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Soil quality assessment of yellow clayey paddy soils with different productivity

Zhanjun Liu · Wei Zhou · Jianbo Shen · Shutian Li · Chao Ai

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Abstract Yellow clayey paddy soil is a typical soil with low productivity in southern China. However, a systematic evaluation of soil quality, which is important for improving sustainable land use management and increasing crop yields, has not been carried out for yellow clayey paddy soils. This study adopted two indicator selection methods, Total Data Set (TDS) and Minimum Data Set (MDS), to evaluate soil quality of high (HPPS), medium (MPPS) and low (LPPS) productive yellow clayey paddy soils and aimed to identify the factors limiting the rice productivity. Twenty-six soil parameters including physical, chemical and microbiological properties including phospholipid fatty acid analysis, were determined. Most measured soil parameters showed significant differences $(P \le 0.05)$ between the different productivity paddy soils. Best values were always observed for many soil properties in HPPS, indicating a better nutrient supply and microbiological activity. Those 15 variables having significant differences were selected for principal component analysis, and arbuscular mycorrhizal fungi (AMF), microbial biomass carbon (MBC), available silicon (ASi), available potassium (AK) and total nitrogen (TN) were retained in the refined MDS. After scoring and weighting the selected indicators, a soil quality index (SQI) was calculated using the Integrated Quality Index equation. Based on the TDS method, the mean SQI scores of HPPS, MPPS and LPPS were 0.79, 0.71 and 0.57, respectively. Similarly, HPPS, MPPS and LPPS showed

Z. Liu \cdot W. Zhou $(\boxtimes) \cdot$ S. Li \cdot C. Ai Ministry of Agriculture Key Laboratory of Crop Nutrition and Fertilization, Institute of Agricultural Resources and Regional Planning, Chinese Academy of Agricultural Sciences, Beijing 100081, China e-mail: wzhou@caas.ac.cn

Z. Liu : J. Shen

College of Resources and Environmental Sciences, China Agricultural University, Beijing 100193, China

average SQI scores of 0.82, 0.67 and 0.50, respectively, using the MDS method. A significant correlation was observed between SQI and rice yield considering both TDS and MDS methods. Although the TDS method is more accurate, the MDS method can adequately represent the TDS method $(r²=0.85)$. Low levels of AK and TN were considered as the major constraints limiting the rice productivity for LPPS. All soil samples collected were rich in available P, Zn and Si, but deficient in available K, which may be the major constraint for the studied regions.

Keywords Minimum data set . PLFA . Soil quality evaluation . Soil quality index . Yellow clayey paddy soil

Introduction

Soil quality integrates soil physical, chemical and microbiological attributes and is often defined as "the capacity of the soil to function within ecosystem boundaries to sustain biological productivity, to maintain environment quality and to promote plant and animal health" (Doran and Parkin [1994\)](#page-10-0). Maintaining soil quality is essential for ensuring a sustainable environment and biosphere (Arshad and Martin [2002](#page-10-0)). However, soil quality has declined significantly worldwide, especially in developing countries (Barrios and Trejo [2003;](#page-10-0) Krowntree and Fox [2008](#page-10-0)). Food security remains a priority in China, but it has been challenged by climate change, increasing population and other anthropogenic factors (Khan et al. [2009\)](#page-10-0). Paddy soils are the most important arable soil types in southern China and the area under cultivation has continued to increase in recent years. Unfortunately, about one-third of these soils belong to low-yield soil types (Xiao [1981](#page-11-0)). Yellow clayey paddy soil is considered as one primary soil of low productivity, and covers about 1.3 million ha across southern China with an important contribution to the national

food supply. A better knowledge and comprehensive evaluation of soil quality are crucial to designing sustainable agricultural management, improving crop production and developing appropriate soil conservation measures (McGrath and Zhang [2003](#page-11-0); Tesfahunegn et al. [2011](#page-11-0)). Therefore, evaluating soil quality status and revealing the differences concerning yellow clayey paddy soil with different productivity are rather critical for developing sustainable land use management and improving grain yield.

Unfortunately, challenges remain in assessing soil quality because no established standards exist and soils vary widely, both spatially and temporally (Stocking [2003](#page-11-0)). Soil quality depends on the interactions of physical, chemical and biological characteristics and a proper assessment of soil quality requires measurement of a high number of parameters (Marzaioli et al. [2010\)](#page-11-0). Specialists have agreed to search for a minimum data set (MDS) to reduce the cost of soil quality assessment (Rezaei et al. [2006](#page-11-0)). The MDS with proper indicators can reduce the need for determining a large number of indicators (Andrews et al. [2002\)](#page-10-0) and should adequately represent the total data set (Qi et al. [2009\)](#page-11-0). Though soil biological indicators have been increasingly used to evaluate soil quality (Bhardwaj et al. [2011](#page-10-0)), numerous studies mainly focused on soil physical and chemical properties (Bastida et al. [2008;](#page-10-0) Qi et al. [2009;](#page-11-0) Tesfahunegn et al. [2011;](#page-11-0) Li et al. [2013](#page-10-0); Yao et al. [2013\)](#page-11-0). Bastida et al. [\(2008\)](#page-10-0) pointed out that the structural and functional relationships of soil microbial communities are considered as probable future indicators for soil quality. Moreover phospholipid fatty acid (PLFA) analysis has been increasingly used to study the composition and of the abundance of soil microbial groups (Puglisi et al. [2005;](#page-11-0) Ramsey et al. [2006](#page-11-0); Moeskops et al. [2010;](#page-11-0) Romaniuk et al. [2011,](#page-11-0) [2012\)](#page-11-0).

Numerous studies have evaluated soil quality using different indicators, but only a few established SQI have been set up (Bastida et al. [2008](#page-10-0)), and some have little biological significance (Li et al. [2013](#page-10-0)).

