

## Supplementary Material

### 1 GRADIENT ARTEFACT REMOVAL METHODS

Table S1: Methods for Reducing Gradient Artefact (GA) in Simultaneous EEG-fMRI Recordings, Literature 1998-2018.

| Method                           | Description   | Literature  |
|----------------------------------|---|---|
| <b>Avoiding GA</b>               |   |   |
| Stepping stone sampling (SSS)    | Novel fMRI sequence, where EEG is sampled between slices of fMRI, thus avoiding GA. Requires accurate synchronisation of MR and EEG clocks.   | Anami et al. (2003)                                 |
| MR-Link Device                   | Wireless amplifier that reduces the effect of electromagnetic interference during recording. Currently only tested in animal MRI.   | Mandal et al. (2019)                                |
| <b>Reducing GA</b>               |   |   |
| Short cable length               | Reducing the overall length of the cables reduces induced voltage from GA reaching EEG amplifiers, due to reduction in size of loops of EEG cables in the magnetic field.                   | Chowdhury et al. (2015)<br>Asseondi et al. (2016) * |
| Twisted EEG cables (cap)         | Twisting cables from opposite sides of the EEG cap together reduces GA, due to reduction in cable loop size and noise caused by gradient and radiofrequency (RF) pulses during fMRI.        | Allen et al. (1998)<br>Goldman et al. (2000)        |
| Twisted leads (cap to amplifier) | Twisted leads outperform flat ribbon leads when connecting EEG cap to the amplifier inside the MR environment, due to reduction in loop size in the magnetic field.                         | Chowdhury et al. (2015)<br>Jorge et al. (2015a)     |
| Cable position on EEG cap        | Positioning the cable bundle at Cz electrode when leaving the EEG cap, could reduce GA effects over the temple region; although this has not been conclusively validated in human subjects. | Mullinger et al. (2014)                             |
| Novel EEG cap                    | High density (256 channels) EEG cap (Inknet) showed reduced GA on 3T fMRI images, compared with similar high-density copper wire EEG cap.   | Poulsen et al. (2017)<br>**                         |
| Re-wiring EEG cables             | Altering the configuration of EEG leads to reduce scanner specific GA contamination.  | Chowdhury et al. (2019)                             |
| *4T study , **7T study           |   |   |

Table S1: Methods for Reducing Gradient Artefact (GA) in Simultaneous EEG-fMRI Recordings, Literature 1998-2018.

| Method                                   | Description  | Literature   |
|--|--|--|
| <b>Clock Synchronisation</b>             |  |  |
| Synchronisation of EEG and MRI clocks    | Synchronisation of EEG and MRI clocks using specialised hardware, helps with reducing residual GA during post processing of EEG recordings, when template subtraction methods are used.  | Anami et al. (2003)<br>Mandelkow et al. (2006)<br>Mullinger et al. (2008a)<br>Gebhardt et al. (2008)                         |
| EPI fMRI sequence                        | Echo-planar imaging (EPI) fMRI sequence produces less GA on EEG than spiral fMRI sequence. GA from both sequences can be mitigated by appropriate AAS and clock synchronisation.   | Solana et al. (2014)   |
| Post processing synchronisation          | Use of:<br>(a) interpolation ,<br>(b) time continuous cubic spline model,<br>(c) interpolation and auto-correlation , and<br>(d) least across squared variance methods for correcting for datasets where EEG and MR clocks are not synchronised. | (a) Goncalves et al. (2007a,b)<br>(b) Koskinen and Vartiainen (2009)<br>(c) Mandelkow et al. (2010)<br>(d) Tan et al. (2017) |
| <b>Post-Processing: Template Methods</b> |  |  |
| Average Artefact Subtraction (AAS)       | Segmentation of EEG data into epochs based on MR image acquisition trigger. An average template is created for each of the epochs and interpolation is used to remove this artefact template from the EEG.                                       | Allen et al. (2000)  |
| “Real time” (online) AAS                 | Adapted AAS algorithm to calculate imaging artefact in close to real time, to allow for reading EEG during fMRI scan and immediate feedback.   | Garreffa et al. (2003);<br>Gualniera et al. (2004)   |
| Additional information for AAS           | (a) Inclusion of head displacement parameters from analysis of fMRI images to improve the estimation of GA template.<br>(b) External sensors used to estimate motion and use in calculation of GA template.                                      | (a) Moosmann et al. (2009)<br>Sun et al. (2009)<br>(b) Zhang et al. (2019)   |

