Ultrafine Magnetic Particles: A DIET-Proxy in Organic Rich Sediments? 3

4	Andrea Ustra, University of São Paulo, Brazil
5	Carlos Alberto Mendonça, University of São Paulo, Brazil
6	Aruã Leite, Géosciences Environment Toulouse, France
7	Melina Macouin, Géosciences Environment Toulouse, France
8	Rory Doherty, Queen's University of Belfast, United Kingdom
9	Marc Respaud, LPCNO-INSA Toulouse, France
10	Giovana Edery Tocuti, University of São Paulo, Brazil
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Abstract

In this work we present results of the magnetic properties characterization of sediment samples from a brownfield site that is generating methane biogas in São Paulo - Brazil. We applied interpretation procedures (frequency dependent susceptibility and time-dependent Isothermal Remanent Magnetization) appropriate to study the ultrafine magnetic fraction response of the samples. The higher content of superparamagnetic (SP) particles correlates well with the detected biogas pockets, suggesting that the methanogens activity produces these ultrafine particles, different from the magnetic particles at other depth levels. We propose the use of two simple measurement and interpretation techniques to identify such magnetic particles superparamagnetic fingerprints. The results presented here support the use of environmental magnetism techniques to investigate biogeochemical processes of anaerobic microbial activity.

Introduction

51 Organic matter buried in anaerobic environments (e.g., landfills or organic-rich 52 sediments) is oxidized through a series of biogeochemical processes producing methane 53 and carbon dioxide as major products (Christensen, 2010). The well-known electron 54 sources for carbon dioxide reduction to methane are H₂ (Sieber et al., 2012) or other 55 dissolved carriers (Bryant et al., 1967; Stams and Plugge, 2009). Recent findings 56 however have shown that Methanosaeta and Methanosarcina species can directly accept 57 electrons from *Geobacter* as donors via direct interspecies electron transfer (DIET), in 58 this process reducing carbon dioxide to methane (Chen et al., 2014a; Chen et al., 2014b; 59 Rotaru et al., 2014a; Rotaru et al., 2014b; Wang et al., 2016; Xiao et al., 2018). Possible 60 mechanisms of electron transfer in DIET-based syntrophy seem to be through electrified 61 paths formed bypili-like appendages with conductive minerals or outer cell electrical 62 connectors of adjacent partners (Lovley, 2017). DIET connection of Methanosaeta with 63 Geobacter species has been recognized (Summers et al, 2010; Lovley 2011; Shrestha et al. 64 2013a; Shrestha et al. 2013b) and assumed as a major player in global methane budget 65 (Rotaru et al. 2014b). Methane production based on DIET can be stimulated by 66 introducing conductive particulates (Martins et al., 2018), such as biochar (Chen et al., 67 2014; Xiao et al., 2019); carbon cloth (Li et al., 2018a) and magnetite nanoparticles (Kato 68 et al., 2012; Zhang and Lu, 2016; Xiao et al., 2018) suggesting the importance of 69 conductive particulate to shuttle interspecies electron-transport.

In principle, syntrophic DIET associations can sustain methanogenesis in H₂
 depleted environments (or other dissolved carriers) by directly coupling iron-reducing
 bacteria with methanogens. It is accepted that the partnership between *Geobacter* and

Methanosarcina can competitively exclude acetoclastic methanogens like *Methanothrix* in the absence of dissolved electron carrier (Rotaru et al., 2018).Paddy soil incubation of ferrihydrite indicates that methanogenesis is initially suppressed as magnetite grains are produced and *Geobacter* proliferates, and then enhanced as DIET develops using the magnetite network for interspecies electrical connections (Liu et al, 2015). Other species such as *Syntrophomonas* have been proposed as candidates for DIET with *Methanosaeta* suggesting that many microorganisms are capable of DIET processes (Zhao et al., 2018).

80 Magnetite production and alteration then may develop a major role in DIET 81 syntrophy, either in stages in which Fe(III) reduction are catalyzed by iron-reducing 82 bacteria as used to convey electron-transfer between interspecies partners. Iron speciation 83 by dissimilatory iron-reducing bacteria is widespread in waterlogged soils (Lovley, 1987, Maher and Taylor 1988) and their importance for iron cycling in such environments 84 85 makes them a key potential source of ultra-fine soil magnetite (Roberts, 2015). A proxy 86 characterizing defined by concentration and properties of magnetite properties (grain size 87 and mineral type, for example) may be useful to recognize a biogeochemical process 88 active in modern environments or recorded in continuous coring recordings of 89 sedimentary sequencesbasins. Adiversity of iron-reducing microorganisms can convert 90 poorly crystalline Fe(III) oxy/hydroxides to extracellular magnetite while using Fe(III) as 91 an electron acceptor for the oxidation of organic compounds (Lovley et al., 2004). The Fe 92 (III) reducing bacteria Geothrix has been shown to produce magnetite at brownfield sites 93 (Klueglein et al., 2013) and it has been suggested the Geothrix can act in syntrophy with 94 methanogens though not necessarily via a DIET mechanism (Sutcliffe et al., 2018). 95 Common Fe(III) minerals in soils and sediments are hematite (α -Fe₂O₃), ferrihydrite 96 (5Fe₂O₃.9H₂O) or oxyhydroxides goethite (α -FeOOH), lepidocrocite(γ -FeOOH). The 97 reduction ofFe(III) minerals to produce magnetite (Fe₃O₄) is energetically favorable 98 (~0.01 eV), adding 1 Bohr magneton (9.27×10⁻²⁴ Am²) to the crystalline frame, which 99 represents a magnetization upgrade of about 25% (Liu et al., 2012).