Soil organic matter (SOM) content of paddy soils increased during recent two decades, and it can play a important role in maintaining the yields of cereals (Pan et al. [2009\)](#page-11-0). Conversely, soil pH, and the contents of Olsen-P and available K decreased in large area of paddy soils in southern China. Qi et al. [\(2009\)](#page-11-0) has evaluated soil quality indices in agricultural soils of the region and established an MDS for the cultivated soil layer considering topography, obstacle horizon depth, drainage modulus, and contents of SOM, available P and available Fe. Li et al. [\(2013\)](#page-10-0) also established an MDS including available N, P and K, SOM and sand and there was significant correlation between SQI and crop yield. However, little attention has been paid on evaluating soil quality of low productivity yellow clayey paddy soils. Therefore, it is necessary to evaluate soil quality for yellow clayey paddy soils. In this paper, several physical, chemical and biological properties

were determined, with the aim to evaluate soil quality by (1) an MDS with proper indicators and (2) an SQI using both Total Data Set (TDS) and MDS methods. In addition, we aimed to identify the constraints limiting the rice productivity.

Materials and methods

Study area

Soil sample sites were collected in a large area of yellow clayey paddy soils, with similar cropping systems and productivity levels in eastern Hubei and Zhejiang provinces, southern China. In general, Hubei is characterized by a subtropical monsoon climate with a mean annual temperature of 21.0 °C and an annual rainfall of 1,117 mm during the rice growth season (from March to November). Similarly, the subtropical monsoon climate also prevails in Zhejiang, and the mean annual temperature and precipitation are 21.1 °C and 1,154 mm, respectively. The natural conditions were considered similar, although Hubei and Zhejiang were located in Huang–Huai–Hai plain temperate zone and Central East Subtropical zone, respectively (Pan et al. [2009\)](#page-11-0). All studied fields had yellow clayey paddy soil were cropped with a double rice system and the major clay minerals are hydrous mica and kaolinite. Fertilizer types were $CO(NH₂)₂$, $Ca(H_2PO_4)_2$, and KCl for N, P and K, respectively.

Soil sampling

Soil sampling was accomplished in three steps. Firstly, the distribution of the yellow clayey paddy soils was determined based on rural surveys and information provided by the local agricultural department. Secondly, yellow clayey paddy fields were divided into soils with high $(\geq 13,500 \text{ kg ha}^{-1})$, medium $(10,500-13,500 \text{ kg ha}^{-1})$ and low (≤10,500 kg ha⁻¹) yields according to the average annual rice yield over the last 10 years. Thirdly, soil samples were collected from 0 to 20 cm soil plow layer before the transplanting of early rice (February–March).

Ten cores (5.0 cm diameter) were collected randomly and well mixed to form a composite sample. Overall, 81 composite soil samples were collected, with 27 samples from each of the high, medium and low yield paddy soils. Considering the analytical costs, we selected 36 soil samples for soil biological analysis. These 36 samples were collected from four typical locations, Wucheng (119°28′E, 29°02′N), Jinyun (120°02′E, 28°41′N), Yunmeng (113°45′E, 31°09′N) and Xiaochang (113°52′E, 31°17′N). In each location, we collected three samples representative of each productivity class of paddy soils. The samples were immediately transported to the laboratory, and one sub-sample was air-dried at room temperature for physical and chemical analysis, one sub-sample was stored

at 4 °C for biochemical analysis and the last sub-sample was freeze-dried prior to being stored at −18 °C for PLFA analysis.

Soil analysis

Physical and chemical characteristics

Soil texture and bulk density (BD) were determined by Bouyoucos hydrometer (Gee and Bauder [1986\)](#page-10-0) and the core method (Blake and Hartge [1986](#page-10-0)), respectively. Soil aggregate stability (SAS) was measured using the wet sieving method (Beare and Bruce [1993\)](#page-10-0), and available phosphorus (AP) by the method of Olsen and Sommers [\(1982\)](#page-11-0). SOM, pH (soil/ water 1:2.5), available silicon (ASi; citric acid extraction), total nitrogen (TN), alkali-hydrolyzable nitrogen (AN), and available potassium (AK), available zinc (AZn) and cation exchange capacity (CEC) were determined following the procedures described by Page et al. [\(1982](#page-11-0)).

Enzyme activities and microbial C and N

Urease, β-glucosidase, acid phosphatase and dehydrogenase activities were measured according to Alef and Nannipieri [\(1995](#page-10-0)). Microbial biomass carbon (MBC) and nitrogen (MBN) were analyzed using the chloroform fumigation–extraction and the fumigation–incubation method according to Vance et al. [\(1987\)](#page-11-0) and Shen et al. [\(1984\)](#page-11-0), respectively.

Microbial community structure

Microbial community structure was determined by PLFA analysis following the procedure described by Wu et al. [\(2009](#page-11-0)), and concentrations of PLFAs were calculated and expressed in units of nmol g^{-1} and mol%.

The fatty acids iC15:0, aC15:0, iC16:0, iC17:0 aC17:0 were used as biomarkers for Gram-positive bacteria (G+) and C16:1ω7c, C18:1ω7c, cyC17:0 for Gram-negative bacteria (G−) (Kozdroj and van Elsas [2001;](#page-10-0) Moeskops et al. [2010\)](#page-11-0). The sum of G+, G−, C:15, C17:0 and cyC19:0ω11,12c was assumed to represent the total bacterial community, and the sum of $10MeC16:0$ and $10MeC18:0$ was regarded as indicator of actinomycetes. The fatty acids $C18:2\omega$ 6,9c and $C16:1\omega$ 5c were biomarkers for fungi and arbuscular mycorrhizal fungi (AMF), respectively.

Soil quality assessment

Indicator selection

For the TDS method, 26 physical, chemical and biological properties were considered.

In the case of MDS, principal component analysis (PCA) was used because of its ability to group related soil properties

into a small set of independent factors and to reduce redundant information of the original data set (Yao et al. [2013](#page-11-0)). Nonparametric statistics (Kruskal–Wallis χ^2) were conducted to identify indicators with significant treatment differences, and only variables having significant differences $(P \le 0.05)$ were chosen for PCA (Andrews et al. [2002](#page-10-0); Andrews and Carroll [2001\)](#page-10-0). During the PCA process, the biological data columns of soil samples not analyzed for their biological properties were kept blank. We assumed principal components (PCs) with high eigenvalues and variables with high factor loading best represent soil properties, and only examined the PCs with eigenvalues ≥ 1 (Brejda et al. [2000\)](#page-10-0). Within each PC, the factor loading of each variable represents its contribution to the PC. Highly weighted factors were those with absolute values within 10 % of the highest weight of the loading factor. When more than one variable was retained in a PC, each was considered important and was considered in the MDS if the two considered values were not correlated $(r<$ 0.60) (Andrews et al. [2002\)](#page-10-0). Among well-correlated variables within a PC, the variable with the highest correlation sum was selected for the MDS (Andrews and Carroll [2001](#page-10-0)).

