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43 46	Abstract
47	Soil organic matter supports the Earth's ability to sustain terrestrial ecosystems, provide food and
48	fiber, and retain the largest pool of actively cycling carbon. Over 75% of the soil organic carbon
49	(SOC) in the top meter of soil is directly affected by human land use. Large land areas have lost
50	SOC as a result of land use practices, yet there are compensatory opportunities to enhance This is the author manuscript accepted for publication and has undergone full peer review but has not been through the copyediting, typesetting, pagination and proofreading process, which may lead to differences between this version and the <u>Version of Record</u> . Please cite this article as <u>doi:</u> <u>10.1111/gcb.13896</u>

51 productivity and SOC storage in degraded lands through improved management practices. Large 52 areas with and without intentional management are also being subjected to rapid changes in 53 climate, making many SOC stocks vulnerable to losses by decomposition or disturbance. In order to quantify potential SOC losses or sequestration at field, regional, and global scales, 54 55 measurements for detecting changes in SOC are needed. Such measurements and soil-management 56 best practices should be based on well-established and emerging scientific understanding of 57 processes of C stabilization and destabilization over various timescales, soil types, and spatial scales. As newly engaged members of the International Soil Carbon Network, we have identified 58 gaps in data, modeling, and communication that underscore the need for an open, shared network 59 60 to frame and guide the study of soil organic matter and SOC and their management for sustained production and climate regulation. 61

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- Introduction 65 Soil organic matter (SOM) governs many physical, chemical, and biological characteristics of 66 67 soils, and is one determinant of a soil's capacity for fertility, ecosystem productivity, and CO<sub>2</sub> sequestration. Thus SOM, and its main constituent soil organic carbon (SOC), interacts with 68 69 several aspects of the Earth system and its services to society (Banwart et al., 2014), including 70 food, fiber, water, energy, cycling of carbon (C) and nutrients, and biodiversity. Large land areas 71 (up to 6 billion ha) are estimated to be in some state of soil degradation (Gibbs and Salmon, 2015), associated in many cases with deficient stocks of SOM. Increasing SOM content, and thus SOC 72 storage, can improve the state of soil and ecological sustainability, and because SOC stocks are 73 74 large globally, widespread adoption of sustainability can also contribute to climate change
- 75 mitigation by capturing atmospheric CO<sub>2</sub>.

76 SOM and SOC research has traditionally been dominated by at least two scientific 77 communities that have been publishing in rather disparate types of journals (Supplemental 78 Materials SM2a), one focused on soil science/soil health and the other focused on the terrestrial C 79 cycle and global biogeochemistry. Soil health or quality is a concept formalized in the 1990s to 80 describe soil management practices that enhance the biological, chemical, and physical properties of soil. Terrestrial C cycling typically refers to the exchange of land-based C with atmospheric 81 CO<sub>2</sub> and CH<sub>4</sub> although aquatic systems and flows are closely intertwined as well. Owing to the 82 very large and dynamic stocks of soil C globally, the role of soils in climate regulation has been 83 84 increasingly studied in the context of ecological and geological perspectives that link organic 85 matter processing to C, nutrients, productivity, hydrology, and landscape dynamics. As a result, 86 conceptual frameworks and simulation models have become quite elegant and sophisticated in

87 representing both site-based, land management options and global scale syntheses. As the goals of

these communities converge, we are presented with an opportunity to combine and transform our

89 knowledge, databases, and mathematical frameworks for the benefit of environmental health and

90 humanity.

