### 1 Stridulations of *Melolontha spp.* larvae open up new possibilities for species-specific pest

### 2 monitoring in soils

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# 27 Abstract

28	Root-feeding Scarabaeidae larvae can pose a serious threat to agricultural and forest				
29	ecosystems, but many details of larval ecology are still unknown. We developed an acoustic				
30	data analysis method for gaining new insights into larval ecology. In a laboratory study, third				
31	instar larvae of Melolontha melolontha (n=38) and M. hippocastani (n=15) kept in soil-filled				
32	containers were acoustically monitored for 5 min each, resulting in the first known				
33	stridulation recordings for each species. Subsequent continuous monitoring of three M.				
34	hippocastani larvae over several hours showed that a single larva could stridulate more than				
35	70 times per hour, and stridulation rates increased drastically with increasing larval				
36	abundance. The new fractal dimension-based data analysis method automatically detected				
37	audio sections with stridulations and provided a semi-quantitative estimate of stridulation				
38	activity. It is the first data analysis method specifically targeting Scarabaeidae larvae				
39	stridulations in soils, enabling for the first time non-invasive species-specific pest monitoring.				
40					
41	Keywords: Melolontha spp., stridulation, Scarabaeidae, soil acoustic, fractal dimension				
42	analysis, soil pest monitoring				
43					
44	Key message:				
45	• Root-feeding scarab beetle larvae, known as white grubs, can be serious agricultural				
46	and forest pests.				
47	• White grub infestation monitoring is difficult due to their cryptic lifestyle, but detailed				
48	monitoring data is essential for effective pest control.				
49	• We present the first acoustic data analysis routine targeting stridulations, using				
50	Melolontha melolontha and M. hippocastani as model organisms.				
51	• This new method provides for the first time the basis for the development of tools for				
52	non-invasive, species-specific, and rapid white grub monitoring in soils.				

### 53 Introduction

54 The Melolonthinae, a subfamily of the scarab beetles (Scarabaeidae), comprises 29 tribes (Smith 2006) of which several pose a serious threat to agricultural and forest 55 ecosystems all over the world (e.g. Keller and Zimmer 2005; Jackson & Klein 2006; Frew et 56 al. 2016). The adult beetles have strong mandibles for mainly eating leaves, however serious 57 damage to trees and agricultural crops is first and foremost caused by the soil-dwelling, root-58 59 feeding larvae, also known as white grubs (Jackson and Klein 2006). In Europe, two species of Melolonthinae which have to be considered as important pest insects are Melolontha 60 melolontha (Common Cockchafer) and M. hippocastani (Forest Cockchafer) (Keller and 61 62 Zimmer 2005). These two species are very similar in their biology and are not host plant 63 specific. While *M. melolontha* can be found in more open habitats (e.g. pastures, vegetable crops, orchards, vineyards), *M. hippocastani* mainly thrives in deciduous forests (Wagenhoff 64 65 et al. 2014; Sukovata et al. 2015). Currently, these two species occur as pests in Austria, Czech Republic, France, Germany, Italy, Poland and Switzerland, but the available 66 monitoring data is incomplete (Keller and Zimmer 2005), and Melolontha spp. outbreaks are 67 expected to spread again after a decline in population sizes in the middle of the last century 68 (Kahrer et al. 2011). The reasons behind the recovery of Melolontha spp. populations are 69 70 mainly unknown (Kahrer et al. 2011), but are of serious concern as e.g. infested forest areas become more susceptible to droughts and secondary diseases, and forest regeneration can be 71 hindered (Immler and Bussler 2008; Wagenhoff et al. 2014; Sukovata et al. 2015). 72 73 Strategies to control white grub infestations of *Melolontha* spp. include mechanical (soil-covering nets, ploughing), chemical (pesticides) and biological (Beauveria spp., 74 nematodes) measures. These have been applied to various degrees of success during the past 75 century, but until today, there is no generally applicable, environmentally friendly pest control 76 strategy to control white grub infestations at agricultural and forest sites (Jackson and Klein 77 2006; Woreta 2015). One of the main reasons for this are the difficulties associated with 78

monitoring these soil-dwelling insects (Johnson et al. 2007). Due to their cryptic lifestyle,
white grubs can live for years unnoticed in the soil. The larvae of *M. melolontha* and *M. hippocastani* live three and four years, respectively, in the soil until they develop into the
adult chafer. During this time, the larvae pass three different instars. They only reach pest
status if the larval abundance surpasses a certain threshold (Immler and Bussler 2008; Frew et
al. 2016).

