



1    **Effects of tropical rainforest conversion to rubber plantation**  
2    **on soil quality in Hainan Island, China**

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## Abstract

Land-use changes can alter soil properties and thus affect soil quality. Our understanding of how forest conversion (from tropical rainforest to rubber plantations) affects soil properties and soil quality is limited. An ideal testing ground for analyzing such land-use change and its impacts is Hainan Island, the largest tropical island in China. Based on 21 soil physicochemical and biological properties, a soil quality index (SQI) employed principal component analysis to assess soil quality changes from the conversion of tropical rainforests to rubber plantations. The results showed that (i) soil available potassium, available phosphorus, microbial biomass carbon, cellulose decomposition, acid phosphatase, and urease were vital soil properties for soil quality assessment on Hainan Island. (ii) The SQI of rubber plantations decreased by 26.48% compared to tropical rainforests, while four investigated soil properties (soil pH, total phosphorus, cellulose decomposition, and actinomyces) increased. (iii) The SQI of both the tropical rainforests and rubber plantations showed significant spatial differences, which, under tropical rainforests, was more sensitive to seasonal changes than those under rubber plantations. (iv) Structural equation modeling suggested that forest conversion directly impacted soil quality and, indirectly impacted soil qualities' spatial variation by their interaction with soil types and geographical positions. Overall, though the conversion of tropical rainforest to rubber plantation did not decrease all soil properties, the tropical rainforest with its high soil quality should be protected.

**Keywords:** rubber plantation; tropical rainforest; soil properties; soil quality index;



35 structural equation modeling

## 36 **1. Introduction**

37 The rubber tree (*Hevea brasiliensis*), an economically valuable forest species, is  
38 a large source of natural rubber and is grown in more than 40 tropical countries  
39 worldwide (Warren-Thomas, 2015). Due to the increasing development of tire  
40 manufacturing and high prices of rubber, the land-mass of rubber plantations has  
41 expanded rapidly over the last 20 years in tropical Asia (Ahrends et al., 2015;  
42 Warren-Thomas et al., 2015; Lang et al., 2017), which is currently the world's most  
43 prolific region for rubber production (FAO, 2017). The conversion of tropical  
44 rainforests to rubber plantations in tropical Asia accompanies the continuously rising  
45 demand for rubber worldwide (De Blécourt et al., 2014; Allen et al., 2015; Hassler et  
46 al., 2017; Guillaume et al., 2018), which generally has negative impacts on soils and  
47 ecosystem services and threatens biodiversity and human livelihoods (Qiu, 2009;  
48 Ziegler et al., 2009; Tan et al., 2011; Ahrends et al., 2015; Liu et al., 2019; Singh et al.,  
49 2021). Hence, the response of rubber plantation expansion at the expense of tropical  
50 rainforest degradation on the environment - especially soil quality - has recently  
51 become a research focus.

52 Soil quality is a critically important capacity of soil within ecosystems,  
53 functioning not only as sustenance for biological productivity but also in the  
54 maintenance of environmental quality and promotion of plant and animal health  
55 (Doran and Parkin, 1994; Karlen et al., 2003; Shao et al. 2020; Li et al. 2020). Soil  
56 quality can be assessed based on a set of soil properties that affect soil functions (Lal,



1998), such as physical, chemical, and biological soil properties (Yakovchenko et al., 1996; Gil-Sotres et al., 2005; Griffiths et al., 2010; Nosrati et al., 2011; Davari et al., 2020). Evaluating soil quality generally involves three main steps: definition and selection of soil properties, scoring soil properties, and soil quality index calculation (Andrews et al., 2004; Chen et al., 2013). At present, the comprehensive soil quality evaluation methods mainly include soil quality cards and test kits (Ditzler and Tugel, 2002), grey correlation method (Yang et al., 2010), fuzzy methods (Torbert et al., 2008; Yue-Ju et al., 2010; Xue et al., 2010), soil quality indices (Andrews et al., 2004; Masto et al., 2008; Nakajima et al., 2015; Nabiollahi et al., 2017; Zhang et al., 2019; Shao et al., 2020; Jahany and Rezapour, 2020; Jin et al., 2021), and soil quality index area (Kuzyakov et al., 2020). Out of all the methods, the soil quality index (SQI) approach has been applied frequently because of its flexibility and simplicity (Derakhshan-Babaei et al., 2021; Zhang et al., 2021).

Soil quality can be affected by land use and land-use changes (Marzaioli et al., 2010; Moges et al., 2013; Raiesi, 2017; Yu et al., 2018; Pham et al., 2018; Davari et al., 2020). Particularly, land-use changes can influence soil degradation (Vityakon, 2007; Nabiollahi et al., 2018; Nosrati and Collins, 2019), soil physical and chemical quality (Deng et al., 2016; Liu et al., 2018; Wang et al., 2019; Sun et al., 2021), soil biological quality (Berkelmann et al., 2018; Cai et al., 2018), etc. The conversion of tropical rainforests to rubber plantations, a typical land-use change in tropical regions, has been the focus of many previous studies looking at the land-use change affecting soil properties and functions, such as soil physical and chemical properties (Chen et



79 al., 2019; Sun et al., 2021), soil nutrients and fertility (Chiti et al., 2014; De Blécourt  
80 et al., 2014; Guillaume et al., 2015; Allen et al., 2015; Hassler et al., 2017; Maranguit  
81 et al., 2017), soil respiration (Goldberg et al., 2017; Zhao et al., 2018), and soil  
82 microbial communities (Krashevskaya et al., 2015; 2019; Kerfahi et al., 2016; Wang et  
83 al., 2017; Berkelmann et al., 2018; Lan et al., 2017a; 2020). A soil quality index was  
84 also established based on soil's physical and chemical properties to comprehensively  
85 assess the effects of rubber plantations on the soil after being converted from tropical  
86 rainforest (Sun et al., 2021; Zou et al., 2021). Chemical properties were found to  
87 contribute more to the soil quality index than the physical properties (Sun et al., 2021;  
88 Zou et al., 2021), and biological properties were rarely considered.