91 At the global scale, SOM is one of the largest and actively cycling C reservoirs (Cias et al., 92 2013; Jackson et al. 2017) and is subjected to direct human activities impacting over 70% of C 93 stocks in the upper meter of soil. Globally soils store 1,300-1,500 Pg of C in the top meter (Fig. 94 1a; Batjes, 2016). Much of this SOC is in lands impacted directly by cropping, grazing, and 95 forestry practices, with 30% residing in lands only indirectly impacted by human activities such as 96 peatlands and permafrost soils (Hugelius et al., 2014; Köchy et al., 2015; Loisel et al., 2017). The distribution of soils in managed lands follows the distribution of human land use (Fig. 1b, c) and 97 overlaying the estimated SOC stocks with human land-use data shows that the majority of near-98 99 surface SOC stocks are directly affected by human activities today (Fig. 1c). Efforts such as the '4-per-1000' program, a global initiative to reduce atmospheric CO<sub>2</sub> 100 101 through soil C sequestration (Minasny et al., 2017), demonstrate that many soils in managed systems could offer an opportunity for climate regulation. While uncertainties are very large, it is 102 103 evident that land management practices can lead to C gains from 0.01 kg C m<sup>-2</sup> yr<sup>-1</sup> up to 0.07 kg C m<sup>-2</sup> yr<sup>-1</sup> (Minasny et al., 2017, Paustian et al. 2016, Smith et al. 2007). If these numbers are 104 applied across all Earth's managed lands, there is an opportunity to sequester several Pg C yr<sup>-1</sup> 105 106 globally (Fig. 1d). While not all lands are likely to be managed consistently, this maximum 107 estimate could potentially offset future C emissions from permafrost (Koven et al., 2015) or the combined projected emissions from land use change and agricultural management (Pugh et al., 108 109 2015; projected emissions in Fig. 1d). 110 The ability to detect shifts in SOC and to potentially increase SOC storage is important for 111 scientific and societal challenges in the face of rapidly changing terrestrial landscapes. However, 112 detecting changes in SOC is problematic owing to the complex temporal and spatial scales at which we need to measure and predict change. For example, estimates of future SOC dynamics 113 114 range widely, and recent compilations of soil radiocarbon suggest that global models 115 underestimate the transit time of C in soil, biasing estimates for soil C sequestration in future years 116 (He et al, 2016). Meanwhile conceptual frameworks for SOC stabilization are also changing, challenging the science community to shift methods and measurements to test alternative models. 117 For example, paradigms and metrics of SOC stabilization and destabilization (herein referred to as 118 SOC (de)stabilization) have been shifting (Schmidt et al., 2011; Lehmann and Kleber, 2015). 119 120 Emerging paradigms de-emphasize the chemical properties of SOM and SOC and focus more on 121 mechanisms that isolate or stabilize C, such as sorption of biopolymers and their decomposition 122 products on mineral surfaces and the entrapment of organic matter in aggregates. These and other

- 123 recent developments call for model development and new datasets to address aggregate dynamics,
- 124 carbon-use efficiency of microorganisms, the role of dissolved organic matter, priming to enhance
  125 SOC decomposition, and mineral protection of organic matter.
- 126 We posit that there is a need and an opportunity for the scientific community to: 1) better
- 127 identify datasets to characterize ecosystem and landscape properties, processes, and mechanisms
- 128 that dictate SOC storage and stabilization and their vulnerabilities to change; 2) identify, rescue,
- and disseminate existing datasets; 3) develop platforms for sharing data, models, and management
- 130 practices for SOC science; and 4) improve the connection between global C cycle and soil
- 131 management research communities. The International Soil Carbon Network (ISCN) is a
- 132 community devoted to open and shared rigorous science for characterizing the state,
- 133 vulnerabilities, and opportunities for managing SOM. To this end, the ISCN targets SOM and
- 134 SOC-related science questions in Section 2 that are potentially actionable through good science
- and informed management. Challenges and strategies for the ISCN to function as a community
- 136 platform for communication, modeling, and data sharing, as well as to increase interoperability
- 137 among SOC-relevant networks, are outlined in section 3.
- 138

# Challenges for characterizing the state, vulnerabilities, and management opportunities of soil organic matter

- 141 Most needed from our community is detection of changes in SOM and SOC, yet such changes
- 142 vary spatially and temporally because of the many processes that are linked to variations and
- 143 changes in climate, land use, vegetation, topographic, and geologic factors. Broad-scale ecosystem
- 144 models generally build on mechanistic understanding originating from much finer temporal or
- spatial scales. Upscaling the scaling or application of knowledge and data from finer to broader
- scales or from shorter to longer timescales requires insight, data, and models at various scales,
- 147 types and complexity because the responses of soil processes to forcing factors are typically
- 148 different on different spatial scales (O'Rourke et al, 2015). At fine scales, the response might be
- related to a specific landscape or climate attribute. When aggregating over broad spatial scales,
- 150 however, information on the relationship between the driver and the response may be lost or
- 151 obscured. One such example is the apparent control of temperature, rather than precipitation, over
- tropical and global ecosystem fluxes (Cox *et al.*, 2013; Wang *et al.*, 2013; Wang *et al.*, 2014). The
- smaller apparent role of precipitation globally or across the tropics results from large spatial
- 154 heterogeneity in precipitation. Unusually dry and wet regions cancel each other out when averaged
- 155 globally, which can obscure an often stronger local/regional precipitation control of ecosystem
- 156 fluxes (Ahlström *et al.*, 2015; Jung *et al.*, 2017).
- Long-term changes in SOC are particularly difficult to capture with measurements. Fluxes
   of heterotrophic respiration, for example, can be measured only at fine spatial and temporal scales

- 159 (Bond-Lamberty et al., 2016) whereas observing short-term changes in SOC pools is reduced to
- 160 detecting small changes relative to a large pool of bulk SOC (Stockmann et al., 2013). While
- 161 radiocarbon measurements suggest that the majority of bulk SOC is much older (He et al., 2016),
- 162 and hence not very active, long-term changes in SOC storage could be governed by processes
- 163 other than those that determine short term fluxes. It is increasing clear that understanding changes
- 164 and variations in SOC requires a robust understanding of processes and mechanisms that underlie
- 165 stabilization, protection, and destabilization of SOC.
- 166

