15 years	Identification of SOZ
Tang et al. 2016	12 patients with childhood absence epilepsy, 5–12 years	Correlations of HFO source strength with seizure severity
van Klink et al. 2016	12 patients with focal epilepsy, 6–29 years	Identification of irritative hemisphere
von Ellenrieder et al. 2016	17 patients with focal epilepsy, 19–68 years	Localization concordance with clinical data (47% sensitivity)
Migliorelli et al. 2017	9 patients with focal epilepsy, 6–22 years	SOZ identification with 79% precision
van Klink et al. 2017	25 patients with focal epilepsy, 4–29 years	Localization concordance with resection area in 6/8 patients
van Klink 2018	30 patients with focal epilepsy, 8–54 years	Localization concordance with clinical data or resected area with 79% precision
Dirodi et al. 2019	6 children with medically refractory epilepsy, 5.4–16.2 years	Scalp HFOs-on-spikes to be epileptogenic marker
Jiang et al. 2019	15 children with CAE, 5y–11y	Alteration of effective connectivity at both ripple and fast ripple bands as a biomarker for epilepsy networks in CAE
Meng 2019	20 epileptic patients (5 with CAE, 8 with TLE, 4 with FLE, 3 with epilepsy type not reported), 7–17 years	Alteration of scalp HFO networks as a biomarker for epilepsy networks
van Klink et al. 2019	30 patients with drug resistant focal epilepsy, 8–54 years	Scalp HFOs as a biomarker of epileptogenicity
Velmurugan et al. 2019	52 patients with medically refractory epilepsy (25 with mesial temporal lobe epilepsy and 27 with focal neocortical epilepsy), 10–43 years	Scalp HFOs enhancing presurgical SOZ location and postsurgical outcome prediction in medically refractory epilepsy

Table 4: (continued)

Reference	Subjects	Value of HFOs/findings
Yin et al. 2019	21 patients with drug-resistant insular epilepsy, 12–47 years	Scalp ripples on spikes locating SOZ in insular epilepsy
Tamila et al. 2020	Patients with refractory epilepsy, 1.8–17.8 years	Scalp ripples as a prognostic biomarker for epilepsy surgery
Yin et al. 2020	22 patients with refractory insular epilepsy, 12–47 years	Pathologic scalp HFO networks as a new biomarker for epilepsy networks in insular epilepsy

observed that ictal ripples were mainly located in the medial frontal cortex in absence epilepsy, and the ictal MEG functional network at a frequency of 80–250 Hz was found to be an enhanced connection of the posterior cingulate cortex/precuneus with the frontal cortex (predominantly) (Shi et al. 2019).

Absence epilepsy could be considered a proper generalized epilepsy for the noninvasive detection of ictal HFOs. Compared to other seizure types (such as tonic-clonic seizures), absence seizures may produce few artifacts during scalp EEG or MEG in ictal states. For MEG recordings, the ictal data of absence seizures are relatively easy to obtain because absence seizures usually have frequent onsets.

Noninvasive recording of ictal HFOs in focal epilepsy

Recently, Murai et al. reported for the first time that focal ictal direct current (DC) shifts and ictal HFOs after ictal DC shifts can be recorded together via scalp EEG at a sampling frequency of 500 Hz, even with a time constant of 2 s, as seen in their case report of a 77-year-old patient with focal epilepsy (Murai et al. 2020). As early as in 2010, data from four patients who experienced focal seizures during routine MEG tests were retrospectively studied by Jing et al. (Xiang et al. 2010). Ictal HFA recorded by MEG were consistent with the results of semiology and neuroimaging in all four patients, which may suggest the potential role of HFA in the noninvasive localization of the SOZ (Xiang et al. 2010). Recently, Velmurugan et al. have reported the recording of ictal MEG HFOs (80–200 Hz) in drug-resistant focal epilepsy patients; they were able to localize the SOZ with ictal HFOs, with a high sampling frequency and the use of other modalities (Velmurugan et al. 2018).

