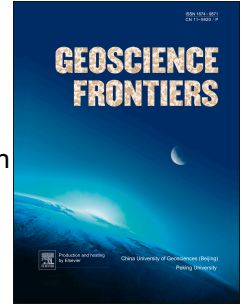


Accepted Manuscript

Spatial analysis of land use change effect on soil organic carbon stocks in the eastern regions of China between 1980 and 2000

Xueqi Xia, Zhongfang Yang, Yuan Xue, Xin Shao, Tao Yu, Qingye Hou



PII: S1674-9871(16)30057-3

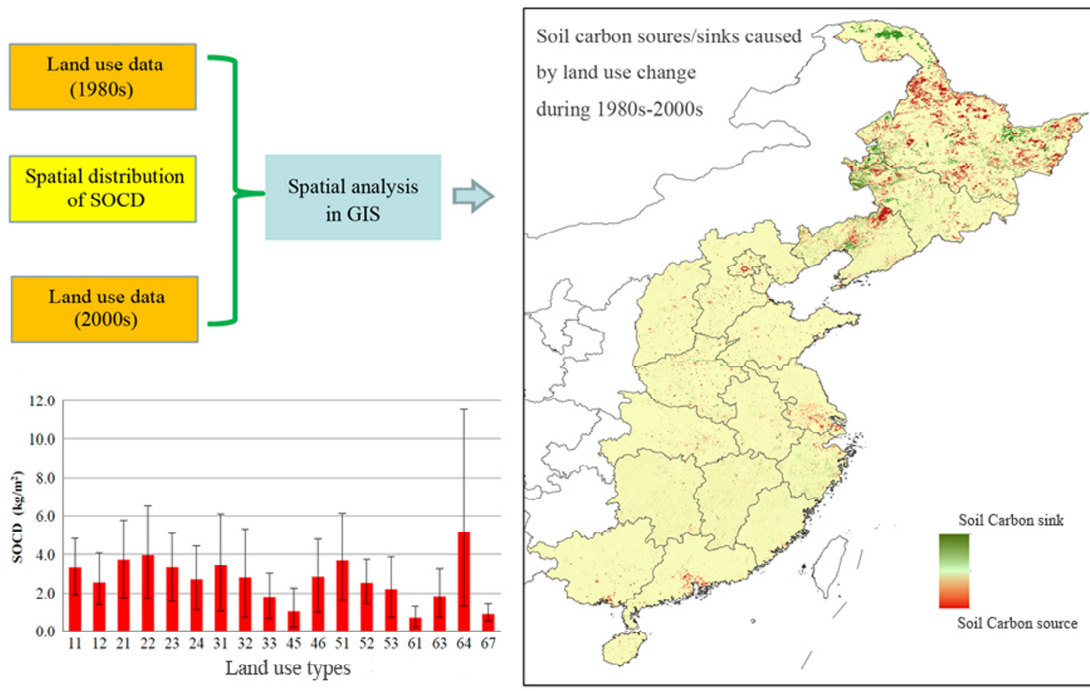
DOI: [10.1016/j.gsf.2016.06.003](https://doi.org/10.1016/j.gsf.2016.06.003)

Reference: GSF 463

To appear in: *Geoscience Frontiers*

Please cite this article as: Xia, X., Yang, Z., Xue, Y., Shao, X., Yu, T., Hou, Q., Spatial analysis of land use change effect on soil organic carbon stocks in the eastern regions of China between 1980 and 2000, *Geoscience Frontiers* (2016), doi: 10.1016/j.gsf.2016.06.003.

This is a PDF file of an unedited manuscript that has been accepted for publication. As a service to our customers we are providing this early version of the manuscript. The manuscript will undergo copyediting, typesetting, and review of the resulting proof before it is published in its final form. Please note that during the production process errors may be discovered which could affect the content, and all legal disclaimers that apply to the journal pertain.



1 **Spatial analysis of land use change effect on soil organic carbon stocks in**
2 **the eastern regions of China between 1980 and 2000**

3 Xueqi Xia^{a,*}, Zhongfang Yang^{a,*}, Yuan Xue^b, Xin Shao^a, Tao Yu^a, Qingye Hou^a

4 ^aSchool of Earth Sciences and Resources, China University of Geosciences, Beijing 100083,
5 China

6 ^bChongqing Institute of Land Surveying and Planning, Chongqing 404000, China

7

8 *Corresponding author e-mail address: xiaxueqi@cugb.edu.cn (X. Xia); zfyang01@126.com (Z.
9 Yang)
10 TEL: +86-10-82320527.

11 ABSTRACT

12 Spatial distributions of 0–20 cm soil carbon sources/sinks caused by land use changes from the
13 year 1980 to 2000 in an area of 2.97×10^6 km² in eastern China were investigated using a land use
14 dataset from a recent soil geochemical survey. A map of soil carbon sources/sinks has been
15 prepared based on a spatial analysis scheme with GIS. Spatial statistics showed that land use
16 changes had caused 30.7 ± 13.64 Tg of surface soil organic carbon loss, which accounts for
17 0.33% of the total carbon storage of 9.22 Pg. The net effect of the carbon source was estimated
18 to be ~ 71.49 Tg soil carbon decrease and ~ 40.80 Tg increase. Land use changes in Northeast
19 China (NE) have the largest impact on soil organic carbon storage compared with other regions.
20 Paddy fields, which were mainly transformed into dry farmland in NE, and constructed land in
21 other regions, were the largest carbon sources among the land use types. Swamp land in NE was
22 also another large soil carbon source when it was transformed into dry farmland or paddy fields.
23 Dry farmland in the NE region formed the largest soil organic carbon sink, as some were
24 transformed into paddy fields, forested land, and other land use types with high SOCD.

25 **Key words:** Land use change; Soil organic carbon; GIS; Eastern China

26

27 1. Introduction

28 Soils are the largest reservoir of carbon in the terrestrial biosphere (Batjes, 1996). Minor
29 changes in soil organic carbon (SOC) storage can affect atmospheric carbon composition
30 (Johnston et al., 2004). Several factors, such as climate change, land use change, land
31 management, etc., interact to regulate soil carbon storage (Xia et al., 2010), and these factors
32 tend to exert their influence at different time scales (Syers, et al., 1970; Jenny, 1980). However,

33 at the time scale of decades, land-use change is one of the important factors considerably
34 influencing soil carbon storage (Scott et al., 2002; Xia et al., 2011; Leifeld, 2013).