89 Hainan Island is the largest tropical island in China. It is a major producer of  
90 natural rubber, with an output of 350.68 million kg from an area of 5,283.51 km<sup>2</sup>  
91 under rubber cultivation in 2018 (Statistical Bureau of Hainan Province, 2019).  
92 During the past few decades, the size and number of rubber plantations have been  
93 expanding rapidly on the island at the expense of losing forested land and agricultural  
94 land (Zhai et al., 2012; 2014; Chen et al., 2016; Sun et al., 2020), which overall has  
95 decreased tropical rainforest area. Therefore, Hainan Island was recognized as an  
96 ideal testbed for analyzing this specific land-use change (from tropical rainforests to  
97 rubber plantations) and its impacts. A soil quality index (SQI) based on a weighted  
98 summation of soil physical, chemical, and biological properties was established in this  
99 study, aiming (i) to assess soil quality of tropical rainforests and rubber plantations  
100 comprehensively, and (ii) to quantify the impact of the land-use change (from tropical



rainforests to rubber plantations) on soil quality variations on Hainan Island. Thereby, tests of the following hypotheses are required: (i) soil quality, which deteriorates by the conversion of tropical forests to rubber plantations, and (ii) the spatial variation of soil quality, which is affected by the interaction of land-use change with soil types, geographical position, and climatic variables.

## 2. Materials and methods

### 2.1. Study area

Hainan Island (18°09'-20°10' N and 108°37'-111°03' E, Fig. 1) is the largest island in Southern China, with a geographical area of 33,920 km<sup>2</sup>. It is also the largest island in the Indo-Burmese biodiversity hotspot (Myers et al., 2000; Wikramanayake et al., 2002), characterized by a tropical monsoon climate. The climate is warm and humid, with a rainy season from May to October and a dry season from November to April (Wu, 2008; Sun et al., 2017). The annual average temperature varies from 23.4 ~ 24.7 °C across the study area, while the mean annual precipitation ranges from 1392.3 mm to 2173.8 mm.

The central part of Hainan Island is mountainous, containing primary forest composed of a mix of tropical rainforest and monsoon forest. The tropical forest, accounting for 17.3% of the island's area, is mainly distributed in the mountains in the south-central region at altitudes above 500 m. Rubber plantations are located in the lowlands surrounding the central mountainous area, where transportation is more accessible, and water sources are nearby (Sun et al., 2020; Fig.1).

The study sites included four different soil types: laterite, lateritic red soil, red



123 soil, and yellow soil. The soil data (with a resolution of 1:1 000 000), was obtained  
124 from a soil survey (completed in 1995 by the National Soil Survey Office of China)  
125 and from the Resources and Environment Data Cloud Platform  
126 (<http://www.resdc.cn/data.aspx?DATAID=145>).

## 127 **2.2. Soil sampling and experimental design**

128 Soil samples were collected from tropical rainforest and rubber plantation on  
129 Hainan Island in January 2018 and July 2018. Five sites were selected for this study  
130 representative of the major tropical rainforest districts of Hainan (Fig. 1), i.e., Bawang  
131 mountain (BW), Diaoluo mountain (DL), Wuzhi mountain (WZ), Yinge mountain  
132 (YG), and Jianfeng mountain (JF). For rubber plantations, five sites were also selected  
133 in the northeast, northwest, center, southeast and southwest of the island, respectively:  
134 Haikou (HK), Danzhou (DZ), Qiongzong (QZ), Wanning (WN), and Ledong (LD).  
135 Note that, mature rubber plantations (25 to 30 years of age) were chosen for each site  
136 to avoid the variable rubber plantation age on soil quality. And intensive management  
137 practices were utilized in rubber plantations, such as latex harvest, and the application  
138 of fertilizers (Lan et al., 2017). In order to facilitate latex harvest, rubber trees were  
139 fertilized once or twice a year using compound fertilizer at a rate of 1-1.5 kg per tree  
140 and organic fertilizers at a rate of 20-25 kg per tree.

141 Study sites characteristics are given in Table 1. For each site, thirteen sample  
142 plots were selected within an area of one square kilometer. A five-point sampling  
143 method was used, and compound soil samples were obtained from each plot. There  
144 were a total of 65 samples collected from both the rubber plantation and tropical



rainforest sites. We sampled twice, once in the rainy season (July) and once in the dry season (January), making for a total of 260 soil samples (130 from rubber plantations and 130 from the tropical rainforest). After removing the litter layer, using a sterilized steel drill, a 5-cm diameter soil core was collected from 0 to 20 cm depth, homogenized, and passed through a 2-mm mesh sieve. Soil samples for physicochemical analysis were put in a sterilized self-sealing bag and stored at 4 °C and were then transported to the laboratory for analysis.

### 2.3. Soil analysis

A total of twenty-one soil physical (WC: soil water content), chemical (pH, SOM: soil organic matter, TN: total nitrogen, NN: nitrate-nitrogen, AN: ammonium nitrogen, TP: total phosphorus, AP: available phosphorus, TK: total potassium, and AK: available potassium), and biological properties (MBC: microbial biomass carbon, RQ: microbial respiratory quotient, CD: cellulose decomposition, URE: urease, ACP: acid phosphatase, CAT: catalase, CEL: cellulose, SI: sucrose invertase, BAC: bacteria, FUN: fungi, and ACT: actinomyces) were determined to be soil indicators for soil quality assessment.

Soil physical and chemical properties were quantified using standard techniques recommended by a guide to soil physical and chemical analysis (Institute of Soil Science, Chinese Academy of Sciences, 1978). Detailed protocols for measuring soil water content are available (see Deng et al. 2016; Chen et al., 2019; Zhang et al., 2019). Soil pH was measured in a 1:1 soil-water suspension with a pH meter (pHS-2, Leici, China). Soil organic matter was determined by the potassium dichromate





167 oxidation method. TN was determined using micro-Kjeldahl digestion followed by  
168 steam distillation. NN and AN were determined by steam distillation and  
169 indophenol-blue colorimetry, respectively. TP and AP were quantified using the  
170 molybdenum-antimony anti-spectrophotometric method; TK and AK were measured  
171 by flame photometry (Soil Science Society of China, 2000).

172 Soil biological properties were measured, including soil microbial function  
173 (MBC, RQ, and CD), soil microbial quantity (BAC, FUN, and ACT), and enzymatic  
174 activity (URE, ACP, CAT, SI, and CEL). MBC was measured by the chloroform  
175 fumigation method (Ross, 1990). RQ was titrated by alkali absorption, and CD was  
176 decomposed by the embedding sheet method (Xu and Zheng, 1986). URE, ACP, CAT,  
177 CEL, and SI were determined using sodium phenol sodium hypochlorite colorimetry,  
178 colorimetric method of benzene disodium phosphate, potassium permanganate  
179 titration, nitrosalicylic acid colorimetry, and the 3, 5-dinitrosalicylate colorimetric  
180 method, respectively (Guan, 1986). Measurement of bacteria, fungi, and actinomyces  
181 included DNA extraction and PCR amplification using Illumina MiSeq sequencing  
182 and bioinformatic analysis pipelines referred to in a previous study (Lan et al., 2020).