The current standard method for monitoring larval abundances and to confirm white 85 grub infestations is to excavate the soil. This type of monitoring is invasive, laborious and 86 time-consuming and cannot be performed at a high temporal frequency (Johnson et al. 2007; 87 88 Immler and Bussler 2008; Mankin et al. 2009). As a result, Melolontha spp. infestations can go unnoticed until severe damage to the vegetation becomes visible, larval abundances can be 89 underestimated, and many details of the larval ecology are still unknown. However, a 90 91 stringent monitoring and a detailed knowledge of a target species' ecology are essential for the development of environmentally friendly and successful pest control measures (Frew et al. 92 93 2016).

One way to improve the monitoring of *Melolontha* spp. larvae is the use of acoustics. 94 Acoustic sensors inserted into the soil have already been successfully applied for detecting 95 96 white grub infestations and also for the quantification of larval abundances non-invasively (Zhang et al. 2003; Mankin et al. 2009a; Mankin et al. 2011). However, these studies were 97 purely based on monitoring incidental sounds (movement, feeding sounds) and species 98 99 identification still had to be confirmed via soil excavations. Several different species belonging to the Melolonthinae can co-occur in soils – not all of them necessarily being 100 regarded as pest species (Jackson and Klein 2006) – and even for experts it can be difficult to 101 differentiate the species rapidly in the field when they are still in their larval stage. Especially 102 differentiation of *M. melolontha* and *M. hippocastani* larvae based only on morphological 103 features alone does not seem possible (Krell 2004). One promising way to overcome this 104

problem is to shift the focus of acoustic monitoring from incidental sounds to stridulations. 105 106 Stridulations are actively produced sounds for communication created by rubbing together certain body parts (Alexander and Moore 1963). Harvey et al. (2011) have shown for three 107 different Scarabaeoidea species that the larvae produce species-specific stridulation patterns. 108 Targeting larval stridulations has the potential to greatly improve pest monitoring by enabling 109 non-invasive, species-specific monitoring with high spatial and temporal coverage. However 110 111 thus far, stridulations have rarely been studied and never been utilized in field monitoring programs (Sprecher-Uebersax & Durrer 1998; Harvey et al. 2011). This study presents the 112 first stridulation audio recordings of M. melolontha and M. hippocastani larvae and 113 114 demonstrates their applicability for easy identification of these two species. We also designed 115 a new data analysis routine for rapid detection and quantitative estimation of *Melolontha* spp. stridulation events in soil audio recordings based on fractal dimension. *Melolontha* spp. were 116 117 chosen due to their pest status in Europe, but they also serve as model organisms for white grubs in general. The acoustic data analysis method presented here should be easily 118 transferable to other soil-dwelling Melolonthinae and Scarabaeidae species, providing for the 119 first time the basis for the development of tools for non-invasive, species-specific, and rapid 120 121 pest monitoring in soils, but also for soil biodiversity and soil insect ecology studies in 122 general.