35 Houghton (2003) showed that global land use changes since 1850 had caused 156 Pg of soil
36 carbon release into the atmosphere. In particular, the transformation of forests to agricultural
37 land and grassland will result in the decrease of soil carbon storage by 20–50% and ~20%,
38 respectively. Others (Schlesinger, 1986; Moraes et al., 1995; Knopes and Tilman, 2000;
39 Motavalli et al., 2000; Guo and Gifford, 2002; Murty et al., 2002) have obtained similar results,
40 which showed that SOC decreases 20–89% when forests are transformed into agricultural lands
41 depending on the region and vegetation. Furthermore, it is widely known that when agricultural
42 land changes to forest and grassland, soil organic carbon density (SOCD) will increase
43 significantly (Post and Kwon, 2000; Guo and Gifford, 2002; Martens et al., 2004). Several
44 studies (Osher et al., 2003; Parfitt et al., 2003; Beniston et al., 2014) have investigated the
45 microcosmic mechanisms for various types of land use changes, and showed that each land use
46 has a steady SOCD attained when the soil carbon cycling reaches the state of equilibrium at a
47 certain climate condition as well as other environmental factors (Johnston et al., 2004).

48 With the rapid development of agriculture and industry in China, significant land use changes
49 have occurred over recent decades, particularly in the eastern regions (Liu et al., 2004; Zhang et
50 al., 2006). Paddy fields and dry farmland have been expanded by reclamation of forests,
51 swampland, water regions, or sandy lands, especially in Northeast China. Urbanization expanded
52 the constructed lands by occupying the surrounding farmlands. The estimations of change of soil
53 carbon stock caused by the change of land use at national scale and the spatial distribution of the
54 soil carbon source/sink are the major challenges faced by many researchers. In China, many
55 studies have been undertaken (Li et al., 2002; Shi and Yu, 2003; Wu and Yu, 2004; Xu et al.,

56 2005; Wang et al., 2006) related to soil organic carbon storage under various land use types in
57 local areas. However, estimations at the regional or national scale are limited.

58 Estimating the effect of land use changes on soil carbon storage depends on data sources and
59 techniques (Leifeld, 2013). Former studies in China used soil data measured in situ (Li et al.,
60 2002; Shi and Yu, 2003; Wu and Yu, 2004; Xu et al., 2005; Wang et al., 2006) or from the
61 second soil survey performed in China during 1980 (Liu et al., 2004). However, both datasets
62 have limited sample sizes. China's national "Multi-Purpose Regional Geochemical Survey"
63 (MPRGS) (Li et al., 2013) project, started in 1999, has now covered 1.7 million km². It has
64 provided a new high resolution data source for assessing soil carbon storage changes with a
65 surface (0–20 cm) soil sampling density of 1 sample/km². And also, the techniques to quantify
66 the effect of land use changes on soil carbon storage on large spatial scales are poorly developed,
67 particularly those based on GIS to investigate the spatial distribution of the changes.

68 Using spatial data analysis techniques based on GIS, this study aims to investigate (1) SOCD
69 under various land use types in eastern China, (2) the spatial distribution of soil carbon
70 sources/sinks caused by land use changes from 1980 to 2000, and (3) the dominant types of land
71 use changes in each region, e.g., Northeast China (NE), North China (NC), East China (EC),
72 Central China (CC), and South China(SC), and their soil carbon effects. This paper focuses on
73 the assessment of the soil carbon effect by land use changes on the regional scale during the
74 decades.

75 **2. Materials and methods**

76 *2.1 Study area*

77 The study area in eastern China covers $\sim 2.97 \times 10^6$ km², and is divided into five regions:
78 Northeast China (NE, including Heilongjiang, Jilin, and Liaoning), North China (NC, including

79 Beijing, Tianjin, Hebei, Shanxi, Shandong, and Henan), East China (EC, including Shanghai,
80 Jiangsu, Anhui, and Zhejiang), Central China (CC, including Hubei, Hunan, and Jiangxi), and
81 South China (SC, including Guangdong, Guangxi, Fujian, and Hainan). A map of the study area
82 is shown in Fig. 1.

83 2.2 Data sources

84 *Soil organic carbon.* The basic soil carbon data are taken from China's MPRGS project. In the
85 project, the soil samples (grid wise) were collected both from surface (0–20 cm) and depth (150–
86 180 cm). In this study, only the surface (0–20 cm) soil data were used as it directly records the
87 impact of land use changes in the time scale of decades. In the surface soil sampling, the samples
88 were randomly collected from the top soil layer (0–20 cm) within a 1 km² sampling cell defined
89 as a 1 km × 1 km grid on a topographic map. Four samples were mixed to make a composite
90 sample to reduce analytical cost. A 4 km² cell for the four mixed 1 km² samples was designated
91 as the analytical cell, so as to get a soil data resolution of 2 km. A total of 292,074 analytical
92 cells and mixed samples were obtained in the study area, which covered an area of ~2.5 × 10⁵ km²
93 in NE, ~3.3 × 10⁵ km² in NC, ~2.1 × 10⁵ km² in EC, ~2.1 × 10⁵ km² in CC, and ~1.7 × 10⁵ km² in SC
94 as shown in Fig. 1. Fifty-four soil parameters, including SOC for this study, were analyzed in
95 qualified labs. Details of the sampling scheme, sample preparation, analytical schemes, and
96 analytical quality monitoring methods were adopted from the regulation document developed
97 specifically for MPRGS (2014).

98 *Soil bulk density, gravel volume, and land use data.* Soil bulk density (ρ) and gravel volume
99 percentage (G) for SOCD calculation were spatially retrieved from the Harmonized World Soil
100 Database (HWSD v1.1) distributed by FAO and IIASA in 2009. The land use data were
101 collected from the Data Center for Resources and Environmental Sciences, Chinese Academy of

102 Sciences (RESDC, <http://www.resdc.cn>). The grid data with a resolution of 1 km, for the 1980s,
 103 1995, and 2000, used a taxonomy of two levels with 6 first level types and 25 second ones. The
 104 land use type of the first level included plow land (1), woodland (2), grassland (3), water regions
 105 (4), constructed land (5), and unused land (6). In the second level, plow land (1) included paddy
 106 fields (11) and dry farmland (12); woodland (2) included forests (21), shrub land (22), thin
 107 forested land (23), and other woodlands (24); grassland (3) included density grassland (31),
 108 middle grassland (32), and thin grassland (33); water regions (4) included rivers and channels
 109 (41), lakes (42), reservoirs (43), permanent glaciers and snow land (44), tidal zones (45), and
 110 bottom land (46); constructed land (5) included urban land (51), rural residential (52), and other
 111 constructed land (53); unused land (6) included sand land (61), the Gobi (62), saline and alkaline
 112 land (63), swampland (64), barren fields (65), rock and gravel covered land (66), and other
 113 unused land (67). Each land use type was assigned a code as shown above. The raster data files
 114 were named after the code of each land use type. The values in the 1×1 km grids are the area
 115 percentage of the land use type.