#### 183 **2.4. Soil quality assessment method**

184 Based on the twenty-one physical, chemical, and biological soil properties, a soil  
185 quality index (SQI) was established employing principal component analysis (PCA)  
186 to comprehensively assess soil qualities in spatial variation and seasonal changes  
187 under tropical rainforests and rubber plantations on Hainan Island.

188 First, all the selected soil properties were scored using the scoring function



189 “more is better” (Andrews et al., 2002; Shao et al., 2020) according to the soil  
 190 functions of each soil property. The equation of the scoring function “more is better”  
 191 (Eq. (1)) is as follows:

192

$$f(x) = \begin{cases} 0.1, & x \leq L \\ 0.9 \times \frac{x-L}{U-L} + 0.1, & L < x < U \\ 1, & x \geq U \end{cases} \quad (1)$$

196 where  $f(x)$  is the linear score of soil properties,  $x$  is the value of soil properties, and  $L$   
 197 and  $U$  are the lower and upper threshold values of the property, respectively.

198 Second, all the soil properties of tropical rainforests and rubber plantations were  
 199 grouped into components for PCA. The weights of the properties were calculated  
 200 using Eq. (2) based on the values of their communalities. Communality describes the  
 201 proportion of variance in each soil property explained by the PCA model. The larger  
 202 the communality, the higher the proportion of an indicator’s variance can be explained  
 203 by the factors (Brejda et al., 2000; Imaz et al., 2010; Chen et al., 2013; Zhang et al.,  
 204 2016).

$$W_i = C_i / \sum_{i=1}^n C_i \quad (2)$$

206 where  $W_i$  is the weight of the soil properties,  $C_i$  is the communality value of soil  
 207 property obtained from the PCA results, and  $n$  is the number of soil properties.

208 Finally, after all the soil properties were scored and weighted, SQIs were  
 209 calculated using the PCA-based Soil Quality Index equation (Eq. (3)):



$$SQI = \sum_{i=1}^n W_i P_i \quad (3)$$

where  $W_i$  is the weight of each soil property,  $P_i$  is the score of each soil property, and  $n$  is the number of soil properties.

Except for calculating the weight of each soil property, the PCA can be used to select vital soil properties for assessing soil quality (Ngo-Mbogba et al., 2015). Principal components (PCs) are sets of indicators with large eigenvalues and factor loading. Only the PCs with eigenvalues  $\geq 1$  (Brejda et al., 2000) and PCs that explained at least 5% of the variation in the data (Mandal et al., 2008) were selected. According to Andrews and Carroll (2001), soil properties with weighted absolute values within 10% of each PC's the highest soil property value were selected. However, in the process of calculating the factor load of each soil property by PCA and the data structure is simplified, some important soil properties' information can be lost (Yemefack et al., 2006). The norm value, which is the magnitude (length) of the vector representing the variable in the multi-dimensional space spanned by the set of PCs, was introduced to avoid this defect (Yemefack et al., 2006). The higher the norm value is, the stronger its ability to represent the overall soil quality information for further interpretation. The equation of the norm is:

$$N_{ik} = \sqrt{\sum_{i=1}^k (U_{ik}^2 \lambda_{ik})} \quad (4)$$

where  $N_{ik}$  is the comprehensive loading of the  $i$ -th soil variable on the first  $k$  PCs,  $\lambda_{ik}$  is the eigenvalue of the PC, and  $U_{ik}$  is the loading of the  $i$ -th soil variable on PC $_k$ . Soil properties receiving  $N_{ik}$  within 10% of the highest norm values were



231 considered the most important for assessing soil quality (Chen et al., 2013; Zhang et  
232 al., 2016).

## 233 2.5. Statistical analysis

234 One-way analyses of variance (ANOVA) and *Tukey* HSD post hoc tests were  
235 used to assess the significant difference ( $P < 0.05$ ) of the investigated soil properties  
236 and soil quality between tropical rainforests and rubber plantations in wet and in dry  
237 seasons. A radar diagram was drawn to show each of the soil properties, and soil  
238 functions changed by converting tropical rainforests to rubber plantations (Kuzakov  
239 et al., 2020). Pearson correlation analysis (PeCA) was conducted to identify  
240 relationships among measured soil properties. Structural equation model (SEM) was  
241 established to reveal hypothetical relationships based on the assumption that the  
242 spatial variation of soil quality is affected by land-use change with soil types,  
243 geographical position, and climatic variables.

## 244 3. Results

### 245 3.1. Soil properties under tropical rainforests and rubber plantations

246 Descriptive statistics of the measured soil properties are shown in Table 2. Soil  
247 pH was acidic in the investigated rubber plantations and tropical rainforests. Most soil  
248 chemical and biological properties of tropical rainforests were significantly higher  
249 than those of rubber plantations, such as SOM, TN, TK, NN, AN, AP, AK, RQ, URE,  
250 ACP, CAT, SI, and CEL. However, Soil pH, TP, CD, and ACT, increased noticeably  
251 with the conversion of natural tropical rainforest to monoculture rubber plantations.

252 Soil TN, TP, AP, URE, and SI varied significantly between seasons in both



rainforests and rubber plantations; the concentration of these properties increased from dry to rainy seasons. These results suggested that seasonal patterns substantially affected the chemical and biological properties of the soil, and thus, the soil quality.

### 3.2. Soil quality changes from tropical rainforests to rubber plantations

SQI values of the investigated tropical rainforest and rubber plantations on Hainan Island were calculated based on the soil property score and weights (Table 3), ranging from 0.358 to 0.418 for tropical rainforests and from 0.229 to 0.325 for rubber plantations (Fig. 2a). The SQI values of tropical rainforests were significantly higher than rubber plantations ( $P < 0.05$ ), which indicated that the conversion of natural tropical rainforest to monoculture rubber plantations would deteriorate soil quality. For the seasonal difference, the wet season SQI values were significantly higher than those in the dry season under tropical rainforests conditions. At the same time, there were no significant differences for rubber plantations (Fig. 2b), indicating that the soil quality under tropical rainforests was more sensitive to seasonal changes than those under rubber plantations.

To show each soil property and soil functions change by the conversion from tropical rainforests to rubber plantations, a radar diagram was constructed for both the soils under tropical rainforests and rubber plantations (Fig.3), assuming the averaged soils under tropical rainforests as natural soil. Our study found that most soil properties and functions decreased when converting tropical rainforests to rubber plantations. In contrast, soil TP, CD, and ACT increased by 59%, 91%, and 94%, respectively (Fig.3). In addition, the radar diagram indirectly reflects the most



sensitive (AK, ACP, CEL, TP, CD, ACT) and resistant (WC, MBC) soil properties by comparing the soils of rubber plantations and tropical rainforests (Fig. 3).