100 Depending on culture conditions and bacterial forms (Vali et al., 2004), the respiration of 101 iron-reducing bacteria based on solid Fe(III) mineral phases produces extracellular 102 magnetite crystals (Lovley et al., 1987; Lovley, 1991; Coker et al., 2008) of ultrafine size 103 (spherical grains with diameters between 10 and 50 nm) depending on culture conditions 104 and bacterial forms (Vali et al., 2004). The extracellular crystallization process results in 105 particles that lacking characteristic unique morphology but usually with 106 superparamagnetic (SP) properties at room temperature (Moskowitz et al., 1993). The 107 superparamagnetic response is observed when single-domain, ferromagnetic minerals are 108 bellow a critical blocking volume, unable to sustain permanent magnetization at room 109 temperature. Incubation of metal-reducing bacteria with Fe(III) oxyhydroxides have 110 produced magnetite nanoparticles with diameters between 10 and 15 nm for bacterium 111 Geobacter sulfurreducens (Byrne et al., 2015) and between 26 nm to 38 nm for 112 bacterium Shewanella (Lee et al., 2008). Magnetite grains with distinct shape and characteristic size sustaining stable magnetization are generated by magnetotactic 113 114 bacteria in the form intracellular magnetite chains which act as a compass to guide these 115 microorganisms at surface watersredox boundaries (Komeili, 2012). These well-formed grains may settle in the bottom of lakes or marine coastal sediments, mixed with 116 magnetite grains carried by erosion from geological background media. 117 Magnetotaticmagnetites usually are found with characteristic grain sizes above the 118

119 eritical blocking volume, supporting stable single-domain (SSD) 120 magnetization (Bazylinski and Frankel 2004). In many environments the magnetic 121 properties associated to ultrafine magnetite particles must be isolated in order to better 122 understand the superparamagnetic signature associated to iron-reducing bacteria and their 123 role in DIET syntrophy.

124 In this paper we study a trapped gas pocket formed in Quaternary organic 125 sediments by expelling interstitial pore water, by tracking specific mineral changes that 126 can be associated to biogeochemical processes. We focus our analysis on changes 127 regarding the magnetic carrier mineralogy analyzing the frequency dependent 128 susceptibility and time-dependent Isothermal Remanent Magnetization (IRM) to detect 129 subtle physical and compositional variations that could be indicative of a DIET process. 130 In addition to classic techniques used in environmental magnetism (thermomagnetic and 131 hysteresis curves) we apply specific procedures to characterize the SP mineral content in 132 terms of volume variations and concentration quantitative estimates along a cored section 133 that intercepts a methane pocket trapped within organic-rich sediments. We recognize an 134 association between iron-reducing bacteria and occurrence of SP minerals at a region 135 were iron-reduction is developed and methane accumulation observed, possibly 136 according to a DIET scheme.

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Research Site

139 The studied site is situated at a flood plain of the Tietê River, in São Paulo - SP, Brazil.
140 The area contains a series of anthropogenic deposits (~4 m) that overlies Quaternary
141 fluvial sediments (~6 m) and Neogene sandstones. The entire site was formerly used as a

142 large drying pool for dredged sediments when a nearby channel was opened. The 143 sediments settled in the pool kept under anoxic conditions the organic-rich sediments of 144 the fluvial plain inducing methanogenic processes and methane trapping within sandy 145 lenses at different depths of the section. Two main methane pockets were sampled along 146 This site was investigated with three multilevel monitoring wells, each one with 15 gas 147 and water sampling ports 0.6 m spaced down to able to sample gas and water until 8.6 m 148 in the Quaternary section depth (Mendonça et al., 2015a). Continuous samples of direct-149 push coring were analyzed for total content of organic carbon and grain size laser 150 diffraction Mendonça et al., (2015a). The shallower accumulation corresponds to the 151 vadose zone. The trapped pockets of biogas were identified within a thick 152 (approximately 6 m) layer of organic-rich sediments, with organic carbon up to 40% in 153 weight. The pockets of methane were confirmed by direct gas sampling from the 154 multilevel monitoring wells (Fig. 1a). The shallower accumulation (top at ~ 2.5 m) has 155 pressure equilibrated to the atmosphere, while the deeper gas reservoir (depth $\sim 6 \text{ m}$) is 156 overpressured to about 0.4 to 0.5 kPa above the atmosphere. Gas composition in both reservoirs is enriched in CH₄, about 37-45% of CO₂ to 55-63% CH₄, with traces of H₂S 157 158 (~30 ppm). The piezometric surface is relatively flat, with a hydraulic gradient of 0.0082 towards the river channel. High permeability (12-62 cm day⁻¹) of the surface 159 160 anthropogenic layer does not work as an efficient sealing unit for gas pockets volumes 161 reaching the vadose zone but it facilitates water recharge and removal of gas in this zone 162 as the water infiltrates. A monthly based ERT (Earth Resistivity Tomography) imaging 163 recognized one episode with methane release and paths for water infiltration during rainy 164 periods (Mendonça et al., 2015b).

165 Sediments recovered from groundwater sampled from the multi-wells underwent 166 microbial analysis. Groundwater sampled from the multi-wells underwent microbial 167 analysis. Procedures for microbial DNA extractions, bacterial and archaeal 168 pyrosequencing, and sequence analysis are described in Mendonça et al. (2015b). It was 169 found that the methane-producing archaea Methanosaeta are ubiquitous in the 170 environment and probably generates the methane and carbon dioxide gas pockets trapped 171 beneath impervious layers (Fig 1b). The distribution of methanogens is well correlated 172 with the methane pockets and higher levels of acetate. Methanosaeta species have high 173 affinity for acetate (Lee et al., 2014) and are ubiquitous in many natural environments. 174 Methanosaeta species are also capable of direct interspecies electron accepting from 175 some Geobacter species for the reduction of carbon dioxide to methane (Rotaru et al., 176 2014b). Based on these findings we undertook a sampling regime of the recovered cores 177 for magnetic properties characterization to identify if there is a relationship between 178 methane production within gas pockets and the production of biogenic magnetic minerals 179 in soils at the same horizons.

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Magnetic properties characterization

Magnetic properties of soils and rocks are strongly dependent upon magnetic carrier grain size, which are classified as multi domain(MD), stable single domain(SSD) (e.g., up to 50 nm for magnetite), pseudo single domain(PSD) or '*vortex*' structure. Magnetic particles formed by dissimilatory iron-reducing bacteria are typically ultrafine, as such generating mineral carriers with superparamagnetic properties(e.g, ultrafine magnetite or greigite) from reducing Fe(III) minerals from background geological media.To characterize the 188 magnetic properties within and in the vicinity of the methane pockets 21 sediment 189 samples from direct pushing coring (every 0.5 m, from 0.5 to 10.5 m deep) were analysed 190 with focus on their superparamagnetic content, by using FDS (frequency dependent 191 susceptibility) and SPDM (superparamagnetic concentration and dipole moment) 192 analysis.