Table S1: Methods for Reducing Gradient Artefact (GA) in Simultaneous EEG-fMRI Recordings, Literature 1998-2018.

| Method  | Description   | Literature  |
|---|---|---|
| AAS extensions  | Additional steps added to AAS for GA removal:<br>(a,b) Addition of adaptive filter to minimise residual GA after AAS<br>(c) Weighting artefact templates based on proximity<br>(d) Amplitude of each template subtraction adjusted by linear regression<br>(f) Cross correlation used to phase shift each template to optimally fit each epoch<br>(g) Pre-process EEG with non-linear filter and signal slope adaptation (SSD) prior to AAS | (a) Allen et al. (2000) (adaptive noise cancellation)<br>(b) Wan et al. (2006a)<br>(c) Freyer et al. (2009)<br>(e) Sartori et al. (2010)<br>(f) Huang et al. (2012)<br>(g) Ferreira et al. (2014) |
| Basis Set of Templates                                  | A set of artefact templates based on cubic spline interpolation. Each epoch's artefact is defined as a combination of templates from the set.   | LeVan et al. (2016)   |
| Hierarchical clustering                                 | Many templates are created based on data from the whole recording. Epochs are grouped into similar clusters, and templates are applied to clusters rather than using a sliding window.  | de Munck et al. (2013)  |
| <b>Post-Processing: Blind Source Separation Methods</b> |   |   |
| Independent Component Analysis (ICA)                    | Separates the signal into Independent Components (IC), based on ICs being as non-Gaussian as possible.  | Ryali et al. (2009)   |
| Independent Vector Analysis (IVA)                       | ICA using multiple datasets, with each EEG channel considered a separate dataset.   | Acharjee et al. (2014, 2015)  |
| Principle Component Analysis (PCA)                      | Reduces dimensionality by maximising variation in the data set. Results in a set of Principal Components (PC), with the first PC explaining most of the variability in the data set. PCs estimated to be related to GA are removed.   | Negishi et al. (2004)   |
| Optimal Basis Set (OBS) / FASTR.                        | After template subtraction, PCA is used to determine an OBS. The PCs from the OBS that relate to artefact are removed.  | Niazy et al. (2005)   |
| Single Value Decomposition (SVD)                        | One form of PCA. SVD decomposes a mixed matrix into orthonormal matrices, which can be ordered by variance.   | Liu et al. (2012)   |

Table S1: Methods for Reducing Gradient Artefact (GA) in Simultaneous EEG-fMRI Recordings, Literature 1998-2018.

| Method                                | Description  | Literature   |
|---------------------------------------|--|--|
| Canonical Correlation Analysis (CCA)  | Maximising temporal correlation across the data set, obtaining components which are uncorrelated and represent artefact.   | Li et al. (2017)   |
| Blind Source Extraction (BSE)         | BSS technique, with aim to separate one source of interest, therefore limiting number of sources to be found.  | Jing and Sanei (2006)  |
| <b>Post-Processing: Other Methods</b> |  |  |
| Frequency filtering                   | (a) Removing artefact from EEG based on its frequency components<br>(b) Real time filtering using the Fast Fourier Transform<br>(c) Taylor-Fourier Transform: An extension of the Fourier Transform that takes into account more frequencies, is applied to GA at each individual TR | (a) Hoffmann et al. (2000)<br>(b) Shaw (2017)<br>(c) Frigo and Narduzzi (2014) |
| Dictionary Learning                   | Mixed over complete Dictionary (MOD), containing wavelets and discrete cosine functions, sparsely represents the EEG and GA. Matching pursuit algorithm (MP) separates EEG and GA signals from the dictionary.   | Xu et al. (2005)   |