### 3.3. Important soil properties for soil quality assessment

Important soil properties for SQI values under the tropical rainforests and rubber plantations on Hainan Island were determined based on the absolute factor loading values ( $\geq 0.50$ ) of each PC and the norm values (within 10% of the highest values) (Shao et al. 2020). PeCA examined the relationships among these properties to reduce redundancy (Table 4). PCA results showed that the first six components had eigenvalues  $> 1$ , with values ranging from 1.168 to 5.771, each explaining at least 5.561% of the data variation and accounting for 68.539% of the total variance (Table 3). Thus, the first six components were selected. In PC1, the absolute factor loading values of NN, AK, SOM, pH, TN, URE, ACP, CAT, SI, and CEL were  $\geq 0.50$ . Among these soil properties, ACP had the highest norm value of 2.08, NN, SOM, TN, and CEL had norm values within 10% of the highest value. As ACP, NN, SOM, TN, and CEL significantly correlated, ACP was selected as the first important soil property. Similarly, the other five components, AK, AP, MBC, CD, URE, and FUN, were also selected.

The accuracy analysis of the selected soil properties for quality assessment, SQI-M (including ACP, AK, AP, MBC, CD, and URE), showed that the SQI-M values significantly correlated with SQI values of the total soil properties (Fig. 4a). From the six soil properties, ACP contributed 26.91% to SQI-M, followed by URE (15.82%), AK (14.18%), MBC (13.58%), and AP (10.01%), FUN and TP had the lowest



297 contribution (9.79% and 9.71%) (Fig.4b).

### 298 **3.4. Factors influencing soil quality**

299 A structural equation model was established to explain the relationships between  
300 the soil quality index and its influential factors (Fig. 5). The influential factors, which  
301 may drive variation in soil quality, are related to climate (temperature and  
302 precipitation), geographical location (latitude, longitude, and altitude), land-use  
303 change, and soil type. Our structural equation model explained 57% of the variation in  
304 SQI values for the tropical rainforests and rubber plantations on Hainan Island. The  
305 land-use change (from rubber plantations to tropical rainforests) played the most  
306 significant positive role in the spatial variation of SQI, followed by the climate.  
307 Land-use type, soil type, and geographical position also interacted with each other.  
308 Hence, there were some direct and indirect effects of land-use type on the soil quality.

## 309 **4. Discussion**

### 310 **4.1. Soil properties affected by tropical rainforests converted to rubber** 311 **plantations**

312 The conversion of tropical rainforests to rubber plantations decreased most soil  
313 chemical and biological properties on Hainan Island. Soil nutrient status (SOM, TN,  
314 TK, NN, AN, AP, and AK), soil microbial function (RQ), soil microbial quantity  
315 (BAC and FUN), and enzyme activities (URE, ACP, CAT, SI, and CEL), generally  
316 displayed a net lower level in rubber plantations than in tropical rainforests, which  
317 was consistent with many previous studies (Allen et al., 2015; Balasubramanian et al.,  
318 2020; Singh et al., 2021).



319           However, four investigated soil properties, i.e, soil pH, TP, CD, and ACT, were  
320   demonstrated to increase by converting tropical rainforest to rubber plantations on  
321   Hainan Island. The soil pH change of tropical forests to rubber plantations was  
322   consistent with the previous studies in Sumatra, Indonesia (Allen et al., 2015; 2016),  
323   opposite the earlier study of the Xishuangbanna region of Yunnan Province, China  
324   (Liu et al., 2019). The soil TP in rubber plantations was greater than the adjacent  
325   native forest on Hainan Island. The greater TP concentrations on rubber plantations  
326   could be caused by fertilization and the net transfer of phosphorus from dead  
327   vegetables, litter, and decaying roots to soil (Yang et al., 2010a; Wang et al., 2017).

#### 328   **4.2. Soil quality affected by tropical rainforests converted to rubber plantations**

329           Our previous study has found that the comprehensive assessment indices based  
330   on fourteen soil physical and chemical properties of rubber plantations were  
331   significantly lower than those of tropical rainforests on Hainan Island (Sun et al.,  
332   2021). Similarly, as in Xishuangbanna (southwest China) the soil quality index value  
333   based on 23 soil physical and chemical properties of the rubber plantation decreased  
334   by 15.50%, compared to the primary rainforest (Zou et al., 2021). The previous  
335   studies also found that chemical properties contributed more to the soil quality index  
336   than the physical properties (Sun et al., 2021; Zou et al., 2021), with the biological  
337   properties were rarely considered. Hence, soil chemical and biological properties were  
338   the focus of this study. And the results indicated that the soil quality index value of the  
339   investigated rubber plantations decreased by 26.48%, compared to the primary  
340   rainforests on the tropical island.





341 Comparing various SQI between studies is complex and partly impossible  
342 because of the diverse soil properties and weighting factors (Kuzyakov et al., 2020).  
343 Hence, a radar diagram was applied to show each of the soil properties and soil  
344 function changes. It was found that most of the soil properties and functions decreased  
345 by the conversion of tropical rainforests to rubber plantations on Hainan Island.  
346 Taking into account that the soil quality would significantly decrease from high to low  
347 plant diversity on rubber plantations (Hemati et al., 2020), interplanting (Liu et al.,  
348 2018a, 2019; Chen et al., 2019; Sun et al., 2021; Zou et al., 2021) and natural  
349 management (Lan et al., 2017a) were considered as alternative mechanisms to  
350 improve soil quality on monoculture rubber plantations.

#### 351 **4.3. Factors influencing soil quality**

352 Land-use change (from rubber plantations to tropical rainforests), interacting with soil  
353 type and geographical position, played the most critical positive role on the SQI  
354 variation (Fig.5). SQI variation illustrated that soil quality was negatively affected by  
355 the conversion of tropical rainforests to rubber plantations. The spatial variation of  
356 SQI was significant on both the rubber plantations and tropical rainforests of Hainan  
357 Island (Fig. 2a), indicating that spatial variability played an important role in soil  
358 quality. Previous studies have been found that spatial variability (e.g., soil depth  
359 intervals) surpasses land-use change effects on soil biochemical properties of  
360 converted lowland landscape in Sumatra, Indonesia (Allen et al., 2016).