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194 Thermomagnetic curve

195 In this analysis, magnetic susceptibility changes as a function of temperature are 196 recorded. The high temperature protocol consists of measurements during the heating 197 stage, from room temperature to approximately 700°C and then repeating measurements 198 while the sample cools to room temperature. High temperature curves are useful to 199 identify changes of mineral phase that take place at specific temperatures (e.g, Curie 200 temperature T_C or Néel temperature T_N). T_C marks the sudden loss of magnetization when 201 a ferri- or ferro-magnetic mineral becomes paramagnetic in temperatures $T > T_C$. For magnetite, $T_C \sim 580^{\circ}$ C. T_N is the analogous of the Curie temperature in antiferromagnetic 202 203 minerals such as hematite ($T_N \sim 675^{\circ}$ C), where the mineral becomes paramagnetic at 204 temperatures $T > T_N$ (Dunlop and Özdemir, 2001).

Thermomagnetic curves can also show magnetic carrier size effect, such as the Hopkinson peak (sudden increase of susceptibility temperature until a peak reached before T_C). Özdemir and Dunlop (2014) reported a systematic trend of the Hopkinson's peak height with magnetic grain size for natural magnetite samples. Also recognizable is mineral phase transformations as the sample is heated and cooled. In this case, the heating and cooling curves are distinguishable from one another and are said to be irreversible, revealing mineralogical transformations caused by dehydration or change inthe sample redox state.

The measurements presented in this work were taken with Kappabridge KLY-4S at USPMAG (University of São Paulo), at the heating rate of 0.2°C/second under inert Ar atmosphere.

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217 Magnetic Hysteresis

Hysteresis cycles are designed to observe the ability of a ferromagnetic material to acquire permanent magnetization under an external magnetic field. This feature is usually investigated by first applying a strong field magnetic (H) so that the magnetization (M) is saturated. As H is then decreased to zero, M does not fall to the origin. If the field increases in the opposite direction, M gradually falls to zero to then reverse again as the saturation magnetization is reached. Repeated cycling of H traces out the *hysteresis loop*.

The standard hysteresis parameters Mr, Ms, Hc, and Hcr (where Mr is the saturation remanence, Ms is the saturation magnetization, Hc is the coercive force, and Hcr is the coercivity of remanence) represent the bulk magnetic properties of the sample and are often used to characterize geological samples. Low coercivity materials will produce hysteresis loops of rectangular shape and mixtures of minerals with different coercivities may produce constricted hysteresis loops that are narrow in the middle section but wider above and below this region (wasp-waisted) (Tauxe et al., 1996, 2002).

The analysis of hysteresis loops at different temperatures may reveal changes in the magnetic domain state for the magnetic minerals. Magnetic grains below a certain particle size, for example, do not preserve magnetic remanence above a critical temperature, when the superparamagnetic condition is activated (Dunlop and Özdemir,2001).

We used the Physical Properties Measurement System (PPMS) Quantum Design using a vibrating sample magnetometry (VSM) to record hysteresis loops at 300, 25, 10 and 5 K and maximum external field of approximately 5×10⁴Oe.

- 239
- 240 First-order Reversal Curves (FORC)

FORC diagrams (Pike et al., 1999; Roberts et al., 2000) provide further magnetic minerals and domain states characterization and the extent of magnetostatic interactions. FORC measurements start by saturating a sample in a strong positive field *Hr*, followed by changing the field to a negative field *Hr* and then sweeping it back to *Hr*. The difference between successive FORCs arises from irreversible magnetization changes that occur between successive reversal fields. FORCs distributions are interpreted in terms of the coercivity distribution and the interaction field distribution.

248 For example, an assemblage of noninteracting single domain particles produces closed 249 concentric contours with negligible vertical spread of the FORC distribution, in contrast 250 with the closed concentric contours with high vertical spread produced by interacting 251 single domain particles. The superparamagnetic behavior is dominant in the FORC 252 distribution when the measurement time is comparable to the relaxation times of particles 253 near the SP-SSD threshold size (Pike et al., 2001). Multidomain particles produce a 254 different feature in the FORC diagram, where the magnetic interactions among domain 255 walls produce asymmetric contours, which make it straightforward to discriminate these 256 particles.

258 Frequency Dependent Susceptibility (FDS)

FDS aims to quantify the SP-SSD response in terms of grain size variation able to explain the dependence of the magnetic susceptibility with grain size fining from a reference SSD characteristic volume. This formulation is based on the Debye relaxation model (Ustra et al. 2018) by considering measurements with three-frequency susceptibilimeters usually employed to characterize superparamagnetic contents in soil and rock magnetism. According to this model, the in-phase (or real) magnetic susceptibility $\chi_r = \chi(f)$ for an

assemblage of uniform magnetic carrier is
$$\chi_r = \chi_h + \Delta \chi \frac{1}{1 + (2\pi f \tau)^2}$$

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where χ_h is the FDS high-frequency limit, $\Delta \chi = \chi_l - \chi_h$ with χ_l as its corresponding lowfrequency limit and τ is relaxation time constant. For measurements with a set of at least three frequencies f (e.g., 976, 3904 and 15616 Hz as for the MFK1-FA Kappabridge susceptibility meter) the FDS data allow solving for unknown parameters ($\chi_h, \Delta \chi, \tau$) according to a constrained, non-linear data-fitting procedure (Ustra et al., 2019). Once determined such model parameters are used to determine the transition parameter, $F_t = \chi_1/\chi_h = v/v_c$, that relates the mean volume v for the particle assemblage with

274 respect to a characteristic volume
$$v_c = \frac{2k_BT}{\mu_0 H_K M_S}$$

standing for the respective mineral grains in the SP-SSD transition, in which M_s is the sample saturation magnetization [Am⁻¹], $k_B 1,38 \times 10^{-23}$ [JK-1] is the Boltzmann constant and T [K] is the temperature, H_K [Am-1] is the sample macroscopic coercivity and

 $\mu_0 = 4\pi \times 10^{-7}$ [Hm-1] is the free space permeability. The quantity F_t^{-1} , such that 278 $v_c = F_t^{-1}v$, can be regarded as a fining proxy since it expresses how much the particles go 279 finer having as reference the characteristic volume for the grain. As discussed by Ustra et 280 al. (2019) the determination of volume v according to the Neel's model $v = v_c \ln(\tau/\tau_0)$ is 281 inaccurate using inferences for τ from data sets with three-frequencies only. 282 Characteristic time τ_0 is a time-factor varying from 10^{-12} to 10^{-8} s (Dormann *et al.* 1996; 283 Worm 1998). We use the MATLAB program FDS inv.m (Ustra et al., 2019) to invert the 284 285 three-frequency dataset acquired with Kappabridge MK1 at LabCore (University of São 286 Paulo).