In general, ictal HFOs show stronger specificity for the SOZ than interictal HFOs. Many studies have proved that

favorable and improved surgical outcomes are associated with surgical plans based on ictal HFO findings recorded by invasive EEG (Fujiwara et al. 2012; Leung et al. 2018; Modur et al. 2011; Nariai et al. 2011; Ramachandran et al. 2008; Zijlmans et al. 2012). Liu et al. studied 13 patients with clinically suspected bitemporal epilepsy, by monitoring interictal and ictal HFOs using invasive EEG (Liu et al., 2016). The findings showed that ictal HFOs pointed toward the lateralization of the SOZ, whereas conventional EEG and brain magnetic resonance imaging (MRI) failed to do so (Liu et al., 2016). Ictal HFOs and interictal HFOs were compared in a study by Zijlmans et al., and the findings showed that ictal HFOs may have more specificity for seizure onset zones (SOZs) than interictal HFOs, despite their similar locations (Zijlmans et al. 2011). However, it may be difficult to analyze HFOs using scalp EEG or MEG owing to the increase in artifacts during the ictal state, compared to that during the interictal state. Moreover, it is not easy to ensure patient availability for continuous MEG recording so as to obtain ictal data. For the above-mentioned reasons, compared to those on interictal HFOs, studies on the noninvasive detection of ictal HFOs in other epilepsy types (except for CAE and West syndrome) have been few.

Noninvasive recording of interictal HFOs in epilepsy

There are more studies on noninvasive interictal HFOs than on ictal HFOs. The studies on noninvasive interictal HFOs published before 2019 were described in a comprehensive review by Thomschewski et al. (Thomschewski et al. 2019). It has been reported that scalp interictal HFOs could reflect epileptogenesis, predict seizure activity, sensitively monitor the response to pharmacological treatment with methylprednisolone in CSWS and with adrenocorticotropic hormones in West syndrome, and could be associated with pathological brain networks; they could also be used to assess epileptogenic seizure risk post-brain injury (Thomschewski et al. 2019). Here, we describe the literature published on this topic since 2019.

Value of scalp interictal HFOs in locating the SOZ and predicting surgical outcomes

Kramer et al. studied 21 children with BECTS using HD-EEG with a 70-channel EEG cap at a sampling frequency of 2035 Hz (Kramer et al., 2019). The findings showed scalp interictal ripples-on-spikes as a biomarker of epileptogenicity, and interictal ripples-on-spikes outperformed

spikes without ripples (Kramer et al. 2019). Scalp interictal HFOs are also very valuable in drug-resistant epilepsy. In a recent MEG study on insular epilepsy, Yin et al. reported that interictal ripples-on-spikes were valuable in locating the SOZ (Yin et al. 2019). Velmurugan et al. studied other medically refractory epilepsies (mesial temporal lobe epilepsy and focal neocortical epilepsy) and found that interictal MEG HFOs were useful as biomarkers not only for presurgical evaluation but also in the prediction of surgical outcomes (Velmurugan et al. 2019). By combining HD-EEG with simultaneous MEG recordings, scalp interictal HFOs have been considered as a noninvasive biomarker for the SOZ (Dirodi et al. 2019; van Klink et al. 2019). Tamilya et al. studied 20 children with refractory epilepsy using simultaneous HD-EEG and MEG recordings and demonstrated the value of scalp interictal HFOs in predicting the surgical outcome (Tamilya et al. 2020). Kuhnke et al. reported that scalp interictal HFOs combined with simultaneous intracranial recordings could easily identify children with poor surgical outcomes (Kuhnke et al. 2019).

Value of scalp interictal HFOs in characterizing brain networks

Currently, research on brain networks with regard to HFOs is a hot topic. Brain network alterations in the high frequency (80–1000 Hz) range recorded by MEG have been reported in 20 children with epilepsy (Meng, 2019). In a MEG study, Jiang et al. reported that the medial frontal cortex and deep brain areas were the sources of HFOs during interictal periods in CAE (Jiang et al. 2019). The effective connectivity from cortical regions to the thalamus has been strengthened at both ripple and fast ripple bands. In a MEG study by Yin et al., the interictal HFO-based effective connectivity networks were found to be altered in patients with insular epilepsy (Yin et al. 2020). Promisingly, abnormal HFO networks will likely become a new biomarker for epilepsy networks.