361 Seasonal changes also played a role in soil quality. According to the SQI values,  
362 tropical rainforests in the wet season were significantly higher than those in the dry



season. However, there were no significant differences in SQI values for rubber plantations, which can be attributed to the fertilization in dry seasons. Although the effect of seasonal change on the SQI values under rubber plantations was relatively small, it controlled some important soil chemical and biological properties (e.g., TN, TP, AP, URE, and SI) as well as the bacterial communities in soils of rubber plantations in tropical region of Hainan (Lan et al., 2018; 2020).

## 5. Conclusions

The soil quality of rubber plantations decreased compared to the tropical rainforests on Hainan Island, with soil AK, AP, MBC, CD, ACP, and URE as vital soil properties. However, four investigated soil chemical and biological properties (soil pH, TP, CD, and ACT) increased by the conversion of tropical rainforest to rubber plantations. Except for the land-use change, spatial variability and seasonal changes played essential roles in soil quality, and soil quality under tropical rainforests was more sensitive to seasonal changes than rubber plantations. In this sense, the conversion of tropical rainforest to rubber plantations results in significant changes in soil quality; thus, the tropical rainforest with its high soil quality should be protected.

## Declaration of Competing Interest

The authors declare that they have no known competing financial interests or personal relationships that could have influenced the work reported in this paper.

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## 675 **List of Figures**

676 **Fig. 1** Maps of the geographic position, topography, and soil sampling sites of Hainan

677 Island, China: (a) location of Hainan Island (red); (b) topography and drainage of

678 Hainan Island; (c) spatial distribution of soil sampling sites in tropical rainforests and

679 rubber plantations.

680 **Fig. 2** Soil quality index (SQI) values under rubber plantations and tropical rainforests

681 on Hainan Island: (a) spatial distribution; (b) temporal variation. Different lower-case

682 (or upper-case) letters indicate significant difference at  $P < 0.05$  between the seasonal

683 (or annual) SQI values of rubber plantations and tropical rainforests.

684 **Fig.3** Radar diagram for soil properties changing by the conversion from tropical

685 rainforests to rubber plantations on Hainan Island. The measured soil properties are:

686 WC, soil water content; SOM, soil organic matter; PH, soil pH; TN, total nitrogen;

687 NN, nitrate nitrogen; AN, ammonium nitrogen; TP, total phosphorus; AP, available

688 phosphorus; TK, total potassium; AK, available potassium; MBC, microbial biomass

689 carbon; RQ, microbial respiratory quotient; CD, cellulose decomposition; NF,

690 nitrogen fixation; UR, urease; ACP, acid phosphatase; CAT, catalase; CEL, cellulose ;

691 SI, sucrose invertase; BAC, bacteria; FUN, fungi; ACT, actinomycetes.

692 **Fig.4** (a) Scatter diagram and linear relationships between SQI-M and SQI values ( $n =$

693 260) and (b) individual contributions of soil properties to the soil quality indicator

694 SQI-M based on the seven important properties (SQI is the soil quality indicator

695 based on the total soil properties). The measured soil properties are: AP, available

696 phosphorus; AK, available potassium; MBC, microbial biomass carbon; CD, cellulose



697 decomposition; UR, urease; ACP, acid phosphatase; FUN, fungi.  
698 **Fig.5** Structural equation model (SEM) analysis of the effects of land-use changes,  
699 soil types, climatic variables, and geographic position on the soil quality index (SQI).  
700 Red arrows indicate negative effects and green arrows represent positive effects.  
701 Numbers adjacent to arrows are path coefficients ( $p$  values) indicating the effect size  
702 of the relationship, and  $p$  values are as follows:  $*p < 0.05$ ;  $**p < 0.01$ ;  $***p < 0.001$ .  
703 CFI: Comparative Fit Index; RMSEA: Root Mean Square Error of Approximation.  
704



705    **List of Tables**

706    **Table 1** Site characteristics for tropical rainforests and rubber plantations.

707    **Table 2** Soil properties under tropical rainforests and rubber plantations on Hainan

708    Island.

709    **Table 3** Results of principal component analysis and weight values of each soil

710    property.

711    **Table 4** Correlation coefficients among the soil properties.

712



**Table 1** Site characteristics for tropical rainforests and rubber plantations.

Site name	Longitude (°)	Latitude (°)	Elevation (m)	Forest type	Soil type	Precipitation (mm)	Temperature (°C)
Danzhou (DZ)	109.58	19.56	112	Rubber plantation	Laterite	1831.5	23.6
Qiongzong (QZ)	109.74	19.26	156	Rubber plantation	Lateritic red soil	2067.3	23.5
Ledong (LD)	109.22	18.75	170	Rubber plantation	Laterite	1661.3	24.5
Wanning (WN)	110.13	18.67	51	Rubber plantation	Laterite	1786.5	24.7
Haikou (HK)	110.57	19.70	102	Rubber plantation	Laterite	1863.4	24.2
Diaoluo (DL)	109.86	18.73	958	Rainforest	Red soil	1921.3	24.2
Jianfeng (JF)	108.88	18.73	950	Rainforest	Yellow soil	1392.3	24.7
Bawang (BW)	109.13	19.08	575	Rainforest	Red soil	1602.1	24.3
Yingge (YG)	109.56	19.05	620	Rainforest	Red soil	2067.8	23.6
Wuzhi (WZ)	109.68	18.91	820	Rainforest	Yellow soil	2173.8	23.4

Notes: Soil type data was obtained from a soil survey (completed in 1995 by the National Soil Survey Office of China) and from the Resources and Environment Data Cloud Platform (<http://www.resdc.cn/data.aspx?DATAID=145>). The precipitation and temperature data of each site was obtained from the results of a reference (Sun et al. 2016).



Table 2 Soil properties under tropical rainforests and rubber plantations on Hainan Island.

