

1 ***In vivo* magnetic recording of single-neuron action potentials**

2 **Abbreviated title: *In vivo* magnetic single-neuron action 3 potentials**

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15 **Abstract**

16 Measuring fast neuronal signals is the domain of electrophysiology and magnetophysiology. While
17 electrophysiology is easier to perform, magnetophysiology avoids tissue-based distortions and
18 measures a signal with directional information. At the macroscale, magnetoencephalography (MEG) is
19 established, and at the mesoscale, visually evoked magnetic fields have been reported. At the
20 microscale however, while benefits of recording magnetic counterparts of electric spikes would be
21 numerous, they are also highly challenging *in vivo*. Here, we combine magnetic and electric recordings
22 of neuronal action potentials in anesthetized rats using miniaturized giant magneto-resistance (GMR)
23 sensors. We reveal the magnetic signature of action potentials of well-isolated single units. The
24 recorded magnetic signals showed a distinct waveform and considerable signal strength. This
25 demonstration of *in vivo* magnetic action potentials opens a wide field of possibilities to profit from
26 the combined power of magnetic and electric recordings and thus to significantly advance the
27 understanding of neuronal circuits.

28 **Significance statement**

29 Electrophysiological tools allow the measurement of single-neuron action potentials with high
30 temporal resolution. Magnetophysiological measurements would add valuable information, but are
31 particularly hard to achieve for single neurons. Established technology for non-invasive magnetic brain
32 signal measurements can currently not be used inside living tissue. Here, we demonstrate that
33 miniaturized magnetic sensors based on giant magneto-resistance enable the measurement of the
34 magnetic counterpart of single-neuron action potentials *in vivo*. This proof-of-principle shows a way
35 towards integrating magnetic and electric recordings in future experiments and thus to profit from the
36 complementary information measured by the two modalities.

37

38 **Introduction**

39 Neuroscience is often driven by the development of new methods to record neuronal activity.
40 Neuronal activity is characterized by electric currents, generated by neuronal outputs in the form of
41 action potentials, and by neuronal inputs in the form of synaptic potentials. Synaptic potentials are
42 often highly correlated across thousands to millions of neighboring synapses, thereby summing

43 effectively to mass potentials, which are recorded as LFP (and LFP-derived signals like ECoG and EEG).
44 By contrast, action potentials are typically weakly correlated between neighboring neurons, and are
45 often studied using extracellular microelectrode recordings of so called “spikes”, which can provide
46 information on the level of single neurons or small clusters of neurons. Spike recordings provide unique
47 information about neuronal outputs, often revealing high spatial specificity.

48 Electric currents are inextricably linked to magnetic fields (Fig 1A). Thus, magnetic equivalents must
49 exist both for action potentials and LFPs. However, *in vivo*, only LFP equivalents have been magnetically
50 recorded, in the form of MEG. MEG sensors need to be extremely sensitive (in the femto-Tesla range)
51 and massively shielded, to detect the weak neuronally generated fields. The development of this
52 technology was highly challenging (Cohen, 1968; Hari et al., 1984; Hämäläinen et al., 1993; Hari and
53 Salmelin, 1997), and still today, MEG is technologically much more demanding and expensive than its
54 electric counterpart EEG. Nevertheless, MEG is used at many research institutions, because of its
55 specific advantages: (1) While electrical currents need to flow through tissue, thereby getting
56 attenuated, distorted and smeared by the tissue’s variable conductivity, magnetic signals pass through
57 the neuropil almost unaffected (Barnes and Greenebaum, 2007) (2) While electrical recordings in
58 practice require a reference, magnetic recordings do not. Reference-free recordings are particularly
59 advantageous for analyses of functional connectivity based on correlations, which can be spuriously
60 introduced by shared references. (3) While electrical recordings merely provide a measure of electric
61 signal strength, magnetic recordings additionally provide a measure of magnetic field direction.

62 The fact that magnetic signals are mostly unaffected by tissue, combined with the fact that their
63 recordings provide directional information, could be utilized to improve action potentials recordings.
64 Action potentials generate currents primarily at the neuronal cell bodies, and dozens of such cell
65 bodies surround any given sensor position in neuropil. Nevertheless, at a given position, a
66 microelectrode contact typically provides spike waveforms of merely 1-10 single neurons (Buzsáki,
67 2004). Other neurons in the close vicinity of the recording electrode might not be detectable because
68 they are too strongly electrically insulated by the dense mesh of cell membranes. These membranes
69 are essentially transparent to magnetic fields, which might enable the simultaneous recording of large
70 numbers of single neurons. The detectable neurons could then also be source localized by using the
71 directionality of the magnetic signal. This would be aided by future probes that combine magnetic
72 sensors with sensitivity in different directions in close spatial proximity.

73 Given these clear theoretical advantages, our goal was to record the magnetic signals of neuronal
74 action potentials (APs) *in vivo*. Recording magnetic AP signals *in vivo* is technically very challenging. It
75 is generally difficult to shield magnetic interference from external artifact sources. Furthermore,
76 magnetic recordings require advanced technology. Conceivable approaches include (1) coils, which
77 would however be difficult to miniaturize for AP recordings; (2) optically pumped magnetometers,
78 which would suffer from the same problem; (3) nitrogen-vacancy centers in diamonds, which can be
79 miniaturized sufficiently but require the application of both microwaves and polarized light; (4) giant
80 magnetoresistive (GMR) sensors, which can be miniaturized and do not pose these challenges.
81 Therefore, we used GMR sensors to investigate the feasibility of *in vivo* magnetic AP recordings.
82 Achieving this requires the use of miniaturized magnetic sensors that can be positioned in the
83 immediate vicinity of the neuronal cell bodies. GMR sensors provide sufficiently high sensitivity at a
84 surface size of 30 x 30 μm . GMR sensors show a resistance that is proportional to the strength of the
85 magnetic field and can yield a measurement sensitivity in the nanotesla (nT) range (Chopin et al., 2020).
86 To measure the magnetic field, a small current is passed through the GMR sensor, and magnetic-field
87 related resistance is measured as voltage across the sensor.

88 We have recently been able to record the magnetic counterparts of neuronal LFPs from the visual
89 cortex of anesthetized cats using GMR sensors on silicon backbones, which we refer to as
90 "Magnetrodes" (Caruso et al., 2017). However, these probes were too large to bring the magnetic
91 sensors sufficiently close to intact, spiking neurons. Therefore, we further miniaturized the probes to
92 be located close to the tip of 25-micron thick silicon needles, similar to typical silicon-based multi-
93 contact electrodes (Chopin et al., 2020). Here, we used conventional electrophysiological techniques
94 to record electrical neuronal spikes in anesthetized rat hippocampus, in combination with two high-
95 sensitivity, miniaturized GMR sensors to uncover the magnetic counterparts of single-neuron action
96 potentials *in vivo*. This is a proof-of-principle study to evaluate the possibility of recording magnetic
97 signatures at the level of single unit action potentials.

98 **Methods**

99 **EXPERIMENTAL MODEL AND SUBJECT DETAILS**

100 **Animals**

101 A total of 8 male Sprague-Dawley rats (Janvier Labs, France) were used in this study (4 for the first set
102 of experiments, 4 for the second set). Rats were all approximately 7 to 8 weeks of age (330-420 grams).
103 We used only male rats as they are bigger at this age, which was advantageous for the experiments.
104 Animals were housed in pairs or groups of 4 animals. All animal experiments were in accordance with
105 the German law for the protection of animals and the "European Union's Directive 2010/63/EU" and
106 approved by the local government office (Regierungspräsidium Darmstadt).