Other applications of scalp interictal HFOs

Zhang et al. studied 61 patients with BECTS and found that scalp interictal HFOs were more indicative of cognitive deficits than other abnormal EEG discharges (Zhang et al. 2020). Ohuchi et al. reported for the first time that the high density of ripples per spike in CSWS could be closely related to the pathophysiology of epileptic encephalopathy (Ohuchi et al. 2019). Cao et al., in a study of 22 children with CSWS, showed that scalp HFOs were an indicator of treatment response (Cao et al. 2019). Boran et al. studied 11 children with drug-resistant focal epilepsy and observed that scalp HFOs could reflect

seizure frequency and disease severity (Boran et al. 2019). Besides spontaneous HFOs, evoked HFOs have also been reported in EPC recently (Insola et al., 2019). Through scalp EEG recordings, Insola et al. found that significant suppression of high-frequency somatosensory-evoked potentials (HF-SEP) was helpful in understanding the pathophysiological mechanism of EPC (Insola et al. 2019). Evaluation of HFOs has also been used in comatose patients with periodic epileptic discharges in intensive care units (Ferrari-Marinho et al. 2020). Ferrari-Marinho et al. reported that scalp interictal HFOs indicated a latent brain structural lesion and could be a biomarker for the risk of subsequent development of epilepsy (Ferrari-Marinho et al. 2020).

Noninvasive recording of HFOs in other pathologic conditions

Besides epilepsy, HFOs have also been investigated in other diseases and disorders. In 2013, an MEG study in individuals with acute migraine headaches reported a task-elicited alteration of cortical activation (Xiang et al. 2013b). Patients with migraine showed increased spectral power in the 100–200 Hz range during ictal states (headache phases), but not during interictal states (pain free intervals). These findings may be important for developing new therapeutic interventions for migraine in the future (Xiang et al., 2013b).

Differences in cortical activation have been compared between ictal and interictal states in children and adolescents with migraine using low-to-high-frequency MEG signals. The results show that the source power of ictal HFOs (65–150 Hz) was significantly higher than that of the controls, whereas the source power of interictal HFOs was significantly lower than that of controls. These results suggest that the noninvasive assessment of cortical abnormality in migraine with MEG is feasible, and that novel therapeutic strategies for childhood migraine can be developed to focus on maintaining balanced cortical excitability (Xiang et al. 2013a). In 2016, a study reported quantitative neuromagnetic signatures of aberrant cortical excitability elicited by a finger tapping task in pediatric chronic migraine. The chronic migraine group showed increased spectral power between 100–200 Hz and 2200–2800 Hz, suggesting that chronic migraines may be associated with elevated cortical excitability and aberrant activation from deep brain areas (Leiken et al. 2016). The spatial heterogeneity of cortical excitability during an auditory-motor task in adolescents with migraine has also been investigated using MEG recordings (5–1000 Hz) at

both sensor and source levels. This study showed that high-frequency neuromagnetic signals were indicative of heterogeneous cortical activation in patients with migraine subjects as compared with controls. The degree of neuromagnetic heterogeneity of cortical activation was significantly correlated with headache frequency. These findings may be crucial for developing spatially-targeted strategies to normalize cortical excitability and treat migraine (Xiang et al. 2016b). These four migraine HFO studies by Xiang et al. are related to task states; therefore, future noninvasive research on resting state HFOs in migraine is needed.

In autism spectrum disorder (ASD), HFO localization of aberrant brain activity has been measured using wavelet and beamforming MEG methods. The results showed that patients with ASD generally had HFA (90–2884 Hz) in the frontal cortex and the source power of HFA (200–1000 Hz) in the frontal cortex in ASD was significantly higher than in controls. These findings suggest that elevation of intrinsic HFA in the frontal cortex may play a key role in ASD (Xiang et al. 2016a).