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288 Superparamagnetic Concentration and Dipole Moment (SPCDM)

289 The SPCDM procedure developed by Leite et al. (2018) is based on Neél's model for superparamagnetism for which sample magnetization $M(B_i,T)$ is dependent of the 290 external applied field (B_i) and temperature $M(B_i,T) = M_s L\left(\frac{\mu B_i}{k_s T}\right)$ in which μ is the 291 mean moment of dipole[Am²] of the magnetic carrier composing the sample; B_i is the 292 external magnetic field applied to the sample, L is the Lagrange function such that 293 $L(\alpha) = \operatorname{coth}(\alpha) - 1/\alpha$. The magnetization is such that $M_s = n\mu$, the term η [m⁻³] 294 295 expressing the concentration (number of particles per volume) of the magnetic carriers. For a sample with density ρ [kgm⁻³], the mass concentration of the magnetic carriers is 296 obtained by η/ρ . The moment of dipole of the particle is such that $\mu = v\sigma_s$ where σ_s is 297 298 the magnetization saturation for the magnetic carrier. The SPCDM procedure isolates the

superparamagnetic contribution $M(B_i, T)$ by applying a set of external fields $B_i(i = 1:17)$ 299 300 B_i ranging from 5 to 340 mT, by using a precise MicroMag3900 magnetometer, at 301 USPMAG (University of São Paulo). These magnetization values provide unknown 302 parameters (M_s, μ) from which estimates about particle concentration $(\eta = M_s/\mu)$ and particle volume ($v = \mu/\sigma_s$) can be achieved. For volume estimates, the magnetization of 303 304 pure magnetite can be assumed in most cases. In summary, the SPCDM provides 305 saturation magnetization (M_s) , the particle moment of dipole μ and, from these, particle concentration η [m-3] and grain volume v, if saturation magnetization σ_s for mineral 306 307 carrier is known.

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309 Results and discussion

310 The thermomagnetic measurements presented in Fig. 2 served as a preliminary analysis 311 to identify the magnetic mineralogy diversity at the site. All heating curves captured the 312 magnetic susceptibility increase above 250 – 300 °C, indicating transformations of iron 313 a reducing atmosphere (Hanesch et al., 2006).indicating (hydr)oxides under 314 transformations of ferrihydrite minerals to more stable forms. While heating, the magnetic susceptibility increases with temperature to around 400 - 580 °C, followed by a 315 316 significant loss of magnetization, indicating the occurrence of magnetite. The magnetic 317 susceptibility increase indicates transformations of paramagnetic or clay minerals into 318 magnetite (Roberts, 2015). The formation of new magnetite (and sometimes, goethite, 319 with an increase in the magnetic susceptibility around T=120°C) is supported by the 320 irreversible behavior in the cooling curves, which exhibit higher values of magnetic 321 susceptibility.

It is possible that ferrihydrite is being converted to magnetite, a common product of bacterial Fe(III) hydroxide reduction. The precipitation of magnetite in ferrihydrite reduction by dissimilatory Fe(III)-reducing microorganisms has been reported by several studies (e.g., Lovley et al., 1987; Vali et al., 2004; Coker et al., 2008, Zhuang et al., 2015).

327 Even though magnetite is visible in the irreversible thermomagnetic curves, the presence 328 of magnetite in the soils, prior the transformation of ferrihydrite into goethite/magnetite is 329 verified in the FORC diagrams. Figure 3 (a) shows a clear SD-like behavior on 2.5m 330 (anthropogenic sediments) with small asymmetrical spread (higher towards the positive 331 area) in the Bu axis, peaking around zero, indicating little to no magnetic interaction. The 332 coercivity distribution peak in Bcis around 20mT, evidence of magnetite, in accordance 333 to the thermomagnetic curves. Figure 3 (b) shows the FORC diagram from the sample 334 collected at 6m (Quaternary sediments). A maximum coercivity peak close to the origin 335 at around 5mT indicates a prevalent reversible component of magnetization (Sagnotti and 336 Winkler, 2012), with open contours diverging asymmetrically on the Bu axis, showing 337 resemblance to SP dominated population of grains (Roberts et al., 2014). The FORC also 338 shows strong interaction fields (Bu) spreading until coercivities of 40mT. 339 We then searched for evidence of SP-SSD particles, before applying quantitative

interpretation techniques based on the SP SSD magnetic response. Samples collected at
depths of 2.5 and 8 m were submitted to hysteresis cycles taken at distinct temperatures
(Fig. 4a, 4b and 4c, respectively). Below room temperature, the magnetization processes
are irreversible and produces the ferromagnetic hysteresis loop. However, Figs 4a (2.5m)
and 4b (8.0 m) capture the magnetic carrier's inabilities to sustain magnetization at room

temperature (300 K, also shown as insets graphs), producing a superparamagneticresponse of the sigmoidal shape of a ferromagnetic response, but losing the loop.

347 With evidence of SP-SSD particles in the magnetic particles assemblages, quantitative 348 interpretation techniques based on the SP-SSD magnetic response were applied. Fig. 5 shows the depth profiles of the measured magnetic susceptibility, F_t^{-1} obtained from FDS 349 350 measurements and superparamagnetic particles concentration, n. Magnetic susceptibility 351 measurements (Fig. 5a) show that the shallower portion of the soil is more magnetic and 352 MS decreases with depth. The high MS in the uppermost 2.5 m is attributed to the 353 unsaturated sediments magnetic properties. The maximum value of magnetic 354 susceptibility is observed at 2.5m, a known zone of gas pocket. Even though magnetic 355 susceptibility decreases with depth, around 6.5 m it increases again, at a depth coincident 356 with the second gas pocket zone. The parameter F_t^{-1} (Fig. 5b), an estimation of the SP-357 SSD size variations, reveals that magnetic particles present a more significant frequency 358 effect at 4.5 m and 6.5m. We interpret that magnetic carriers size variations in the SP-359 SSD threshold are more significant at these two depths, which is at the boundary of the 360 second gas pocket zone. The superparamagnetic particles concentration (SP 361 concentration) profile (Fig. 5c) shows two peaks, which agree with the gas pockets 362 depths (0.5-2.5, 5-6 m and 10.5 m). This result suggests that the magnetic responses on 363 these samples are strictly due to superparamagnetic particles, with no significantchange 364 in particle size(F_{\pm}^{-1} closer to 1).