107 **METHOD DETAILS**

108 **Surgical procedures**

109 All experiments were performed under general anesthesia. The rat was anesthetized with an injection
110 of Ketamine (80 mg/kg) in combination with Medetomidine (0.01 mg/kg). Anesthesia was maintained
111 throughout the experiment with Isoflurane (0.5% – 2% in 100% oxygen). For analgesia, the animal
112 received Buprenorphine (0.3 mg/kg) subcutaneously (s.c.) every three to five hours. The animal was
113 placed in a stereotaxic frame (Kopf Instruments, USA) and received a s.c. injection of Dexamethasone
114 (1 mg/kg) to prevent edema. Every two to three hours they also received a 2 ml bolus injection of a
115 solution containing amino acids and glucose (Aminomix 1 Novum, Fresenius Kabi). Heart rate,
116 respiration rate and body temperature were continuously monitored throughout the experiment.

117 The skin was removed over the skull, and a craniotomy was performed centered on 4.5 to 5 mm
118 posterior of Bregma and 4 mm lateral to the midline. To facilitate probe insertion, we opened a slit in
119 the dura mater using a manually bent hypodermic needlea (Sterican, 30G). The probes were lowered
120 either into the cortex or to a depth of approximately 2 mm to record in the hippocampus. At the end
121 of the experiment, the animal was euthanized using an overdose of Narcoren (min. 160 mg/kg).

122 **Probes**

123 *Magnetic Sensors*

124 The magnetic sensors or "Magnetrodes" used in this study are devices for local magnetic sensing based
125 on spin electronics principle, where the electrical transport varies as a function of the magnetic
126 configuration of a set of very thin (nanometers) magnetic layers.

127 The Magnetrodes used here have been produced by depositing the magnetic layers on a SOI substrate,
128 allowing a thinning process where the tip of the probe, which contains 2 magnetic sensing elements,
129 is reduced down to 25 μ m to facilitate insertion within tissues. Details on the probe fabrication can be

130 found in Chopin et al. (2020). The Magnetrode's sensing elements use the Giant Magneto Resistance
131 principle (Baibich et al., 1988; Dieny et al., 1991) effect. They are designed as a meandering structure
132 of 5 segments, each of which is 4 μ m wide and 30 μ m long. The two GMRs are separated center to
133 center by 250 μ m. The magnetic sensors are kept electrically decoupled from the environment by a
134 Al₂O₃ (150 nm)/Si₂N₄ (150 nm) passivation bilayer.

135 Prior to the experiments, magnetotransport and noise measurements were performed to characterize
136 the GMR sensors. Their sensitivity is in the range of 1.5-2%/mT and their limit of detection (i.e. the
137 signal amplitude at which the signal-to-noise ratio is equal to 1) at 1 kHz of 1nT/ \sqrt{Hz} . To allow for
138 continuous recording including experimental and control condition, we set up a system in which we
139 switched the bias voltage to the GMR sensor on and off in a pseudorandom way, thereby interleaving
140 DC on and DC off blocks. Every 10 seconds during a recording, a pseudorandom decision was made to
141 either change the DC state or to leave it as it was before. This led to at least 10 s long blocks per
142 condition. Over a continuous recording block, the number of 10 s DC on and DC off blocks was equal.

143 **Electrodes**

144 In the first round of experiments, we used Tungsten microelectrodes (FHC, USA) to record the electrical
145 spikes as ground truth. One or two Tungsten electrodes were manually attached to the Magnetrode
146 under a microscope. The tip of the microelectrode was placed close to the lowest GMR sensor. In the
147 case when two microelectrodes were used simultaneously, they were positioned with a vertical offset.
148 In the second set of experiments, the Tungsten electrodes were replaced by multi-contact silicon
149 arrays (A1x32-Poly2_HZ32 & A1x32-Poly3_HZ32, NeuroNexus, USA). These have the advantage of
150 allowing for wider coverage and denser sampling of the surrounding tissue, making it possible to spike-
151 sort the data. They were glued to the Magnetrode in a similar way as the Tungsten electrodes, with
152 their contacts facing outward.

153 **Acquisition of electric and magnetic signal**

154 The animal was placed inside a Faraday cage (Fig 1B). The Faraday cage was built in house and
155 consisted of a single layer of aluminum, providing weak magnetic shielding. This explains the relatively
156 high noise floor in the magnetic recordings and could be improved in future recordings. For reference,
157 Figure 2 shows power spectra for the magnetic sensors in the recording situation in the brain (Fig 2)
158 and measured in air in a well-shielded room (Fig 2, note that the peak at 30Hz is due to a local
159 calibration coil emitting a signal at that frequency). All connections going in or out of the Faraday cage
160 used here were optical, apart from a gas and a water line for the anesthesia and the water bed used
161 to keep the animal warm. This was done in order to reduce electric and magnetic noise for the
162 recordings. Electric signals were recorded via active, unity gain headstages (ZC32, Tucker Davis
163 Technologies, USA) and digitized at 24,414.0625 Hz or 48,828.125 Hz (PZ2 preamplifier, Tucker Davis
164 Technologies, USA). The TTL signal controlling the DC on/off switches was recorded at 48,828.125 Hz.
165 Each GMR sensor was measured in a Wheatstone bridge configuration with a variable resistance for
166 adjustment (Chopin et al., 2020), fed on DC bias. Low noise amplification of the output voltage was
167 performed with a Texas Instrument INA 103. A second stage of filtering amplification (0.3-30 kHz) of
168 the GMR signal was obtained with a low noise amplifier (SR 560-Stanford Research Systems). To reduce
169 noise and avoid contamination by 50 Hz power line signals, the bias voltage and both levels of
170 amplification for the GMRs were battery powered.

171 **QUANTIFICATION AND STATISTICAL ANALYSIS**

172 All analyses were performed using custom MATLAB (MathWorks) code.

173 **Spike detection**

174 For the thresholding approach, we first band-pass filtered the electric signal using a fourth-order
175 Butterworth filter (500 – 5,000 Hz). In the filtered signal, peaks were detected (*findpeaks* function of
176 MATLAB) for each electrode. Peaks that crossed a pre-set threshold were identified as spikes and used
177 for further analysis. For the spike sorting approach, we used the “Kilosort” algorithm (Pachitariu et al.,
178 2016) or, in the case of the Tungsten data, the “spyKING CIRCUS” toolbox (Yger et al., 2018). For the
179 single units recorded on Tungsten units, a manual inspection after the algorithm step was performed.
180 Well-isolated single units were identified by inspection of the wave shape, the ISI distribution and the
181 number of events detected. Since we only had two recording channels available in these recordings,
182 some of the clusters identified by the algorithm did not resemble a neuronal wave shape and were
183 most likely clusters of noise artifacts and thus not suitable for further analysis.

184 **Processing of magnetic signal**

185 The magnetic signal was filtered using a fourth-order Butterworth filter (500 – 5,000 Hz) for the analysis
186 based on thresholded spikes, and using a second-order Butterworth filter (5 – 6,000 Hz) for the analysis
187 based on spike sorting. The DC switch between DC-on and DC-off blocks induced artifacts in all signals
188 (illustrated in Fig 1C). Therefore, we discarded the first 2 seconds after a switching event as well as the
189 last 0.5 s before a switch from both the electric and the magnetic signal.