Soil properties		Rubber plantation			Tropical rainforest		
		Dry season	Wet season	Annual	Dry season	Wet season	Annual
WC	%	32.08±9.23a	28.17±9.65a	30.13±9.61A	31.08±11.13a	32.17±8.29a	31.63±9.79A
AN	mg/kg	12.28±5.03a	12.49±6.92a	12.39±6.03A	14.18±4.03ab	16.45±6.46b	15.31±5.49B
NN	mg/kg	7.35±3.79a	6.53±3.17a	6.94±3.50A	10.34±3.93b	15.69±7.86c	13.01±6.75B
AP	mg/kg	2.62±0.95a	3.92±2.61b	3.27±2.06A	1.79±0.48ab	7.1±6.13c	4.45±5.09B
AK	mg/kg	27.12±13.05a	31.63±17.15a	29.37±15.35A	72.23±36.82b	84.92±41.64b	78.58±39.67B
SOM	%	1.48±0.86a	1.65±0.89a	1.56±0.88A	2.68±0.95b	3.06±0.67b	2.87±0.84B
pH		4.71±0.34ab	4.87±0.51b	4.79±0.44A	4.6±0.33a	4.59±0.76a	4.59±0.59B
TN	g/kg	0.94±0.39a	1.62±0.69c	1.28±0.65A	1.34±0.34b	2.82±0.74d	2.07±0.94B
TP	(P <sub>2</sub> O <sub>5</sub> )%	0.06±0.04b	0.07±0.04c	0.06±0.04A	0.03±0.01a	0.05±0.04b	0.04±0.03B
TK	(K <sub>2</sub> O)%	1.18±1.09a	1.47±1.15ab	1.33±1.12A	1.73±0.74b	1.41±0.79ab	1.57±0.78B
MBC	mg/kg	0.07±0.02b	0.04±0.05a	0.05±0.04A	0.04±0.04a	0.05±0.06ab	0.05±0.05A
RQ	mg/kg	115.91±67.15a	118.31±83.11a	117.11±75.27A	218.98±75.95b	117.28±53.48a	168.13±82.99B
CD	%	0.66±0.38bc	0.68±0.43c	0.67±0.41A	0.51±0.36b	0.19±0.09a	0.35±0.31B
UR	mg/kg	46.28±32.52a	71.95±37.19b	59.11±37.11A	62.16±25.66ab	109.7±52.83c	85.93±47.46B
ACP	mg/kg	1522.2±543.98b	1007.04±513.99a	1264.62±587.14A	3424.72±464.48c	3264.83±982.59c	3344.77±769.72B
CAT	ml/g	0.69±0.31b	0.46±0.29a	0.57±0.32A	1.09±0.45c	0.94±0.26c	1.01±0.37B
SI	mg/kg	2714.24±1648.49a	4398.23±1768.33b	3556.23±1901.06A	5956.87±2971.49c	8156.99±4850.99d	7056.93±4156.32B
CEL	mg/kg	20.15±19.15a	26.05±6.97a	23.1±14.66A	58.53±25.65c	44.97±19.65b	51.75±23.75B
BAC	10 <sup>4</sup> /g	1.31±3.01a	2.97±7.23ab	2.14±5.58A	2.00±2.21ab	4.73±11.27b	3.36±8.20A
FUN	10 <sup>4</sup> /g	0.82±1.34a	0.71±0.90a	0.76±1.14A	1.27±1.93a	0.92±1.45a	1.09±1.71A
ACT	10 <sup>5</sup> /g	0.49±1.25ab	0.92±1.75b	0.71±1.53A	0.55±1.27ab	0.18±0.28a	0.37±0.94B

Notes: Different lower-case (or upper-case) letters indicate significant difference at  $P < 0.05$  (one-way ANOVA). The measured soil properties are: WC, soil water content; SOM, soil organic matter; TN, total nitrogen; NN, nitrate nitrogen; AN, ammonium nitrogen; TP, total phosphorus; AP, available phosphorus; TK, total potassium; AK, available potassium; MBC, microbial biomass carbon; RQ, microbial respiratory quotient; CD, cellulose decomposition; NF, nitrogen fixation; UR, urease; ACP, acid phosphatase; CAT, catalase; CEL, cellulase; SI, sucrose invertase; BAC, bacteria; FUN, fungi; ACT, actinomycetes.



Table 3 Results of principal component analysis and weight values of each soil property.

Soil properties	PC1	PC2	PC3	PC4	PC5	PC6	Norm	Communalities	Weight1	Weight2
WC	0.457	-0.562	0.011	0.383	-0.030	0.228	1.539	0.725	0.050	
AN	0.395	0.482	0.257	0.462	-0.017	-0.229	1.430	0.721	0.050	
NN	<b>0.726</b>	-0.269	0.205	-0.170	-0.381	-0.074	1.888	0.821	0.057	
AP	0.237	0.160	<b>0.653<sup>a</sup></b>	-0.134	-0.514	0.268	1.293	0.862	0.060	0.160
AK	0.550	<b>0.631<sup>a</sup></b>	-0.043	-0.134	0.119	-0.189	1.722	0.771	0.054	0.161
SOM	<b>0.838</b>	-0.080	0.013	0.101	0.247	0.101	2.044	0.791	0.055	
PH	-0.496	0.484	0.266	0.079	0.206	0.365	1.563	0.733	0.051	
TN	<b>0.777</b>	-0.071	0.487	-0.115	0.017	-0.006	1.994	0.859	0.060	
TP	0.102	-0.476	0.427	0.208	0.446	-0.084	1.176	0.668	0.046	
TK	-0.244	0.789	-0.014	-0.089	0.024	0.134	1.464	0.708	0.049	
MBC	0.051	0.371	0.291	<b>0.617<sup>a</sup></b>	-0.275	0.015	1.092	0.681	0.047	0.158
RQ	0.251	0.129	-0.610	0.238	-0.132	0.293	1.153	0.611	0.042	
CD	-0.358	-0.158	-0.028	<b>0.501<sup>a</sup></b>	0.138	-0.052	1.089	0.426	0.030	0.083
UR	0.650	0.092	0.211	-0.055	<b>0.502<sup>a</sup></b>	-0.276	1.723	0.806	0.056	0.120
ACP	<b>0.830<sup>a</sup></b>	0.275	-0.269	-0.078	0.040	-0.008	2.084	0.845	0.059	0.162
CAT	0.619	0.221	-0.349	0.097	0.161	0.346	1.664	0.708	0.049	
SI	0.733	0.083	0.004	-0.135	-0.146	0.069	1.783	0.589	0.041	
CEL	<b>0.793</b>	-0.018	-0.271	0.173	-0.053	0.069	1.955	0.740	0.051	
BAC	-0.006	0.250	0.168	-0.284	0.360	0.298	0.786	0.390	0.027	
FUN	0.019	0.275	-0.255	0.007	-0.178	<b>-0.629<sup>a</sup></b>	0.920	0.568	0.039	0.156
ACT	-0.208	0.490	0.206	0.189	0.059	-0.053	1.035	0.368	0.026	
Eigenvalue	5.771	2.838	1.931	1.377	1.308	1.168				
% of Variance	27.481	13.514	9.196	6.556	6.231	5.561				
Cumulative %	27.481	40.995	50.191	56.747	62.978	68.539				