116 2.3 Data processing and calculation

117 2.3.1 SOCD calculation.

118 SOCD for 0–20 cm was calculated as: $SOCD = SOC/100 \times D \times \rho \times (100 - G)/100 \times 10$, where SOC
 119 is the concentration of soil organic carbon in %; D is the depth of the SOCD to be calculated,
 120 namely, 20 cm in this study; ρ is the soil bulk density; and G is the volume percentage of >2 mm
 121 gravel.

122 2.3.2 The spatial distribution of soil sources/sinks caused by land use changes

123 The spatial distribution of SOCD in each region was calculated by the map algebra function in
 124 ArcGISTM 10.0 with $SOCD_{(i,j)} = \sum_k SOCD_k \cdot Value_{(i,j),k}$, where $SOCD_{(i,j)}$ denotes SOCD in the

125 grid (i,j) ; k is the code of land use type; SOCD_k is the average SOCD for land use type k in the
 126 corresponding region (NE, NC, EC, CC, and SC); and $\text{Value}_{(i,j),k}$ is the value of grid (i,j) for land
 127 use type k , i.e., the area percentage of land use type k in the grid (i,j) . $\text{SOCD}_{(i,j)}$ was calculated
 128 with the land use data from the 1980s to the 2000s to obtain two raster datasets for the respective
 129 temporal points. $\text{SOCD}_{(i,j)}$ was calculated for each region, and then the raster data for the five
 130 regions were integrated to obtain the data for the whole study area. The raster data for the 1980
 131 were subtracted from those for the 2000 using the map algebra function in ArcGIS to obtain the
 132 raster data describing the soil carbon sources/sinks.

133 2.3.3 Areas of land use changes

134 Raster data analysis tools in ArcGIS, e.g., Reclassify, Raster calculator, etc., were used to
 135 calculate the area of each land use type. The area of land use type k transformed into land use
 136 type t in a grid, denoted by $C_{k \rightarrow t}$, was calculated by: $C_{k \rightarrow t} = \min(-A_k, A_t)$, where $\min()$ is the
 137 function that returns the smallest number of the input values. A_t denotes the area increased for
 138 land use t in a grid, which was calculated by: $A_t = \text{if}(A_{t,2000} - A_{t,1980s} \geq 0, A_{t,2000} - A_{t,1980s}, 0)$, where
 139 $A_{t,2000}$ is the area of land use type t in the 2000 dataset, and $A_{t,1980s}$ denotes the area in the 1980s.
 140 $\text{if}()$ is a logic function that returns the second input parameter when the first input parameter is
 141 true and returns the third parameter, i.e., 0, when it is false. $-A_k$ in formula (4) denotes the
 142 decreased area of land use k , which was calculated by
 143 $-A_k = -\text{if}(A_{k,2000} - A_{k,1980s} < 0, A_{k,2000} - A_{k,1980s}, 0)$, where $A_{k,2000}$ is the area of the land use type k
 144 in the 2000 dataset, and $A_{k,1980s}$ denotes land use type in the 1980s.

145 2.3.4 Carbon storage change caused by land use changes

146 Change of SOCD caused by the transformation of land use type k into type t , denoted by
 147 $\text{SOCD}_{k \rightarrow t}$, was calculated by $\text{SOCD}_{k \rightarrow t} = \text{SOCD}_t - \text{SOCD}_k$, where SOCD_t and SOCD_k are the

148 average values of SOCD of t and k respectively, in each region. Carbon storage change from k
149 into t ($CSC_{k \rightarrow t}$) was calculated by: $CSC_{k \rightarrow t} = SOCD_{k \rightarrow t} \times C_{k \rightarrow t}$.

150 2.3.5 Uncertainty analysis

151 Uncertainties from the calculation and statistics of $SOCD_{k \rightarrow t}$ and $CSC_{k \rightarrow t}$ were estimated using a
152 Monte Carlo method and the errors have been given in standard deviation (SD) after the sign of
153 “ \pm ” in related figures.

154

155 3. Results and discussion

156 3.1 SOCD and storage by land use type

157 The statistical result of SOCD for various land use types in the study area is shown in Fig.2.
158 The columns in the figure denote the average values, and the upper and bottom error lines denote
159 the 9/10 and 1/10 quantiles, respectively. In plow lands, paddy fields typically show higher
160 SOCD compared to dry farm land. Forest and shrub lands had higher SOCD values compared to
161 thin forested land. For construction lands, urban land SOCD was higher than that for rural
162 residential areas. It should be noted that the MPRGS samples from urban lands were typically
163 collected in the green fields of cities. Therefore, urban land SOCD was actually representative of
164 city green fields. Unused land had a high variety of SOCD values in the second land use levels,
165 including the highest values for swampland and the lowest values for sand land.

166 The SOCDs for each land use type in NE, NC, EC, SC, and CC are shown in Table 1, which
167 provides the averages and standard deviations. SOCD in an ecosystem is controlled by soil
168 carbon inputs (e.g. litter) and outputs (e.g. soil respiration). It reaches equilibrium at a steady
169 land use and climate condition for a long period of time, i.e. usually several decades depending
170 on the land use (Kutsch et al., 2009). The average values of SOCD by land use type for each

171 region in Table 1 can be regarded as the equilibrium values under each land use, as the majority
172 of the samples have been in a steady land use type and climate condition for decades, or even
173 centuries, so it is reasonable to assume that they have reached the equilibrium.

174 The storage of surface SOC under each land use type for each region is calculated and
175 provided in Table 2. The study area, which was approximately 2.96×10^6 km², had a total carbon
176 storage of approximately 9.22 Pg. NE had the largest soil organic carbon stock of 3.13 Pg
177 followed by 2.05 Pg in CC. From the perspective of land use, forested land had the largest SOC
178 storage because of its high SOCD. Dry farm land and paddy fields also had high carbon storage
179 because they were dominant land use types in the study area.

