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1 What is a good level of soil organic matter? An index based

2 on organic carbon to clay ratio

3 **Running Title:** Soil carbon index

4 J. M. Prout^{1,2} | K. D. Shepherd³ | S. P. McGrath¹ | G. J. D. Kirk² | S. M. Haefele¹

- ⁵ ¹ Department of Sustainable Agricultural Sciences, Rothamsted Research, West
- 6 Common, Harpenden, Hertfordshire, AL5 2JQ, UK
- ⁷ ² School of Water, Energy & Environment, Cranfield University, Cranfield, Bedford
- 8 MK43 0AL, UK
- ⁹ ³ World Agroforestry (ICRAF), UN Avenue, P. O. Box 30677-00100, Nairobi, Kenya
- 10 Correspondence: Jonah Prout. E-mail: jonah.prout@rothamsted.ac.uk

11 Abstract

12 Simple measures of appropriate levels of soil organic matter are needed for soil 13 evaluation, management and monitoring, based on readily-measurable soil properties. 14 We test an index of soil organic matter based on the soil organic carbon (SOC) to clay 15 ratio, defined by thresholds of SOC/clay ratio for specified levels of soil structural 16 quality. The thresholds were originally delineated for a small number of Swiss soils. 17 We assess the index using data from the initial sampling (1978–83) of the National Soil 18 Inventory of England and Wales, covering 3809 sites under arable land, grassland and 19 woodland. Land use, soil type, annual precipitation and soil pH together explained 21% 20 of the variance in SOC/clay ratio in the dataset, with land use the most important 21 variable. Thresholds of SOC/clay ratio of 1/8, 1/10 and 1/13 indicated the boundaries 22 between 'very good', 'good', 'moderate' and 'degraded' levels of structural condition.

23	On this scale, 38.2, 6.6, and 5.6% of arable, grassland and woodland sites, respectively,
24	were degraded. The index gives a method to assess and monitor soil organic matter at
25	national, regional or sub-regional scales based on two routinely measured soil
26	properties. Given the wide range of soils and land uses across England and Wales in
27	the dataset used to test the index, we suggest it should apply to other European soils in
28	similar climate zones.

29 Highlights

- We assess the use of SOC/clay ratios as guidelines for soil management in England
 and Wales.
- We use data from 3809 sites to assess thresholds based on work for Polish, French
 and Swiss soils.
- SOC/clay threshold values can indicate degraded and good soil structural condition.
- The thresholds show the effect of land use and provide an index for use in England
 and Wales.
- 37 **Keywords**: land use, soil clay content, soil organic carbon, soil structure.

39 1 | INTRODUCTION

What is a good level of soil organic matter? Maintaining and if possible increasing the level of soil organic matter is generally a good thing for most functions expected of soils, including carbon sequestration, and increased levels improve soil structure. Farmers, food producers and governments need to know their soil status in relation to a critical value of soil organic matter. However, as soil organic matter varies with land use, soil type, location and other variables an index for gauging the level of soil organic matter under given conditions needs to account for these variables.

47 Verheijen et al. (2005) derived indicative ranges of soil organic carbon (SOC) 48 content for arable soils of England and Wales that are potentially attained under 49 different types of management and environmental conditions, and they found that clay 50 content, precipitation and depth of topsoil could explain 25% of the variation in SOC 51 content. Clay soils under wetter conditions had higher values than more-sandy soils, 52 and grassland soils had higher values than arable soils with similar clay content. Clay 53 content is a key factor because of its effects on SOC protection including adsorption on 54 mineral surfaces and within soil aggregates (Dungait *et al.*, 2012; Six *et al.*, 2002). 55 Under constant land management and organic matter inputs, soils tend towards a 56 steady-state SOC content, with a capacity for stabilising SOC modelled as a function 57 of clay content (Hassink, 1997; Hassink & Whitmore, 1997; Six et al., 2002; Stewart 58 et al., 2007).