190 **Spike triggered average**

191 To calculate the spike triggered averages, we first determined for every detected spike whether it
192 occurred during a DC on or a DC off block. All spikes that fell into the artifact period around a switching
193 event were ignored. For each condition individually, we centered a window on each detected spike
194 and cut these windows from the continuous signal. We then averaged these windows per condition
195 using a trimmed mean to reduce the influence of outliers (*trimmean10* function of Matlab). For the
196 spike-sorted data, we performed this analysis per cluster, for the thresholded data for all spikes
197 detected on a given electrode.

198 For the electric STAs based on spike sorted units, the raw electric signal was filtered using a second-
199 order Butterworth filter (5 – 6,000 Hz).

200 **Correlation analysis**

201 We extracted the central 2 ms of each electric STA and its corresponding magnetic STAs. In a next step,
202 every STA was corrected for its mean. We then calculated individual cross correlation values for the
203 electric STA with the magnetic STA per sensor. For the cross correlation, we shifted the electric signal
204 sample-by-sample across the magnetic signal. Each shift corresponded to 1 sample (sampling rate
205 24,414.0625 Hz, 1 sample \approx 0.04 ms), and the maximal shift was \pm 10 samples. Significance was
206 assessed for each correlation value individually and Bonferroni-corrected for the number of sample
207 shifts, single units, and sensors.

208 **Estimation of magnetic signal strength**

209 To estimate the magnetic peak-to-peak amplitude, we subtracted the magnetic STA of the off
210 condition from the magnetic STA of the on condition, such that the capacitive coupling present in both
211 conditions is subtracted out and the remaining signal can be assumed to be purely magnetic.

212 To test whether the measured difference was bigger than what could be expected by chance, we
213 performed a min/max based permutation test (Westfall and Young, 1993). We ran 1,000 difference
214 calculations in which the trials were randomly assigned to the on- or off-condition, keeping the number

215 of trials per condition consistent with the observed values. From each resulting difference, we saved
216 the minimum and maximum values across all time points. The observed difference was then tested
217 against the 97.5th percentile of the maximum distribution and against the 2.5th percentile of the
218 minimum distribution. This corresponds to a two-sided test at an alpha level of 0.05, corrected for the
219 multiple comparisons across time points.

220 To transform the measured μ V values into nT we use the sensitivity of the probes as experimentally
221 determined under a known magnetic signal (see Chopin et al. (2020)), defined as the voltage variation
222 at the bias voltage of the GMR (here 1 V) per field unit and is expressed in V/T.

223

$$s = \frac{\Delta V}{B}$$

224 The output voltage needs to be divided by the amplification gain in the acquisition chain (here 1000),
225 so the output signal in T is:

226

$$V(T) = \frac{V(V)}{\text{gain } s} \cdot \frac{1}{s}$$

227 With a sensitivity of 18.5 V/T, 100 μ V signal corresponds to 5.4 nT.

228

229 **Results**

230 **Spike triggered averages based on thresholded data reveal noise artifact**

231 We simultaneously recorded electric and magnetic signals from the brain of anesthetized rats placed
232 in a Faraday cage (Fig 1B,C). By switching the DC supply to the GMR sensors on and off at
233 pseudorandom times during the experiment, the recordings included randomly interleaved control
234 blocks during which the GMR sensor did not receive any external current. Periods containing the
235 artifact that was introduced by the switching of the DC supply were removed during data processing.
236 In a first set of experiments, we used Magnetrodes with Tungsten electrodes positioned in close
237 proximity to one of the magnetic sensors (Fig 3A). With this probe combination, we recorded data
238 either from visual cortex or from the hippocampus underneath the visual cortex. High-amplitude spike
239 events were extracted from the continuously recorded data by detecting peaks and selecting those
240 that exceeded a pre-determined threshold. The spike-triggered average (STA) of the magnetic signal
241 around these events revealed a signature in a subset of recordings. Note that all magnetic STAs were
242 kept on the μ V scale of the electric recording system, because it is possible that the data contains a
243 mix of magnetic and electric signals, due to capacitive coupling (see below). Fig 3B shows STA results
244 for one example recording. In this example a threshold of 5 SDs was used to detect spike events. At
245 this threshold, we detected 15.119 events. A window centered on the time of each detected spike
246 events was cut from the continuous electric and magnetic recordings. These windows were averaged
247 per condition. The resulting STA for the DC-on condition is illustrated in red, for the DC-off condition
248 in blue. The electric STA indicates, as expected, no difference in the DC-on and the DC-off conditions.
249 For the two magnetic sensors, a peak appeared in the DC-on condition, corresponding to the condition
250 in which the GMR sensor is sensitive. However, when we lowered the threshold for spike detection,
251 this signal became bigger (left two columns Fig 3C), and when we increased the threshold, the signal
252 decreased and even disappeared in some instances (right two columns Fig 3C). The electric STA was
253 also affected by changes in the threshold, however becoming more pronounced with higher thresholds
254 (top row Fig 3C – note the changing y-axis scales for Fig 3C).

255 This tight relationship to the selected threshold for both, the electric and the magnetic STA, suggests
256 that the signature in the magnetic STA arises due to an external artifact rather than a magnetic signal.
257 Such an artifact could be induced by correlated electric and magnetic noise from an external source
258 being picked up by both, the magnetic and the electric sensors.

259 **STAs based on isolated single units reveal magnetic signature**

260 One way to avoid this artifact is to separate spikes from noise by applying state-of-the-art spike-sorting
261 algorithms. These sorting algorithms utilize template matching of the spike waveforms rather than
262 relying purely on amplitude thresholds, thus reliably separating spikes of putative single neurons,
263 commonly referred to as single units, from noise events (Pachitariu et al., 2016; Yger et al., 2018).

264 We first selected the recording block with the most robust peak in the magnetic STA of the thresholding
265 analysis (Fig 4A) and identified two well-isolated single units after spike-sorting (Fig 4B, D). Both units
266 showed a pronounced deflection in the magnetic STA on magnetic sensor 1 (Fig 4C, E). The amplitude
267 of this signal was much larger in the DC-on condition in which the GMR sensors are active. Note that
268 there are differences in the number of spikes when comparing the DC-on and DC-off conditions, which
269 might be due to a small increase in temperature of the surrounding tissue caused by the electric
270 current in the GMR sensor. Since the spike counts for each unit are the results of a spike-sorting
271 procedure, the difference cannot be attributed to artifacts.

272 A total of 12 blocks were recorded using a Magnetrode with 2 Tungsten electrodes attached to it. We
273 spike-sorted all 12 blocks and identified a total of 31 well-isolated single units (see Methods). To assess

274 whether a single unit exhibited a magnetic spike signature on one of the adjacent GMR sensors, we
275 calculated the cross-correlation between the magnetic and the electric STAs for the central 2 ms
276 around the time of the electric spike. We investigated sample-by-sample shifts for up to 10 samples in
277 each direction (1 sample ≈ 0.04 ms), since the time course of the magnetic spike could differ from that
278 of the electric spike (Fig 5A for illustration). For each cross-correlation, we identified the peak
279 correlation value and tested this correlation for significance (using Bonferroni correction for multiple
280 comparisons across units, magnetic sensors and sample shifts). Using this approach, we identified 4
281 single units with significantly correlated signals on the two sensor types (Fig 5B). Two units showed
282 this correlation for the magnetic signal recorded on sensor 1, one unit for the signal recorded on sensor
283 2, and one unit showed a correlation with the signal on both magnetic sensors. Note that the
284 correlations tend to show a peak (maximal y-value) for slightly positive shifts (x-values), which suggests
285 that the magnetic signal is leading the electric spike. A detailed consideration of this shift is provided
286 in the discussion.