180 *3.2 The spatial distributions of the soil carbon sources/sinks*

181 The SOCD equilibrium will be disturbed when one land use type is changed to another, and
182 reaches a new equilibrium after a period time, usually in the scale of several decades (Kutsch et
183 al., 2009). China has seen dramatic land use changes in recent decades as described by Liu et al.
184 (2002, 2014). The maps of land use in the study area, for 1980 and 2000 respectively, were given
185 in Fig. 3. Figure 4 shows the map for the soil carbon sources/sinks caused by land use changes
186 during this period. Positive values, i.e., in dark green, denote an increased SOCD during this
187 period. Soils with increased SOCD act as carbon sinks. Negative values, i.e., in red, denote
188 decreased SOCD. Soils with decreased SOCD act as a carbon source. Figure 4 shows the effect
189 of land use change during 1980s–2000s. It is to be noted that the carbon stock increase/decrease
190 might not have finished completely during that period, but could have continued for a longer
191 time until it reached a new equilibrium. It can be seen that NE had large amounts of soil carbon
192 sources and sinks with significant land use changes of various types. However, the SOCD
193 changes in NC, EC, CC, and SC mainly occurred near cities and were mainly exhibited as soil

194 carbon sources, particularly near the urban agglomerations of the Changjiang River and Pearl
195 River deltas.

196 The SOCD changes in Fig. 4 reflect many events, including human activities or projects with
197 the natural processes, in the last decades. For example, the forest fire in the 1980s in the most
198 north Heilongjiang Province, i.e., Mohe County and Tahe County, caused a loss of soil carbon,
199 but then the vegetation restoration of the cut-over land gained a soil carbon sink in the following
200 decades. Reclamation of forests in the north part of Heilongjiang province near the Sunwu, Beian,
201 and Yichun, and reclamation of swampland in Sanjiang Plain in the northeast Heilongjiang
202 Province have caused a soil carbon loss in the past decades. Other events linked to the soil
203 carbon changes caused by land use change in the NE China can be found in Xia et al. (2011).
204 Soil carbon loss in other regions, i.e., NC, EC, CC, and SC, was mainly caused by the
205 urbanization in the last decades in China. Expansion of the cities occupied the farmland around
206 them and brought about a loss of soil carbon. Another notable event is the several ecological
207 restoration projects that have been carried out in the last decades from 1980. The projects mainly
208 carried out in the large river drainage basins such as Changjiang, Huaihe, and Qiantangjiang,
209 began to show the effect of carbon sequestration, and caused soil carbon increase to some extent.

210

211 *3.3 Statistics from regional perspective*

212 When a land use type with higher SOCD is changed to another with lower one, soil carbon
213 storage will decrease until a new equilibrium is reached, i.e., the soil has a potential to act as a
214 carbon source, provided there is no other disturbances such as climate change, change of soil
215 management etc. And also, when a land use type with lower SOCD is changed to another with
216 higher one, it has a potential to act as a carbon sink (Kutsch et al., 2009). There are many such

217 types of land use changes in the study area. Some of them will act as a carbon source and others
218 as a carbon sink. Based on spatial analysis and statistics with GIS, total carbon decrease and
219 increase in each region was calculated and presented in Table 3. For the $29.68 \times 10^5 \text{ km}^2$ study
220 area of eastern China, the total soil carbon loss caused by land use change was $\sim 71.49 \text{ Tg}$, and
221 the increase was $\sim 40.80 \text{ Tg}$ with an aggregate effect of $30.7 \pm 13.64 \text{ Tg}$ of soil carbon loss.
222 Compared to total surface soil carbon storage of 9.22 Pg in the eastern regions, the aggregate
223 effect of land use changes caused a 0.325% soil carbon loss. The result of this study is
224 comparable to that of Liu et al. (2004), which estimated that the soil carbon loss caused by land
225 use changes in China from 1990 to 2000 was 53.7 Tg . This quantity is for the whole region of
226 China, whereas 30.7 Tg is estimated for the eastern regions during 1980 and 2000.

227 Table 3 also gives comparison of soil carbon change among the regions, which shows that land
228 use changes in NE had the most significant effect on soil carbon storage. Both land use data in
229 this study and those in literature of Zhang et al. (2006) showed that NE had the most significant
230 land use changes in the last decades. Also, NE had relatively higher SOCD variances among the
231 different land use types. So, carbon storage change in this region is most significant.

232 *3.4 Statistics from land use perspective*

233 Table 4 presents the soil carbon changes by the initial land use for each region i.e. during
234 1980s. The result shows that forest land, swamp land, and paddy fields are the main soil carbon
235 sources. Forest land, especially in NE, was transformed to dry farm land, which caused a carbon
236 loss. This type of transformation leads a soil carbon decrease of $\sim 14.9 \text{ Tg}$ in the study area. Soil
237 carbon change of swamp land occurred also in NE. It was transformed to paddy fields and dry
238 farmland by $\sim 1900 \text{ km}^2$ and $\sim 2280 \text{ km}^2$ and caused a carbon loss of 3.17 Tg and 5.34 Tg
239 respectively. Paddy fields were another carbon source. Some of them were transformed to dry

240 farmland in NE, and to urban land in other regions, thus a little soil carbon source was formed.
241 Dry farmland in the study area totally forms a carbon sink. Some of it was transformed to paddy
242 fields, and forest land in NE, and EC, and CC to form a carbon sink, at the same time, some was
243 transformed to urban land, especially in NC, SC, and CC to form a carbon source, and the
244 aggregated result is a carbon sink. Some area of lake in NE was transformed to swamp land, and
245 it forms a small carbon sink. Details of the typical types of land use change in each area and its
246 soil carbon effect was given in Tables S1 to S5 in the Supplementary files.

247 This study estimates the soil carbon storage change caused by the change of land use during
248 the period from 1980 to 2000. The results do not conclude that the carbon storage change was
249 completed during the time as it needs further time to reach equilibrium (Johnston et al., 2004).
250 Also, the present study aims to assess the carbon storage change using land use changes only and
251 all other factors were excluded (Xia et al., 2011), such as climate change, land management etc.

252

253 4. Conclusion

254 The spatial distributions of 0–20 cm soil carbon sources/sinks caused by various types of land
255 use changes from 1980 to 2000 in the study area were mapped and statistically investigated.
256 Following are the conclusions of the study:

- 257 (1) Spatial statistics showed that land use changes from 1980 to 2000 had caused $30.7 \pm$
258 13.64 Tg of surface soil organic carbon loss in the area of 2.97×10^6 km², which
259 accounted for 0.33% of the total carbon storage of 9.22 Pg.
- 260 (2) The net effect of the soil carbon source was estimated as ~ 71.49 Tg soil carbon decrease
261 and ~ 40.80 Tg increase.

- 262 (3) The land use changes in NE China disturbed the soil organic carbon storage most
263 significant compared to other regions because of the considerable land use changes and
264 the variety of SOCD in the different land use types.
- 265 (4) Paddy fields, which were mainly transformed into dry farmland in NE, and constructed
266 land in other regions, were the largest carbon sources among the original land use types.
267 Furthermore, swamp land in NE was also another large soil carbon source when it was
268 transformed into dry farmland or paddy fields.
- 269 (5) Dry farmland in the NE region formed the largest soil organic carbon sink, as some were
270 transformed into paddy fields, forested land, and other land use types with high SOCD.