Indicators scoring

Because of different indicator units, a standard scoring function (SSF) was used to score soil indicators in the TDS and MDS methods and to normalize indicator observations to a value between 0 and 1.0 (Andrews et al. [2002](#page-10-0)). Three types of indicators were divided according to their soil quality function, which were described by three SSF equations as follows:

$$
SSF1: f(x) = \begin{cases} = 0.1 & x < L \\ = 0.1 + \frac{0.9 \times (x - L)}{(U - L)} & L \leq x \leq U \\ = 1.0 & x > U \end{cases}
$$
(1)

$$
SSF2: f(x) = \begin{cases} = 1.0 & x < L \\ = 0.1 + \frac{0.9 \times (U - x)}{(U - L)} & L \leq x \leq U \\ = 1.0 & x > U \end{cases}
$$
 (2)

$$
\text{SSF3: } f(x) = \begin{cases} = 0.1 & x < L_1, x > U_2 \\ = 0.1 + \frac{0.9 \times (x - L_1)}{(U_1 - L_1)} & L_1 \leq x < U_1 \\ = 1.0 & U_1 \leq x \leq L_2 \\ = 0.1 + \frac{0.9 \times (U_2 - x)}{(U_2 - L_2)} & L_2 < x \leq U_2 \end{cases} \tag{3}
$$

In these three equations, x is the monitoring value of the indicator; $f(x)$ is the score of indicators ranging between 0.1 and 1; and L and U are the lower and the upper threshold values of the indicator, respectively. The indicators without a certain threshold value were scored and normalized using a linear scoring function described by Liebig et al. [\(2001\)](#page-11-0).

Weight assignment

Based on the TDS method, the PCA was conducted with all observations of measured soil properties, and the weight for each TDS indicator was calculated by its communality, which was equal to the ratio of its communality divided by the sum of communalities of all TDS indicators (Shukla et al. [2006\)](#page-11-0). For the MDS method, MDS variables selected by PCA results were subjected to another PCA, and the weight of each MDS indicator was also assigned by its communality, which is similar to the TDS (Shukla et al. [2006;](#page-11-0) Li et al. [2013](#page-10-0)).

Developing the soil quality index

After the selected indicators were scored and weighted, soil quality index (SQI) was calculated using the following equation described by Doran and Parkin [\(1994](#page-10-0)):

$$
SQL = \sum_{i=1}^{n} W_i \times S_i,
$$
\n(4)

where W is the PC weighting factor and S is the indicator score. We assumed that the higher index scores indicated better soil quality or strong performance of soil functions.

Statistical analysis

Data were subjected to statistical analysis using SPSS 18.0 and Canoco for Windows (version 4.5). One-way analysis of variance (ANOVA) was used to test all the parameters and separation of means was subjected to Tukey's honestly significant difference test. Correlation analysis was conducted using the Pearson product moment correlation test (two-tailed) to identify relationships between the measured properties.

Results

Evaluation of soil quality using soil characteristics

Physical and chemical properties

Table [1](#page-4-0) showed that no significant difference was found for sand, silt and clay contents between the yellow clayey paddy soils with different productivity, although comparatively lower sand (36.1 %) and higher silt contents (41.2 %) were observed in the high productivity paddy soils (HPPS). Generally, all tested samples were loamy sand soils. The highest BD was observed in the low productivity paddy soils (LPPS) (1.32 Mg m^{-3}) , which was higher than that of in the HPPS

 (1.19 Mg m^{-3}) , but not significantly different compared with the medium productivity paddy soils (MPPS) (1.24 Mg m^{-3}) . The lowest values of SAS were observed in LPPS (Table [1](#page-4-0)).

In Table [2](#page-4-0), we summarized the statistics of soil chemical properties and showed that the HPPS had the highest pH values. Significantly lower SOM, TN and AN contents were observed in LPPS compared with the HPPS and MPPS. The HPPS contained the highest values for AK, CEC and ASi, which were significantly higher than those for the LPPS, but not significantly different compared with those of the MPPS. Also, no significant differences were found for AP and AZn between the paddy soils of different productivity.

Soil enzyme activities and microbial biomass C, N

Table [3](#page-5-0) showed that no significant differences among soil enzyme activities except for dehydrogenase activity, which was 1.8 times higher in HPPS than in the LPPS, but no significant difference was observed between the HPPS and MPPS. The MBN contents of HPPS and MPPS were significantly increased by 1.2 times and 0.94 times, respectively, compared with the LPPS value. The HPPS had the highest MBC value, which was 1.1 times higher than the LPPS, but not significantly different compared with the MPPS.

PLFA analysis

The total PLFA ranged from 34.59 to 77.03 nmol g^{-1} and was significantly higher in HPPS than in LPPS, whereas the MPPS had values not significantly different compared to HPPS and LPPS (Fig. [1a\)](#page-6-0). No significant differences were found among G+, total bacteria and fungi when data were expressed as nmol g^{-1} (Fig. [1a\)](#page-6-0). The concentrations of actinomycetes in the HPPS and the MPPS were significantly higher than that in LPPS, increasing by 78.9 % and 68.4 %, respectively. The concentrations of G−and AMF in the HPPS were increased by 75.0 % and 94.0 %, respectively, compared with the LPPS.

There were no significant differences in G+, G−, total bacteria, actinomycetes, fungi and AMF among HPPS, MPPS and LPPS, when data were expressed mol% (Fig. [1b](#page-6-0)).

Based on the PLFA data, the PCA was conducted with 35 PLFAs expressed as nmol g⁻¹. The PC1 and PC2 accounted for 62.6 % and 14.3 % of the total variation, respectively; HPPS, MPPS and LPPS were well separated by the PC scores either in Hubei or Zhejiang province (Fig. [2a\)](#page-6-0). PC loadings of each PLFA are shown in Fig. [2b](#page-6-0). The amounts of saturated fatty acids (14:0, 15:0, 16:0, 17:0, a 14:0, a 15:0, a 16:0), monounsaturated fatty acids (16:1w5c, 16:1w7c, 16:1w9c, 17:1w8c) and polyunsaturated fatty acids of 18:2w6,9c and 18:3w6c(6,9,12) increased in HPPS, whereas those of the saturated fatty acid i16:0, monounsaturated fatty acids 16:1w11c and 20:1w9c, and the hydroxylated fatty acid 16:1 2 OH increased in MPPS.