365 The high MS values are not always in agreement with high SP particles shown by η , 366 demonstrating that that increasing content of SP ferrimagnetic particles alone cannot 367 account for the variations of magnetic susceptibility of all samples. This apparent 368 contradiction results from the limitations of both the FDS and the SPCDM methods. The
369 FDS method captures a relaxation from magnetic particles within the SP-SSD threshold,
370 in the 976-15616 Hz AC field frequency range. On the other hand, the SPCDM captures
371 faster relaxations, which are produced by finer particles (higher relaxation frequencies).
372 In this study, both methods were complementary, delimiting a zone of increasing the

abundance SP-SSD particles (high F_t^{-1} and low η) and a zone of mostly SP particles (low F_t^{-1} and high η).

In the unsaturated zone, from 0.5 to 2.5 m, we believe that superparamagnetic particles are formed in a different process that will not be discussed in this work, where the grain size is not affected. The linear correlation between MS and η shown in Figure 6 evidence that Nevertheless, η follows the same pattern as magnetic susceptibility within this anthropogenic layer, suggesting the magnetic response of this portion is dominated by the superparamagnetic particles. F_t^{-1} closer to 1 supports the interpretation that these depths are dominated by the superparamagnetic particles.

When superparamagnetic particles are predominant, they dominate the susceptibility and SPCDM signals, but the frequency effect is little because there are little variations of the grain size distribution of the sample. In terms of bio-precipitation, this may be reflecting that most of the Fe-bearing particles are being used by microorganisms.

Even though magnetic signatures are a result of the magnetic grain sizes, this investigation approach does not aim to estimate the magnetic grain sizes and rather seek for these grains fingerprints. Moreover, the complex history of the site reminds us to expect an assemblage of grain sizes. This aspect enhances the usefulness of our quantitative interpretation procedures, which isolates and quantifies the ultrafine content.

392 In general, the distribution of SP minerals correlates well with the detected methanogens, 393 suggesting that the SP particles of magnetite at these depths are anaerobically produced 394 by iron-reducing dissimilatory microorganisms such as, Geobacter and Geothrix. There 395 may be further syntrophy with methanogens such as Methanosaeta where Geobacter can 396 further be involved in the DIET mechanism. Microbial analysis (Fig. 1) supports the 397 hypothesis of DIET as the methane producing mechanism at depths where 398 superparamagnetic particles achieve highest concentrations. We propose a conceptual 399 model of magnetic particles size range associated with the DIET hypothesis. Figure 7 400 illustrates the transformation of ferrihydrite into magnetite by iron reducing bacteria and 401 the electron transfer to methanogens archaea. The DIET zone in this case is identified by 402 a region of high SP content, surrounded by coarser particles within the SP-SSD threshold. 403 Other non-DIET reactions with Fe(III) reducing bacteria such as Geothrix with may also 404 have a role in the production of magnetite (Klueglein et al., 2013) and there may be 405 some syntrophy with Methanosaeta (Sutcliffe et al., 2018). 406 407 Conclusions 408 409 Magnetic properties measurements revealed the ultrafine magnetic particles occurrence in

a brownfield site. The distribution of superparamagnetic concentration correlates well with the detected methanogens in gas pockets, suggesting that the microbial activity producing methane is producing these ultrafine particles, different from the magnetic particles produced at other depths. The results presented here support the use of

414	environmental magnetism techniques to investigate biogeochemical processes of
415	anaerobic microbial activity. Possibly, this kind of superparamagnetic fingerprintcan be
416	found in non-active methanogenic basins but recorded by magnetic mineralogy once
417	preserved.
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429	References
430	
431	Bryant, M. P., Wolin, E. A., Wolin, M. J., Wolfe, R. S. (1967). Methanobacillu
432	somelianskii, a symbiotic association of two species of bacteria. Arch. Mikrobiol. 59, 20-
433	31. https://doi.org/10.1007/BF00406313.
434	Byrne, J. M., Klueglein, N., Pearce, C., Rosso, K. M., Appel, E., Kappler, A. (2015).
435	Redox cycling of Fe (II) and Fe (III) in magnetite by Fe-metabolizing bacteria. Science,
436	347, 1473–1476. https://doi.org/10.1126/science.aaa4834.

- 437 Chen, S, Rotaru, A. E., Shrestha, P. M., Malvankar, N. S., Liu, F., Fan, W., Nevin, K.P.,
- 438 Lovley, D. R. (2014a). Promoting interspecies electron transfer with biochar. Sci Rep
- 439 4:5019. https://doi.org/10.1038/srep05019.
- 440 Chen, S., Rotaru, A. E., Liu, F., Philips, J., Woodard, T. L., Nevin, K. P., Lovley, D. R.
- 441 (2014b). Carbon cloth stimulates direct interspecies electron transfer in syntrophic co-
- 442 cultures. BioresourTechnol 173:82–86. https://doi.org/10.1016/j.biortech.2014.09.009.
- 443 Christensen, T. R.(2010). Wetlands in methane and climate change: Earthscan Ltd.
- 444 Coker, V. S., Bell, A. M. T., Pearce, C. I., Pattrick, R. A. D., Van der Laan G., Lloyd, J.
- 445 R. (2008). Time-resolved synchrotron powder X-ray diffraction study of magnetite
- formation by the Fe(III)-reducing bacterium Geobacter sulfurreducens, Am. Mineral.,
- 447 93(4), 540–547. https://doi.org/10.2138/am.2008.2467.
- 448 Dormann, J. L., D'Orazio, F., Lucari, F., Tronc, E., Prené, P., Jolivet, J. P., Fiorani, D.,
- 449 Cherkaoui, R., Noguès, M. (1996). Thermal variation of the relaxation time of the
- 450 magnetic moment of γ -Fe2O3 nanoparticles with interparticle interactions of various
- 451 strengths, Phys. Rev. B., 53(21), 14291. https://doi.org/10.1103/PhysRevB.53.14291.
- 452 Dunlop, D.J. &Özdemir, O. (2001). Rock Magnetism: Fundamentals and Frontiers,
 453 Cambridge Univ. Press.
- 454 Hanesch, H., Stanjek, H., Petersen, N. 2006. Thermomagnetic measurements of soil iron
- 455 minerals: The role of organic carbon. Geophysical Journal International, 165, 53-61.
- 456 https://doi.org/10.1111/j.1365-246X.2006.02933.x.
- 457 Kato, S., Hashimoto, K., Watanabe, K. (2012). Microbial interspecies electron transfer
- 458 via electric currents through conductive minerals. ProcNatlAcadSci USA 109:10042-
- 459 10046. https://doi.org/10.1073/pnas.1117592109.