167 Understanding mechanisms underlying storage and (de)stabilization of SOC

- 168 Changes in SOC are generally based on assessments of stocks and some metric of turnover,
- residence, or transit time (Sierra et al. 2017; He et al, 2016). Assessments of SOC stocks and
- 170 transit times remain a critical constraint on the ability of models to predict CO<sub>2</sub> exchanges and
- 171 their responses to environmental and land use pressures (Todd-Brown et al, 2013). Advancements
- in measurements and numerical models must be grounded in our best understanding of the
- 173 processes controlling SOC dynamics across scales (Hinckley et al, 2014).
- 174 Currently, most global model frameworks rely on state-factor theory (Campbell and 175 Paustian, 2015), where soil properties are the product of a suite of factors including climate, biota, 176 topography, parent material, and stage or age of pedogenesis (Jenny,1941), superimposed with 177 major land uses such as deforestation or agriculture (Amundson and Jenny, 1991). Under this 178 framework, global-scale spatial heterogeneity of SOC is a direct reflection of variation within 179 these factors and, accordingly, will vary with climate and land use change. A quantitative and
- 180 predictive understanding of how soil and ecosystem properties interact to regulate SOC remains
- 181 elusive due to interactions and interdependencies of the state variables with local-scale
- 182 physicochemical, and biological processes that also influence the (de)stabilization of SOC.
- 183 Mechanisms of C stabilization and destabilization are of particular importance for 184 establishing a predictive understanding of SOC dynamics because these same mechanisms presumably drive vulnerabilities (to emission) and opportunities (accumulation or sequestration) 185 186 under changes in climate, management, or other disturbances. A quantitative understanding of 187 SOC pool dynamics requires a quantitative understanding of both processes and mechanisms 188 leading to (de)stabilization. A process represents a fundamental sequence of actions or steps that 189 leads to a particular outcome, whereas a mechanism reflects the combined interaction of processes 190 (Fig. 2). Processes are often more directly measureable than mechanisms and, therefore, a more 191 fundamental construct for incorporation into models. We tend to classify mechanisms of SOC 192 (de)stabilization as being primarily biological, physical, or chemical (Six et al., 2002; Fig. 2), but 193 many mechanisms cross these boundaries due to interactions among processes. The past two 194 decades brought substantial advances in our conceptual understanding of mechanisms of SOC

- 195 (de)stabilization (Schmidt et al., 2011 and Lehmann and Kleber 2015). Yet, quantitative
- 196 representations of these concepts in global and regional models lags, due in part to a lack of data
- 197 synthesis to connect concepts and models, as well as a lack of incorporation of local-scale
- 198 understanding of SOC dynamics.
- 199 Understanding the mechanisms of SOC (de)stabilization, the underlying processes driving 200 soil change, and the relationships between processes and drivers at various spatial scales is needed 201 to evaluate potential changes in SOC stocks. To address this need, an emerging priority is to conduct and synthesize manipulative field, greenhouse, and laboratory experiments that 202 specifically target processes and drivers at a variety of spatial and temporal scales (see section 2.2. 203 204 and Fig. 3). Examples include experimental manipulations that target specific processes, such as 205 the Detritus Input and Removal Treatments (DIRT) that manipulate organic inputs to soil (e.g., Lajtha et al. 2014), the international Soil Experimental Network (iSEN) that warms deep soil 206 207 (Torn et al. 2015), Drought-Net that manipulates precipitation, as well as natural environmental 208 gradients of temperature and soil moisture (Giardina et al. 2014). By coupling broadly distributed 209 and comparable data synthesis efforts with process-based models, we have the opportunity to capture mechanistic understanding and to constrain the SOC storage and its sensitivity to 210 211 disturbance.
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- 213

## 214 Prioritizing soil data to empower our science

There are many types of data, beyond SOC stock data, used to investigate C dynamics at different 215 spatial and temporal scales (Fig. 3). Data consolidation and archiving efforts so far have focused 216 217 principally on SOC stocks (e.g. Batjes et al. 2016; Scharlemann et al. 2014), but SOC stocks 218 typically change slowly over timescales of decades to millennia, providing limited sensitivity for 219 investigating shorter-term processes such as land use and climate impacts (Jastrow et al. 2005; 220 Kravchenko and Robertson 2011; Phillips et al. 2015). At the same time, technique advancements over the last several decades have seen an escalation in methods pertinent for investigating SOC 221 222 change at shorter timescales (Fig. 3). For instance, utilization of the enriched atmospheric  $^{14}$ C signal ("bomb C") has allowed tracing and dating of SOC at annual timescales (Trumbore 2000). 223 224 Density and size fractionation techniques have helped to distinguish more rapidly cycled SOC from protected, less rapidly-cycled C (Jastrow 1996, Kong et al. 2005, Gregorich and Janzen 225 1996). More recently, *in situ* chemistry techniques have been used to investigate SOC 226 transformation over timescales of hours to days (Mackelprang et al. 2016; Haggerty et al. 2014). 227 228 The many of the data types that are most relevant for measuring SOC change at 229 experimental timescales, however, have not been consolidated and are generally not archived, thus 230 impeding two of the more important lines of inquiry in SOC science, namely 1) the biochemical

mechanisms of SOC stabilization and destabilization, and 2) the anticipated impacts of changing climate and land use (see top panels of Fig. 3). Part of the challenge in assembling and archiving diverse SOC data types is social--they are collected by different sub-communities of soil science and microbiology, and part is logistical--the data have different structures and storage formats (see Supp. Material SM4). Nevertheless, some of these data types have been widely collected, and archiving efforts could open several novel research opportunities.