## 2 BCG ARTEFACT REMOVAL METHODS

Table S2: Methods for Reducing Ballistocardiogram Artefact in Simultaneous EEG-fMRI Recordings, Literature 1998-2018.

| Method                                  | Description  | Literature                                   |
|---|--|--|
| <b>Avoiding BCG</b>                     |  |  |
| ECG triggered stimulus delivery         | Use of ECG channel to estimate BCG artefact peaks that will be seen in EEG. Deliver task (stimulus) during times of low BCG artefact to reduce its impact on EEG signal. | Ertl et al. (2010)                           |
| <b>Monitoring Physiological Signals</b> |  |  |
| ECG electrodes                          | An additional electrode placed on the back or chest measures echocardiogram (ECG) signals, which are collected for the purpose of estimating BCG.                        | Allen et al. (1998)<br>Goldman et al. (2000) |

Table S2: Methods for Reducing Ballistocardiogram Artefact in Simultaneous EEG-fMRI Recordings, Literature 1998-2018.

| Method  | Description  | Literature   |
|---|--|--|
| Scanner equipment                                     | Scanner inbuilt photoplethmography (PPG) and respiration band is used to measure the heart rate and breathing rate of the subject, with data used for later estimation of BCG artefact.  | Mullinger et al. (2008a)   |
| <b>Direct Artefact Recording: EEG Cap Alterations</b> |  |  |
| Multi lead EEG  | A custom multi-lead EEG cap oversamples the EEG, artefact is removed during post-processing based on spatial voltage differences.  | Dyrholm et al. (2009)  |
| Dual array EEG  | Modified commercial brain cap, by moving some electrode positions, to produce orthogonal loops that detect head motion. ICA used post-recording to remove motion artefact.   | Klovatch-Podlipsky et al. (2016)   |
| Conductive gel bridge sensor                          | Using the dual array EEG layout (above), but applying the conductive gel between electrodes to form an artificial bridge. Affected electrodes used as a motion sensor.   | Cohen et al. (2019)  |
| Isolation of electrodes                               | Use of plastic layer (ie. plastic tape, shower cap) for isolating a subset of electrodes from a high density (256 channel) cap. Isolated electrodes are used to provide an estimate of motion artefact.  | Xia et al. (2013a,b, 2014a,b)<br>Jorge et al. (2015b) **   |
| Artefact reference layer                              | Use of an additional “reference” layer of electrodes which are isolated from the scalp, either placed:<br>(a) on top of<br>(b) or underneath the EEG cap<br>(c) or between EEG electrodes<br>The reference layer records general artefact occurring at EEG electrodes, including motion artefact, which can be removed directly from EEG during post-processing. | (a) Chowdhury et al. (2014),<br>Chowdhury et al. (2019)<br>(b) Luo et al. (2014)<br>(c) Steyrl et al. (2015, 2017, 2018) |
| <b>Direct Artefact Recording: Additional Sensors</b>  |  |  |
| Piezoelectric sensor                                  | Piezoelectric sensor attached to subject’s temple measures motion, filtered from EEG with adaptive noise cancellation.   | Bonmassar et al. (2002)  |

Table S2: Methods for Reducing Ballistocardiogram Artefact in Simultaneous EEG-fMRI Recordings, Literature 1998-2018.