For the same property, different letters indicate significant differences ($P < 0.05$)

HPPS high productive paddy soils, MPPS medium productive paddy soils, LPPS low productive paddy soils. n is the number of representative sampling points used for soil analysis in each productive paddy soils

Stepwise multiple regression analysis

Stepwise multiple regression analysis showed that SAS was the most important physical factor, markedly affecting $(P< 0.05)$ all microbial groups with the exception of fungi (Table [4\)](#page-7-0). Both G+and TB were significantly correlated with soil ASi ($P < 0.05$) and MBC($P < 0.01$); G−was correlated $(P< 0.01)$ with MBN. Both AMF and actinomycetes were correlated $(P< 0.01)$ with SOM and MBN; MBC was significantly correlated with $(P< 0.01)$ actinomycetes, and a significant correlation (P< 0.01) was found between AMF and CEC.

Soil quality evaluation

Indicator selection

The nonparametric test of means of soil parameters revealed that of 26 soil variables, soil texture (sand, silt and clay), AP and AZn, β-glucosidase, acid phosphatase, and urease activities, G⁺, total bacteria and fungi, did not show significant

differences among HPPS, MPPS and LPPS $(P > 0.05)$. Therefore, these 11 variables were dropped, and the remaining 15 variables with significant differences were selected for PCA (Table [5](#page-7-0)); this analysis grouped soil parameters into four main PCs with eigenvalues≥1. The communalities of the four extracted PCs explained 82.5 % to 99.8 % of the variance of soil parameters, which indicates that the extracted components well represented the soil variables. Finally, soil parameters were grouped into four main PCs with eigenvalues ≥1 which explained 93.84 % of the variance of data.

The major weighted variables of those analyzed by PC, defined as those within 10 % of the highest weight of eigenvectors, were SAS, MBN, MBC, G−, actinomycetes and AMF in PC1, TN and AN in PC2, Si in PC3, and K in PC4, and are presented in bold in Table [5](#page-7-0).

Generally, the major weighted variables in PC1 were correlated, and AMF was chosen as the most representative of the PC1 group to be used in the MDS because of its highest weight of factor loading (Table [5](#page-7-0)) and correlation sum (Table [6\)](#page-8-0). Because the PC1 explained such a large percentage of the data

Table 2 Descriptive statistics of the chemical properties for HPPS, MPPS and LPPS (mean±standard deviation and range of variation)

Soil parameters	HPPS $(n=27)$		MPPS $(n=27)$		LPPS $(n=27)$	
	Mean	Range	Mean	Range	Mean	Range
pH	5.80 ± 0.68 a	$4.80 - 7.50$	5.36 ± 0.62 b	$4.50 - 6.90$	5.35 ± 0.71 b	$3.90 - 6.70$
SOM $(g \ kg^{-1})$	29.8 ± 6.47 a	$19.7 - 44.3$	28.9 ± 6.54 a	$19.4 - 41.8$	23.7 ± 6.44 b	5.90 - 37.4
Total N $(g \text{ kg}^{-1})$	1.57 ± 0.52 a	$0.81 - 2.70$	1.56 ± 0.37 a	$0.78 - 2.44$	1.24 ± 0.42 b	$0.29 - 2.22$
AN $(mg kg^{-1})$	128 ± 35.5 a	$62.4 - 202$	130 ± 5.10 a	$76.8 - 220$	103 ± 9.60 b	$20.5 - 164$
Available P (mg kg^{-1})	13.3 ± 6.24 a	$6.10 - 28.5$	14.0 ± 8.08 a	$3.10 - 37.3$	11.0 ± 5.81 a	$1.40 - 23.4$
Available K (mg kg^{-1})	97.2 ± 22.4 a	$56.1 - 145$	87.0 ± 7.50 ab	$21.3 - 178$	75.7 ± 24.9 h	$24.0 - 138$
CEC (cmol kg^{-1})	15.6 ± 6.49 a	$4.50 - 25.9$	11.6 ± 0.57 ab	$2.30 - 27.6$	10.7 ± 5.82 b	$2.70 - 22.6$
Available Si $(mg kg^{-1})$	111 ± 52.3 a	$23.5 - 230$	84.1 ± 0.90 ab	$21.9 - 247$	76.1 ± 37.6 b	$24.0 - 181$
Available Zn (mg kg ⁻¹)	5.08 ± 2.34 a	$1.86 - 11.4$	5.07 ± 3.52 a	$1.01 - 15.5$	4.22 ± 2.22 a	$0.30 - 10.9$

For the same property, different letters indicate significant differences ($P < 0.05$)

SOM soil organic matter, AN alkali-hydrolyzable N, CEC cation exchange capacity, HPPS high productive paddy soils, MPPS medium productive paddy soils, LPPS low productive paddy soils. n is the number of representative sampling points used for soil analysis in each productive paddy soils

For the same property, different letters indicate significant differences ($P < 0.05$)

MBN microbial biomass N, MBC microbial biomass C, HPPS high productive paddy soils, MPPS medium productive paddy soils, LPPS low productive paddy soils. n is the number of measured soils used for soil analysis in each productive paddy soils

variation (50 %), we also select the parameter with the lowest correlation sum, MBC, to represent the variation within this group (Table [6\)](#page-8-0). Additionally, MBC is a simple and inexpensive test, and it has been regarded as a good indicator of soil quality assessment by Chilima et al. [\(2002\)](#page-10-0). Two important variables for PC2, TN and AN, were correlated $(r > 0.60)$; TN was selected for the MDS because of its higher weight of factor loading. Both PC3 and PC4 only showed one variable with high weighting, respectively, and thus available Si and K were also included in the MDS. Therefore, the refined MDS included the following parameters: AMF, MBC, TN, ASi and AK. All the measured soil parameters were included in the TDS method.