287 The STA analysis also revealed a small deflection in the DC-off condition (Fig 4E). This most likely
288 indicates capacitive coupling. Capacitive coupling refers to currents in the tissue inducing currents in
289 the electric circuits of the GMR sensor. The electric contacts of the GMR constitute a capacitor that is
290 isolated by an insulation layer from the surrounding bath. If the insulation were perfect and the voltage
291 in the bath were homogeneous, the electric signal would not be visible on the GMR. However, since
292 the neuronal signal source likely generates an inhomogeneous voltage field, a capacitive coupling
293 signal can appear on one or both sensors. The resulting artifacts reflect the ongoing current
294 fluctuations in the tissue and can thus resemble a spike-like fluctuation in the GMR signal. Since
295 capacitive coupling decreases with lower frequencies, it might be of less concern and influence when
296 recording LFP signals (as in our previous study Caruso et al. (2017)). At higher frequencies, necessary
297 for AP detection, the capacitive coupling is expected to be more apparent. In order to be able to
298 estimate the amplitude of the true magnetic signal, we subtracted the STA in the DC-off condition from
299 the STA in the DC-on condition. Capacitive coupling should be present in both conditions, independent
300 of the bias voltage, hence not amplified in the DC-on condition, and therefore will be eliminated by
301 this subtraction, because the sensor is only able to measure a true magnetic signal when the DC supply
302 is turned on. The experimental design with multiple DC-on and DC-off blocks randomly interleaved in
303 each recording session provided optimal conditions for this subtraction, because the sensor location
304 and the sources of the recorded spikes did not change between the two conditions. The differences
305 on the significantly correlated channels were bigger in amplitude than would be expected by chance
306 (see Methods) for all 4 units. However, unit 3 (Fig 5B), which was significantly correlated with the
307 magnetic signals on both sensors, showed a significant on-off difference only on sensor 1. Since we
308 can now assume the signal to be purely magnetic in nature, we transformed the μ V scale into a nT
309 scale (Fig 5C).

310 Tungsten electrodes often yield only a very small number of sortable single units. To increase the yield
311 of single units with a high number of detected events, we switched to 32-channel silicon probes
312 mounted on the Magnetrode (Fig 6A) for our second set of experiments.

313 Recordings using this probe combination were performed in hippocampus and yielded a large number
314 of single units after spike sorting ($n = 593$ from 7 recording blocks). Fig 6B and D show two example
315 units. Calculating magnetic STAs based on individual single units did not show any apparent magnetic
316 signature (Fig 6C and E).

317 We focused our further analysis on well-isolated single units with a high number of events. We
318 considered a single unit to be well isolated if less than 1% of spikes occurred within 2 ms of the
319 preceding spike (reflecting the refractory period of the neuron) and excluded units with less than 7000

320 spikes. Across the 7 recording blocks, we found a total of 73 of such well-isolated single units (73 units
321 out of 593 units, corresponding to 12%, minimum number of spikes in the distribution = 7,038,
322 maximum number of spikes = 279,872, 25th percentile = 10,974 spikes, 75th percentile = 31,328 spikes).
323 None of the 73 well-isolated single units showed a significant correlation with the magnetic signal on
324 either sensor (Bonferroni correction for multiple comparisons across units, sensors and sample shifts).
325 Thus, while the switch from Tungsten electrodes to silicone probes strongly increased the number of
326 recorded single units, no magnetic signatures were detected in this configuration.

327

328 **Increasing the sensitivity of the GMR sensor leads to heating artifact**

329 In an attempt to increase the yield of magnetic AP signatures, we increased GMR sensitivity by
330 increasing the voltage applied across the sensor. We recorded two blocks in which 2 V instead of 1 V
331 were applied to the GMR. However, these data revealed that at this voltage the heating artifact
332 mentioned earlier (see consideration about differences in spike count above) substantially affected
333 the spiking behavior of the recorded neurons, not only in spike rate but also in spike shape. The effect
334 of temperature on neuronal activity has been reported before (see for example Hedrick and Waters
335 (2011), Hedrick and Waters (2012)). In our case, it leads to a disturbance in the waveforms of the
336 electric spikes and increased the spike count in the on condition compared to the off condition. The
337 extent of heat-related disturbance in the 2 V blocks made direct comparison of the two conditions
338 problematic and hindered the reliability of spike sorting results. We therefore decided to exclude those
339 data from the analysis.

340 **Discussion**

341 After having previously demonstrated that it is possible to record the magnetic signatures correlated
342 to ERPs *in vivo* (Caruso et al., 2017), we performed two sets of experiments in an attempt to measure
343 magnetic signatures of APs *in vivo*. Our initial approach of using simple amplitude thresholds to detect
344 electric spikes revealed the importance of reliable spike sorting methods in order to avoid artifacts
345 caused by correlated electro-magnetic noise. With the refined spike sorting approach, we identified
346 four single units with significant magnetic signatures around the time of the electric spike. The
347 waveform of this magnetic signature was highly correlated with the waveform of the electric signal
348 and was significantly bigger in the DC-on than the DC-off control condition for all four units. Since the
349 number of single units that can be identified using two Tungsten electrodes is low, we increased the
350 single unit yield by performing additional experiments with silicon electrode arrays mounted directly
351 onto the GMR sensors. We were able to record a large number of single units with this arrangement.
352 However, none of the units recorded with silicon probes showed a magnetic spike signature that was
353 statistically significant. When increasing the sensitivity of the GMR by increasing the voltage applied
354 to it, we observed a clear heating artifact and had to exclude the data recorded with this setup from
355 further analysis.

356 We obtained magnetic signatures of electrically recorded spikes only from a small proportion of the
357 units recorded with Tungsten electrodes and from none of the units recorded with silicon probes. The
358 silicon probes were attached to the Magnetrode and thereby created an obligatory distance to a
359 neuron of at least the probe thickness (15 μ m). This distance was orthogonal to the main orientation
360 of neuronal dendrites in the recorded areas. The distance might have prevented successful magnetic
361 recordings. Using silicon probes in different spatial configurations with respect to the magnetic sensor
362 could potentially avoid this problem and is an interesting option for future research. By contrast, the
363 Tungsten electrodes had conical tips that left a gap between the Tungsten tip and the magnetic
364 sensors. In this gap, neurons could come in very close proximity to the magnetic sensors. It is even

365 conceivable that neurons were “trapped” in this gap during probe insertion. Note that in one case, a
366 magnetic spike signature was detected on sensor 2, which was 250 μm above sensor 1 with the
367 immediately neighboring Tungsten tip, but this separation was parallel to the main orientation of
368 neuronal dendrites in the recorded areas. The pattern of results is consistent with successful magnetic
369 recordings requiring that the distance between the neuron and the magnetic sensor be very small.
370 Even at this distance, averaging of many action potentials, based on simultaneous electric recordings,
371 was required to reveal the magnetic signature. Further improvements in sensitivity will be required to
372 enable the direct magnetic recording of individual action potentials *in vivo*. Yet, our approach
373 demonstrates a proof of principle and it provides a measurement of the amplitude of the magnetic
374 action potential, which is crucial for further developments in this area.