123

#### 124 Material and methods

125 Cockchafer larvae for acoustic laboratory measurements

Acoustic measurements were performed with scarab beetle larvae of the species *Melolontha hippocastani* (Forest cockchafer) and *M. melolontha* (Common cockchafer). Thirty *M. hippocastani* larvae (second instar) were excavated in a mixed coniferous forest on sandy soil (Hessisches Ried, Pfungstadt, Germany) in November 2015, and individually kept in small plastic containers (100 ml) with perforated lids in the laboratory in the dark at near constant

room temperature (~17 °C). Each container was filled with soil from the excavation site. 131 132 Approximately every two weeks, carrot slices were added to the containers as food source and the soil sprayed with tab water to keep it from drying out. In the laboratory, the larvae shed 133 their exoskeleton once passing from second to third instar in March 2016. In June 2016, 15 134 larvae were randomly selected for acoustic monitoring in the laboratory. Seventy-five third 135 instar larvae of *M. melolontha* were excavated in a meadow on sandy soil (Blaubeuren-Weiler, 136 137 Germany) in May 2017, and transferred to the laboratory being kept in the same way as the M. hippocastani larvae. One week after excavation, 38 of these M. melolontha larvae were 138 randomly selected for acoustic monitoring. 139

140

#### 141 *Acoustic monitoring*

All acoustic measurements were conducted at room temperature (~20 °C) in a plastic 142 box (60 cm x 40 cm x 33 cm) insulated with acoustic foam to reduce background noises. 143 Detailed instructions for replicating the acoustic sensors described in the following paragraphs 144 can be obtained from David Chesmore. In the first experiment, each larva was acoustically 145 monitored for 5 min by placing one plastic container at a time into the box with a low-cost 146 sensor attached to the outside wall of the container. The sensor was self-made based on a 147 148 piezoelectric transducer (amplified, gain 20). It was connected to an external battery box which in turn was plugged into the microphone input of a commercially available audio 149 recorder (TASCAM Linear PCM Recorder DR-05 Version 2, TEAC Europe GmbH, 150 151 Wiesbaden, Germany). Sounds were recorded in .wav format with an audio sampling rate of 44.1 kHz. Audio recordings of *M. hippocastani* and *M. melolontha* were conducted in June 152 2016 and June 2017, respectively. For the *M. hippocastani* recordings, the box was placed in a 153 room with almost no background noises, whereas for the *M. melolontha* recordings, the box 154 was placed in a laboratory with a noisy environment. 155

After the acoustic screening of the *M. hippocastani* larvae, the three most sound-156 producing larvae from this population were selected for a second experiment. An acoustic 157 sensor consisting of a piezoelectric transducer encased in a water-proof, silicone sealed plastic 158 case (length: 21 cm, width: 3 cm, thickness: 0.5 cm) was positioned upright in a glass jar 159 (volume: 2.7 l, height: 24 cm, diameter: 10 cm). Subsequently, the glass jar was completely 160 filled with sandy soil from the original excavation site of the larvae. In the first step of the 161 162 experiment, one of the three selected *M. hippocastani* larvae was placed on top of the soil together with fresh carrot slices as food source. The larva had to burrow itself into the soil. 163 Upon placing the larva in the glass jar, sounds were recorded continuously with the buried 164 165 sensor for 12 hours. A new audio file was created every 50 min. Two weeks later, the remaining two selected *M. hippocastani* larvae were also added to the jar together with fresh 166 carrot slices. A new continuous audio recording was started, this time lasting for 18 hours. 167 168 Apart from the sensor, the audio recording equipment and the audio sampling rate were the same as in the first experiment. During the recordings, the silent box was stored in a room 169 170 with little background noise.

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172 Data analysis

In a first step, all audio files were bandpass filtered (200 – 5000 Hz) and normalized 173 (maximum amplitude -1.0 dB, DC offset removed) using the software Audacity 2.1.3 174 (Audacity Team 2017). Afterwards, stridulation events were manually detected and counted 175 by visual and audible inspection of each audio file. In a second step, a new data analysis 176 routine utilising fractal dimension was developed for automated rapid detection and 177 quantitative estimation of stridulation events based on the work of Schofield (2011). The data 178 analysis routine was written with the software R 3.4.3 (R Core Team 2017) utilizing the R 179 packages "fractaldim 0.8-4" (Sevcikova et al. 2014) and "tuneR 1.3.2" (Ligges et al. 2016) 180

(see Online Resource 1). It was applied to all audio files generated in the second experimentafter these files were pre-processed in Audacity as described.