271

272 **Acknowledgements**

273 SOC data used in the study were from the MPRGS project, a joint project between the
274 China Geological Survey (CGS) and the Provincial Governments in China. Sampling
275 was performed by participants from the Institute of Geological Survey of each Provincial
276 Government in their respective home areas. Many people contributed to the planning and
277 the implementation of this project, and we would like to express our sincere thanks to all
278 of the participants. This work was financially supported by the Geological Survey
279 Project of CGS (12120113000400) and the fundamental research funds for the central
280 universities (2652015055). The authors are also grateful to the three anonymous
281 reviewers for their helpful suggestions, which have highly improved the quality of the
282 paper.

283

284 **References**

- 285 Batjes, N.H., 1996. Total carbon and nitrogen in the soils of the world. *European Journal of Soil*
286 *Science* **47**, 151-163.
- 287 Beniston, J.W., Dupont, S.T., Glover, J.D., Lal, R., Dungait, J.A.J., 2014. Soil organic carbon
288 dynamics 75 years after land-use change in perennial grassland and annual wheat agricultural
289 systems. *Biogeochemistry* **120**, 37-49.
- 290 Guo, L.B., Gifford, R.M., 2002. Soil carbon stocks and land use change: a meta analysis. *Global*
291 *Change Biology* **8**, 345-360.
- 292 Houghton, R.A., 2003. Revised estimates of the annual net flux of carbon to the atmosphere
293 from changes in land use and land management 1850-2000. *Tellus B* **55**, 378-390.
- 294 Jenny, H., 1980. *The Soil Resource, Origin and Behavior*. Springer Verlag, New York.
- 295 Johnston, C.A., Groffman, P., Breshears, D.D., Cardon, Z.G., Currie, W., Emanuel, W., Gaudinski,
296 J., Jackson, R.B., Lajtha, K., Nadelhoffer, K., Nelson, D., Mac Post, W., Retallack, G.,
297 Wielopolski, L., 2004. Carbon cycling in soil. *Front Ecol. Environ.* **2**, 522-528.
- 298 Knops, J.M. H., Tilman, D., 2000. Dynamics of soil nitrogen and
299 carbon accumulation for 61 years after agricultural abandonment. *Ecology* **81**, 88-98.
- 300 Kutsch, W.L., Bahn, M., Heinemeyer, A., 2009. *Soil Carbon Dynamics: An Integrated*
301 *Methodology*. Cambridge University Press, Cambridge
- 302 Leifeld, J., 2013. Prologue paper: Soil carbon losses from land-use change and the global
303 agricultural greenhouse gas budget. *Science of the Total Environment* **46**, 3-6.

- 304 Li, M., Xi, X.H., Xiao, G.Y., Cheng, H.X., Yang, Z.F., Zhou, G.H., Ye, J.Y. & Li, Z.H., 2013.
305 National multi-purpose regional geochemical survey in China. *Journal of Geochemical*
306 *Exploration*<http://www.sciencedirect.com/science/journal/aip/03756742>**139**, 21-30.
- 307 Li, Y.L., Peng, S.L., Ren, H., Li, Z.A., 2002. A Study on the Soil Carbon Storage of Some Land
308 Use Types in Heshan, Guangdong, China. *Journal of Mountain Science***20**, 548-552(In
309 Chinese).
- 310 Liu, J.Y., Kuang, W.H., Zhuang Z.X., Xu, X.L., Qin Y.W., Ning, J., Zhou W.C., Zhang, S.W., Li,
311 R.D., Yan, C.Z., Wu, S.X., Shi, X.Z., Jiang, N., Yu, D.S., Pan, X.Z., Chi, W.F., 2014.
312 Spatiotemporal characteristics, patterns and causes of land use changes in China since the
313 late 1980s. *Acta Geographica Sinica*, 2014, 69(1): 3-14.
- 314 Liu, J.Y., Liu, M.L., Zhuang, D.F., Zhang, Z.X., Deng, X.Z., 2002. Spatial pattern of recent land
315 use change in China. *Science in China: Series D*, 2003, 46(4): 373-384.
- 316 Liu, J.Y., Wang, S.Q., Liu, M.L., Zhuang, D.F., 2004. Storages of Soil Organic Carbon and
317 Nitrogen and Land Use Changes in China: 1990-2000. *Acta Geographica Sinica***59**, 453-496.
- 318 Martens, D.A., Reedy, T.E., Lewis, D.T., 2004. Soil organic carbon content and composition of
319 130-year crop, pasture and forest land-use managements. *Global Change Biology***10**, 65-78.
- 320 MLRPRC (Ministry of Land and Resources of the People's Republic of China),
321 2014. *Specification of Multi-purpose Regional Geochemical Survey (1:250000)*,
322 China Standard Press, Beijing.
- 323 Moraes, J.L., Cerri, C.C., Melillo, J.M., Kicklighter, D., Neill, C., Skole, D.L., Steudler P.A.,
324 1995. Soil carbon stocks of the Brazilian Amazon Basin. *Soil Sci. Soc. Am. J.***59**, 244-247.

- 325 Motavalli, P., Discekici, P.H., Kuhn, J., 2000. The impact of land clearing and agricultural
326 practices on soil organic C fractions and CO₂ efflux in the northern Guam aquifer. *Agric
327 Ecosystem Environ* **79**, 17-27.
- 328 Murty, D., Kirschbaum, M.U.F., Mcmurtrie, R.E., Mcgilvray, H., 2002. Dose
329 conversion of forest to agricultural land change soil
330 carbon and nitrogen? A review of the literature. *Global Change Biol.* **8**, 105-123.
- 331 Osher, L.J., Matson, P.A., Amundson, R., 2003. Effect of land use change on soil carbon in
332 Hawaii. *Biogeochemistry* **65**, 213-232.
- 333 Parfitt, R.L., Scott, N.A., Ross, D.J., Salt, G.J., Tate, K.R., 2003. Land-use change effects on soil
334 C and N transformations in soils of high N status: comparisons under indigenous forest
335 pasture and pine plantation. *Biogeochemistry* **66**, 203-221.
- 336 Post, W.M., Kwon, K.C., 2000. Soil carbon sequestration and land use change: processes and
337 potential. *Global Change Biology* **6**, 317-327.
- 338 Schlesinger, W.H., 1986. Changes in soil carbon storage and associated
339 properties with disturbance and recovery. In Trabalka, J.R., Reichle, D.E. (Eds.),
340 *The Changing Carbon Cycle: A Global Analysis*. Springer Verlag, New York, pp 194-220.
- 341 Scott, N.A., Tate, K.R., Giltrap, D.J., Tattersall Smith, C., Wilde, R. H., Newsome, P. F. J., Davis,
342 M.R., 2002. Monitoring land-use change effects on soil carbon in New Zealand: quantifying
343 baseline soil carbon stocks. *Environmental Pollution* **116**, S167-S186.
- 344 Shi, P.L., Yu G.R., 2003. Soil carbon stock patterns of different land use types in the lower Lhasa
345 River valley, Tibet plateau. *Resource Science* **25**, 96-102 (In Chinese).