| Method  | Description  | Literature  |
|---|--|---|
| Facial electrodes                                       | Use of high-density EEG and facial and temporal electrodes to determine BCG artefact due to small head motion. Difference between right and left side of non-neuronal electrodes showed better result for removing BCG than recording ECG.   | Iannotti et al. (2015)  |
| Wire loops  | Large (~10cm) copper or carbon wire loops attached to the outside of the EEG cap or sewn to the cap. Regression algorithm used during post-processing to reduce motion and ballistocardiogram artefacts from EEG.  | Masterton et al. (2007); Abbott et al. (2014)<br>van der Meer et al. (2016a,b)                      |
| <b>Post-Processing: Template Methods</b>                |  |   |
| Average Artefact Subtraction (AAS)                      | Similar to AAS for GA (described above), with the exception that the segmentation of EEG data into epochs is based on R peaks of the QRS complex seen on ECG recordings, rather than MR triggers.  | Allen et al. (1998)   |
| AAS extensions  | Additional steps added to AAS for BCG removal:<br>(a) Template scaled by exponentially updated weights, giving more weight to temporally close epoch templates<br>(b) After AAS, residual noise reduction by wavelet decomposition and RLS adaptive filtering<br>(c) Dynamic time warping. Correcting for slight temporal shifts in BCG by linearly warping the data to the template | (a) Goldman et al. (2000)<br>(b) Kim et al. (2004)<br>(c) Kustra et al. (2008)                      |
| BCG template optimisation for AAS                       | Algorithms to enhance the detection of cardiac R peaks, or BCG artefact template, used with AAS.   | Ellingson et al. (2002, 2004)<br>Oh et al. (2007, 2014)<br>Wen et al. (2016),<br>Wong et al. (2018) |
| Basis Set of Templates                                  | A Fourier set of BCG templates, derived from the whole data set. BCG at each epoch is defined as a combination of templates from the set.  | Vincent et al. (2007)   |
| Hierarchical clustering                                 | See previous section: Gradient Artefact.   | de Munck et al. (2013)  |
| <b>Post-Processing: Blind Source Separation Methods</b> |  |   |

Table S2: Methods for Reducing Ballistocardiogram Artefact in Simultaneous EEG-fMRI Recordings, Literature 1998-2018.

| Method                               | Description  | Literature  |
|--------------------------------------|--|---|
| Independent Component Analysis (ICA) | See previous section: Gradient Artefact.   | Béнар et al. (2003)   |
| IC classification                    | Methods for classifying IC as neuronal activity or BCG artefact:<br>(a) Clustering ICs based on multiple ICA runs<br>(b) ICs sorted by minimum spectral difference to measured ECG<br>(c) Discrete Hermite Transform<br>Mutual Information algorithm:<br>- (d) with single value decomposition (SVD)<br>- (e) with a threshold criteria<br>(f) Correlation to ECG (maximum squared coherence)<br>(g) K means clustering (PROJIC) with additional OBS or AAS on BCG ICs<br>(h) Clustering ICs and removal based on spatial maps | (a) Briselli et al. (2006)<br>(b) Koskinen and Vartiainen (2008)<br>(c) Ferdowsi et al. (2012a)<br>(d) Liu et al. (2012)<br>(f) Silva de Souza et al. (2013)<br>(e) Abbasi et al. (2015)<br>(g) Abreu et al. (2016)<br>**<br>(h) Piorecky et al. (2019) |
| Constrained ICA (cICA)               | Converges IC to some prior estimation of noise, rather than being statistically independent.<br><br>Extension:<br>(a) Clustering of ICs from cICA for BCG classification   | Rasheed et al. (2006, 2009)<br>Leclercq et al. (2009)<br>(a) Wang et al. (2018)   |
| Principal Component Analysis (PCA)   | See previous section: Gradient Artefact.<br><br>Extensions:<br>(a) Maximum Noise Fraction. Noise whitening with PCA<br>(b) Empirical Mode Decomposition (EMD) with PCA   | Béнар et al. (2003)<br>(a) Sun et al. (2009)<br>(b) Javed et al. (2014a,b, 2015, 2017)  |
| Optimal Basis Set (OBS) / FASTR.     | See previous section: Gradient Artefact.<br><br>Extensions:<br>(a) Real time filtering<br>(b) Using prior information  | Niazy et al. (2005)<br>(a) Wu et al. (2016)<br>(b) Marino et al. (2018)   |
| Canonical Correlation Analysis (CCA) | See previous section: Gradient Artefact  | Asseondi et al. (2008, 2009)  |