Recently, an MEG study reported an association between HFA in the visual cortex and emerging psychosis. This was the first comprehensive investigation into the oscillatory signatures during different stages of early psychosis. HFA is impaired in the visual cortex during emerging psychosis and may be linked to behavioral and clinical impairments. These findings suggest that MEG-aided measurement of neural oscillations could be used as a biomarker for clinical staging of emerging psychosis (Grent-'t-Jong et al. 2020). However, this study used limited frequencies, up to 90 Hz; thus, future HFO studies on psychosis should include higher frequencies (>90 Hz).

HFOs have also been evaluated in patients with Parkinson's disease (PD). High-frequency cortico-basal ganglia oscillations have been investigated using implanted EEG electrodes (Hirschmann et al. 2017; Petersson et al. 2019). The findings showed that HFOs in the limbic circuits are associated with psychotic-like states; this observation provides an exciting new approach for evaluating new antipsychotic treatments. To date, no study has non-invasively assessed HFOs in PD.

Challenges in noninvasive HFO research

Source scarcity in MEG, high density EEG (HD-EEG), and tripolar EEG (tEEG)

When recording HFOs, it is necessary to consider the appropriate temporal and spatial sampling of signals. In

general, there are three methods for noninvasive recording of HFOs: MEG, HD EEG, and tripolar EEG (tEEG). MEG has excellent spatial and temporal resolutions and is less affected by the skull and scalp, which makes it ideal for noninvasive HFO research. MEG is commonly considered as an add-on to basic diagnostic approaches, such as video EEG and MRI, and is mostly used to localize epileptic activities.

Compared to EEG, MEG has better performance in localizing epileptic regions (Velmurugan et al. 2018); however, traditional MEG is costly, and thus, have limited availability. A European survey published in 2016 found that MEG is performed in only 7 out of 25 epilepsy surgery centers (Mouthaan et al. 2016). In recent years, technological innovations in MEG have been ongoing. New MEG systems with optically pumped magnetometers (OPMs) are currently of great interest in research (Boto et al., 2019). These MEG sensors do not require cooling with liquid helium as traditional MEG systems do, which makes using these new MEG systems much less costly. OPMs is less affected by the head movement compared to conventional MEG, and can be worn more conveniently because of the sensors' positions on the scalp (Boto et al. 2019). Although OPMs is not yet used clinically, there have been some recent studies using OPMs in several areas (Barry et al. 2019; Borna et al. 2020; Boto et al. 2019; Elzenheimer et al. 2020; Hill et al. 2020; Iivanainen et al. 2020; Lin et al. 2019; Nardelli et al. 2019). OPMs has not yet been used in HFO research, but this is a very promising future application of this technology. Accordingly, we believe that introducing MEG into hospitals should be a priority to accelerate its use in noninvasive clinical HFO research.

It is commonly accepted that scalp EEG can record HFOs as long as the EEG electrodes are positioned correctly and the signal has a sufficient signal-to-noise ratio (SNR) (Zelmann et al. 2014; Zijlmans et al. 2017). It has been suggested the low rate of HFO detection on the conventional 10–20 electrode EEG system could be due to insufficient spatial sampling. The HD EEG system has a high sensor density, much like MEG. The denser mesh of electrodes is considered to be more sensitive to HFOs and local propagation patterns than conventional EEG (Besio et al. 2014; Menendez de la Prida and Trevelyan, 2011; Zelmann et al. 2014). Furthermore, HD EEG and MEG have better spatial resolution than conventional EEG and are capable of filtering spatial artifacts. To improve signal quality, tripolar concentric ring electrodes have also been reported to automatically attenuate muscle artifacts (Besio et al. 2014). Recently, it was reported that tEEG, i.e. EEG recorded on the scalp with tripolar concentric ring electrodes, can detect HFOs (approximately 80–400 Hz) that correlate with

SOZs (Toole et al. 2019). The source localization of HFOs in tEEG may help clinicians identify epileptic brain regions or to determine the optimal location for intracranial recording (Toole et al. 2019). Both HD-EEG and tEEG currently have restricted accessibility, the possible reasons for which include high costs, patient discomfort in wearing the apparatus, and the data analysis being more time-consuming than that for conventional scalp EEG. This seems to be a challenge for clinical HFO research presently.