237 For instance, the soil-to-atmosphere  $CO_2$  flux (soil respiration or  $R_S$ ) is one data type that has been measured extensively and offer a unique window into terrestrial carbon dynamics at fine 238 239 temporal and spatial resolution where questions about temperature, moisture sensitivity and 240 respiratory pathways are addressed (Fig. 3). The main reason field Rs is not used in model 241 validation is because it spans two sub models which are generally developed in isolation (vegetation and soil). Field-based, in-situ Rs data provide an instantaneous measurement of root 242 243 respiration and soil metabolism, whereas laboratory incubations potentially can isolate soil 244 metabolism from root respiration. While a considerable effort has been made to synthesize 245 seasonal and annual averages for field-based R<sub>s</sub> fluxes (e.g., Bond-Lamberty and Thomson, 246 2010a), flux datasets including isotopic measurements (isofluxes), time series and experimental manipulations that include soil moisture, and laboratory-based incubation data have only sparingly 247 248 archived in centralized repositories (e.g.; Kim et al., 2012). Field-based  $R_S$  data have been used only sparsely for soil C model validation (Wang et al., 2014) or model benchmarking (Shao et al., 249 250 2013) despite having characteristics ideal for these purposes; they reflect fundamental metabolic 251 processes, are geographically widespread, and do not require extensive post-observational 252 processing. High-temporal-resolution  $R_S$  data may also present unique possibilities for 253 constraining and validating fluxes inferred from eddy covariance (Phillips et al., 2016) and 254 spatiotemporal analyses (Lavoie et al. 2014; Leon et al. 2014). Finally, because soil-to-atmosphere C fluxes (in particular soil heterotrophic respiration) cannot be directly measured at scales larger 255 than  $\sim 1 \text{ m}^2$  (Bond-Lamberty et al., 2016), data compilations have enormous value for upscaling 256 and for synthesizing our understanding of soil metabolism. While  $R_s$  is but one example of data 257 258 that will help meet challenges for characterizing SOM and SOC, their relevance to mechanistic 259 questions of SOC (de)stabilization has the potential to address higher level questions related to 260 landuse practices, policy, and long-term consequences of change (Fig. 3). 261

262 Land management and its potential to increase SOC: an emerging priority

Increases in SOC play a key role in climate regulation through sequestration of  $CO_2$ , but there also co-benefits relevant to land managers through increased land yield, soil water retention, resilience to extreme weather and nutrient retention. Land managers are primary agents governing changes to SOM and SOC stocks, thus in order for scientists to help shape and drive more successful and

scalable practices, it is important to view SOC research as a social enterprise as well as a scientificenterprise.

269 Successful management of SOC requires collaboration among scientists, land managers, 270 landowners, and policy makers. A science-land manager-policy partnership can be initiated at any 271 stage of a problem, for example as a science question or a land management challenge. One 272 example (Fig. 4) starts with research question and tethers field/lab experiments to ecological and 273 social issues important to land managers. Seeking feedback from stakeholders at each phase of 274 inquiry also generates new inquiries, which can be visualized in Fig. 4 as movement from right to 275 left on the research-to-policy progression. A cooperative research approach introduces more 276 sources of feedback and points of iteration than an isolated scientific process, but is instrumental 277 for influencing SOM management practices.

278 279

Grazing lands (rangelands) represent a largely untapped global potential for SOC sequestration as 280 281 they occur across a wide range of bioclimatic conditions, cover ca. 40% of ice-free land and store ca. 30% of the terrestrial SOC pool to 1 m depth (Fig. 1) The global potential for rangeland C 282 283 sequestration has been estimated to range from 0.3 to as much as  $1.6 \text{ Pg CO}_2$ -eq yr<sup>-1</sup> (Paustian et 284 al, 2016). Many grazing lands have degraded SOC stocks due to historic poor management 285 practices and changes in land use intensity. Stocks of SOC in grazing lands are vulnerable to losses through erosion, compaction, and reductions in plant C inputs from plant community shifts 286 287 or overgrazing. Improved grazing, irrigation, plant species management, and the use of organic or inorganic fertilizers of these lands can significantly increase soil C stocks (Conant et al. 2017). 288 289 Application of composted organic waste streams has been demonstrated to be an economic and 290 beneficial proactive that contributes to both rangeland productivity and climate regulation (Ryals 291 et al 2013, DeLonge et al. 2013; see SM5). Lifecycle assessments, in which broader implications 292 for land management are tracked, (e.g., the waste management and energy systems; DeLonge et al. 2013) and other ecosystem services and values (e.g. biodiversity or endemic plant impacts) are 293 294 also important issues that drive land management choices.