Table S2: Methods for Reducing Ballistocardiogram Artefact in Simultaneous EEG-fMRI Recordings, Literature 1998-2018.

| Method                                | Description   | Literature  |
|---------------------------------------|---|---|
| Blind Source Extraction (BSE)         | See previous section: Gradient Artefact   | Kosma et al. (2009)<br>Ferdowsi et al. (2012b, 2013)      |
| ** study included 7T data             |   |   |
| <b>Post-Processing: Other Methods</b> |   |   |
| Spatial                               | Multiple Source Correction. Topography of BCG recorded outside of the scanner used to cancel BCG from inside the scanner. | Siniatchkin et al. (2007)                                 |
| Spectral                              | Statistical methods are used to estimate the main spectral properties of BCG.   | Ghaderi et al. (2010)<br>Krishnaswamy et al. (2013, 2016) |
| Wavelet                               | Decomposition by a pre-defined wavelet function, which may help separate artefact or activity.                            | Wan et al. (2006b)  |
| Dictionary                            | Mixed over complete dictionary sparsely models BCG signal.  | Abolghasemi and Ferdowsi (2015)                           |
| Kalman                                | Iterative filter, which predicts and updates weights throughout.  | In et al. (2006)<br>Sameni et al. (2008)                  |
| Morphological                         | Use of Discrete Hermite Transform (DHT) to separate artefact from activity based on the shape content of each signal.     | Mahadevan et al. (2008a,b)                                |

### 3 OTHER ARTEFACT REMOVAL METHODS

Table S3: Methods for Reducing Ballistocardiogram Artefact in Simultaneous EEG-fMRI Recordings, Literature 1998-2018.

| Method                      | Description  | Literature          |
|-----------------------------|--|---------------------|
| <b>Reducing Head Motion</b> |  |                     |
| Head restraints             | Vacuum cushion (plastic bag filled with polystyrene spheres, additional air removed by suction) successfully used to reduce head motion and improve patient comfort. | Bénar et al. (2003) |



Table S3: Methods for Reducing Ballistocardiogram Artefact in Simultaneous EEG-fMRI Recordings, Literature 1998-2018.

| Method                                    | Description  | Literature   |
|---|--|--|
| EOG electrode                             | Electrooculogram (EOG), an electrode placed on the temple, is used to record eye blink movements, in an eyes-open visual EEG-fMRI study. Recordings from EOG electrodes can be used to remove eye blink artefact during post processing.   | Bonmassar et al. (1999)  |
| MR compatible camera                      | MR compatible camera mounted to the head coil during EEG-fMRI scan allows for post-recording exclusion of EEG data due to motion.  | Ruggieri et al. (2015)   |
| Optical motion tracking                   | Optical motion tracking system. Using Moiré Phase Tracking (MPT) marker attached to base of forehead and an MRI compatible camera, head motion can be measured with 6 degrees of freedom. Linear regression of the motion parameters reduces BCG and motion artefact in the EEG recording. | LeVan et al. (2013, 2016)  |
| <b>Reducing Environmental Artefact</b>    |  |  |
| Restricting EEG lead and amplifier motion | Minimise EEG lead/amplifier motion:<br>- sand/rice bags<br>- cantilever beam   | Kruggel et al. (2000)<br>Bénar et al. (2003)<br>Mullinger et al. (2008b) |
| AAS                                       | See Part 1 - Gradient Artefact.<br>- Use of AAS for ventilation and helium cooling pump noise.   | Rothluebbers et al. (2013)   |
| PCA                                       | Recursive, Segmented PCA (rsPCA) for MRI helium pump noise.  | Kim et al. (2015)  |
| <b>Other Post-processing Methods</b>      |  |  |
| ICA                                       | See part 1- Gradient Artefact.<br>- Real time ICA, for non GA related artefact (BCG and mixed)   | Mayeli et al. (2015, 2016)   |
| Functional Source Separation              | ICA constrained by an estimate of the noise, at the cost function level of the algorithm.  | Porcaro et al. (2010)  |
| PCA                                       | See Part 1 - Gradient Artefact.<br>- (stepping stone acquisition, residual GA after AAS)   | Freyer et al. (2009)   |