Low signal-to-noise ratio (SNR) in scalp EEG and MEG

Typically low SNRs present a substantial challenge for HFO research. The reconstruction of signals through beamformer virtual sensors has been suggested as a spatial filtering method to increase the SNR (van Klink et al. 2016; van Klink et al. 2017). The OPMs system uses sensors positioned directly on the scalp; therefore, the SNR of the recording is relatively high due to the closeness, proximity of the sensors to the brain, with a good fit for all head sizes (Boto et al. 2019).

Suppression of sensor noise would significantly increase SNR for HFOs. A recent study investigated the validity of two temporal projection noise suppression algorithms for MEG measurements (Clarke et al. 2020). The findings showed that both oversampled temporal projection and temporal signal space separation effectively suppress noise in raw MEG data. These methods had the greatest joint effect in cases where SNR is low, or when detecting higher SNR single-trial responses from raw data. HFO signals are difficult to detect with noninvasive techniques due to low SNRs. Suppression of sensor noise would be especially beneficial to increase SNR for HFOs, which could help to improve the diagnosis and treatment of epilepsy (Clarke et al. 2020). The effects of muscle artifacts and removal of false HFOs should be accounted for in the evaluation of HFOs. A recent study reported that using two tools (with an EMG detector either on the scalp EEG or on the intracranial EEG) effectively alleviated the effects of muscle artifacts on HFOs (Ren et al. 2019). However, it is unknown whether this method can be applied to MEG or scalp EEG.

Visual identification vs. automatic analysis

The detection of HFOs after noninvasive recording is a challenging task. Although considered the gold standard for HFO detection, visual identification is highly time-

consuming and subjective (Frauscher et al. 2017). There are controversial reports regarding the reliability of visual analysis (Spring et al. 2017, 2018). Furthermore, the variability in HFO rates and inconsistency in sources in recordings by long-term intracranial EEG make visual analysis more demanding (Gliske et al. 2018). Thus, it is essential to develop methods for the automatic detection for HFOs.

A variety of automated detectors have been developed in recent times (Gliske et al. 2016; Roehri et al. 2016; von Ellenrieder et al. 2012; Zijlmans et al. 2017). Automated detection of HFOs has shown a performance comparable with that of visual detection in locating the SOZ (Holler et al., 2015; Pail et al. 2013). Three classic automated methods of HFO detection have been validated and are widely used (Salami et al. 2012; Staba et al. 2002; Worrell et al. 2008). Recently, artificial intelligence (AI) with machine-learning techniques has been applied to the automated detection of HFOs (Schirrmeyer et al. 2017). With AI encoding the features of signals after configuration optimization, the new automated detector outperforms other classic methods (Guo et al. 2018). Several HFO detection approaches have been developed in the form of MATLAB-based open-source tools. The RIPPLELAB software is a comprehensive application for visual and automatic HFO detection (Navarrete et al. 2016). MEEGIPS is a software to detect HFOs in a computer-assisted manner (Holler et al. 2019). When using softwares to detect HFOs, it is essential to verify that the right filter settings have been used. The detection of false-positive HFOs can be reduced by visual validation. However, false-negatives cannot be easily detected. The sensitivity and specificity of an automatic detector might vary based on the recording site and individual subjects.

An alternate technique to detect HFOs in the past was to identify HFA using spectral analysis (Xiang et al. 2009). This method can allow processing for long data periods or the processing of several data points at a time; it has been used in analyzing the majority of MEG HFO data (Velmurugan et al. 2019). It has also been demonstrated that beamformer virtual sensors can improve the visualization of MEG ripples (van Klink et al. 2016; van Klink et al. 2018). Lately, the combination of wavelet transform and Granger causality analyses for HFOs recorded via intracranial EEG has been reported to be accurate in suspecting bitemporal epilepsy (Han et al. 2019).

It is known that most clinicians read EEG traces on the screens but rarely look at raw MEG signals. Postprocessing of raw MEG signals is common, although the degree of postprocessing that is rational and feasible for clinical use remains unknown. Currently, there are no reliable

automated detection methods that are easy to use and are validated by clinical trials. The use of an automated detection method alone is rather insignificant for noninvasive HFO research (Migliorelli et al. 2017; von Ellenrieder et al. 2012). Automated or semi-automated detection methods with broad applicability are crucial for noninvasive HFO research with MEG and scalp EEG (Zijlmans et al. 2017). It is recommended that automated detection techniques should be integrated into clinical review software, thus allowing for the validation of visual detection. However, further research is warranted for developing improved detection techniques.