375 We observed that magnetic spikes tended to show a very slight temporal lead over electric spikes, and
376 that the capacitive component during DC-off tended to show a very slight temporal lead over the
377 magnetic component during DC-on. Overall, the observed shifts were very small, in the range of one
378 sample, corresponding to 40 microseconds. There are a number of factors that could generate or
379 influence these shifts: (1) The electrode has an impedance spectrum that generates phase delays and
380 thereby time delays. (2) The magnetrode signal is recorded via an electronic circuit that generates
381 small, but non-negligible time delays. (3) The magnetic signal on the one hand and the electric and
382 capacitive signal on the other hand reflect different underlying processes. The magnetic signal most
383 likely reflects primary intracellular ionic currents, occurring after the AP has emerged at the AP-
384 initiation zone and invades the cell body. The electric and capacitive signals most likely reflect
385 extracellular return currents. The return currents are thought to occur simultaneous to the primary
386 intracellular currents, yet they are expected to have a different spatio-temporal profile. Furthermore,
387 the magnetic versus the electric recordings (and to a lesser extend the magnetic versus the capacitive
388 recordings) are expected to have slightly different spatio-temporal integration profiles. These factors
389 together can lead to small time shifts between magnetic versus electric or capacitive signals. These
390 considerations are also relevant for the question of whether the observed magnetic signal has a dipolar
391 or quadrupolar source. We consider it most likely that we measured a dipolar source. Dipolar sources
392 arise in the cell body, and thus from the biggest magnetic field. Quadrupolar sources are mainly limited
393 to the axon and/or the axon initial segment with the AP-initiation zone and are probably too small to
394 be recorded by our sensors. Additional support for this argument is provided by the fact, that the axon
395 and the axon initial segment are approximately rotationally geometric, which would further cancel
396 quadrupolar field contributions.

397 A previous attempt at measuring APs using magnetoresistance in slices from mouse brain provided
398 promising preliminary results (Amaral et al., 2011). However, in these experiments, it was not possible
399 to separate a putative magnetic signal from potential capacitive coupling. To achieve this separation,
400 several subsequent studies using magnetoresistance, including the present one, used different
401 approaches. Barbieri et al. (2016) APs in a muscle-nerve preparation and used a control for capacitive
402 coupling that was possible in this specific setting: they turned the muscle fiber by 90 degree, which is
403 expected to rotate the magnetic signal out of the direction of sensitivity of the magnetic probe. Caruso
404 et al. (2017) used a high-frequency (20-80 kHz) modulation-demodulation approach to successfully
405 separate a capacitive component from the visually evoked field. The signals measured in these
406 preparations were within the range predicted and estimated for *in vivo* recordings in the central
407 nervous system (Petridou et al., 2006; Hall et al., 2012). Finally, here, we used a new approach enabled
408 by new technical developments that allowed us to record interleaved DC-on and DC-off conditions.
409 The DC-off condition provides a clear estimate of the capacitive component, which was much lower
410 than observed in the study of Amaral et al. (2011). While our approach was able to identify a magnetic
411 AP signal that exceeded a putative capacitive component, and while it was able to measure AP signals

412 from isolated single neurons, it was not (yet) able to measure the magnetic counterpart of single APs.
413 Rather, we needed to use the simultaneously recorded electric spike signals to trigger the averaging
414 of the magnetic signal and thereby reveal the magnetic AP recordings. For the empirical data, we used
415 a threshold of at least 7000 electric spikes for this averaging process. We also calculated the theoretical
416 limit for this number, given the observed noise spectra (Fig 2). In the frequency range up to 1 kHz, the
417 noise spectra show a typical $1/f$ pattern, and the probe's intrinsic noise is around $2 \frac{nT}{\sqrt{Hz}}$, which
418 corresponds to a detection level of $2 \times \sqrt{1000} = 63nT$. In the frequency range between 1 and 6 kHz,
419 the noise spectra are at the thermal noise of $300 \frac{pT}{\sqrt{Hz}}$, corresponding to 21 nT, such that the detection
420 level is at $\sqrt{63^2 + 21^2} = 66$ nT. This means that to measure a signal of 1nT with an SNR of 1, one
421 needs to have $66^2 = 4356$ acquisitions.

422 Magnetic recordings of action potentials from isolated axons have been achieved with nitrogen-
423 vacancy (NV) centers in diamonds placed in close proximity to the squid giant axon or a large worm
424 axon (Barry et al., 2016). However, this imaging technique is currently still limited to sensor placement
425 outside of the examined tissue rather than within it. By contrast, our miniaturized GMR sensors can be
426 introduced into nervous tissue, very similar to standard silicon-based electrodes. Interestingly, the
427 peak-to-peak magnetic signal amplitude measured with NV diamond sensors from squid giant axons
428 or isolated large worm axons placed directly onto the sensor were in the range of 4 nT. This is within
429 the range of peak-to-peak amplitudes that we measured *in vivo*. Murakami and Okada (2006) predicted
430 current dipoles in the order of 1 pAm; at 10 μ m distance; for a 100 μ m long neuron compartment, this
431 would lead to around 200 pT, and for a 10 μ m long structure, like the soma, 2 nT would be reached.
432 Since the giant squid axon is larger in size than a neuron, it is theoretically expected to give a larger
433 amplitude signal than the neuron. Yet, Murakami and Okada (2015) demonstrate that current dipole
434 moment density is invariant across brain structures and species. Furthermore, by introducing the
435 sensor into the tissue, we might have brought it closer to the source than previous studies (Barry et al.
436 (2016) report 1.2 mm from the center of the axon in the intact worm, 300 μ m in the excised worm).
437 The greater proximity might have compensated for the smaller source size. A variety of parameters of
438 the experimental paradigm and experimental conditions will influence the magnetic amplitude (Roth
439 and Wikswo, 1985) and might explain some differences between theoretically predicted and
440 empirically observed signals. Those parameters could not be measured in our *in vivo* recordings. For
441 example, we do not know the precise spatial relation between the sensor and the signal source, and
442 we do not know whether the spike signal originated fully or partly from the axon (initial segment) or
443 the cell soma. These parameters might have been particularly favorable in the subset of our Tungsten-
444 electrode recordings that led to detected magnetic spikes, and might thereby have contributed to
445 relatively large observed magnetic field strengths.

446 As a non-invasive method to map magnetic fields induced by neuronal firing, Xiong et al. (2003) used
447 a special acquisition technique in a conventional MRI scanner. They succeeded to greatly improve the
448 temporal accuracy when scanning human subjects. However, a later study was not able to replicate
449 this MRI approach to map neuronal activity (Parkes et al., 2007). Petridou et al. (2006) also used MRI
450 scanning methods to measure activity in neuronal cell cultures. They were successful in detecting
451 magnetic signals of neural activity. Additionally, new scanning paradigms have been suggested to use
452 MRI to record magnetic signatures of ongoing neuronal activity *in vivo* (Sundaram et al., 2016; Truong
453 et al., 2019; Roth, 2023). Yet, these measurements cannot be achieved at single neuron resolution,
454 and the temporal constraints of MRI measurements make it nearly impossible to detect magnetic
455 signature of single spikes.