295 Forest SOC management often focuses on minimizing losses to erosion and disturbance 296 and less on building SOC through residue and vegetation management, as is common in 297 grazinglands and croplands (Binkley and Fisher 2013). While there are robust, broadly consistent 298 methods for accounting for and predicting future C stocks in forest aboveground biomass, there is 299 less consensus on methods for assessing belowground SOC. Long-term monitoring (Johnson and 300 Todd 1998; McLaughlin and Phillips 2006), experimental manipulation (Edwards and Ross-Todd 301 1983; Gundale et al. 2005), expert review (Jandl et al. 2007; Lal 2005), quantitative synthesis (Laganiere et al. 2010; Nave et al. 2010), and ecosystem modeling (Kurz et al. 2009; Scheller et al. 302

303 2011) have all produced valuable insights into forest management impacts on SOC. At the same 304 time, the many conflicting results of these studies raise the question of whether responses of SOC 305 to forest management can be generalized across soil and ecosystem types. In addition, the lack of spatially explicit assessments (e.g., maps, geostatistical models) of forest management impacts on 306 307 SOM highlights our challenge to quantify SOC stocks and the complex spatiotemporal processes 308 involved in scaling. Given these limitations, methods of quantifying the spatial distribution and 309 controls on forest SOM across scales are needed for forest practices. These applications may be 310 aided by promising advances in digital soil mapping (Mansuy et al. 2014; Mishra and Riley 2015) and spatially explicit soil carbon assessments (Domke et al. 2017; Soil Survey Staff 2013). 311 312 Croplands have been managed for more than two decades in ways that benefit soil 313 conditions and reduce greenhouse gas emissions (e.g., Smith et al. 2007, Paustian et al. 2016). There are many practices influencing SOC storage in croplands. These include tillage management 314 315 (in some cases, Powlson et al. 2014); crop rotations and cover crops (Poeplau and Don 2015); 316 improving crop production through fertilization and irrigation management; selection of high 317 residue-yielding crops; crop intensification by removing bare-fallow management in a cropping system; application of silica residues to reduce greenhouse gas emissions (Gutekunst et al. 318 319 2017), and application of organic amendments with manure or biochar. 320 Despite existing knowledge, there is a limited ability to accurately estimate the changes in 321 SOC, particularly at smaller scales (Ogle et al. 2010, Paustian et al. 2016). For example, 322 mechanistic understanding such as the effect of tillage management on aggregate dynamics (Six et 323 al. 2000), has not been effectively incorporated into modelling frameworks. Biochar amendments have emerged as one of the most promising practices for sequestering C in agricultural soils 324 325 (Lehmann, 2007), but there are still questions about the impact of biochar on SOM dynamics 326 (Knicker, 2011). Efforts to incorporate agricultural SOC sequestration into policy programs have 327 been plagued by lack of understanding about the longer term impacts of pervasive warming on 328 SOC pools (Conant et al. 2011), which could vary widely depending on the response of microbial communities (Wieder et al. 2015). 329

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#### 333 The ISCN as a platform for communication, modeling, and data

While science communities targeting soil health or climate regulation are making great strides in the science of SOC, a combined and coordinated effort could take advantage of technological and communication advances to meet challenges discussed in section 2. The International Soil Carbon Network or ISCN along with partnering entities seeks to establish the basis (platforms) by which we share openly our means of communication, modeling, and data sharing.

- 339
- 340 **Communication** of our science starts with restructuring and broadening the soil data that are
- 341 shared within and by ISCN, allowing for different types of data, and discovering new ways to
- 342 share data without compromising its attribution and credits. To increase the potential impact of
- 343 SOC science and to better impact land management practices, it also is beneficial to frame and
- 344 disseminate our information in the context of both soil health and climate regulation. For example,
- 345 given some knowledge of the dominant processes leading to C stability in a given soil (path A,
- Fig. 5), one may evaluate which disturbances may release SOC and what measurements would
- 347 mitigate SOC losses. Conversely, we may apply this framework in the reverse direction. Given
- 348 some ongoing or historical management practices (path B, Fig. 5), we can work inward and to
- assess what processes could be most affected. Carbon cycle science can also be reframed from the
- biological, chemical and physical processes paradigm presented in Fig. 2 to a land management
- 351 perspective (Table 1). See supplementary materials SM2 for more precise definitions and
- 352 references.