- 346 Syers, J.K., Adams, J.A., Walter, T.W., 1970. Accumulation of organic matter in a
347 chronosequence of soils developed on windblown sand in New Zealand. *Journal of Soil*
348 *Science***21**, 146-153.
- 349 Wang, X.L., Su, Y.R., Huang, D.Y., Xiao, H.A., Wang, L.G., Wu, J.S., 2006. Effects of Land
350 Use on Soil Organic C and Microbial Biomass C in Hilly Red Soil Region in Subtropical
351 China. *Scientia Agricultura Sinica***39**, 750-757 (In Chinese).
- 352 Wu, J.G., Yu, D.Y., 2004. *The effects of land-use change on the soil organic carbon*. China
353 Forestry Publishing House, Beijing, (in Chinese).
- 354 Xia, X.Q., Yang, Z.F., Liao, Y., Cui, Y.J., Li, Y.S., 2010. Temporal variation of soil carbon stock
355 and its controlling factors over the last two decades on the southern Song-nen Plain,
356 Heilongjiang Province. *Geoscience Frontiers***1**, 125-132.
- 357 Xia, X.Q., Yang, Z.F., Yu, T., Hou, Q. Y., Bai, R.J., Cui, Y.J., 2011. Soil carbon source/sink
358 caused by land use change in the last decades of the last century in Northeast China. *Earth*
359 *Science Frontiers***18**, 041-048 (in Chinese).
- 360 Xu, X.W., Pan, G.X., Hou, P.C., 2005. Impact of Different Land Use on Topsoil Organic Carbon
361 Density in Anhui Province. *Journal of Soil and Water Conservation***19**, 193-196 (In Chinese).
- 362 Zhang, S.W., Zhang, Y.Z., Li, Y., Chang, L.P., 2006. *Spatial and temporal characteristic of*
363 *Land use/Land cover in Northeast China*. Science Press, Beijing.

364 **Supplementary Items**

- 365 Details of the typical types of land use change in each area and its soil carbon effect (Tables S1
366 to S5).

367

368 **Figure captions**

369 Fig. 1 A sketch map of the study area and MPRGS data coverage.

370 Fig.2 SOCD of 0–20 cm under the different land use types for eastern China. The columns
371 denote the average values, and the upper and bottom error lines denote the 9/10 and 1/10
372 quantiles. Horizontal: 11–paddy fields; 12–dry farmland; 21–forested land; 22–shrub land;
373 23–thin forested land; 24–other woodland; 31–density grassland; 32–middle grassland;
374 33–thin grassland; 45–tidal zone; 46–bottom land; 51–urban land; 52–rural residential;
375 53–other constructed land; 61–sand land; 63–saline and alkaline land; 64–swampland;
376 67–other unused land.

377 Fig. 3 Land use map of the study area for 2000 (left) and 1980 (right).

378

379 Fig. 4 The soil carbon sources/sinks caused by land use changes from 1980 to 2000. Positive
380 values in dark green denote an increased SOCD, which act as carbon sinks. Negative
381 values in red denote decreased SOCD, which act as a carbon source.

382

383 **Table captions**384 Table 1 SOCD by land use type for each region (kg/m^2).

385 Table 2 Soil carbon storage by various land use types in eastern China.

386 Table 3 Soil carbon sources/sinks caused by land use changes in each region.

387 Table 4 Soil carbon sources/sinks by land use changes in the study area (Tg).

Table 1 SOCD by land use type for each region (kg/m²)

Code	Land use	NE	NC	EC	SC	CC
11	Paddy fields	3.89±1.9 3	2.56±1.0 5	3.15±0.9 8	2.69±1.1 3	3.77±1.1 3
12	Dry farmland	3.20±1.5 4	2.23±0.9	2.39±0.7	2.51±1.1 3	3.24±1.1
21	Forested land	5.02±3.5 8	3.03±2.2 3	3.19±1.0 9	2.94±1.3 5	3.99±1.4 6
22	Shrub land	3.47±2.3 1	3.01±1.9 3	3.11±1.1 3	3.19±1.6 4	3.50±1.2 9
23	Thin forested land	2.94±1.3 8	2.06±1.4 3	2.90±0.8 7	2.94±1.3 5	3.71±1.2 4
24	Other woodland	2.84±2.0 5	2.20±1.1 9	2.59±1.1 3	2.73±1.3 2	3.69±1.8 9
31	Density grassland	3.61±2.6 1	2.31±1.2 9	2.49±1.3 8	2.87±1.4 7	4.15±2.0 8
32	Middle grassland	2.91±1.6 5	2.26±1.8 4	2.55±1.1 7	2.76±1.2 8	3.41±1.1 5
33	Thin grassland	2.32±1.3 3	1.38±0.7	-	3.22±1.5 7	-
41	Rivers and channels	2.41±1.4 9	1.66±1.3 2	2.60±1.1 3	2.42±0.9 5	2.59±1.0 7
43	Reservoirs	3.10±2.0 5	2.32±1.4 3	2.72±1.2 2	2.38±1.0 3	3.28±1.2 1
45	Tidal zones	1.81±1.5 5	0.88±0.7 3	0.71±0.5 4	1.38±1.0 9	-
46	Bottom land	3.17±2.1 3	2.45±2.1 1	2.95±1.5 2	2.17±1.1 9	2.90±1.2 7
51	Urban land	4.82±2.4 5	3.83±2.7 6	3.48±1.6	2.43±1.4 3	4.12±1.7 4
52	Rural residential	2.84±1.5 2	2.37±0.9 2	2.68±0.9	2.34±1.1 8	2.90±1.0 4
53	Other constructed land	2.78±2.5 6	1.92±1.7 8	1.70±0.9 8	1.79±1.0 3	3.45±1.6 2
61	Sand land	1.55±0.8 8	1.21±0.4 9	-	0.63±0.8	-
63	Saline and alkaline land	2.02±1.4 3	1.37±0.7 7	-	-	-
64	Swampland	5.58±5.8 3	2.38±1.1 7	-	-	2.85±1.1 8
67	Other unused land	-	0.87±0.4	-	-	-

Note: the table values were given in Mean ± SD.