Table S3: Methods for Reducing Ballistocardiogram Artefact in Simultaneous EEG-fMRI Recordings, Literature 1998-2018.

| Method                    | Description   | Literature                    |
|---------------------------|---|-------------------------------|
| Beamformer spatial filter | Estimation of the topographical artefact across EEG channels. | Brookes et al. (2008, 2009)** |
|                           |   | ** 7T study                   |

#### 4 EEG-FMRI SETUP IN CONTEMPORARY STUDIES

Table S4: EEG-fMRI Setup: Contemporary Studies (2016-2018)

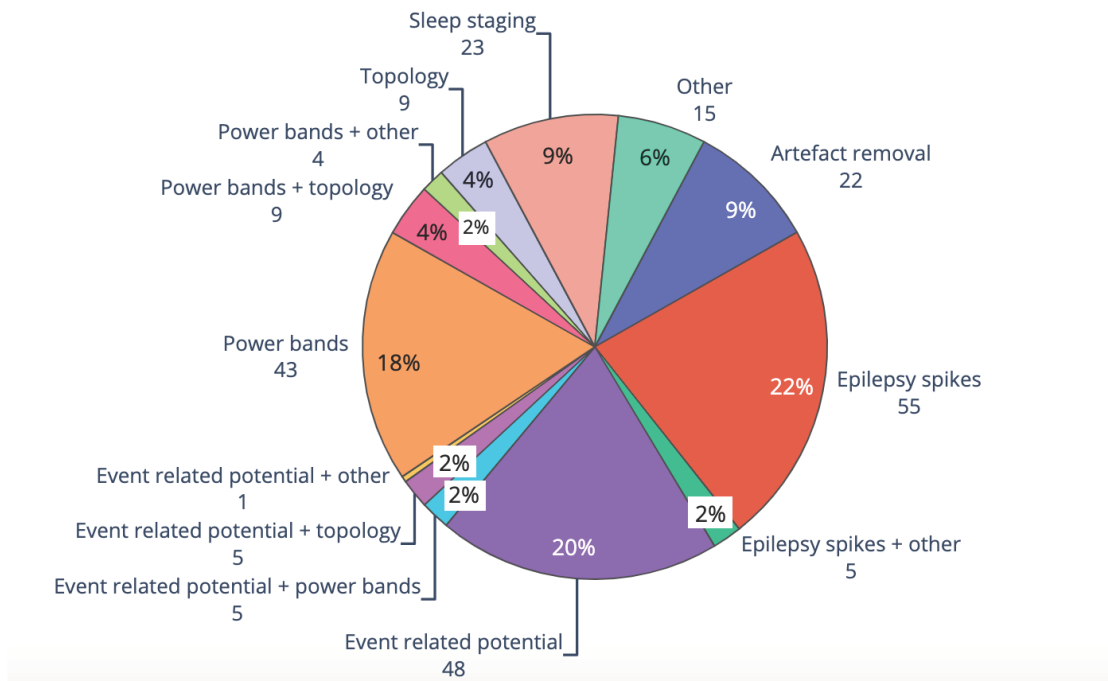
| Setup of EEG-fMRI                                   | No. of papers | Percentage (%) |
|---|---------------|----------------|
| <b>EEG channel number</b>                           |               |                |
| - under 32 channels                                 | 75            | 31             |
| - 32  | 31            | 13             |
| - 33-63   | 57            | 23             |
| - 64  | 49            | 20             |
| - 65-100  | 5             | 2              |
| - 128+  | 17            | 7              |
| - Unclear   | 2             | 1              |
| - Not stated  | 5             | 2              |
| - Multiple  | 3             | 1              |
| <b>Other channels</b>                               |               |                |
| ECG   | 162           | 66             |
| EOG   | 54            | 22             |
| EMG   | 7             | 3              |
| <b>Physiological Monitoring</b>                     |               |                |
| Total, any monitoring (may use multiple techniques) | 28            | 11             |
| - Respiratory band                                  | 24            | 10             |
| - Pulse oximetry                                    | 18            | 7              |
| - Scanner Vectorcardiogram                          | 6             | 2              |
| - Chest accelerometer                               | 2             | 1              |
| <b>EEG / MRI clock synchronisation</b>              |               |                |
| Total using synchronisation                         | 119           | 49             |