59 Dexter *et al.* (2008) found that soil physical properties (bulk density, water 60 retention characteristics and clay dispersibility) could be better explained by the relative 61 amounts of SOC and clay content to each other than by their total contents. In their 62 analysis of data on French and Polish arable and grassland soils, maxima of correlations 63 between the mass of clay per unit mass of SOC and soil physical properties

corresponded to SOC/clay = 1/10, the SOC/clay content ratio was a good indicator of soil physical conditions, and this ratio gave a general separation between the different land uses. These findings were subsequently supported by others in Danish and (de Jonge *et al.*, 2009; Jensen *et al.*, 2019; Schjønning *et al.*, 2012). Johannes *et al.* (2017) developed the approach further, and, in an analysis of Swiss soils, defined SOC/clay thresholds of 1/8, 1/10 and 1/13 as indicating the boundaries between 'very good', 'good', 'suggest improvement' and 'poor' levels of structural condition.

71 In this paper, we assess the three SOC/clay thresholds of Johannes et al. (2017) for 72 soils across different land uses and climates in England and Wales. We use data from 73 the original sampling of the National Soil Inventory (NSI) which contains information 74 on soils at 5662 sites under agricultural and non-agricultural land uses across the two 75 countries (Bellamy et al., 2005). This is a far larger dataset with greater variation in 76 soils, environments and land use than the datasets used by Dexter et al. (2008) and 77 Johannes et al. (2017), and so provides a more comprehensive test of the SOC/clay 78 ratio. We have three objectives. First, to assess the variation in SOC/clay ratio and its 79 drivers across the NSI dataset. Second, to test its ability to delineate soils of different 80 structural quality. Third, to illustrate the use of the SOC/clay index for mapping soil 81 carbon across England and Wales, and for gauging changes in a long-term experiment 82 with contrasting organic and inorganic fertiliser treatments.

83

2 | MATERIALS AND METHODS

84 2.1 | National-scale data

The NSI was first conducted between 1978 and 1983. Topsoil (0–15 cm depth) samples were collected at the intersections of an orthogonal 5 km grid over the entire area. A full description of the survey methods, analytical methods and available data is given 88 in the LandIS database (www.landis.org.uk; Proctor et al., 1998). We considered only 89 arable, ley grassland, permanent grassland and woodland sites, and excluded sites 90 without measurements of soil clay content, pH or depth of topsoil, or that were 91 classified as 'peat'. To reduce the impact of sites with very high SOC content relative 92 to clay content, we excluded 290 outliers with SOC/clay > third quartile + 1.5 \times 93 interquartile range. This gave 3809 sites. Figure 1 shows the distribution of the sites 94 across the two countries and Table 1 gives summary statistics for SOC and clay 95 contents.

Soils at each site were classified by major soil group (Avery, 1980). Data on soil
carbonate content were obtained from field observations of fizzing on addition of HCl
to samples on a five-point scale from non-calcareous to very calcareous.

Soil structural quality was characterised using the Agricultural Land Classification of England and Wales (MAFF, 1988), which gave scores of good, moderate or poor structural quality according to the texture and shape, size and development of aggregates, and friability of subsoil. The NSI contains values for each of these except friability, therefore we estimated based on the shape and size criteria (and where possible development of aggregates was taken into account) (Table S1).

105 Monthly average precipitation was obtained from the UKCP09 dataset (Met Office, 106 2017). Mean accumulated annual precipitation was calculated for the years 1910–1983, 107 and values at each NSI site were intersected using ArcGIS version 10.4. (ESRI, 2015). 108 Ranges for precipitation classes were taken from Verheijen et al. (2005): < 650, 650– 109 800 and 800–1100 mm year⁻¹ with the addition of "very wet" for annual precipitation 110 > 1100 mm year⁻¹.

111 **2.2 | Data analysis**

112 Statistical analyses were performed in R version 3.5.0 (R Core Team, 2017). Random 113 Forest analysis (package: randomForest; Liaw & Wiener, 2002) was used to analyse 114 the variance of SOC/clay with land use, average annual precipitation, major soil group, 115 pH, lower depth of topsoil, calcareous score and risk of flooding. A square-root 116 transformation was applied to SOC/clay to reduce the skewness of the data. Three-117 quarters of the data (n = 2857) was used as a training set, and the RMSE and R² values 118 of predictions of the remaining set (n = 952) were calculated. Training and sample sets 119 were randomly selected. Spatial or other correlations across training and validation sets 120 were unlikely because only topsoil samples were used and the minimum distance 121 between sites was 5 km.