353

- Modeling with computational and conceptual paradigms is an integral part of the scientific 354 process that greatly enhances our ability to understand variations among spatial and temporal 355 356 scales and to precisely and accurately estimate and predict changes in SOC. Conceptual paradigms 357 that form the scientific basis for our computational models were initially based on "humification" processes (Hedges, 1988; RothC model (Jenkinson and Rayner, 1977) and Century model (Parton 358 359 et al., 1987). The community is increasingly recognizing the role of microbial access to SOC and 360 its stabilization involving specific mechanisms described in Fig. 2 (Jastrow et al. 1996, Six et al. 2000, Kaiser and Kalbitz 2012, Averill et al. 2014, Keiluweit et al. 2015, Cotrufo et al. 2015, 361 362 Lehmann and Kleber 2015). Measurements used to drive and test these models vary and are often 363 not structured experimentally to test one model over another. As discussed above in section 2, 364 issues of **spatiotemporal scaling** must address whether mechanisms and functions change or vary 365 between spatial and/or temporal scales. Thus as models increasingly incorporate these new ideas 366 into mathematical frameworks, new paradigms can emerge (e.g., Allison et al. 2010, Wieder et al. 2013, Sulman et al. 2014). Moreover, soil datasets and databases are needed to evaluate models 367 (Todd-Brown et al. 2013, Shao et al. 2013). The ISCN strives to openly share modeling code and 368 369 specific parts of models along with data used to drive and test model performance. 370
- 371 In addition to simply sharing model codes, it is also becoming clear that a **community-based**
- 372 **model** could emerge from the soils community. In particular modular frameworks with water,
- temperature, and plant production modules would allow for "plug and play" with new SOC
- modules that are under development. Plug and play modules would not likely be the focus of

- development, but are needed to realistically simulate SOC dynamics from experiments and
- 376 regional analyses. The design of such supporting modules could be informed by or rely on recent
- 377 progress with multi-model comparative frameworks (e.g. PeCAN project
- http://pecanproject.github.io/index.html). As new models are published and shown to work better than the existing SOC community model, the community model would be replaced with improved mathematical frameworks for SOC dynamics. In turn, scientists and investigators evaluating SOC dynamics could incorporate the latest science embodied in the SOC community model housed on the platform into their assessments. ISCN would effectively encourage the use of the latest science in national assessments such as evaluating climate change impacts, greenhouse gas emissions and soil health (e.g. Ogle et al., 2014).
- As soil or belowground datasets are collected, compiled, and assembled for specific 385 386 questions or assessments there is an emerging opportunity for **Big soil data** to be incorporated into 387 a searchable database for soil properties, and serve as a platform for syntheses of soil dynamics 388 and large spatial and temporal scales. Empirical models could be structured from a searchable, 389 robust database, but we could also challenge our conceptual and computational models with robust 390 data. The ISCN network database (http://doi.org/10.17040/ISCN/1305039 or http://ameriflux-391 data.lbl.gov:8080/ISCN/DOI.html.) afforded early opportunities to design common data templates, 392 promote data synthesis, and generate publications. The ISCN-gen3 database (http://ameriflux-393 data.lbl.gov:8080/ISCN/DOI.html) is poised to move beyond observational soil point data and associated drivers, and into the realm of process-level attributes such as soil fractions and spectral 394 395 data. These data types have been envisioned and piloted since its earliest generations, but have 396 only recently gained attention and use among the broader community of scientists interested in SOM . 397
- 398 Currently the ISCN database has a mix of overlapping and unique data as compared with 399 other databases (Supplemental Material SM1). For example, most closely aligned are the World 400 Soil Information Service (WoSIS) and ISCN, both of which report soil profile data but for 401 different attributes: The ISCN reports over 100 (carbon plus other attributes) soil properties for 402 ~70,000 profiles and their constituent layers, whereas WoSIS reports 12 properties for over 403 150,000 profiles. ISCN currently hosts solid phase attributes for soil, and the data are structured in 404 a way compatible with ecosystem CO<sub>2</sub>-land-atmosphere flux data served by the FLUXNET and 405 AmeriFlux networks. Despite the large number of soil profiles included in both WoSIS and ISCN, 406 however, there remains an enormous amount of un-archived soil data. Compiling and harmonizing 407 these data could help answer questions of C turnover; soil properties related to mechanisms 408 controlling SOC (de)stabilization; soil respiration fluxes in context of soil and environmental 409 measurements; and metrics of pools or forms of bioavailable vs non-available SOCC.