Indicator scoring and weight assignment

To normalize the selected parameters, the SSF1 was used for SAS, SOM, TN, AN, AP, AK, AZn, ASi and CEC; SSF2 was used for BD and sand; and SSF3 was used for silt, clay and pH. Meanwhile, the threshold values for quantitative soil quality indicators were used according to Qi et al. [\(2009\)](#page-11-0) and Li et al. [\(2013\)](#page-10-0). The remaining microbial and biological properties were considered as "higher is better". For urease activity, the highest value received a score of 1, and the other values were divided by the highest value to normalize them. The same procedure was carried out for MBN, MBC, the other enzymatic activities and soil microbial group.

All measured parameters of the TDS method and the MDS variables were subjected to another PCA and their communalities and weights are shown in Table [7](#page-8-0). The weights of TDS variables were relatively even, and AMF and MBC received the highest weight of all MDS indicators, suggesting that these two soil properties probably played a more important role in soil quality evaluation than the others.

Developing the soil quality index

After the selected indicators were scored and weighted, the SQI was calculated using the Integrated Quality Index equation (Eq. [4\)](#page-3-0). The SQI values calculated by the TDS method ranged from 0.48 to 0.88, and the mean SQI values of HPPS, MPPS and LPPS were 0.79 ± 0.04 , 0.71 ± 0.05 and 0.59 ± 0.05 , respectively (Fig. [3](#page-9-0)). The SQI values calculated by the MDS method ranged from 0.32 to 0.93, and the HPPS, MPPS and LPPS showed average SQI values of 0.82±0.07, 0.67 ± 0.09 and 0.50 ± 0.08 , respectively (Fig. [3\)](#page-9-0). Significant differences were observed for SQI values among the different productive yellow clayey paddy soils, which can be ranked as HPPS>MPPS>LPPS using both TDS and MDS methods (Fig. [3](#page-9-0)).

Correlation analysis showed that soil quality indices calculated using both TDS and MDS methods were significantly correlated with rice yields (Fig. [4a and b\)](#page-9-0). The TDS method was more accurate than MDS method because of its higher coefficient of determination. Also, a significant correlation was observed between SQL_{TDS} and SQL_{MDS} values (Fig. [5\)](#page-9-0), indicating that evaluating soil quality using the MDS method can adequately represent the TDS approach.

Discussion

Soil quality is important for sustainable agriculture (Warkentin [1995\)](#page-11-0). According to our soil quality evaluation, paddy soils can be ranked as HPPS>MPPS>LPPS on the basis of both TDS and MDS methods, suggesting that there were some constraints limiting soil quality in MPPS and in particular in LPPS compared to HPPS.

Evaluation of soil quality status using physical and chemical properties

Soil physical properties strongly influence soil function and determine potential land uses (Fernández-Ugalde et al. [2009\)](#page-10-0). BD has often been used as a physical indicator for soil quality evaluation (Andrews et al. [2002;](#page-10-0) Bhardwaj et al. [2011](#page-10-0)). HPPS had lower BD, which indicated that high bulk density in LPPS

Fig. 1 Total PLFA (TPLFA) and abundance of gram-positive bacteria $(G+)$, gram-negative bacteria $(G-)$, total bacteria (TB) , actinomycetes (ACT), fungi and AMF expressed in nmol g^{-1} (a) and mol% (b). Vertical *bars* represent the SE $(n=12)$; columns with different letters indicated significant differences $(P < 0.05)$ between HPPS, MPPS and LPPS. HPPS high productive paddy soils, MPPS medium productive paddy soils, LPPS low productive paddy soils

may be unfavorable to crop growth through affecting circulation of air, water and plant nutrients (Doran et al. [2002\)](#page-10-0) and soil penetration by the root system (Tesfahunegn et al. [2011\)](#page-11-0). SAS is considered one of the most important indicators of soil degradation, and is defined as the resistance of the soil against external destructive effects (Saygın et al. [2012](#page-11-0)). The lowest SAS value was observed in LPPS, and this was probably due to lower SOM levels, which is in agreement with the findings of Tesfahunegn et al. ([2011\)](#page-11-0).

Appropriate values of soil pH and SOM contents are fundamental for soil fertility (Lal [2004](#page-10-0); Manlay et al. [2007](#page-11-0)). In general, a value of 7.0 for soil pH is regarded as optimum for nutrient cycling (Smith and Doran [1996\)](#page-11-0) and availability of soil nutrients (Brady [1974](#page-10-0)). However, the pH values of HPPS, MPPS and LPPS were all lower than 7.0. HPPS had the

Fig. 2 Plot of first two principal components (PC1 and PC2) grouped in HPPS, MPPS and LPPS of Hubie (HB) and Zhejiang (ZJ) provinces (Fig. [3a](#page-9-0)) and plot of first two principal components (PC1 and PC2) among 35 PLFAs from the collected paddy soils. HPPS high productive paddy soils, MPPS medium productive paddy soils, LPPS low productive paddy soils

highest pH value, which was closed to 7.0. Therefore, the availability of the immobile nutrient P may be increased during the crop growing in the HPPS, although no significant difference was found for AP between the paddy soils of different productivity. LPPS had the lowest SOM contents indicating worse soil fertility and irrational land use management. Improving the quantity of SOM in these soils should be a future management practice.

Noble et al. [\(2000\)](#page-11-0) noted that a potential risk exists for chemical degradation of acid paddy soils with low CEC levels. The LPPS has the lowest CEC value, which indicates a potential chemical degradation for LPPS. Some sustainable measures should be taken to improve CEC values of LPPS.