Table S4: EEG-fMRI Setup: Contemporary Studies (2016-2018)

| Setup of EEG-fMRI  | No. of papers | Percentage (%) |
|--|---------------|----------------|
| - Brain Products SyncBox   | 54            | 22             |
| - MR trigger timed (TTL)   | 9             | 4              |
| - Other device   | 2             | 1              |
| - Device not stated  | 54            | 22             |
| <b>Environmental Artefact</b>                                    |               |                |
| Total reporting on environmental variables                       | 56            | 23             |
| - Helium pump off  | 12            | 5              |
| - Ventilation low / off  | 7             | 3              |
| - EEG cables secure (e.g. sandbags)                              | 16            | 7              |
| - Other (e.g. lights off, amplifier configuration)               | 29            | 12             |
| <b>Motion Artefact</b>   |               |                |
| Total reporting on motion artefact                               | 165           | 68             |
| - ICA for removing residual artefacts, including motion artefact | 77            | 32             |
| - Head cushioning / immobilisation                               | 56            | 23             |
| - Visual inspection of motion on EEG                             | 41            | 17             |
| - Data driven post-processing methods                            | 15            | 6              |
| - External calibration of eye blinks                             | 5             | 2              |
| - Camera / video system  | 10            | 4              |
| - Other Hardware (modified EEG cap, motion loops)                | 11            | 5              |
| - Sedation   | 5             | 2              |

## 5 ROLE OF EEG IN CONTEMPORARY EEG-FMRI STUDIES

For EEG-fMRI studies published between 2016 and 2018, the most common use of EEG data recorded with fMRI was for detection of epileptic events (epilepsy spikes), as shown in figure S1. This result is perhaps not surprising, given that the earliest iterations of EEG-fMRI during the 1990s used spike-triggered scanning to help localise epileptic regions in patients Warach et al. (1996). However, just under 50% of contemporary EEG-fMRI studies used EEG to measure either event related potentials (an EEG correlate of a task based activity), or power bands (EEG magnitude in a particular frequency range). Another 13% of studies used the EEG primarily for either sleep staging or determining spatial topology of an event in EEG. Finally, studies included in the ‘other’ section (n=15) included measures such as EEG: phase Onojima et al. (2017), microstates, speech envelopes Anwar et al. (2016), and measures of working memory Baenninger et al. (2016), or connectivity Anwar et al. (2016); Wirsich et al. (2017). The results of this review show that whilst simultaneous EEG-fMRI is still useful in studies involving epilepsy patients, its use has grown to include research into the fMRI activity during many different types of EEG events.



**Figure S1.** EEG measurements used during EEG-fMRI; papers published between January 2016 – December 2019 (n=244). IED = interictal epileptic discharge; ERP = event related potential.

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