- 460 Klueglein, N., Lösekann-Behrens, T., Obst, M., Behrens, S., Appel, E., Kappler, A.
- 461 (2013) Magnetite Formation by the Novel Fe(III)-reducing Geothrix fermentans Strain
- 462 HradG1 Isolated from a Hydrocarbon-Contaminated Sediment with Increased Magnetic
- 463Susceptibility.GeomicrobiolJ30:863-873.
- 464 https://doi.org/10.1080/01490451.2013.790922
- 465 Komeili, A. (2012). Molecular mechanisms of compartmentalization and
 466 biomineralization in magnetotactic bacteria. *FEMS Microbiol Rev* 36: 232–255.
- 467 Lee, J.H., Roh, Y., and Hur, H.G.(2008). Microbial production and characterization of
- 468 super paramagnetic magnetite nanoparticles by Shewanella sp. HN-41. Journal of
 469 Microbiology and Biotechnology, 18, 1572–1577.
- 470 Lee, J., Hwang, B., Koo, T., Shin, S.G., Kim, W., Hwang, S. (2014) Temporal variation
- 471 in methanogen communities of four different full-scale anaerobic digesters treating food
- 472 waste-recycling wastewater.Bioresour. Technol., 168 (3), 59-63.
- 473 <u>https://doi.org/10.1016/j.biortech.2014.03.161</u>.
- 474 Leite, A. S., Mendonça, C. A., Moraes, P. L. A., Ustra, A. T. (2018). A procedure for 475 quantitative characterization of superparamagnetic minerals in environmental 476 magnetism. Geophysical Journal International, 215 (3), 1974–1984. 477 https://doi.org/10.1093/gji/ggy395
- 478 Li, Y., Zhang, H., Tu, C., Luo, Y. (2018). Magnetic characterization of distinct soil layers
- and its implications for environmental changes in the coastal soils from the yellow river
- 480 delta. Catena 162, 245–254.
- 481 Liu, F., Rotaru, A. E., Shrestha, P. M., Malvankar, N. S., Nevin, K. P., Lovley, D. R.
- 482 (2015). Magnetite compensates for the lack of a pilin-associated c-type cytochrome in

- 483 extracellular electron exchange. Environ Microbiol 17: 648–655.
 484 https://doi.org/10.1111/1462-2920.12485.
- 485 Liu, F., Rotaru, A., Shrestha, P. M., Malvankar, N. S., Nevin, K. P., Lovley, D. R. (2012).
- 486 Promoting direct interspecies electron transfer with activated carbon. Energy Environ Sci
- 487 5:8982. https://doi.org/10.1039/c2ee22459c.
- 488 Lovley, D. R. (2017). Syntrophy goes electric: direct interspecies electron
- 489 transfer. Annual review of microbiology, 71, 643-664. https://doi.org/10.1146/annurev-
- 490 micro-030117-020420.
- 491 Lovley, D. R. (2011). Live wires: direct extracellular electron exchange for bioenergy
- 492 and the bioremediation of energy-related contamination. Energy Environ Sci 4:4896-
- 493 4906. https://doi.org/10.1039/c1ee02229f.
- 494 Lovley, D. R., Holmes, D. E., Nevin, K. P. (1991). DissimilatoryFe(III) and Mn(IV)
- 495 reduction. Adv Microb Physiol. 2004, 49, 219-286. https://doi.org/10.1016/S0065-
- 496 2911(04)49005-5
- 497 Lovley, D.R. (1991). Magnetite formation during microbial dissimilatory iron reduction,
- 498 in Iron Biominerals, pp. 151–166, eds Frankel, R.B. & Blakemore, R.P., Springer.
- 499 Lovley, D., Stolz, J., Nord, G., Phillips, E. J. P. (1087). Anaerobic production of
- 500 magnetite by a dissimilatory iron-reducing microorganism. Nature 330, 252–254.
- 501 https://doi.org/10.1038/330252a0
- 502 Maher BA, Taylor RM. (1988). Formation of ultrafine-grained magnetite in
- 503 soils.Nature336:368 370. https://doi.org/10.1038/336368a0

- Martins, G., Salvador, A. F., Pereira, L., Alves, M. M. (2018). Methane production and
 conductive materials: a critical review. *Environmental science & technology*, 52(18),
 10241-10253. <u>https://doi.org/10.1021/acs.est.8b01913</u>.
- Mendonça, C. A., R. Doherty, A. Fornaro, E. L. Abreu, G. C. Novaes, S. S. Fachin, Jr.,
 and M. A. La-Scalea. (2015a). Integrated earth resistivity tomography (ERT) and
 multilevel sampling gas: A tool to map geogenic and anthropogenic methane
 accumulation on brownfield sites: Environmental Earth Science, 74, 1217–1226.
 https://doi.org/10.1007/s12665-015-4111-6.
- 512 Mendonça, C. A., Doherty, R., Amaral, N. D., McPolin, B., Larkin, M. J., Ustra, A.
- 513 (2105b). Resistivity and Induced Polarization Monitoring with Microbial Ecology of
- 514 Biogas Dynamics on a Brownfield Site. Interpret, 4 (3): SAB43-SAB56.
- 515 <u>https://doi.org/10.1190/INT-2015-0057.1</u>
- 516 Moskowitz, B. M., Frankel, R. B., Bazylinski, D. A. (1993). Rockmagnetic criteria for
- 517 the detection of biogenic magnetite. Earth Planet. Sci. Lett. 120, 283–300.
- 518 <u>https://doi.org/10.1016/0012-821X(93)90245-5</u>.
- 519 Pester, M., Bittner, N., Deevong, P., Wagner, M., Loy, A. (2010). A 'rare biosphere'
 520 microorganism contributes to sulfate reduction in a peatland. *ISME J* 4: 1591–1602.
- 521 Pike, C. R., A. P. Roberts, K. L. Verosub (1999). Characterizing interactionsin fine
 522 magnetic particle systems using first order reversal curves. J. Appl. Phys., 85, 6660–
 523 6667.
- 524 Pike, C. R., A. P. Roberts, and K. L. Verosub (2001). FORC diagrams andthermal
- relaxation effects in magnetic particles.Geophys. J. Int., 145,721–730.