Table 2 Soil carbon storage by various land use types in eastern China

Code	Land use type	Area(km ²)	Carbon storage (Tg)					Total
			NE	NC	EC	CC	SC	
11	Paddy fields	364102	170.85	39.99	365.73	438.05	189.4	1204.02
12	Dry farmland	809161	821.45	817.95	156.39	184.23	143.45	2123.47
21	Forested land	885854	1473.24	208.49	257.07	790.75	716.65	3446.2
22	Shrub land	174293	111.1	126.81	30.21	139.6	169.49	577.21
23	Thin forested land	178889	62.11	29.67	15.04	304.46	162.66	573.94
24	Other woodland	30619	10.37	8.64	6.42	9.24	49.41	84.08
31	Density grassland	134473	96.67	101.91	28.12	56.23	107.08	390.01
32	Middle grassland	70030	60.41	69.69	1.02	22.73	28.21	182.06
33	Thin grassland	31637	3.79	37.16	0.5	0	7.43	48.88
45	Tidal zones	1038	0.12	0.17	0.25	0	0.77	1.31
46	Bottom land	24425	34.72	12.53	7.75	10.98	1.85	67.83
51	Urban land**	26326	6.37	13.47	7.19	4.01	9.98	41.02
52	Rural residential	104680	54.03	106.5	63.65	20.72	23.02	267.91
53	Other constructed land	10303	3.08	9.5	2.84	2.4	3.09	20.91
61	Sand land	1324	0.43	0.97	0	0	0.16	1.56
63	Saline and alkaline land	13450	23.9	1.99	0	0	0	25.89
64	Swampland	32917	162.61	3.17	0	5.48	0	171.26
67	Other unus	165	0	0.08	0	0	0	0.08
Total		2968121*	3095.25	1588.69	942.18	1988.88	1612.65	9227.64

* Including the areas of rivers, channels, lakes, and reservoirs in the study area, whose areas are not shown above. ** It was corrected by multiplying 36% as samples in urban land were typically collected from green fields in cities.

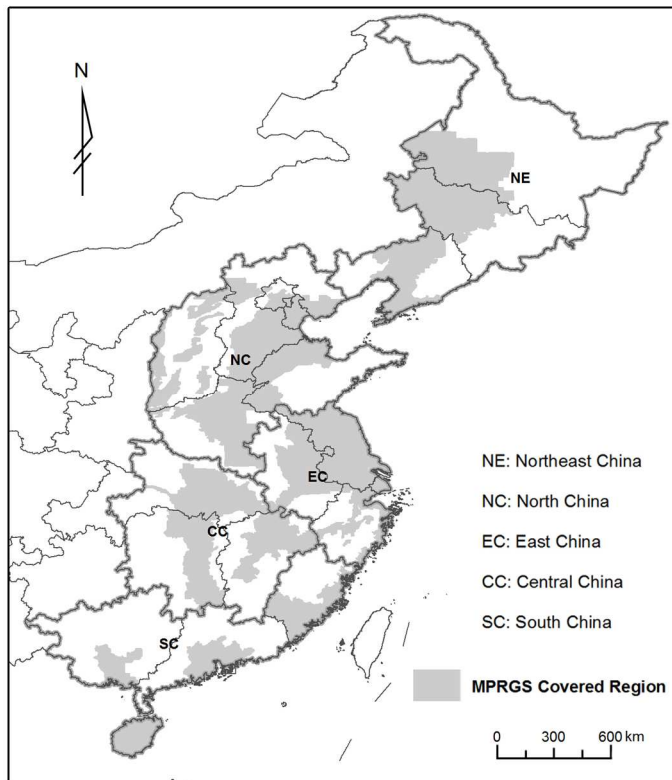
Table 3 Soil carbon sources/sinks caused by land use changes in each region

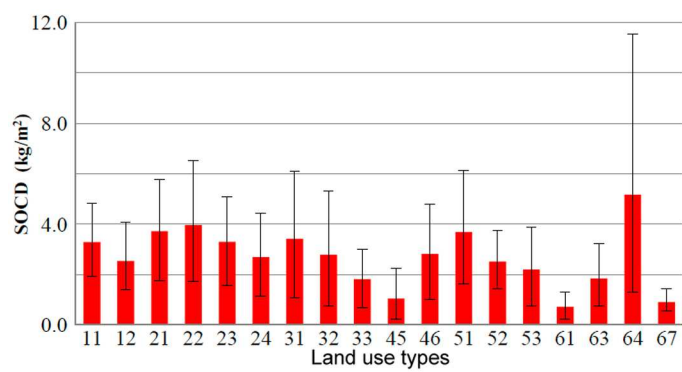
	Area ($\times 10^5$ km ²)	Carbon storage decrease (Tg)	Carbon storage increase (Tg)	Aggregated effect (Tg)
NE	7.88	-49.09	27.91	-21.18 \pm 12.18
NC	6.93	-6.72	4.10	-2.62 \pm 0.34
EC	3.51	-5.23	2.36	-2.87 \pm 0.08
SC	5.71	-5.77	2.86	-2.91 \pm 0.76
CC	5.65	-4.68	3.56	-1.12 \pm 0.28
Total	29.68	-71.49	40.80	-30.70 \pm 13.64