In fractal dimension analysis, the waveform of an audio recording is considered as a 183 geometric shape and its complexity approximated through the calculation of scalar values 184 (Schofield and Chesmore 2008). The geometric complexity of stridulation events differs from 185 incidental larval sounds (movement, feeding sounds) or background noise. First, the pre-186 processed audio files were imported into R and sliced into 2 s long sections (sc), of which 187 only the amplitude values were extracted for further analysis (Fig. 1a). For each sc, fractal 188 dimensions (D) for the waveform were calculated twice with the madogram estimator 189 190 (Gneiting et al. 2010) and non-overlapping frames (f) using a frame size of 88.2 samples (= 2 ms) and 176.4 samples (= 4 ms), respectively. Subsequently for each f in sc, D was converted 191 into a fractal distance (FD) by calculating its median deviation from the median (md) (Leys et 192 193 al. 2013):

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195 
$$FD_f = (D_f - \text{median}(D_{sc})) / \text{md}(D_{sc})$$

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The FD timeseries with a frame size of 88.2 samples consisted of 1000 samples for 197 each sc. The FD timeseries with a frame size of 176.4 samples was linearly interpolated to 198 comprise the same amount of samples, and then both timeseries were summed up (SFD) (Fig. 199 1b). The SFD timeseries was utilized for the detection and quantitative estimation of 200 stridulations. First, the R function 'rle' (= run length encoding) was used to filter out all f with 201 SFD > -4.0. Second, all f were filtered out where SFD < -4.0 for more than 2 adjacent f. Third, 202 the time interval (in f) between the remaining f was calculated (TI). Clusters of single f with 203 SFD < -4.0 being spaced apart less than 10 TI within the clusters were indicative of 204 stridulation events (Fig. 1c). For each 50 min audio file, stridulation activity (STRAC) was 205

automatically estimated by multiplying *TI* 1 to 10 with their respective frequencies andsumming up the products.

- 208
- 209 **Results**

#### 210 *Stridulation patterns*

Stridulations by the two species were easily recognizable when listening to the audio 211 212 recordings. The common stridulations of *M. melolontha* and *M. hippocastani* consisted of short bursts of sound (Fig. 2). They were very similar and both peaked at a frequency of 213  $\sim$ 1700 Hz, however, *M. melolontha* stridulations were of longer duration than the ones of *M*. 214 215 hippocastani. Stridulations often occurred in pairs, but repetitions up to 4 times were also recorded. A second type of stridulation which was recorded less frequently from both species 216 217 consisted usually of 4 (seldom only 2 or 3) repeated patterns with a duration of  $\sim 250$  ms each 218 and a frequency peak at 3000 Hz (Fig. 3).

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#### 220 Distribution of stridulation events

During the 5 min acoustic screening of individual larvae, only few stridulations were 221 detected. In total, only 5 stridulations from 3 different individuals were recorded from the set 222 223 of 15 M. hippocastani larvae. Of the 38 M. melolontha larvae, 5 individuals were caught stridulating, producing 16 stridulations altogether. In contrast, numerous stridulations were 224 observed during the continuous acoustic monitoring of *M. hippocastani* larvae in the second 225 226 experiment (Fig. 4). The first larva which was placed in the soil-filled glass jar stridulated 75 times in the first 50 min after placement. The stridulation rate dropped to 15 stridulations h<sup>-1</sup> 227 over the next 4 h and subsequently, the larva almost completely stopped stridulating except 228 for a few single stridulation events. In total, the larva produced 188 stridulations during 12 h 229 of continuous recording. Stridulation activity drastically increased in the soil-filled glass jar 230 after adding 2 more larvae. In the first 2.5 h alone, the 3 M. hippocastani larvae stridulated 231

682 times. Afterwards, the stridulation rate levelled below 70 stridulations h<sup>-1</sup> with periods of
high activity alternating with periods of very low activity. Over the course of 18 h of
continuous recording, the 3 larvae produced 1100 stridulations.