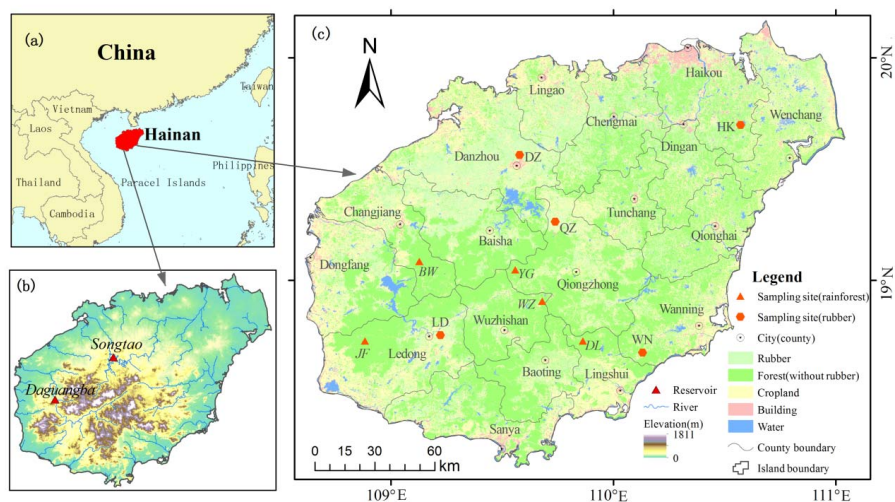
Notes: Bold font values are considered highly weighted. <sup>a</sup> Values are the most important properties for the results of SQI-M. Weight 1 refers to total data set; Weight 2 refers to the important properties data set. The measured soil properties are: WC, soil water content; SOM, soil organic matter; TN, total nitrogen; NN, nitrate nitrogen; AN, ammonium nitrogen; TP, total phosphorus; AP, available phosphorus; TK, total potassium; AK, available potassium; MBC, microbial biomass carbon; RQ, microbial respiratory quotient; CD, cellulose decomposition; NF, nitrogen fixation; UR, urease; ACP, acid phosphatase; CAT, catalase; CEL, cellulose; SI, sucrose invertase; BAC, bacteria; FUN, fungi; ACT, actinomycetes.



735 Table 4 Correlation coefficients among the soil properties.

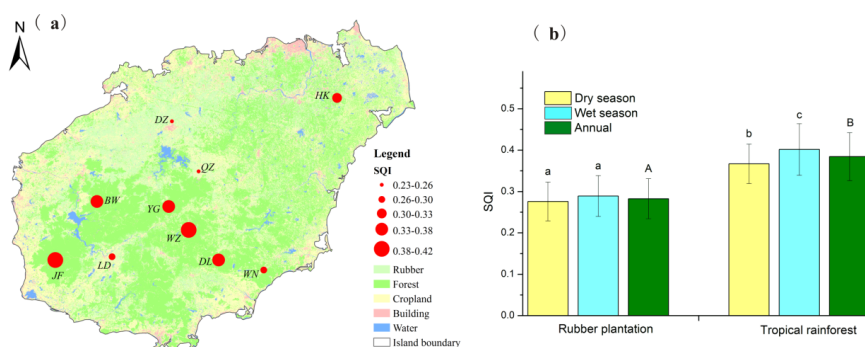
	WC	AN	NN	AP	AK	SOM	pH	TN	TP	TK	MBC	RQ	CD	UR	ACP	CAT	SI	CEL	BAC	FUN	ACT
WC	1	0.00	0.37**	0.02	-0.17**	0.51**	-0.35**	0.37**	0.26**	-0.51**	0.07	0.12	0.06	0.15*	0.22**	0.22**	0.25**	0.37**	-0.15*	-0.19**	-0.30**
AN		1	0.16**	0.19**	0.45**	0.28**	0.03	0.30**	0.00	0.13*	0.49**	0.05	-0.07	0.35**	0.34**	0.22**	0.18**	0.32**	0.02	0.12*	0.19**
NN			1	0.44**	0.20**	0.50**	-0.56**	0.66**	0.12	-0.37**	-0.04	0.03	-0.27**	0.30**	0.52**	0.22**	0.52**	0.52**	-0.09	-0.01	-0.22**
AP				1	0.13*	0.08	0.14*	0.49**	0.01	0.10	0.23**	-0.14*	-0.19**	0.00	0.02	-0.01	0.27**	0.08	0.07	-0.10	0.08
AK					1	0.39**	-0.07	0.38**	-0.23**	0.38**	0.12	0.15*	-0.27**	0.50**	0.67**	0.37**	0.41**	0.34**	0.07	0.16**	0.12
SOM						1	-0.26**	0.67**	0.21**	-0.26**	-0.01	0.17**	-0.21**	0.56**	0.68**	0.53**	0.53**	0.66**	0.02	-0.04	-0.17**
pH							1	-0.26**	-0.07	0.50**	0.14*	-0.16*	0.11	-0.26**	-0.34**	-0.06	-0.34**	-0.47**	0.19**	-0.03	0.36**
TN								1	0.29**	-0.20**	0.06	-0.05	-0.30**	0.63**	0.48**	0.24**	0.59**	0.43**	0.05	-0.08	-0.14*
TP									1	-0.38**	-0.07	-0.16*	0.08	0.28**	-0.19**	-0.07	-0.08	0.05	-0.04	-0.17**	-0.42
TK										1	0.17**	0.08	0.01	-0.08	0.00	-0.00	-0.09	-0.19**	0.14*	0.08	0.32**
MBC											1	0.04	0.04	0.02	0.04	0.04	-0.01	0.01	0.02	0.06	0.15*
RQ												1	-0.05	-0.06	0.31**	0.36**	0.17**	0.40**	-0.04	0.09	-0.06
CD													1	-0.17**	-0.33**	-0.25**	-0.20**	-0.18**	-0.08	-0.05	0.08
UR														1	0.49**	0.32**	0.41**	0.37**	0.12	-0.00	-0.09
ACP															1	0.64**	0.59**	0.66**	0.07	0.13*	-0.09
CAT																1	0.45**	0.61**	0.03	-0.00	-0.08
SI																	1	0.52**	-0.01	0.02	-0.04
CEL																		1	-0.07	0.06	-0.13*
BAC																			1	-0.04	0.06
FUN																				1	0.09
ACT																					1

736 Notes: \*  $P < 0.05$ , \*\*  $P < 0.01$ . The measured soil properties are: WC, soil water content; SOM, soil organic matter; TN, total  
 737 nitrogen; NN, nitrate nitrogen; AN, ammonium nitrogen; TP, total phosphorus; AP, available phosphorus; TK, total potassium;  
 738 AK, available potassium; MBC, microbial biomass carbon; RQ, microbial respiratory quotient; CD, cellulose decomposition; NF,  
 739 nitrogen fixation; UR, urease; ACP, acid phosphatase; CAT, catalase; CEL, cellulose; SI, sucrose invertase; BAC, bacteria; FUN,  
 740 fungi; ACT, actinomyces.