About two-thirds of the region's paddy soils in south China are deficient in K, and the over-exploitation has exacerbated this problem (Sheldrick et al. [2003\)](#page-11-0). Usually, soils with K concentrations ≤ 150 mg kg⁻¹ are K-deficient. The average AK value of our studied yellow clayey paddy soils was below the critical

Dependents (Y)	Variables related (X)								
	Physical properties	R^2	Chemical properties	R^2	Biochemical properties	R^2			
Gram-positive	SAS	$0.57**$	ASi	$0.44*$	MBC	$0.66**$			
Gram-negative	SAS	$0.54*$	NS		MBN	$0.74**$			
Total bacteria	SAS	$0.59**$	ASi	$0.37*$	MBC	$0.59**$			
Fungi	NS ^a		NS		NS				
AMF	SAS	$0.83**$	SOM, CEC	$0.78**$	MBN	$0.69**$			
Actinomycetes	SAS	$0.74**$	SOM	$0.52**$	MBN, MBC	$0.89**$			

Table 4 Stepwise regressions between the selected microbial groups (dependents variable Y) and the other determined properties (independents variable X)

No variable was detected by stepwise regression analysis to be correlated with a corresponding microbial property $*P< 0.05$; $*P< 0.01$

value, even for HPPS (Table [2](#page-4-0)). Therefore, soil AK can be considered a constraint for yellow clayey soils, especially for LPPS. Increasing K application on a national basis is suggested as being an effective measure for improving rice yield and this fertilization practice should be investigated in further studies.

Silicon is a beneficial element for rice and Si deficiency in soil is now recognized as a factor potentially limiting rice production (Liang et al. [2007\)](#page-11-0). Our results showed that the contents of soil ASi for HPPS, MPPS, and LPPS were all above the critical value of 60 mg Si kg^{-1} reported by Ma and Takahashi [\(2002\)](#page-11-0). although significant differences were observed in the different productivity paddy soils. Conversely, the concentrations of soil AP and AZn in HPPS, MPPS and LPPS are all above the threshold values of 10 mg kg^{-1} (Kamprath and Watson [1980](#page-10-0)) and 1.0 mg kg^{-1} (Zhu and Liu [1981](#page-11-0)), respectively. This suggests that P and Zn are not factors limiting the productivity of yellow clayey paddy soils.

Soil microbial properties

Soil enzyme activities have been suggested as suitable indicators for evaluating soil quality, because of their rapid

Table 5 Results from the principal components analysis (PCA) of statistically significant variables

n.a. not applicable

a Data presented in bold indicate highly weighted properties

Table 6 Correlation coefficients and correlation sums for highly weighted variables under principal components (PCs) with multiple high factor loadings

a The correlation sum is the sum of the absolute value of correlation coefficients for each variable

response and high sensitivity to soil management changes (García-Ruiz et al. [2009](#page-10-0); Huang et al. [2013](#page-10-0)). Dehydrogenase activity is used as an indicator of soil microbiological activity and plays an important role in the initial oxidation of organic matter (Bastida et al. [2006](#page-10-0); Nannipieri et al. [2012\)](#page-11-0). The HPPS showed the highest enzyme activities, probably due to the highest fertility and microbial activity of these soils.

Soil microbial biomass is considered one of the most sensitive indicators of changes in soil quality (Stenberg [1999\)](#page-11-0). Higher soil MBC and MBN values were observed in HPPS than in the other paddy soils. Garcia-Gil et al. [\(2000\)](#page-10-0) showed that highest MBN and MBC values were found in the most fertile soils. Microbial activity, microbial biomass and enzyme activities of soils are correlated to SOM contents (Chaer et al. [2009\)](#page-10-0). Soil microbial properties were all significantly correlated with MBC $(P<0.05)$ but not always with

SOM. Therefore, soil MBC may be an accurate indicator for assessing soil quality (Chilima et al. [2002\)](#page-10-0).

Concentrations of PLFA markers of selected microbial groups (e.g., actinomycetes, total bacteria and fungi) were significantly increased by organic management, and decreased by contamination of paddy soils (Li et al. [2006;](#page-10-0) Moeskops et al. [2010\)](#page-11-0). AMF have been considered indictors of fertility of soils subjected to sustainable agricultural management because of their susceptibility to disturbance (Bending et al. [2004\)](#page-10-0). Significantly lower abundances of G −, actinomycetes and AMF were observed in LPPS, and these data also suggest the use of proper agricultural managements to improve fertility of LPPS. AMF abundance was significantly correlated with most soil properties including soil nutrient status, thus confirming results by Lauber et al. [\(2008\)](#page-10-0). AMF may have enhanced the uptake of immobile soil

COM communality of each indicator, BD bulk density, SAS soil aggregate stability, SOM soil organic matter, TN total N, AN alkali-hydrolyzable N, AP available P, AK is available K, ASi available Si, AZn available Zn, CEC cation exchange capacity, MBN microbial biomass N, MBC microbial biomass C, ACP acid phosphatase, G+ gram-positive bacteria, G− gram-negative bacteria, AMF arbuscular mycorrhizal fungi

Fig. 3 Mean values of soil quality index for HPPS, MPPS and LPPS based on TDS method (filled bars) and MDS method (empty bars). HPPS high productive paddy soils, MPPS medium productive paddy soils, LPPS low productive paddy soils

Fig. 4 Correlation between soil quality index and rice yield of 81 paddy fields using the TDS method (a) and MDS method (b)

nutrients in HPPS (Jakobsen [1999\)](#page-10-0). Generally, AMF are considered to be a suitable indicator for soil quality assessment, and the relative abundance was selected for the MDS according to the PCA results.

Soil quality index

SQI is considered as the primary indicator of sustainable land management (Mohanty et al. [2007\)](#page-11-0). Based on the MDS method and the relative SQI values, the paddy soils are ranked as HPPS>MPPS>LPPS. The same rank order was observed by SQI values of the TDS method. Therefore, there were constraints limiting the rice productivity in MPPS and LPPS. Comparing these soils with HPPS, lower values of TN and AK were probably the primary factors limiting the productivity particularly for LPPS. Probably the low content of AK was the main factor limiting the productivity in MPPS. Some effective management approaches such as biochar amendment may be conducted for improving the productivity of the LPPS.

The significant correlation between SQL_{MDS} and rice yield indicated that soil parameters selected for MDS had a biological significance, and can be used to evaluate soil as a rice production medium. Similar findings were observed by Li et al. ([2013](#page-10-0)). In addition, we have found that the MDS method can adequately represent the TDS method, although the TDS method was more accurate, in accordance with Qi et al. [\(2009\)](#page-11-0).