Distinction between physiologic and pathologic HFOs

It has been widely reported that the healthy brain can produce HFOs in certain areas. Distinguishing physiologic HFOs from pathologic HFOs is both important and challenging. Previous studies using invasive EEG or a combination of invasive and scalp EEG have reported several different methods that can be applied to differentiate physiologic from pathologic HFOs.

Different coupling of HFOs in relation to slow waves during non-rapid eye movement (NREM) sleep has been shown to improve discrimination between physiologic and pathologic HFOs (Frauscher et al. 2015; von Ellenrieder et al. 2016). One invasive EEG study showed that both spontaneous occipital HFOs and epileptogenic extra-occipital HFOs were associated with delta phase activity, while the strength of delta-phase coupling decayed from 1–3 Hz in physiologic occipital HFOs (Nagasawa et al. 2012). Another invasive EEG study found that physiologic HFOs were more tightly coupled to slow waves of 0.5–1 Hz, whereas epileptic HFOs were preferentially coupled with slow waves of 3–4 Hz (Nonoda et al. 2016). In addition to their different relationships with NREM sleep slow waves, physiologic and pathologic HFOs are differentially coupled to rapid eye movement (REM) sleep. Physiologic HFOs are more abundant, whereas epileptic HFOs are less frequent during REM sleep (Frauscher et al., 2016; Sakuraba et al. 2016). It has been reported that the rate of pathologic HFOs decreases with prolonged sleep duration, while physiologic HFOs increase during overnight REM sleep (von Ellenrieder et al. 2017). Distinctive relationships with interictal spikes have also been found: epileptic HFOs specific to the SOZ in the human neocortex are typically coupled with spikes while spontaneous physiologic HFOs outside of the SOZ do not often occur coincidentally with spikes (Wang et al. 2013).

Evaluation of background EEG signal is another method for distinguishing between physiologic and pathologic HFOs. It has been shown that continuous HFOs on the oscillatory background EEG are typically physiologic (Melani et al. 2013), but HFOs on a flat background tend to be epileptic (Kerber et al. 2014).

Comparing the classical features of HFO morphology, including rate, amplitude, duration, and spectral frequency, is also a commonly used method (Alkawadri et al. 2014; Malinowska et al. 2015). Physiologic HFOs are considered to be mainly in the ripple frequency range, whereas fast and very fast ripples are more commonly, and perhaps even exclusively, associated with epilepsy (Alkawadri et al. 2014; Brazdil et al. 2017; Liu et al. 2018; Usui et al. 2015). Compared to epileptic ripples, physiologic spindle-linked ripples appear to be shorter and lower in amplitude (Bruder et al. 2017). As to the waveforms, HFOs linked to the SOZ are considered to have a high degree of consistency while HFOs in functional regions are more random (Liu et al. 2018).

Another method to identify HFOs as physiologic is to purposefully evoke oscillations using tasks or stimuli. It has been reported that task-evoked physiologic HFOs have higher mean frequencies and shorter durations than epileptic HFOs (Matsumoto et al. 2013; Nagasawa et al. 2012). Although there are significant differences in classical features, as reported previously, the substantial overlap between the physiologic and pathologic HFOs should not be ignored.

Because of the distinct functions in different brain areas, physiologic HFOs can be classified into different types: memory-related HFOs, located in the hippocampus, parahippocampus, and entorhinal cortex; motor-related HFOs, located in the motor cortex and subthalamic regions; somatosensory HFOs, located in the somatosensory cortex and thalamic regions; and visually-evoked HFOs, located in the occipital lobe and visual cortex (Thomschewski et al. 2019). Compared to invasive EEG studies of physiologic HFOs, research using noninvasive techniques are limited. The first report on physiologic HFOs recorded with only scalp EEG was published in 2017 (Mooij et al. 2017). In this study, the authors studied ripples in epileptic and healthy children with spike-free scalp EEGs during sleep. The findings showed that ripples occurring in normal EEGs of healthy children are considered physiologic, occurring mostly on the central and midline channels with a regular shape. By comparing the classic features of HFOs, physiologic ripples have been observed in children with epilepsy using scalp EEG, and these physiologic ripples are coupled with specific oscillations during sleep (Mooij et al. 2018).