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### 236 *Performance of data analysis routine*

For the fractal dimension analysis, the chosen f sizes of 88.2 and 176.4 samples were 237 238 best suited for describing the geometric complexity of stridulation events in the time domain, and thus for detecting them in the amplitude timeseries. For stridulation events, FD became 239 more negative in comparison to incidental sounds (movement and feeding sounds, 240 241 background noise, and interferences). Summing up the two FD time series for each analysed sc enhanced that effect, separating stridulations from incidental sounds even further along the 242 y-axis. A threshold value of -4.0 was determined to be most suitable for separating 243 244 stridulations from incidental sounds. Positive SFD values were associated with background noise and could be completely disregarded in any further analysis (Fig. 1b). 245 246 The SFD threshold value of -4.0 filtered out most of the incidental sounds, but for some of them SFD also fell below -4.0. However, the short bursts of sounds which made up 247 one stridulation event translated into a SFD timeseries in which a cluster of peaks with 248 249 individual peak widths of 1 or 2 f and spacing between peaks ranging from 2 to 10 f passed the threshold (Fig. 1b and 1c). For larval movement sounds and interferences, SFD peaks 250 passing the threshold were usually wider than 2 f, and not clustered. Thus, including the 251 252 second and third filter step in the data analysis routine significantly improved its capability for detecting stridulations while ignoring the majority of other sounds regardless of their origin. 253 254 The data analysis routine based on fractal dimension did not provide a direct count of stridulation events or of sound bursts within single stridulations in an audio recording. The 255 combined 1288 stridulations in the second experiment were spread only over 893 sc (= 30256 min) of the entire audio recordings. Stridulations were directly identified by the data analysis 257

258	routine in 379 sc (42 %). 274 sc (31 %) with stridulations contained only one SFD peak
259	passing the -4.0 threshold, no SFD peak clusters, and 240 sc (27 %) with stridulations were
260	not detected. However, there was a high degree of correlation between the automatically
261	calculated STRAC and the manually counted stridulations (Fig. 5).

262

#### 263 Discussion

264 It has long been known that Melolonthinae and other Scarabaeidae larvae possess stridulatory organs and morphological descriptions are available for many species (Wessel 265 2006). The first description for *M. melolontha* larvae stems from 1874 (Schiödte 1874). The 266 267 larval stridulatory organs in Melolonthinae are located maxilla-mandibular and consist of a 268 pars stridens (an area with fine parallel ribs) and a plectrum (sharply confined ridge) which 269 are moving against each other (Schiödte 1874; Wessel 2006). However, actual audio 270 recordings of larval stridulations exist only for very few Scarabaeidae species (Sprecher-Uebersax and Durrer 1998; Mankin et al. 2009b; Harvey et al. 2011). Here, we present to our 271 272 knowledge the first verified audio recordings of larval stridulations from *M. melolontha* and *M. hippocastani*. The stridulations of the two species sounded quite similar, but were still 273 distinguishable for a trained listener. The main difference was the overall duration of the 274 275 single stridulations. This might have simply been the result of size differences since third instar *M. melolontha* are significantly larger than third instar *M. hippocastani* which should 276 also result in larger stridulatory organs and possibly longer scraping times. In that case, 277 stridulating second instar *M. melolontha* might not be distinguishable from third instar *M.* 278 hippocastani in areas where both species co-occur. However, for pest control purposes it is 279 already of great value to have an overview of the distribution of the genus Melolontha in the 280 soil. We have no stridulation recordings of soil-dwelling Scarabaeidae larvae co-occurring 281 with Melolontha spp. yet, but it has already been shown for saproxylic Scarabaeidae larvae 282

that stridulations can be used for non-invasive species-specific monitoring (Harvey et al.284 2011).