**Fig.1** Maps of the geographic position, topography, and soil sampling sites of Hainan Island, China: (a) location of Hainan Island (red); (b) topography and drainage of Hainan Island; (c) spatial distribution of soil sampling sites in tropical rainforests and rubber plantations.

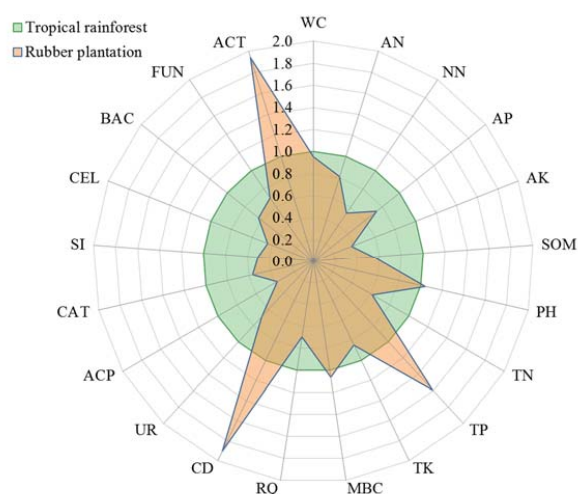




749

750 **Fig. 2** Soil quality index (SQI) values under rubber plantations and tropical rainforests  
 751 on Hainan Island: (a) spatial distribution; (b) temporal variation. Different lower-case  
 752 (or upper-case) letters indicate significant difference at  $P < 0.05$  between the seasonal  
 753 (or annual) SQI values of rubber plantations and tropical rainforests.

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755

756 **Fig.3** Radar diagram for soil properties changing by the conversion from tropical

757 rainforests to rubber plantations on Hainan Island. The measured soil properties are:

758 WC, soil water content; SOM, soil organic matter; PH, soil pH; TN, total nitrogen;

759 NN, nitrate nitrogen; AN, ammonium nitrogen; TP, total phosphorus; AP, available

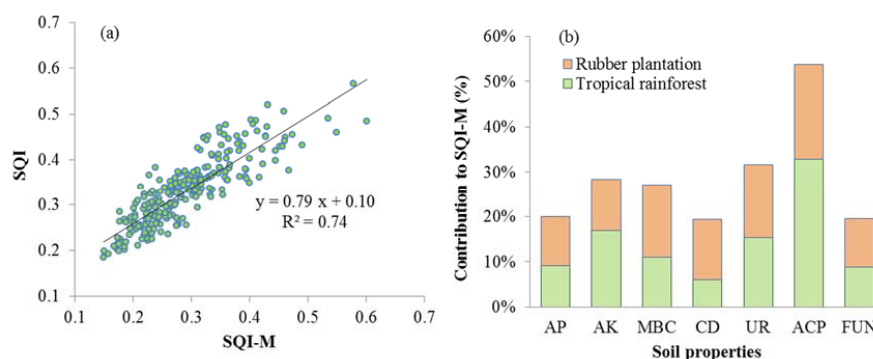
760 phosphorus; TK, total potassium; AK, available potassium; MBC, microbial biomass

761 carbon; RQ, microbial respiratory quotient; CD, cellulose decomposition; NF,

762 nitrogen fixation; UR, urease; ACP, acid phosphatase; CAT, catalase; CEL, cellulose ;

763 SI, sucrose invertase; BAC, bacteria; FUN, fungi; ACT, actinomycetes.

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766 **Fig.4** (a) Scatter diagram and linear relationships between SQI-M and SQI values (n =

767 260) and (b) individual contributions of soil properties to the soil quality indicator

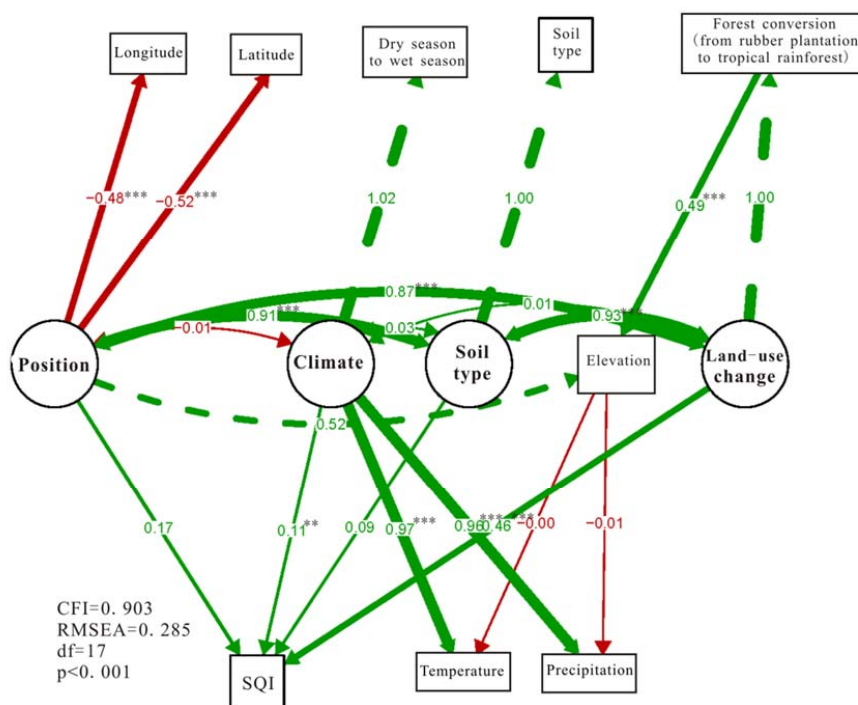
768 SQI-M based on the seven important properties (SQI is the soil quality indicator

769 based on the total soil properties). The measured soil properties are: AP, available

770 phosphorus; AK, available potassium; MBC, microbial biomass carbon; CD, cellulose

771 decomposition; UR, urease; ACP, acid phosphatase; FUN, fungi.

772



773

774 **Fig.5** Structural equation model (SEM) analysis of the effects of land-use changes,  
 775 soil types, climatic variables, and geographic position on the soil quality index (SQI).  
 776 Red arrows indicate negative effects and green arrows represent positive effects.  
 777 Numbers adjacent to arrows are path coefficients ( $p$  values) indicating the effect size  
 778 of the relationship, and  $p$  values are as follows: \* $p < 0.05$ ; \*\* $p < 0.01$ ; \*\*\* $p < 0.001$ .  
 779 CFI: Comparative Fit Index; RMSEA: Root Mean Square Error of Approximation.