122 Chi-square tests were used to compare numbers of sites within SOC/clay ranges 123 under different land uses and precipitation classes and to test the relationship between 124 the SOC/clay thresholds and soil structure. We used the results of statistically 125 significant chi-square tests to interpret interactions between variables, with 126 contributions by specific combinations of variables to the chi-square statistic inferred 127 from the differences between observed frequency and that expected if there was no 128 interaction between the variables.

We tested SOC/clay thresholds of 1/8, 1/10 and 1/13 as indicating the boundaries between 'very good', 'good', 'moderate' and 'degraded' levels of structural condition, following Johannes *et al.* (2017).

Figures were produced using R package ggplot2 (Wickham, 2016) and maps were
produced using QGIS 3.0.1-Girona (QGIS Development Team, 2020).

134 2.3 | Field-scale data

We assessed the effects of field-scale soil management on SOC/clay ratios relative to the threshold values using data from a long-term organic manuring experiment at 137 Woburn, Bedfordshire, UK (Mattingly, 1974). The experiment had eight treatments 138 with four replicates: (1) peat for 6 yr then ley, (2) farmyard manure (FYM), (3) grass 139 ley plus nitrogen, (4) grass-clover ley, (5) green manure (GM) for 6 yr then ley, (6) 140 straw, and (7) and (8) two inorganic fertiliser treatments (details in Mattingly, 1974). 141 Treatments were applied in two cycles (1965 to 1972 and 1979 to 1987), second cycle 142 treatment denoted by 'then' above if different from first. We calculated SOC/clay ratios 143 for each plot and then averaged the values for each treatment. The plot-level soil clay 144 content ranged from 78 to 131 g kg⁻¹ and the initial SOC content ranged from 5.7 to 8.6 145 g kg⁻¹ (Table S2).

146 **3 | RESULTS**

147 **3.1** | Variation in SOC and clay contents and SOC/clay ratio

Mean SOC contents increased in the order arable << ley grass < permanent grass \approx woodland soils (Table 1). Mean clay contents and their ranges were similar across land uses, except those of woodland soils were smaller. The dominant soil types in all land uses were brown soils and surface-water gleys; the proportions of other soil groups varied (Table S3). Arable sites tended to have smaller average annual precipitation than the other land uses (Tables S4 and S5).

The proportions of sites above and below the three SOC/clay thresholds differed between land uses, particularly for the SOC/clay = 1/13 threshold (Figure 2 and Table 2). A greater proportion of arable sites had SOC/clay < 1/13 (i.e. depleted in SOC for their clay content) and a greater proportion of permanent grassland and woodland sites had SOC/clay > 1/8 (i.e. enriched in SOC for their clay content; $X^2(9) = 681.3$, p < 0.001). Analysis of the influence of land use, soil and other variables on SOC/clay ratio by random forest analysis showed that 21.0% of the variance was explained by the variables examined (Table 3). Land use, average annual precipitation, major soil group and pH were more important than carbonate score, flood risk and depth of topsoil. When the model was run with just the top four variables, the variance explained did not change, however the importance of land use increased relative to the other variables.

166 **3.2 | Effects of land use and precipitation**

167 The effect of land use was clear with lower SOC/clay ratios observed for arable and 168 predominantly higher SOC/clay ratios for grassland and woodland (Table 2). As there 169 was some geographical relationship between the distributions of land use and 170 precipitation, the effects of each on numbers of sites relative to the SOC/clay thresholds 171 were considered. Verheijen et al. (2005) suggested that dry sandy soils were more at 172 risk of lower SOC content than wetter clayey soils and that grassland soils would have 173 higher SOC content than (ley-) arable soils. Comparing SOC/clay threshold ranges, 174 land uses, and precipitation classes (< 650, 650 to 800, 800 to 1100 and > 1100 mm yr⁻¹; Table S6), two questions were asked: 1) were arable soils under dry climate 175 176 conditions more likely to have SOC/clay < 13 than arable soils under wetter climate 177 conditions, and 2) for soils under dry climate conditions ($< 650 \text{ mm yr}^{-1}$), were arable 178 soils more likely to have SOC/clay < 13 than other land uses?