Due to the general lack of studies on beetle larval stridulations, their ecological 285 meaning is not well understood although they are mostly interpreted as a territorial defence 286 technique, i.e. stridulating larvae signal their presence to other larvae to avoid competition for 287 resources and to forgo cannibalism (Kocarek 2009). Cannibalism is not uncommon 288 289 (Victorsson and Wikars 1996; Kocarek 2009) and is also known for Melolontha spp larvae. Sprecher-Uebersax and Durrer (1998) observed in a laboratory experiment that Lucanus 290 cervus larvae stridulated much more frequently directly after they were placed in a terrarium 291 292 than later on which is in line with our own observations. A likely explanation is that larvae use stridulations to orient themselves in a new environment, but stridulations diminish once 293 the larvae have settled in their new position (Sprecher-Uebersax and Durrer 1998). Apart 294 295 from this, we do not really know if there are specific times in a Scarabaeidae larval life cycle during which stridulations occur more frequently than in others, if the larvae have a diurnal or 296 297 seasonal rhythm, or what their complete repertoire of sounds is. In our fast screening of larvae, we only detected very few stridulations, and thus far, only one stridulation of a M. 298 299 hippocastani larva has been recorded in the field in undisturbed soil during a survey 300 measurement (data not shown).

A lack of detailed knowledge on the ecology of Melolonthinae and other Scarabaeidae 301 larvae due to their cryptic nature belowground is a general problem for efficient and 302 303 environmentally friendly pest control. Filling knowledge gaps on larvae population dynamics, interactions with abiotic factors, host plant preferences, attractive trap crops as well as 304 naturally occurring pathogens has been identified as one major direction for future research to 305 design more efficient pest management strategies (Frew et al. 2016). Such research would 306 benefit tremendously from the timely development of non-invasive techniques for studying 307 Scarabaeidae larvae in the field, especially of techniques facilitating real-time continuous 308

monitoring. To date, mainly two non-invasive techniques are available for monitoring root-309 310 feeding insects in soils – X-ray microtomography and acoustic detection – of which only the latter one is directly employable in the field thus far (Johnson et al. 2007). 311 312 Since the 1900s, acoustic methods have been successfully applied in a number of insect management applications (Mankin et al. 2011; Mankin 2012). However, the focus has 313 been mainly on airborne sounds or vibrational signals transmitted through plant parts. 314 315 According to Mankin et al. (2011), only 10 root-infesting Scarabaeidae species had been acoustically studied thus far. Soil is a more challenging medium for acoustic studies in 316 comparison to air and plant parts due to its heterogeneity. It attenuates sound more strongly, 317 318 especially at high frequencies, and sound transmission can be affected by already slight changes in soil composition (e.g. bulk density, organic matter content, soil moisture, root and 319 320 stone distribution) on a scale of a few centimetres (Mankin et al. 2000; Zhang et al. 2003; 321 Mankin et al. 2011). A major challenge is still the correct identification of sounds and the differentiation between pest and nonpest signals (Mankin et al. 2000; Mankin and Lapointe 322 323 2003; Zhang et al. 2003; Mankin et al. 2009b;). However, acoustic soil studies on Scarabaeidae larvae have only focused on incidental insect sounds (feeding, movement) 324 which were classified by comparing their spectral profiles with reference spectral profiles 325 326 (e.g. Mankin et al. 2007). We present the first data analysis routine specifically targeting Melolonthinae larval stridulations in soil. It is based on the work of Schofield (2011) who was 327 the first to use fractal dimension analysis for the detection of larval activity sounds, 328 329 specifically larval feeding bites.

Fractal dimension analysis focuses on the time-domain of an audio recording, which considerably reduces its computational costs in comparison to the analysis of spectrograms and facilitates real-time acoustic identification. In addition, fractal dimension analysis is amplitude independent and thus suitable for environments with low signal-to-noise ratios like soils (Schofield and Chesmore 2008; Schofield 2011). We further developed Schofield's