456 A recent publication (Waterstraat et al., 2021) used MEG to record single-trial population spikes in
457 humans. While this is an impressive extension of the MEG technology, it is not possible to perform this
458 type of measurement at the level of spiking of individual neurons. Thus, with regard to magnetic
459 recordings of action potentials from single neurons, the main candidate technologies are NV diamonds
460 and GMR. For GMRs, this study provides a proof of principle for such recordings *in vivo*.

461 In order to increase the yield of magnetic AP recordings using our miniaturized GMR sensors, it would
462 be very helpful to have electrodes integrated on the same probe as the GMR sensors. The two types
463 of sensors would then be on the same needle and in one plane and could be brought very close
464 together. The probes we used did contain electrode sites, but these were not functional due to
465 technical difficulties during probe production. Future efforts might be directed towards integrating
466 functional electrode sites without introducing additional noise in the GMR.

467 Alternatively, adding multiple additional magnetic sensors could also improve the yield of magnetic AP
468 recordings. While this would increase the possibility to be in close vicinity to neurons and, using
469 different sensor orientations, to record signals from neurons with arbitrary spatial orientations, this
470 advancement would come with its own set of challenges. All GMR sensors would need to be connected
471 with separate sets of contact lines, and the number of these lines that can be implemented within one
472 probe is limited. Also, the more GMRs there are inside the tissue, the more substantial the sum of the
473 small temperature increases caused by each individual sensor will be. While this is not of concern when
474 using a small number of sensors (like in our current probe design), it already has an effect on spike rate
475 and any further heating of the tissue has been shown, also in this work, to affect the spiking behavior
476 of neurons in a substantial manner. Thus, while it would be beneficial to integrate more GMR sensors,
477 it currently is not straightforward to implement.

478 Another major improvement would be an increase in the sensitivity of the GMR sensors themselves.
479 In the existing probes, sensitivity can only be improved by increasing the current through the sensor.
480 If this could be achieved without temperature increases, the sensor would be capable of detecting
481 smaller fields than it currently can and thus reduce the need to average across a large number of spike
482 events to detect the magnetic signature. This would probably facilitate the recording of magnetic AP
483 signature more reliably and in a larger number of units. The development of sensors based on magnetic
484 tunnel junctions (Julliere, 1975; Yuasa et al., 2004; Sharma et al., 2017) might add another technical
485 approach worth of consideration for the Magnetrode, because they exhibit high sensitivity but require
486 lower bias currents. However, TMR sensors exhibit a larger low-frequency noise than GMR sensors,
487 and the limit of detection at 1 kHz is of the same order of magnitude (Fermon and Van de Voorde,
488 2016).

489 In conclusion, we demonstrated that it is possible, to use current state-of-the-art GMR sensors to
490 detect the magnetic signature of action potentials of single neurons. This opens a wide field of future
491 research questions, exploring the advantages that magnetic signals provide over electric recordings
492 and the added information one can gain by combining the two. We also identified a number of possible
493 technological improvements, which would make such magnetic recordings easier to achieve and to
494 upscale.

495

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500 **Author contributions**

501 Conceptualization, P.F., M.P.-L., C.F., F.J.K., and P.J.; Methodology: C.C., A.S., M.P.-L., and C.F.;
502 Investigation: F.J.K., P.J., C.C., A.S., M.P.-L., and C.F.; Analysis: F.J.K., P.J., M.P.-D., C.F., M.P.-L., and P.F.;
503 Writing – Original draft: F.J.K., M.P.-L., and P.F.; Writing – Review & Editing: All authors; Funding
504 Acquisition: M.P.-L., and P.F.

505 **Declaration of interests**

506
507 P.F. has a patent on thin-film electrodes and is a member of the Advisory Board of CorTec GmbH
508 (Freiburg, Germany).

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510

511 **Figure legends**

512 **Figure 1.** Biophysical background and recording setup. **A** Illustration of a pyramidal neuron and the
513 electric currents (purple) and magnetic fluxes (turquoise) generated by an action potential originating
514 at the soma and travelling along the axon. **B** Illustration of the recording setup. The anesthetized
515 animal was placed in a Faraday cage. We recorded simultaneously with electric (purple) and magnetic
516 (turquoise) sensors. All electronics necessary for the magnetic recording were contained within the
517 Faraday cage, and no electric connections were entering or leaving the cage. **C** Example raw traces for
518 the electric and magnetic sensors. Switches of the DC supply could occur pseudo-randomly every 10
519 seconds and are indicated here by shading (grey: DC on, white: DC off). A switch of the DC supply
520 caused an artifact on both sensors. As expected, the DC condition did not affect the recorded signal on
521 the electrode, while the GMR sensor can only detect magnetic signals in the DC on condition.

522 **Figure 2.** Power spectra of the GMR sensor. Example power spectrum from one *in vivo* (minimally
523 shielded) recording block and for a control recording with a similar sensor in air in a well shielded room.
524 The experimental condition spectrum shows peaks for electric line noise at 50 Hz and 150 Hz, and
525 additional noise peaks at 5, 9, and 23 Hz of unknown origin in the DC on condition. The peak at 30 Hz
526 in the well shielded room is due to a local coil used for calibration emitting a signal at that frequency.
527 Note that the axes are in logarithmic scales.

528 **Figure 3.** STAs on thresholded spikes. **A** Photo of the magnetic probe with two GMR sensors and one
529 Tungsten electrode glued onto it, and schematic drawing of the probe arrangement below the photo.
530 **B** Electric and magnetic STAs of one example recording session, with spikes detected at a threshold of
531 5 SDs (15.119 spike events detected at this threshold). Left plot shows the STAs resulting from
532 triggering the continuously recorded electric signal on the thresholded spikes from the same electrode.
533 Right plot shows the STAs of the signals recorded from the two magnetic sensors, respectively. All STAs
534 were calculated separately for the two recording conditions (red: DC on, blue: DC off). The STA on
535 magnetic sensor 2 (top right) shows a peak around the time of the spike only for the DC-on condition.
536 Shaded area represents standard error of the mean. **C** Same recording as in B, now with varying
537 thresholds. From left to right the threshold is increased from 2.5 SDs to 7.5 SDs in steps of 1.25 SDs.
538 The top row shows the electric STAs, the middle row the STAs for magnetic sensor 2, bottom row for
539 magnetic sensor 1. The threshold setting illustrated in B is marked with a black box. From left to right,
540 a decrease in the peak amplitude can be observed for the two magnetic sensors, while the peak in the
541 electric STA is becoming more pronounced. Shaded area represents standard error of the mean. Please
542 note that the y-axis scales are different for the different threshold settings.