Conclusion

Twenty-six soil properties including physical, chemical and microbiological properties were determined. Fifteen of the properties showed significant differences between HPPS, MPPS and LPPS, and were selected for PCA. Only MBC, AMF, TN, ASi and K were considered in the MDS based on

the PCA results. The SQI values were calculated using the Integrated Quality, and the paddy soils could be ranked as HPPS>MPPS>LPPS using either the TDS or the MDS method. HPPS were characterized by low bulk density, adequate nutrients supply, favorable physical–chemical properties and good abundances of microbial groups. Low levels of TN and AK were considered to be the primary constraints limiting the rice productivity in LPPS. The contents of soil AP, AZn and ASi were sufficient for plant nutrition whereas that of AK was deficient in the studied paddy fields, even in HPPS. Significant correlations were observed between SQI values and rice yield when these values were calculated by using both the TDS and the MDS methods. Although the TDS method was more accurate, the MDS method can adequately represent the TDS method for soil quality assessment of yellow clayey paddy soil. Based on our results, the application of K and other sustainable management practices eliminating the constraints limiting rice productivity should be conducted to increase rice yield, especially in the LPPS.

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References

- Alef K, Nannipieri P (1995) Methods in applied soil microbiology and biochemistry. Academic Press, London, pp 311–73
- Andrews SA, Mitchell JP, Mancinelli R, Karlen DL, Hartz TK, Horwath WR, Pettygrove GS, Scow KM, Munk DS (2002) On-farm assessment of soil quality in California's central valley. Agron J 94:12–3
- Andrews SS, Carroll CR (2001) Designing a soil quality assessment tool for sustainable agroecosystem management. Ecol Appl 11:573–585
- Arshad MA, Martin S (2002) Identifying critical limits for soil quality indicators in agro-ecosystems. Agr Ecosyst Environ 88:153–160
- Barrios E, Trejo MT (2003) Implications of local soil knowledge for integrated soil management in Latin America. Geoderma 111:217– 31
- Bastida F, Moreno JL, Hernández T, García C (2006) Microbiological degradation index of soils in a semiarid climate. Soil Biol Biochem 38:3463–3473
- Bastida F, Zsolnay A, Hernández T, García C (2008) Past, present and future of soil quality indices: Abiological perspective. Geoderma 147:159–171
- Beare MH, Bruce RR (1993) A comparison of methods for measuring water-stable aggregates: implications for determining environmental effects on soil structure. Geoderma 56:87–104
- Bending GD, Turner MK, Rayns F, Marx MC, Wood M (2004) Microbial and biochemical soil quality indicators and their potential for differentiating areas under contrasting agricultural management regimes. Soil Biol Biochem 36:1785–1792
- Bhardwaj AK, Jasrotiaa P, Hamiltona SK, Robertson GP (2011) Ecological management of intensively cropped agro-ecosystems improves soil quality with sustained productivity. Agr Ecosyst Environ 140:419–429
- Blake GR, Hartge KH (1986) Bulk density. In: Klute A (ed) Methods of soil analysis: Part 1, 2nd edn. America Society of Agronomy, Madison, pp 363–375
- Brady NC (1974) The nature and properties of soil, 8th edn. Macmillan, New York, p 639
- Brejda JJ, Moorman TB, Karlen DL, Dao TH (2000) Identification of regional soil quality factors and indicators. Central and Southern High Plains. Soil Sci Soc Am J 64:2115–2124
- Chaer GM, Myrold DD, Bottomley PJ (2009) A soil quality index based on the equilibrium between soil organic matter and biochemical properties of undisturbed coniferous forest soils of the Pacific Northwest. Soil Biol Biochem 41:822–830
- Chilima J, Huang CY, Wu CF (2002) Microbial biomass carbon trends in black and red soils under single straw application: effect of straw placement, mineral N addition and tillage. Pedosphere 12:59–72
- Doran JW, Parkin TB (1994) Defining and assessing soil quality. In: Doran JW (ed) Defining soil quality for a sustainable environment. Soil Science Society of America Special Publication, Madison, pp $3 - 21$
- Doran JW, Stamatiadis SI, Haberern J (2002) Soil health as an indicator of sustainable management. Agr Ecosyst Environ 88:107–110
- Fernández-Ugalde O, Virto I, Bescansa P, Imaz MJ, Enrique A, Karlen DL (2009) No-tillage improvement of soil physical quality in calcareous, degradation-prone, semiarid soils. Soil Till Res 106:29–35
- Garcia-Gil JC, Plaza C, Soler-Rovira P, Polo A (2000) Long-term effects of municipal solid waste compost application on soil enzyme activities and microbial biomass. Soil Biol Biochem 32:1907–1913
- García-Ruiz R, Ochoa V, Viñegla B, Hinojosa MB, Peña-Santiago R, Liébanas G, Linares JC, Carreira JA (2009) Soil enzymes, nematode community and selected physico-chemical properties as soil quality indicators in organic and conventional olive oil farming: influence of seasonality and site features. Appl Soil Ecol 41:305–314
- Gee GW, Bauder JW (1986) Particle-size analysis. In: Klute A (ed) Methods of soil analysis. Part 1. Physical and mineralogical methods. American Society of Agronomy, Madison, pp 383–411
- Huang M, Jiang LG, Zou YB, Xu SH, Deng GF (2013) Changes in soil microbial properties with no-tillage in Chinese cropping systems. Biol Fertil Soils 49:373–377
- Jakobsen I (1999) Transport of phosphorus and carbon in arbuscular mycorrhizas. In: Varma A (ed) Mycorrhiza: structure, function, molecular biology, 2nd edn. Springer, Heidelberg, pp 535–542
- Kamprath EJ, Watson ME (1980) Conventional soil and tissue tests for assessing the phosphorus status of soil. In: Khasawneh FE (ed) The role of phosphorus in agriculture. Soil Science Society of America, Madison, WI, pp 443–469
- Khan S, Hanjra MA, Mu JX (2009) Water management and crop production for food security in China: a review. Agr Water Manage 96: 349–360