- Roberts, A. P., C. R. Pike, and K. L. Verosub (2000). FORC diagrams: Anew tool for
 characterizing the magnetic properties of natural samples. J. Geophys. Res., 105, 28,461–
 28,475.
- 529 Roberts, A. P., Heslop, D., Zhao, X., & Pike, C. R. (2014). Understanding fine
- 530 magnetic particle systems through use of first-order reversal curved agrams. *Reviews of*
- 531 Geophysics, 52(4), 557-602. Roberts, A. P. (2015) Magnetic mineral diagenesis, Earth
- 532 Sci. Rev., 151, 1–47. https://doi.org/10.1016/j.earscirev.2015.09.010.
- 533 Rotaru, A. E., Calabrese, F, Stryhanyuk, H., Musat, F., Shrestha, P. M., Weber, H. S.,
- 534 Snoeyenbos-West, O. L. O., Hall, P. O. J., Richnow, H. H., Musat, N., Thamdrup, B.
- 535 (2018). Conductive particles enable syntrophic acetate oxidation between Geobacter and
- 536 Methanosarcina from coastal sediments. mBio 9:e00226-18.
 537 https://doi.org/10.1128/mBio.00226-18.
- 538 Rotaru, A. E., Shrestha, P.M, Liu, F., Markovaite, B., Chen, S., Nevin, K. P., Lovley, D.
- 539 R. (2014a). Direct interspecies electron transfer between Geobacter metallireducens and
- 540 Methanosarcinabarkeri. Appl Environ Microbiol 80:4599–4605.
 541 https://doi.org/10.1128/AEM.00895-14.
- Rotaru, A. E., Shrestha, P. M., Liu, F., Shrestha, M., Shrestha, D., Embree, M.,
 Zengler,K., Wardman, C., Nevin, K. P., Lovley, D. R.(2014b). A new model for electron
 flow during anaerobic digestion: direct interspecies electron transfer to Methanosaeta for
 the reduction of carbon dioxide to methane. Energy Environ Sci, 7:408–415.
- 546 https://doi.org/10.1039/C3EE42189A.

- 547 Sagnotti, L., & Winkler, A. (2012). On the magneticcharacterization and quantification of
- the superparamagnetic fraction of traffic-relatedurbanairborne PM in Rome,
 Italy. *Atmospheric environment*, 59, 131-140.
- 550 Shrestha, P. M., Rotaru, A. E., Summers, Z. M., Shrestha, M., Liu, F., Lovley, D. R.
- 551 (2013a). Transcriptomic and genetic analysis of direct interspecies electron transfer.
- 552 Applied and Environmental Microbiology 79: 2397–2404.
 553 https://doi.org/10.1128/aem.03837-12.
- 554 Shrestha PM, Rotaru AE, Aklujkar M, Liu FH, Shrestha M, Summers ZM, Malvankar
- 555 N, Flores DC, Lovley DR. 2013b. Syntrophic growth with direct interspecies electron
- transfer as the primary mechanism for energy exchange. Environmental Microbiology
- 557 Reports 5: 904–910. https://doi.org/10.1111/1758-2229.12093.
- 558 Sieber, J. R., McInerney, M. J., Gunsalus, R. P. (2012). Genomic insights into syntrophy:
- the paradigm for anaerobic metabolic cooperation. Annual Review of Microbiology
- 560 66:429–452. https://doi.org/10.1146/annurev-micro-090110-102844.
- 561 Stams, A. J. M., Plugge, C. M. (2009). Electron transfer in syntrophic communities of
- anaerobic bacteria and archaea. Nat. Rev. Microbiol. 7, 568–577.
- 563 Summers, Z. M., Fogarty, H. E., Leang, C., Franks, A. E., Malvankar, N. S., Lovley, D.
- R. (2010). Direct exchange of electrons within aggregates of an evolved
 syntrophiccoculture of anaerobic bacteria. Science 330:1413–1415.
 https://doi.org/10.1126/science.1196526.
- 567 Sutcliffe B, Chariton AA, Harford AJ, et al (2018) Insights from the Genomes of
- 568 Microbes Thriving in Uranium-Enriched Sediments. Microb Ecol 75:970-984.
- 569 https://doi.org/10.1007/s00248-017-1102-z.

- Tauxe, L., Pick, T., & Constable, C., 1996. Wasp-waists, pot-bellies, and
 superparamagnetism. *Journal of Geophysical Research B: Solid Earth*, *101*(95), 571–
 583.
- 573 Tauxe, L., Bertram, H. N., &Seberino, C., 2002. Physical interpretation of hysteresis
- 574 loops: Micromagnetic modeling of fine particle magnetite. Geochemistry, Geophysics,
- 575 *Geosystems*, *3*(10). https://doi.org/10.1029/2001GC000241
- 576 Ustra, A., Mendonça, C. A., Leite, A., Jovane, L., Trindade, R. I. F. (2018). Quantitative
- 577 interpretation of the magnetic susceptibility frequency dependence. Geophysical Journal
- 578 International, 213 (2), 805–814. https://doi.org/10.1093/gji/ggy007.
- Ustra, A., Mendonça, C. A., Leite, A., Jaqueto, P., Novello, V. F. (2019). Low field
 frequency dependent magnetic susceptibility inversion.Computers& Geosciences, 133,
 104326.https://doi.org/10.1016/j.cageo.2019.104326.
- 582 Vali, H., B. Weiss, Y. L. Li, S. K. Sears, S. S. Kim, Kirschvink, J. L., Zhang, C. L.
- 583 (2004). Formation of tabular single-domain magnetite induced by Geobacter metallic
- reducens GS-15, Proc. Natl. Acad. Sci. U.S.A., 101(46), 16,121–16,126,
 doi:10.1073/pnas.0404040101.
- 586 Wang, L. Y., Nevin, K. P., Woodard, T. L., Um, B. Z., Lovley, D. R. (2016). Expanding
- the diet for DIET: electron donors supporting direct interspecies electron transfer (DIET)
- in defined co-cultures. Front Microbiol 7:236. https://doi.org/10.3389/fmicb.2016.00236.
- 589 Worm, H.U. (1999). Time-dependent IRM: A new technique for magnetic granulometry,
- 590 Geophys. Res. Lett., 26(16), 2557–2560.
- 591 Xiao, L., Liu, F., Liu, J., Li, J., Zhang, Y., Yu, J., Wang, O. (2018). Nano-Fe3O4 particles
- 592 accelerating electromethanogenesis on an hour-long timescale in wetland soil.