543 **Figure 4.** STAs on thresholded versus spike-sorted data from Tungsten probes. **A** Electric and magnetic
544 STAs for one recording block. As the threshold increases from left to right in steps of 1.25 SDs, like for
545 the example shown in Fig 2, the electric STA (shown in the top row) becomes more pronounced, and
546 the magnetic STA on sensor one (in the bottom row) disappears. The peak on sensor 2 (middle row) is
547 less affected and still visible at higher thresholds. Shaded area represents standard error of the mean.
548 Please note that the y-axis scales are different for the different threshold settings. **B** Average waveform
549 and inter-spike interval (ISI) distribution for one example unit after spike-sorting the block shown in A.
550 **C** Top row: STA of the continuous data recorded on one of the 2 Tungsten electrodes triggered on the
551 spikes of example unit 1 per condition (red: DC on, blue: DC off). The number of spikes detected per
552 condition is given in the inset. Shaded area represents standard error of the mean. Middle row: STA
553 of the magnetic signal recorded on the magnetic sensor 2 per condition. The higher level of background
554 noise in the DC-on condition is expected. Bottom row: same as middle row but for magnetic sensor 1.
555 A clear magnetic signature can be observed on sensor 1 only in the DC-on condition. **D, E** Same as B,
556 C, but for example unit 2.

557 **Figure 5.** Correlation analysis of electric and magnetic waveforms. **A** Illustration of the correlation
558 analysis. Top left plot shows the demeaned central 2 ms of the electric STA of one well isolated single
559 unit. The top right plot shows the corresponding demeaned magnetic STA on sensor 1. We computed
560 the cross correlation values for shifts of +/- 10 samples around the time of the spike of the electric STA
561 with respect to the magnetic STA. The resulting distribution of correlation values can be seen in the
562 bottom plot. **B** Tungsten and magnetic-sensor signal, as well as cross-correlation values for the four
563 significantly correlated single units. Shaded area represents standard error of the mean. Not
564 significantly correlated signals are shown at decreased intensity. Unit 2 is the example used in A.
565 Significant correlations are marked by asterisks. **C** Table of signal strength for the significant magnetic
566 signals. The significant correlation with sensor 2 for unit 3 does not differ from chance in amplitude
567 when tested for on/off condition difference.

568 **Figure 6.** STAs on spike-sorted data from silicon probes. **A** Photo of the magnetic probe and the silicon
569 probe with 32 electric contacts glued onto it. Locations of the underlying GMR sensors are indicated
570 with red boxes. **B** Average waveform and inter-spike interval distribution for one example unit. **C** Top
571 row: STA of the continuous data recorded on one of the 32 electric channels triggered on the spikes of
572 example unit 3 per condition (red: DC on, blue: DC off). The number of spikes detected per condition
573 is given in the inset. Shaded area represents standard error of the mean. Middle row: STA of the
574 magnetic signal recorded on the magnetic sensor 2 per condition. The higher level of background noise
575 in the DC-on condition is expected. No apparent magnetic signature can be observed for either
576 condition. Bottom row: same as middle row but for magnetic sensor 1. **D, E** Same as B, C, but for
577 example unit 4.