410 This so-called 'long tail' of data has been identified in other fields (Dietze 2013) and 411 represents data that have been collected but, for one reason or another, are not easily available for 412 re-analysis or syntheses (Wolkovich, Regetz, and O'Connor 2012). A comparison of literature and 413 data repository records suggested that process and biological data are underrepresented in 414 repositories, relative to descriptive, chemical and physical data (Suppl. Materials Figure SF1, 415 methods in supplementary materials SM3). Comparison of the top keywords in the literature to 416 data repositories suggested that other data types ripe for synthesis in context of SOC include soil 417 incubation and temperature sensitivity, soil chronosequence studies, wildfire emissions/retention, 418 nitrogen and phosphorus cycling, root and fungal dynamics, and soil microbiology. For example, a 419 soil carbon-related data repository search suggests that only 1% of the entries in the broader 420 literature have been archived in data repositories (Suppl. Materials SM3). Therefore rescuing data 421 from the literature and making them accessible and compatible with other contributions and 422 databases is a high priority, and particularly important given that climate change effectively makes 423 older soil observations irreproducible (Wolkovich, Regetz, and O'Connor 2012). 424 Harmonizing disparate datasets poses unique challenges due to the diversity in types of 425 measurements and their associated methods, unlike larger national and regional survey campaigns 426 which operate under a single protocol. For example, the Biomass And Allometry Database 427 (BAAD) (Falster et al., 2015) has been a highly successful example of a community-based data aggregation effort. Public repositories, including Dryad, FigShare, and ORNL DAAC, have 428 429 emerged and enjoyed enthusiastic support. As these data repositories have grown, issues around 430 discoverability have emerged such as getting people in a common community to agree on a 431 common technical vocabulary has been challenging. Many efforts (e.g. DataONE) have focused 432 on semantics and linked many of these repositories in a unified search framework. Finally, data 433 harmonization is required not only for typical data cleaning operations like correcting unit mis-434 matches and transparent reproducibility, but also to reconcile different methods and evaluate 435 reliability. This final step requires not only computational skills but also domain expertise.

436 Interoperability of ISCN

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While these international efforts of the ISCN gain momentum, there are parallel requirements to coordinate and share technology, data, protocols, and experiences to maximize resources and generate knowledge. Arguably, this can only be achieved by increasing interoperability within ISCN and among partner networks, organizations, and members. Interoperability is broadly defined as the ability of a system to work with or use the parts of another system (Chen et al. 2008: Marcas et al. 2017)

443 2008; Vargas et al. 2017).

- 444 Challenges related to conceptual barriers include syntactic and semantic differences in the 445 types of information (Madin et al. 2008); technological barriers such as incompatibility of 446 information technologies (e.g. methods to acquire, process, store, exchange, and communicate 447 data; Peters et al. 2014); organizational barriers related to current institutional responsibility and 448 authority such as with institutions, networks, or governments (Supp. Table ST3); and cultural 449 barriers that can be country-specific but must be considered to increase interoperability of 450 networks (Vargas et al. 2017).
- 451

452 **Conclusions** 

- 453 Soils have entered an 'anthropogenic state,' with most of the global surface area either directly 454 managed by humans or indirectly influenced by human activities. As a result, soils globally have
- 455 lost SOC since at least the Industrial Revolution, with direct impacts on climate, ecosystem
- 456 productivity, and resilience to disturbance. There is a crucial need to improve our science and to
- 457 communicate our findings. In this paper, we identified the following goals: (1) identify key data
- 458 needed to improve our detection soil organic matter and SOC trends using our understanding of
- 459 SOC stabilization and destabilization mechanisms, (2) set up communication and sharing
- 460 infrastructure to rescue, centralize, and disseminate currently disparate soil datasets relevant to
- 461 critical soil processes, (3) develop a robust and modular modeling platform for comparing process-
- based models that would move field data and localized experiments into a framework to test Earth
- 463 System processes at local to broader scales and (4) improve the connection between soil C-cycle
- science and land management science and practices. These goals can be achieved through
- improving the exchange of ideas, data, modeling tools, and by sharing information and supportingother networks, organizations, and institutions.
- 467 Processes that influence changes in SOC have been defined and quantified over the past 468 several decades, and metrics for soil health, degradation, and storage are beginning to reflect the 469 interdisciplinary science needed to link soil/land/ecosystem/crop productivity to CO<sub>2</sub> budgets at various scales. Growing populations, increased land use, and intensified land use compel us to 470 471 merge the sciences of soil health with SOC biogeochemistry. The current state of our soils, as well 472 as the opportunities and vulnerabilities that result from different land management practices, are of 473 particular importance. In addition, quantifying the optimal SOC storage capacity of soils would 474 provide a benchmark to further assess human impact on soils and help quantify potential benefits 475 of altered soil management practices.
- 476

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- Table 1. Linkages between soil health indicators and SOC. Soil health indicators are readily-
- 876 measured soil properties that are used to diagnose the ability of soil to provide services such as
- nutrient cycling, erosion mitigation, water storage, or microbial activity. Many of these soil health
- 878 indicators relate directly to SOC content, and many can be ameliorated through restorative
- 879 practices that increase SOM and SOC. For all examples listed, the practices that enhance soil
- health also restore (and enhance) SOM and SOC, thus what is good for the goose (soil) is good for
- the gander (atmosphere). Based on these example, scientists and land managers can readily agree
- that management practices that protect, promote, and conserve soil carbon are practices that
- 883 prevent erosion, provide and preserve water and nutrient capacity.