- 593 Environ. Sci. Nano 5, 436–445.
- Xiao, L., Wei, W., Luo, M., Xu, H., Feng, D., Yu, J., Huang, J., Liu.F. (2019) A potential
- 595 contribution of a Fe(III)-rich red clay horizon to methane release: Biogenetic magnetite-
- 596 mediated methanogenesis. CATENA, 181,
- 597 104081.https://doi.org/10.1016/j.catena.2019.104081.
- 598 Zhang, J., Lu, Y. (2016). Conductive Fe3O4 nanoparticles accelerate syntrophic methane

production from butyrate oxidation in two different lake sediments. Front Microbiol
7:1316. https://doi.org/10.3389/fmicb.2016.01316.

- 601 Zhao Z, Li Y, Yu Q, Zhang Y (2018) Ferroferric oxide triggered possible direct
- 602 interspecies electron transfer between Syntrophomonas and Methanosaeta to enhance
 603 waste activated sludge anaerobic digestion. Bioresour Technol 250:79–85.
- 604 https://doi.org/10.1016/j.biortech.2017.11.003.
- 605 Zhuang, L., Xu, J., Tang, J., Zhou, S. (2015). Effect of ferrihydrite biomineralization on
- 606 methanogenesis in an anaerobic incubation from paddy soil, J. Geophys. Res.Biogeosci.,
- 607 120, 876–886. https://doi.org/10.1002/2014JG002893.
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Figures





Figure 1:(a)Gas composition sampled in a multi-level borehole and (b) Typicalbacterial
and archaeal genus-level taxonomic profile of suspended sediment in groundwater from
different depths (modified from Mendonça et al., 2015b).Three water samples were
collected for bacterial and archaealpyrosequencing (Fig. 1b).



Figure 2: Magnetic susceptibility changes with temperature for samples collected at 1.5, 2.5, 4, 6.5 and 8 m, during sample heating(red) and cooling (blue). The samples are representative of the anthropogenic deposits (a-c) and the Quaternary sediments (organic (d-e). The different values of susceptibility measured when comparing the heating and cooling curves reveal mineralogical transformations caused by dehydration or change in the sample redox state in the heating process.

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Figure 3: FORC distribution of sample collected at (a) 2.5 m (anthropogenic deposit sediments) and (b) 6.0 m (Quaternary sediments). At 2.5 m the contours present small asymmetrical spread in the Bu axis, with a peak around zero, indicating single domain behavior with little to no magnetic interaction. The coercivity distribution peak in Bcaround 20mT is evidence of magnetite. At 6.0 m, open contours diverging asymmetrically on the Bu axis indicate dominance of SP population of grains.



Figure 4: Hysteresis cycles at distinct temperatures: (a) 2.5 m and (b) 8 m and (c) 8 m.The samples are representative of the anthropogenic deposits (a) and Quaternary sediments (b). Inset graphs show in detail the measurements at room temperature. The ferromagnetic behavior is observed bellow room temperature. The superparamagnetic response is observed in (a) and (b) as a sigmoidal shape of a ferromagnetic response with no loop. This fingerprint is not visible in the hysteresis cycle in (eb).





Figure 5: Interpretation parameters: (a) Magnetic susceptibility, χ , (b) transition parameter, F_t^{-1} and (c) concentration of superparamagnetic particles, η . The gas pockets depths are highlighted in brown, orange and green. χ show a more magnetic soil at the vadone zone(depth < 2.5 m). F_t^{-1} indicates highest variations of magnetic particle sizes in the SP-SSD threshold at the boundaries of the second gas pocket zone(4.5 and 6.5 m). η is higher in the gas pockets depths than in the rest of core samples.



- 657 Figure 6: Linear correlation between magnetic susceptibility and SP particles content, for
- 658 the samples from the vadose zone.



Figure 7: Conceptual model illustrating the magnetic signatures observed across the
methane pockets. The transformation of ferrihydrite into magnetite by iron reducing
bacteria and the electron transfer to methanogens archaea. The DIET zone in this case is
identified by a region of high SP content, surrounded by coarser particles within the SPSSD threshold.

670 Supplementary material

671 The analysis was conducted for measurements of all samples collected in the well. Fig. 1 672 shows two examples of the data fit. Based on the results obtained with this inversion 673 method, we conclude that the magnetic susceptibility measurements were able to capture 674 the frequency dependence response and therefore this method is well suited to estimate 675 the frequency effect of the susceptibility, that is, the evaluation of the superparamagnetic 676 content. Fig. 2 presents two examples of the SPCDM, showing that this procedure is also 677 well suited for the samples used in this investigation. Note that even though both FDS 678 and SPCDM inversions interpret a viscosity phenomenon, the FDS inversion captures this response from particles within the SP-SSD range, while the SPCDM inversion 679 680 captures this response from the strictly SP particles.

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Figure 1: Quantitative interpretation of FDS data. (a) Magnetic susceptibility data measured at three frequencies (symbols) and spectral response of frequency dependent susceptibility (solid lines). The vertical dashed black lines represent the relaxation time $(1/2\pi f)$ boundaries constraints used in the inversion and the vertical solid lines represent the relaxation time obtained in the inversion. (b) and (c)Cross-plot of measured and calculated three-frequency susceptibility.



Figure 2: Data fit in the SPCDM procedure. Solid lines represent modeled data while symbols represent measurements. The magnetization M_0 is measured when the external field is on. The equilibrium magnetization Mq is achieved after the recording magnetization decay between 2 and 4 s after the external field is turned off (t = 0 s). M0 – Mq can be regarded as isolating the SP response and, as such, well suited for the SPCDM approach. The horizontal dashed lines represent the estimated saturation magnetization value obtained in the inversion. Red and blue colors are attributed to samples from depths 2.5 and 6.5 m.