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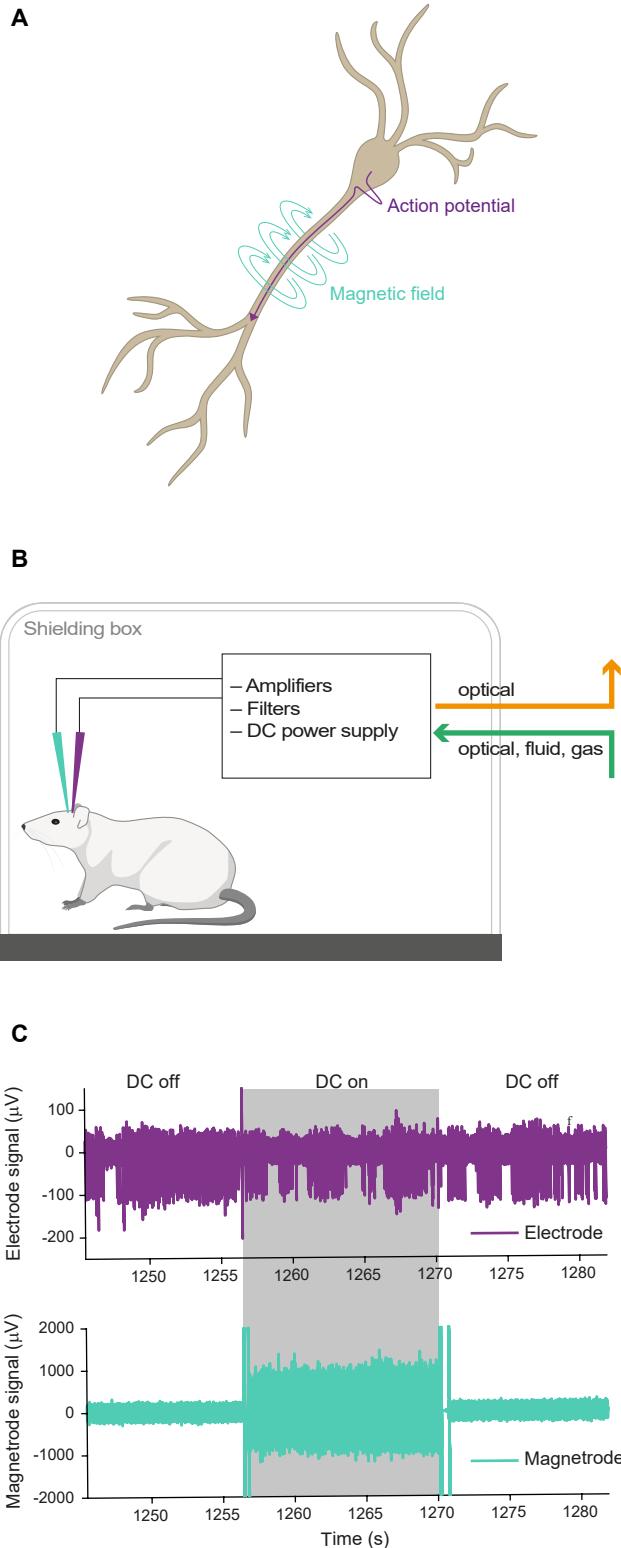
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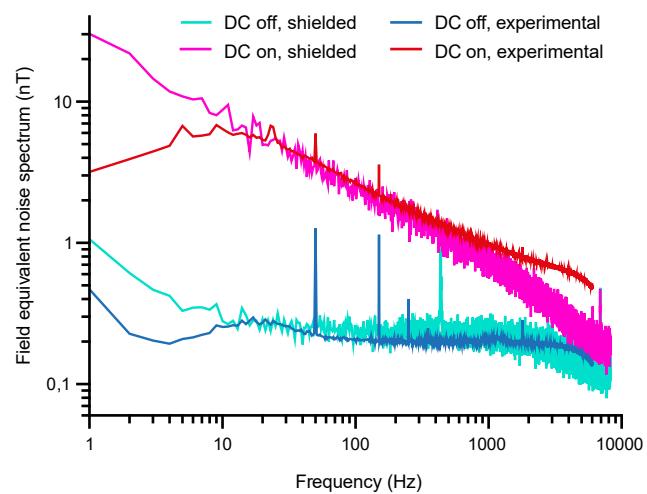
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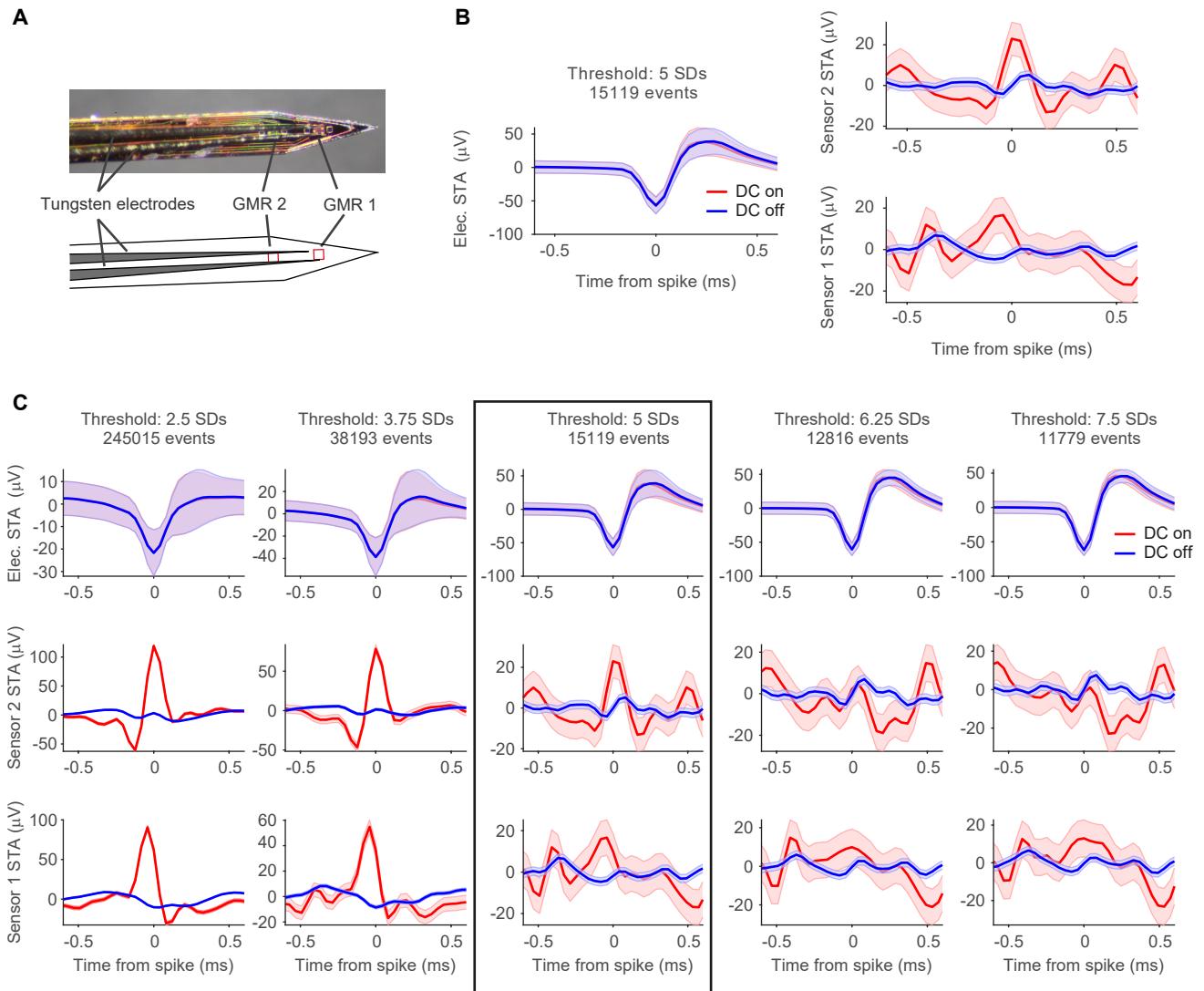
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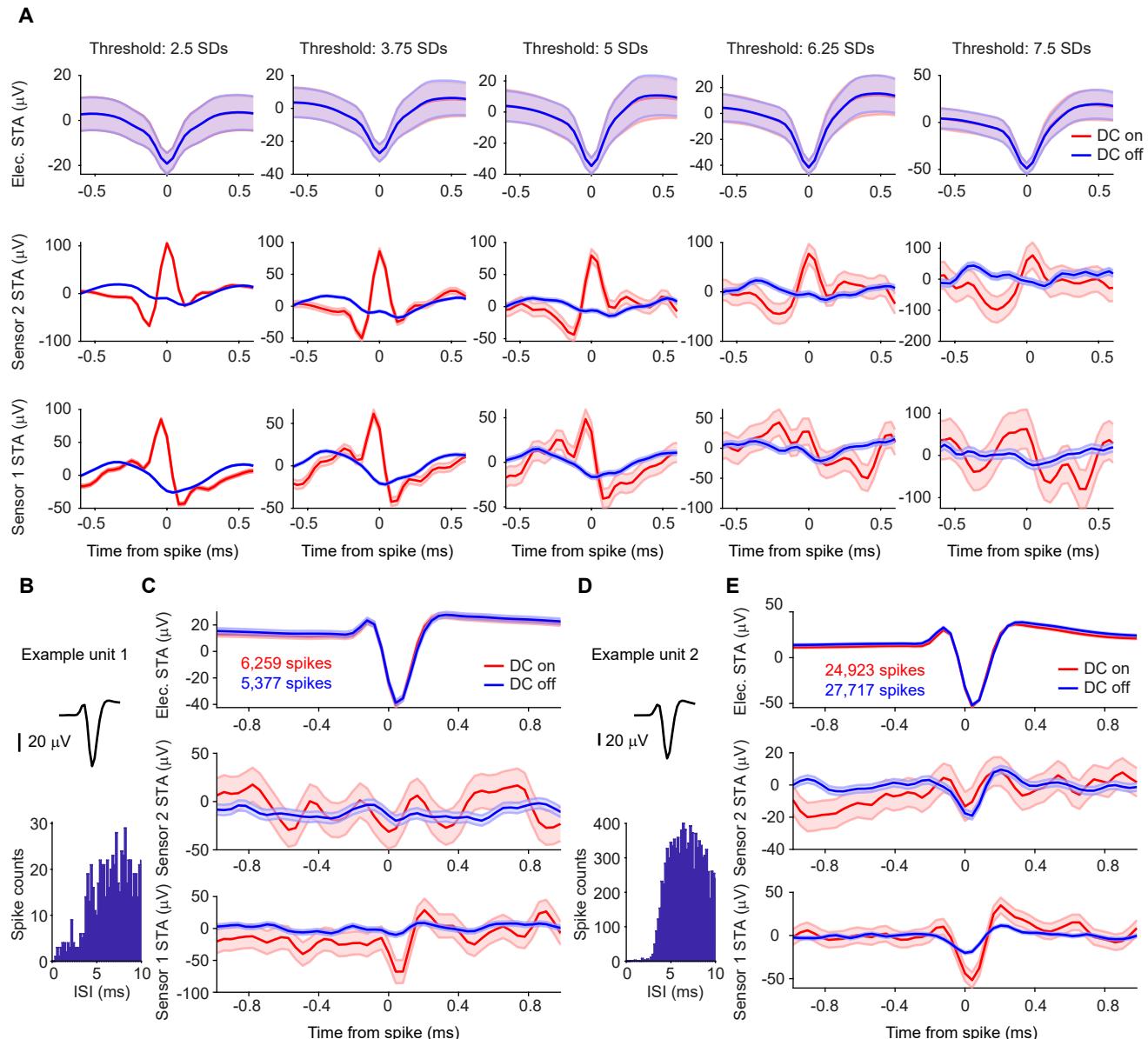
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Klein et al., Fig 2





Klein et al., Fig 4