Health Indicators	Functional	Explanatory C	<b>Restorative Practices</b>				
	Problems	Variables					
Physical							
Microaggregate Stability	Erosion, Compaction	Root growth, fungal biomass,	Conservation tillage, "no-till"				
		biological crusts					
Water Infiltration Rate	Low infiltration, erosion	SOM content	High residue inputs, cover crops,				
			conservation tillage				
Water Holding Capacity	Arid region water	SOM content	Organic matter additions				
	management						
Chemical							
Potentially mineralizable N	Poor fertility	Potentially mineralizable C	Fertility management				
Available P	Poor fertility	Applied organic matter	Fertility and pH management				
Biological							
Microbial Biomass C	Limited soil life	Applied organic matter, root	High residue inputs, conver crops,				
_		biomass	conservation tillate, "no-till"				

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Figure 1. Soil organic carbon stocks and areas currently under land use practices. (a) Spatial variability of soil SOC stocks in the upper meter of soil (where 1 kg C  $m^{-2} = 10 Mg C ha^{-1}$ ), based on the WISE 3.1. database (Batjes, 2016). (b) Fractional human use of the land surface through forestry, grazing and agricultural crops based on the data by Erb et al. (2007); grey areas represent

- unused land. (c) Global SOC stocks (0-1 m) distributed under different land-use categories. (d)
- 891 Potential opportunities for gross annual SOC sequestration in presently managed forest, crop, and
- grazing lands (assuming average management C gains of 0.04 kg C  $m^{-2}$  yr<sup>-1</sup> with error bars
- showing the range of 0.01-0.07 kg C  $m^{-2}$  yr<sup>-1</sup>; Minasny et al., 2017) could compensate for total

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- 894 emission projections from permafrost-C due to the climate feedback (Koven et al., 2015; mean and
- range of projection until 2100 under RCP8.5) and the projected impact of "human land use",
- defined as land use change, agricultural representation, crop harvest, and management (Pugh et al.,
- 897 2015; mean and ensemble range of projection until 2100 under RCP8.5). Note that harvest from
- 898 forestry is not included in this last projection.
- 899
- Figure 2. Processes controlling SOC pools and the mechanisms involved in stabilizing SOC.
- Isolation = physical disconnection (e.g. Schimel & Schaeffer 2012); Cryo = cryopreservation;
- 902 Pyrogenesis = fire residues; Mineral = mineral interaction; Inputs = microbial and plant residues
- 903 that influence desirability or access to microbes (e.g. Kallenbach *et al.* 2016 *Nature*
- 904 *Communications*); Nitrogen = nitrogen or other nutrient limitations (e.g. Averill *et al.* 2014
- 905 906

*Nature*)

- 907 Figure 3. Example research questions and datasets useful for investigating SOC change at different
- timescales. Blue lines indicate relevance of the topic and question to the timescale of
- 909 measurement. Colors for measures indicate status of data archiving efforts. Measurements can be
- 910 well aggregated in centralized repositories (green), have had limited compilation (yellow), or have
- 911 had very limited compilation (red).  $R_s$ , soil respiration;  $R_H$ , heterotrophic respiration; <sup>13</sup>C n.a., <sup>13</sup>C
- natural abundance; TBCA, Total belowground total allocation; POM, particulate organic matter.
- 913
- Figure 4. Creating conditions to optimize the effectiveness of land use to sequester SOC . Actors
- 915 involved in managing lands for soil management change in response to the scale and level of
- 916 information needed. Evaluating and implementing practices (Y axis) starts with scientists working
- 917 with land managers and propagates through broader spatial scales and policies as goals are
- 918 defined, communicated, and met. Major actors can vary with each step, with activities shown in
- the gray boxes. Arrows represent flows of information. In this example, the step-wise progress
- from local to more regional scales represent the increasing opportunity to impact both productivity
- and  $CO_2$  sequestration through soil C sequestration.
- 922

Figure 5. An approach for applying management options to the science of SOC (de)stabilization. Three general classes of soil carbon (de)stabilization processes (biological, chemical and physical) are fundamental to understanding the susceptibility of soils to disturbance (e.g., compaction and erosion, etc). As such, knowledge of the relevant mechanism at play for a given soil can inform key measurements needed (e.g., soil infiltration and sediment transport) and effective management strategies (e.g., diversify vegetation/minimize use and plant stabilizing vegetation/control runoff).

Fig 6: Examples of organizations, groups or entities addressing data, modeling and management relevance of soil carbon. These currently disparate niches need bridging to address complex problems in soil C science. The soil community is data- and knowledge-ready for a platform like ISCN that can bridge data, tools, best management practices and outreach. We propose a way forward to improve soil C data curation with a focus on process variables, which can be applied into a community model framework and actionable science that harnesses mechanistic understanding to address questions on soil health management.



# PROCESSES

# **PROTECTION MECHANISMS**



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**Author** N



Measures





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