In answer to the first question, chi-squared analysis showed that precipitation class was not independent of SOC/clay ratio for arable soils ($X^2(9) = 78.9$, p < 0.001). Comparing the contributions of each combination to the chi-square statistic showed that a larger number of soils receiving less than 650 mm yr⁻¹ and smaller numbers of soils receiving more than 650 mm yr⁻¹ than expected had SOC/clay < 1/13. Also, a smaller number of dry soils and larger number of soils with greater than 800 mm yr⁻¹ had 185 SOC/clay > 1/8. This suggests that lower precipitation conditions were related to
186 SOC/clay < 13 for arable soils.

187 Chi-squared analysis to answer the second question showed that land use was not 188 independent of SOC/clay ratio for soils under dry climate conditions ($X^2(9) = 94.0$, p < 189 0.001). A larger number of arable soils and smaller number of grassland and woodland 190 soils than expected had SOC/clay < 1/13 than if the land use was independent of SOC/clay ratio range for soils receiving < 650 mm yr⁻¹ annual precipitation. For soils 191 192 with SOC/clay > 1/8, the reverse was true (i.e. arable < grassland or woodland). This 193 suggests that land use was affecting the number of dry climate soils with SOC/clay < 194 1/13.

The relative effects of land use, precipitation and soil type were evident from the distribution of the 820 sites with SOC/clay ratio < 13 across England and Wales (Figure S1). These sites were predominantly arable, and their distribution across eastern and central England confirmed the lesser statistical effect of precipitation and major soil group observed. Northwest England and Wales had notably few degraded sites though soils sampled there were mostly under non-arable land uses.

201 **3.3 | Effects of soil type and soil pH**

The statistical effect of major soil group appeared to be driven by three of the soil groups and some of this might already have been accounted for by land use (Figure 3). Podzolic soils tended to have SOC/clay > 1/8 and were mostly not arable, whereas clayrich pelosols were more likely to have SOC/clay < 1/13 and a higher proportion were arable. The lower importance of soil group might be linked to the smaller sample sizes of the podzolic and pelosol soils compared with brown and gley soils for which SOC/clay ratios showed similar variation. As pH decreased below pH = 5, the SOC/clay ratio tended to increase (Figure S2). Above pH = 5 there was less of a trend when considering permanent grass and woodland soils, however, arable and ley grass soils showed decreasing minimum SOC/clay ratio particularly above pH = 7, though sites with SOC/clay > 1/8 were still observed.

214 **3.4** | Relation between structural quality and SOC/clay ratio

215 Structural quality - classified as good, moderate, moderate-degraded and degraded -216 tended to improve with increasing SOC/clay ratio as shown by the box plots in Figure 217 4 and the chi-squared test result for the relation between SOC/clay range between the 218 thresholds and structural quality ($X^2(9) = 129.3$, p < 0.001). Most (82%) of the 219 relationship between SOC/clay and structural quality was explained by (a) a larger than 220 expected frequency of sites with SOC/clay < 1/13 and moderate-degraded or degraded 221 structure; (b) a smaller than expected frequency of sites with SOC/clay > 1/8 and 222 degraded structure; and (c) smaller than expected frequency of sites with SOC/clay < 223 1/13 and good structure.

224 **3.5** | Variation in SOC/clay ratio across England and Wales

Mapping the index across the two countries (Figure 5) showed the effect of land use and geography at the time of survey. For any land use, degraded sites were not limited to a particular region. But, as previously mentioned, there were fewer degraded sites towards the northwest and in Wales. Calculating summary values of SOC/clay by land use (Table 4) showed that the minimum value increased slightly in the order: arable = ley grass < permanent grass < woodland. The median results showed a stronger difference between arable sites and the other land uses, with arable in the moderate category and the other land uses equal to or above the very good threshold. The different

233 land uses have similar upper SOC/clay values as a result of excluding outliers.

234 **3.6** | Changes in SOC/clay ratio with field management

Figure 6 shows changes in SOC/clay ratios over 30 years of the Woburn organic manuring experiment. Leys and treatments with organic matter application (straw, manures) showed similar trends of increasing SOC/clay ratio during the application period and decreasing ratio after the treatment was stopped, but with differing magnitudes. Peat and farmyard manure gave the largest increases, followed by the ley treatments and then straw. Inorganic fertiliser only treatments showed a general trend of decreasing SOC/clay ratio, and consistently occupied the degraded class.