Overall, it is important to distinguish physiologic HFOs from pathologic HFOs. The varying associations of physiologic and pathologic HFOs with sleep should be considered during clinical evaluation. For example, when investigating pathologic HFOs during nonrapid eye movement (NREM) sleep, it has been recommended that HFOs should be recorded during the first occurrence of NREM in the night (von Ellenrieder et al. 2017). One should also be cautious while examining pathologic HFOs in the paracentral areas, hippocampus, and occipital cortex, since physiologic HFOs are most frequently seen in these areas (Thomschewski et al. 2019). It is not clear whether the invasive EEG methods used to distinguish physiologic HFOs from pathologic HFOs can be applied to noninvasive approaches; therefore, further noninvasive research on HFOs is needed. Phase-amplitude coupling of noninvasively detected HFOs has recently been demonstrated in epileptic spasms, suggesting that this may potentially be used to determine the pathogenicity of scalp-recorded HFOs (Bernardo et al. 2020).

Conclusion

Studies utilizing noninvasive recording of HFOs in the clinical setting with MEG and scalp EEG have contributed to the understanding and utility of HFOs as a biomarker of epileptogenicity. Compared to conventional EEG spikes, pathologic HFOs have been considered as a reliable biomarker for localizing the SOZ in symptomatic generalized epilepsy and focal epilepsy. Pathologic HFOs play an important role not only in guiding the scope and boundary of surgical resection and assessing surgical outcomes, but also in evaluating disease activity, the effects of drugs or treatments, and prognosis in epilepsy. Although research is scarce, pathologic HFOs have been investigated noninvasively using MEG in other diseases, such as migraine and autism. In a few noninvasive studies, physiologic HFOs (evoked or spontaneous) have also been reported using MEG or scalp EEG recordings.

Although there are many challenges facing noninvasive HFO research, especially regarding automatic detection, rapid advances in technology (e.g., AI) have the potential to address these problems in the future.

Moving forward, more high-quality, multi-center clinical studies with large sample sizes are needed to investigate HFOs with standardized examination. In particular, there is a need for properly designed, prospective, randomized multi-center trials.

Establishing objective and unified analysis methods for HFOs are expected to facilitate the development of

standardized HFO assessment. With the advancement of MEG technology, it is anticipated that OPMs will become more widely used in clinical settings, making it easier to coordinate and implement noninvasive HFO studies with more participants. Noninvasive methods for evaluating HFOs provide new opportunities for both epilepsy research and other pathologic and physiologic conditions alike. In conclusion, we believe that there is a promising future for routine application of noninvasive HFO recording and analysis in clinical settings.

Abbreviations

AI	artificial intelligence
ASD	autism spectrum disorder
ASE	absence status epilepticus
BECTS	benign childhood epilepsy with centrotemporal spikes
CAE	childhood absence epilepsy
CSWS	continuous spike-waves during slow-wave sleep
DC	direct current
EPC	epilepsia partialis continua
ES	Epileptic spasm
FOS	fast oscillations
GSWD	generalized spike-wave discharges
GC	Granger causality
HD EEG	high density EEG
HFA	high frequency activity
HFOs	high-frequency oscillations
HF-SEP	high-frequency somatosensory evoked potentials
JAE	juvenile absence epilepsy
LGS	Lennox-Gastaut syndrome
MEG	magnetoencephalography
MRI	magnetic resonance imaging
NREM	non-rapid eye movement
OPMs	optically pumped magnetometers
PS	Panayiotopoulos syndrome
PD	Parkinson's disease
REM	rapid eye movement
SNR	signal-to-noise ratio
SOZ	sizure onset zone
tEEG	tripolar EEG
TSC	tuberous sclerosis complex
WT	wavelet transform

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