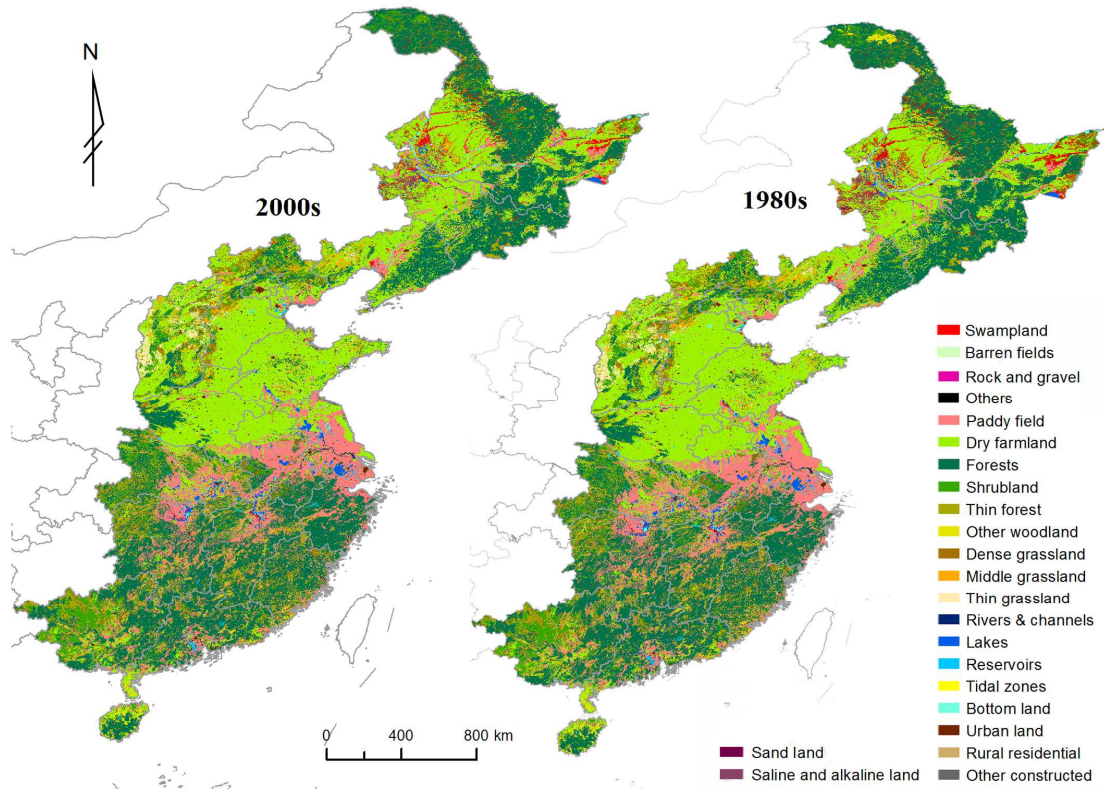
Table 4 Soil carbon sources/sinks by land use changes in the study area

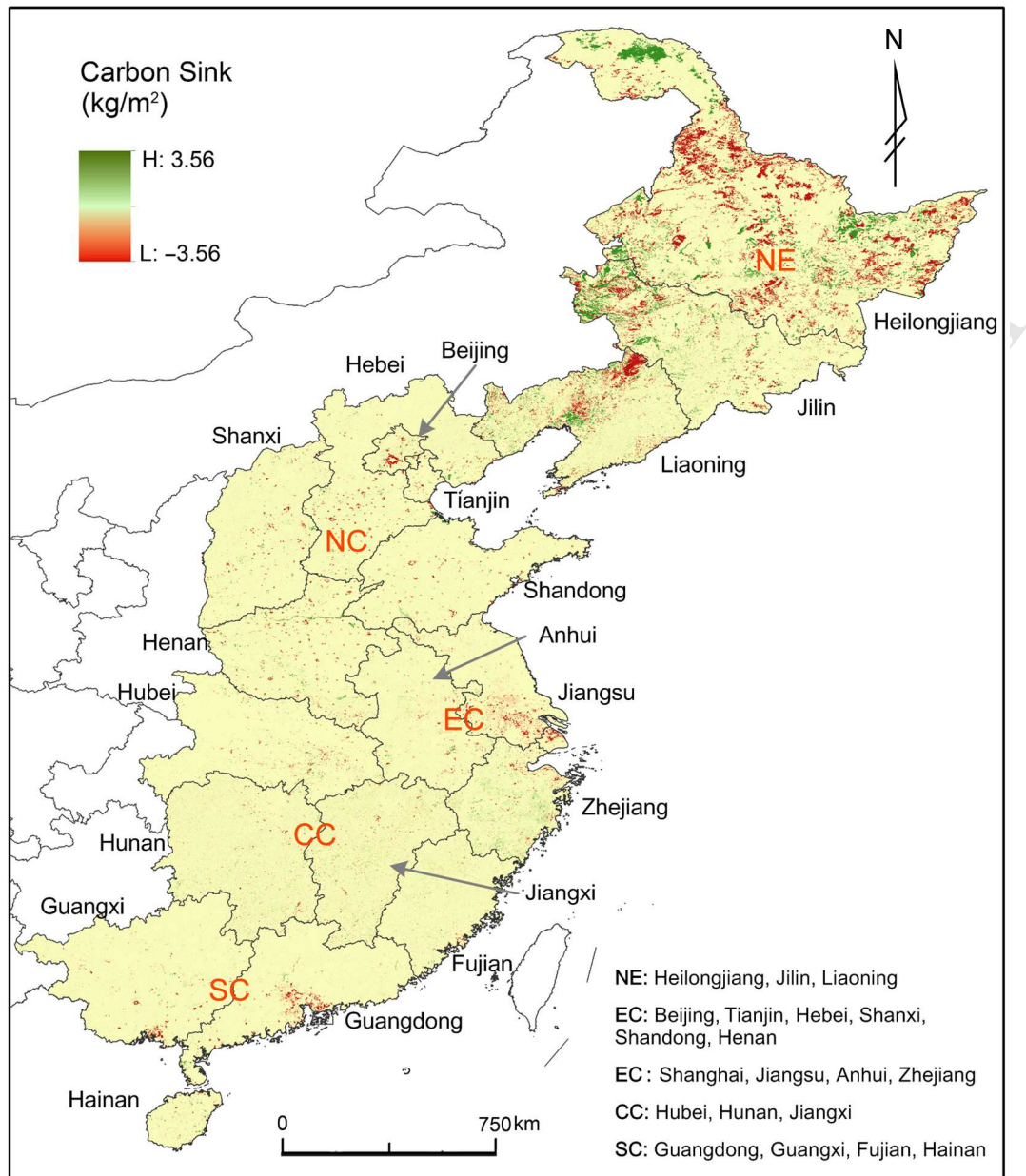
Initial land use	NE	NC	EC	SC	CC	Total
Paddy fields	-3.62	-0.21	-3.47	-1.24	-0.87	-9.41
Dry farmland	8.15	-1.72	0.14	-0.46	0.16	6.27
Forested land	-15.36	-0.79	0.21	-1.23	-0.09	-17.26
Grassland	-1.1	0.41	-0.04	0.05	0.02	-0.66
Water regions	2.06	0.15	-0.01	0.01	-0.02	2.19
Constructed	0.04	-0.68	0.09	-0.18	0.02	-0.71
Swampland	-11.41	0	0	0	0.02	-11.39
Others	0.06	0.22	0.21	0.14	-0.36	0.27

Note: carbon storage change in Tg C; positive values denote carbon increase; negative values denote carbon decrease; data was aggregated by the initial land use.









Research highlights

- Land use change has caused ~30.7 Tg SOC loss in the eastern regions of China.
- Land use change in NE has the most significant disturbance on SOC.
- Paddy field, having changed to dry farmland and others, is a big C source.
- Swampland transformed to plow land as another large soil carbon source.