242 4 | DISCUSSION

243 **4.1** | Variation in SOC/clay ratio with land use and soil type

244 In agreement with Dexter et al. (2008) and Johannes et al. (2017), arable soils had a 245 larger proportion of sites with SOC/clay ratios below 1/10, and permanent grassland 246 soils had a larger proportion above 1/10. Dexter et al. (2008) did not consider soil group 247 or structural condition of the soils in their study, and Johannes et al. (2017) chose only 248 one soil type. Based on the agreement of their results with previous studies on the 249 importance of the SOC/clay = 1/10, Johannes *et al.* (2017) suggested it should apply to 250 a range of soils. Our finding that few grassland and woodland sites had SOC/clay < 251 1/13 supports the use of SOC/clay = 1/13 as an indicative threshold for degradation, as 252 grassland and woodland soils are not generally subject to major disturbance and are 253 close to semi-natural systems. Our analysis shows that many arable soils were depleted 254 in SOC compared with the more natural systems. Ley grassland soils were intermediate 255 between arable and permanent grassland soils. The NSI survey did not include

information on the length of leys nor the time under ley at sampling, but typically this
is between 3 and 8 years. Some proportion of arable sites will have been part of ley
rotations at the time of sampling.

The large variation of SOC/clay ratio within each land use and soil group demonstrates that clay content is not the only determinant of SOC dynamics, especially considering land use history before the sampling will have big effects too. As discussed above, despite the scatter, the thresholds show differences between soils under different land management.

264 The variance of the SOC/clay ratio explained by random forest analysis was similar 265 to the variance of SOC content explained by Verheijen et al. (2005) with step-wise 266 general regression modelling, using similarly-derived precipitation data, and the same 267 soil dataset (though a different subset). We would expect the variance explained to 268 increase with more specific measures of land management within land use classes (crop 269 type, residue treatment, land-use history and, for grassland systems, grazing 270 management). Interpolated precipitation data is another estimation which could be 271 improved, however this is what is generally available at this scale.

272 The effect of major soil group on SOC/clay ratio suggests some consideration 273 should be given to soil type, as highlighted by Johannes et al. (2017). Comparing the 274 variation in SOC/clay ratio between major soil groups, similar variation and medians 275 were found for lithomorphic, brown, gley and man-made soils. The tendency for higher 276 SOC/clay ratio of podzolic soils might be attributed to concentrated organic horizons 277 in the topsoil. The tendency for lower SOC/clay ratios of Pelosols might be attributed 278 to higher clay contents combined with a higher proportion (62%) being arable than most 279 major soil groups. Whilst acidic soils had a tendency for higher SOC/clay ratios, there

appeared to be little relationship between pH and SOC/clay ratio in agriculturally productive pH ranges (circa. pH = 5.5 to 7).

282 **4.2** | Significance of the threshold values

283 The fact that the empirical threshold values found by Johannes et al. (2017) for Swiss 284 soils also hold for the wide range of soils and land uses across England and Wales in 285 our study, suggests they have some fundamental basis, and that they may apply in soils 286 in similar climate zones across Europe. An association of soil structural quality with 287 the SOC/clay = 1/10 ratio was expected from physico-chemical considerations (de 288 Jonge et al., 2009; Jensen et al., 2019). Intuitively there will be some minimum range 289 of SOC/clay ratio below which soil structure is impaired, and some maximum range 290 above which the capacity of soil clays of given mineralogy to bind SOC is exceeded. 291 However, there are no obvious reasons why the precise threshold values indicated by 292 our and the Swiss study should be absolute.

The observed decrease in soil structural quality with decreasing SOC/clay ratio was statistically significant, though there was overlap between the boxplots of SOC/clay ratio between structure classes. Our analysis was limited by the quality of the available data on structure. This was based on the scheme defined for the Agricultural Land Classification of England and Wales, which includes a measure of friability. Since friability was not recorded in the NSI, we had to estimate structural quality without it, introducing error.