approach by combining different f sizes, changing the FD calculation, and adding a new 335 336 horizontal filter component. For larval feeding bites, the f size should ideally be equal to the length of the targeted event (Schofield and Chesmore 2008). This is not feasible for 337 Melolontha spp. stridulation events which are significantly longer than feeding bites and the 338 likelihood to falsely detect background noise increases with increasing f size. Instead, f sizes 339 were kept small to target the single pulses within stridulations. Stridulation duration also 340 341 affects the FD calculation. Schofield (2011) used a classical outlier detection approach by measuring fractal dimensions within a recording as distances from the mean value in 342 multiples of the standard deviation. Stridulations take up a much larger proportion in a 343 344 recording than feeding bites, significantly affecting the standard deviation around the mean. For the implementation of a vertical stridulation detection threshold, it proved more 345 successful a) to use the median deviation around the median as a more robust measure of 346 347 dispersion, and b) to separate the FD of stridulations and background noise further along the y-axis by combining the results of two frame sizes similarly able to capture stridulation 348 349 pulses. The vertical SFD detection threshold separates stridulations pulses and incidental sounds with similar geometrical complexity from any other sounds. Stridulations within this 350 351 subset can then be targeted by the newly developed horizontal filter, which takes into account 352 the distinct temporal pattern of *Melolontha* spp. stridulations.

The performance of the fractal dimension analysis ultimately depends on what other 353 sounds are present in the targeted audio recording even when applying a robust measure of 354 dispersion as filter. The geometrical complexity of incidental sounds can vary widely and 355 overlap with the geometrical complexity of stridulations leading to false positives, whereas 356 357 stridulations can be distorted during transmission through soil in a way that they are not detectable anymore with the chosen filters. As a result, the analysis routine presented here 358 cannot provide an absolute count of stridulation activity. However, for the laboratory 359 experiment the result of the horizontal filter could be used to calculate a stridulation estimator 360

(STRAC), which correlated very well with the manually counted stridulations. Furthermore, 361 362 the number of stridulations clearly increased with increasing larval abundance. If such a relationship between the newly developed stridulation estimator and larval abundances can be 363 verified in the field, it would allow non-invasive species-specific larval abundance 364 measurements with a single acoustic sensor per monitoring plot for the first time. Previous 365 studies using a single acoustic sensor to monitor incidental larval sounds were able to 366 367 determine with high accuracy the presence or absence of Scarabaeidae infestations, but found only a weak correlation between sound rate and larval abundance (Mankin et al. 2001; 368 Mankin et al. 2007). Zhang et al. (2003) managed to predict larval abundances based on 369 370 incidental sounds by using four sensors at a recording point, but this set-up was more timeconsuming to operate than a single sensor system. 371

Frew et al. (2016) advocated that for the development of improved pest management 372 373 strategies for soil-dwelling Scarabaeidae larvae, it is of immediate importance to fill knowledge gaps in the ecology of these insects. Scarabaeidae larval stridulations have been 374 375 neglected in soil research and our knowledge on their ecological meaning is very limited. We used *M. melolontha* and *M. hippocastani* as model organisms in the laboratory to develop the 376 first acoustic data analysis routine specifically targeting stridulations. The fractal dimension-377 378 based method is a fast and non-compute-intensive method for pinpointing audio sections in continuous recordings in which stridulation events took place, significantly reducing the 379 dataset for any potential further manual or automated stridulation analysis. Furthermore, it can 380 be adjusted for detecting other acoustic events if needed by adjusting f sizes and the 381 thresholds for the vertical and horizontal SFD filter. Acoustics should be more considered in 382 studies of cryptic soil insects as the application of sensors in the field is simple, relatively 383 cheap, and can provide non-destructive, continuous automated monitoring. Acoustic 384 monitoring should not be restricted to incidental sounds, but also include stridulations to make 385

386	use of its full potential	for gaining	significant new	insights into	insect ecology and
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- 387 biodiversity in general, and pest monitoring in particular.
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# 389 Author Contribution Statement

- 390 CMG and DC designed the experiment and analysed the data. DC designed and built
- the acoustic sensors. CMG performed the experiment, collected all data and developed the R
- script. CMG wrote the first manuscript draft and DC reviewed the manuscript.

393

### **394 Conflict of Interest**

395 The authors declare that they have no conflict of interest.

396

# 397 Ethical approval

- All applicable international, national, and/or institutional guidelines for the care and
- 399 use of animals were followed.