The mechanistic link between structural quality and SOC/clay ratio should reduce errors due to cross correlation with spatial and temporal variations in the data. We found, as did Verheijen *et al.* (2005), that SOC content tended to decrease with decreasing precipitation across England and Wales, partly in interaction with land use. However, low SOC/clay ratios were not limited to particular combinations of land use

and precipitation; therefore, we would not consider precipitation to limit SOC/clay ratio
in this data set and geographical range. Land management was shown to affect
proportions of very good and degraded soils under dry (< 650 mm year⁻¹) climate
conditions. So, SOC/clay ratios of at least 1/10 should be attainable in such soils.

309

4.3 | Practical usefulness of the index

The SOC/clay index is a simple measure to evaluate the SOC status of any given soil in England and Wales, independent of the land use. It will therefore be meaningful for experts and non-experts and has consequences for many soil functions beyond agricultural uses. It could allow farmers to identify degraded soils on their farms and adjust their management accordingly. It could also be used to monitor and understand the state of soils at a national scale to inform decision making and policy.

316 Application of the index to data from the long-term Woburn experiment showed its 317 behaviour was consistent with expectations, with an improving index in treatments 318 favouring organic matter accumulation, and a deteriorating index in soil-degrading 319 treatments. This illustrates the magnitude and time taken for the various contrasting 320 managements to change SOC and the index. The soil in the Woburn experiment is a 321 sandy loam; the results show that the index can be used for soils with low clay content, 322 despite the narrowing of the SOC/clay thresholds with decreasing clay content, and the 323 relatively small changes in SOC content between the treatments. It should be noted that, 324 to be useful for monitoring purposes, measurements of SOC and clay over time and 325 between sites need to be consistent.

It would be interesting to look at other longer-term studies to explore a wider range of clay contents, treatments and time periods. Saturation concepts suggest that a soil closer to steady state or saturation limit should accumulate carbon more slowly than

one further from saturation (Six *et al.*, 2002; Stewart *et al.*, 2007). Hence, whether sites
with lower index values (higher degradation) improve more quickly could be tested.

331 **5 | CONCLUSIONS**

An index of soil organic matter with threshold SOC/clay ratios of 1/8, 1/10 and 1/13 satisfactorily separates the soils of England and Wales into very good, good, moderate and degraded classes of SOC content and physical structure condition. In agreement with previous publications, grassland and woodland soils mostly had SOC/clay ratio > 1/10, indicating that their SOC contents are close to or above the capacity for protection of SOC by interaction with clay particles. That these more natural systems tend to have SOC/clay ratio > 1/10 supports this as a suitable threshold for good condition.

Arable soils and soils receiving less annual rainfall were most likely to be physically degraded, though rainfall was a less important factor determining SOC/clay ratio. Very good status soils (SOC/clay > 1/8) occurred in low rainfall areas, even under arable management, suggesting that rainfall does not fundamentally limit SOC content in this climate.

The SOC/clay ratio index allows the evaluation of soils on a scale from degraded to good soil conditions. It therefore gives a ready metric for communication to experts and non-experts, enabling users to adjust their practices and decision makers to develop adequate policies. A SOC/clay ratio greater than 1/10 should be achievable for all managed soils of different textures. Many arable soils in England and Wales evidently have a substantial SOC deficit, suggesting a significant opportunity to increase SOC storage to both improve soil conditions and sequester carbon.

Being based on two routinely measured soil properties, the index provides a suitable means of monitoring SOC at national, regional or sub-regional scales. Given the wide range of soils and land uses across England and Wales in the dataset used to test the

index and agreement with literature using French, Polish and Swiss soils, it shouldapply to other European soils in similar climate zones.

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371 Data Sharing and Data Accessibility statement

The NSI dataset is held by Cranfield University and accessed via LandIS
(www.landis.org.uk). UKCP09 data are available from the Centre for Environmental
Data Analysis (CEDA) archive
(http://catalogue.ceda.ac.uk/uuid/94f757d9b28846b5ac810a277a916fa7). Data for the
Woburn Organic Manuring experiment can be obtained via the Electronic Rothamsted
Archive (era.rothamsted.ac.uk).

378 **Conflict of interest statement**

379 The authors have no conflicts of interest related to the work presented in this380 manuscript.

381 Authorship

382 Study concept and design: all. Analysis and interpretation of data: Prout, Shepherd,

383 Haefele. Drafting of the manuscript: Prout. Critical revision of the manuscript for

384 important intellectual content: Kirk, McGrath, Haefele, Shepherd. Statistical analysis:

385 Prout and Shepherd.

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		SOC content (g kg ⁻¹)			Clay content (g kg ⁻¹)				
	n	Mean	Med.	Min.	Max.	Mean	Med.	Min.	Max
Arable	1661	25	22	4	126	262	247	26	879
Ley grass	602	34	31	7	109	267	257	60	756
Permanent	1277	42	39	6	138	281	260	47	795
grass									
Woodland	269	40	37	1	158	251	242	10	606
All land	3809	34	30	1	158	268	252	10	879
uses									

464 Table 1 Soil organic carbon (SOC) and clay contents by land use class in the National465 Soil Inventory

468	Table 2 Percentages of sites above, below and between SOC/clay thresholds of 1/8,
	= 1000000000000000000000000000000000000

		Percenta	ge of sites with	indicated SOC/c	lay ratio
	n	≥ 1/8	<1/8 ≥1/10	<1/10 ≥1/13	<1/13
Arable	1661	28.8	14.0	19.0	38.2
Ley grass	602	50.2	20.3	14.6	15.0
Permanent grass	1277	66.9	15.4	11.1	6.6
Woodland	269	67.7	16.0	10.8	5.6

469 1/10 and 1/13 for each land use and land use precipitation class combination.

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472	Table 3 Contributions of indicated variables to variance in SOC/clay ratio analysed
473	using random forests. Training data was a random selection of 75% of the data ($n =$
474	2857). With all seven explanatory variables, root mean square error (RMSE) for
475	training data = 0.06, R^2 = 0.21; RMSE for remaining data = 0.07; R^2 = 0.21. With only
476	top four variables, RMSE for training data = 0.06, $R^2 = 0.21$; RMSE for remaining data
477	$= 0.06; R^2 = 0.22.$

square erro 32.7 28.0 26.4	39.8 26.0
28.0	26.0
26.4	
	20.3
22.5	20.3
10.4	
10.0	
~ ~	

Table 4 Summary of SOC/clay ratio decimal values calculated for each land use in

482 the NSI subset

	SOC/clay ratio				
	Mean	Median	Min.	Max.	
Arable	0.109	0.090	0.018	0.357	
Ley grass	0.139	0.125	0.018	0.359	
Permanent					
grass	0.165	0.154	0.022	0.360	
Woodland	0.174	0.160	0.025	0.355	

484 FIGURE CAPTIONS

485 **FIGURE 1** Map of arable, ley grass, permanent grass and woodland sites in the 486 National Soil Inventory sampled between 1978 and 1983 (n = 3809).

487 **FIGURE 2** Soil organic carbon content as a function of clay content for different land

488 uses. Lines are SOC/clay thresholds: solid = 1/8, dashed = 1/10, dot-dash = 1/13.

489 FIGURE 3 Box plots of SOC/clay ratio for each major soil group. Horizontal lines

490 are SOC/clay thresholds: solid = 1/8, dashed = 1/10, dotted = 1/13. Abbreviated major

491 soil groups: Terr. raw = terrestrial raw, Lith. = lithomorphic, SW gley = surface-water

492 gley, GW gley = ground-water gley.

FIGURE 4 Box plots of SOC/clay ratio for each structural quality score. Horizontal lines are SOC/clay thresholds: solid = 1/8, dashed = 1/10, dotted = 1/13. Numbers of samples in each group were n = 2250, 1111, 229 and 208 for Good, Moderate, Moderate-Degraded and Degraded, respectively.

497 FIGURE 5 Maps of SOC/clay ratio across England and Wales under (a) arable, (b)
498 ley grass, (c) permanent grass, and (d) woodland coloured by SOC/clay index.

FIGURE 6 Changes over time in SOC/clay ratio in the Woburn long-term manuring experiment. Points are treatment means. Horizontal lines are thresholds separating degraded (SOC/clay < 1/13), moderate (SOC/clay = 1/13-1/10), good (SOC/clay = 1/10-1/8) and very good (SOC/clay > 1/8) soil conditions. Treatments were applied in two cycles (1965 to 1972 and 1979 to 1987); peat and green manure (GM) treatments were replaced by grass ley for the second cycle. Fert. 1 = (PKMg) = Straw plus P, Fert. 2 = (PKMg) = FYM.