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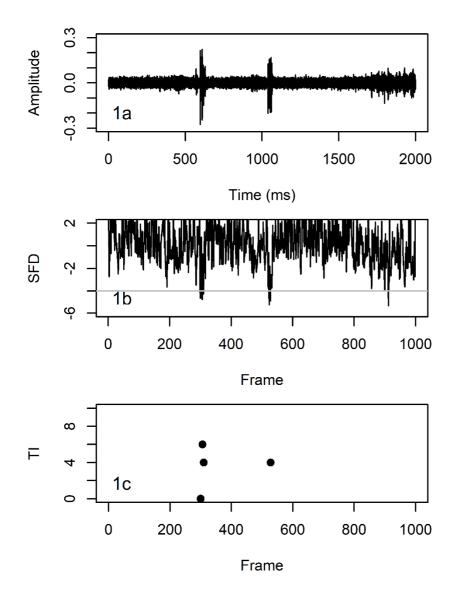
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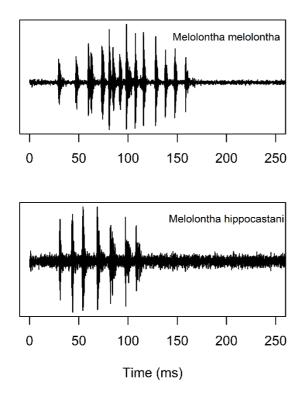
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### 496 Figures



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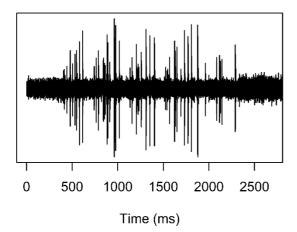
Fig. 1 Detection of cockchafer larvae stridulations using fractal dimension analysis (see text for details). Fig. 1a: Audio recording with two stridulations (at ~650 ms and ~1100 ms) and larval moving sounds (from ~1700 ms onwards). Fig. 1b: Summed fractal distance (*SFD*) for every 2 ms (=frame) of the audio recording. Peaks crossing a threshold of -4.0 are first indicators of stridulation events. Fig. 1c: Number of frames between adjacent peaks (*TT*) crossing the threshold in Fig. 1b. A distance of less than 10 frames is indicative of a peak of clusters crossing the threshold in Fig. 1b, and thus a stridulation event



507 Fig. 2 Comparison of acoustic patterns produced by stridulation of larvae (third instar) of



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520 Fig. 3 Acoustic pattern produced by stridulation of a third instar *Melolontha hippocastani* 

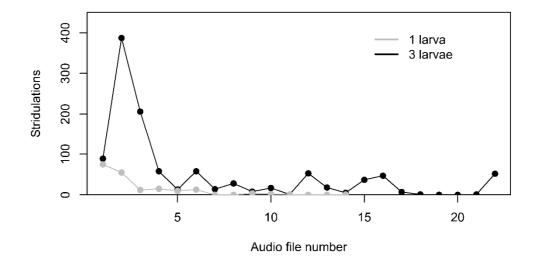
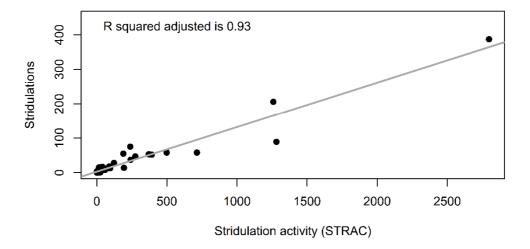


Fig. 4 Stridulations manually counted in continuous audio recordings of third instar Melolontha hippocastani activities in laboratory soil incubations with 1 and 3 larvae, respectively. Each audio file was 50 min long. For the incubation with 1 larva, only 14 audio files were sequentially recorded 



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Fig. 5 Linear regression of manually counted stridulations on automatically calculated
stridulation activity (*STRAC*). Each data point came from a 50 min audio recording. The
stridulation data were the same as in Fig. 4, but without differentiation between the numbers
of larvae in the soil. Stridulation activity was calculated by multiplying *TI* 1 to 10 (see Fig. 1)
with their respective frequencies in each 50 min audio recording and summing up the
resulting products