- Kozdroj J, van Elsas JD (2001) Structural diversity of microorganisms in chemically perturbed soil assessed by molecular and cytochemical approaches. J Microbiol Meth 43:197–212
- Krowntree KM, Fox RC (2008) Active learning for understanding land degradation: African catchment game and risk map. Geogr Res 46: 39–50
- Lal R (2004) Soil carbon sequestration to mitigate climate change. Geoderma 123:1–22
- Lauber CL, Strickland MS, Bradford MA, Fierer N (2008) The influence of soil properties on the structure of bacterial and fungal communities across land-use types. Soil Biol Biochem 40:2407–2415
- Li P, Zhang TL, Wang XX, Yu DS (2013) Development of biological soil quality indicator system for subtropical China. Soil Till Res 126: 112–118
- Li ZJ, Xu JM, Tang CX (2006) Application of 16S rDNA-PCR amplification and DGGE fingerprinting for detection of shift in microbial community diversity in Cu, Zn and Cd contaminated paddy soils. Chemosphere 62:1374–1380
- Liang YC, Sun WC, Zhu YG, Christie P (2007) Mechanisms of siliconmediated alleviation of abiotic stresses in higher plants: A review. Environ Pollut 147:422–428
- Liebig MA, Varvel G, Doran JW (2001) A simple performance-based index for assessing multiple agroecosystem functions. Agron J 93:313–318
- Ma JF, Takahashi E (2002) Soil, fertilizer, and plant silicon research in Japan. Kyoto, Japan, pp 49–52
- Manlay RJ, Feller C, Swift MJ (2007) Historical evolution of soil organic matter concepts and their relationships with the fertility and sustainability of cropping systems. Agr Ecosyst Environ 119:217–233
- Marzaioli R, D'Ascoli R, de Pascale RA, Rutigliano FA (2010) Soil quality in a Mediterranean area of southern Italy as related to different lad use types. Appl Soil Ecol 44:205–212
- McGrath D, Zhang CS (2003) Spatial distribution of soil organic carbon concentrations in grassland of Ireland. Appl Geochem 18:1629– 1639
- Moeskops B, Buchan D, Sleutel S, Herawaty L, Husen E, Saraswati R, Setyorini D, Neve SD (2010) Soil microbial communities and activities under intensive organic and conventional vegetable farming in West Java, Indonesia. Appl Soil Ecol 45:112–120
- Mohanty M, Painuli DK, Misra AK, Ghosh PK (2007) Soil quality effects of tillage and residue under rice–wheat cropping on a Vertisol in India. Soil Till Res 92:243–250
- Nannipieri P, Giagnoni L, Renella G, Puglisi E, Ceccanti B, Masciandaro G, Fornasier F, Moscatelli MC, Marinari S (2012) Soil enzymology: classical and molecular approaches. Biol Fertil Soils 48:743–762
- Noble AD, Gillman GP, Ruaysoongnern SA (2000) Cation exchange index for assessing degradation of acid soil by further acidification under permanent agriculture in the tropics. Eur J Soil Sci 51:233–243
- Olsen SR, Sommers LE (1982) Phosphorus. In: Page AL (ed) Method of soil analysis, 2nd edn. Soil Science Society of America, Madison, pp 403–430
- Page AL, Miller RH, Keeney DR (1982) Methods of soil analysis, 2nd edn. American Society of Agronomy, Madison
- Pan GX, Smith P, Pan WN (2009) The role of soil organic matter in maintaining the productivity and yield stability of cereals in China. Agr Ecosyst Environ 129:344–348
- Puglisi E, Nicelli M, Capri E, Trevisan M, Del Re AA (2005) A soil alteration index based on phospholipid fatty acids. Chemosphere 61: 1548–1557
- Qi YB, Darilek JL, Huang B, Zhao YC, Sun WX, Gu ZQ (2009) Evaluating soil quality indices in an agricultural region of Jiangsu Province, China. Geoderma 149:325–334
- Ramsey PW, Rillig MC, Feris KP, Holben WE, Gannon JE (2006) Choice of methods for soil microbial community analysis: PLFA maximizes power compared to CLPP and PCR-based approaches. Pedobiologia 50:275–280
- Rezaei SA, Gilkes RJ, Andrews SS (2006) A minimum data set for assessing soil quality in rangelands. Geoderma 136:229–234
- Romaniuk R, Giuffré L, Costantini A, Nannipieri P (2011) Assessment of soil microbial diversity measurements as indicators of soil functioning in organic and conventional horticulture systems. Ecol Indic 11: 1345–1353
- Romaniuk R, Giuffré L, Costantini A, Bartoloni N, Nannipieri P (2012) A comparison of indexing methods to evaluate quality of soils: the role of soil microbiological properties. Soil Res 49:733–741
- Saygın SD, Cornelis WM, Erpul G, Gabriels D (2012) Comparison of different aggregate stability approaches for loamy sand soils. Appl Soil Ecol 54:1–6
- Sheldrick WF, Syers JK, Lingard J (2003) Soil nutrient audits for China to estimate nutrient balances and output/input relationships. Agr Ecosyst Environ 94:341–354
- Shukla MK, Lal R, Ebinger M (2006) Determining soil quality indicators by factor analysis. Soil Till Res 87:194–204
- Shen SM, Pruden G, Jenkinson DS (1984) Mineralization and immobilization of nitrogen in fumigated soil and the measurement of microbial biomass nitrogen. Soil Biol Biochem 16:437–444
- Smith JL, Doran JW (1996) Measurement and use of pH and electrical conductivity for soil quality analysis. In: Doran JW, Jones AJ (eds) Methods for assessing soil quality. Soil Science Society of America, Madison, pp 169–185
- Stenberg B (1999) Monitoring soil quality of arable land: microbiological indicators. Acta Agr Scand B-S P 49:1–24
- Stocking MA (2003) Tropical soils and food security: the next 50 years. Science 302:1356–1359
- Tesfahunegn GB, Tamene L, Vlek PLG (2011) Evaluation of soil quality identified by local farmers in Mai-Negus catchment, northern Ethiopia. Geoderma 163:209–218
- Warkentin BP (1995) The changing concept of soil quality. J Soil Water Conserv 50:226–228
- Vance ED, Brookes PC, Jenkinson DS (1987) An extraction method for measuring soil microbial biomass C. Soil Biol Biochem 19:703–707
- Wu Y, Ding N, Wang G, Xu J, Wu J, Brookes PC (2009) Effects of different soil weights, storage times and extraction methods on soil phospholipid fatty acid analyses. Geoderma 150:171–178
- Xiao ZH (1981) Principal types of low yield paddy soil in China. Proceedings of Symposium on paddy soil. Springer Berlin Heidelberg, Berlin, pp 151–159
- Yao RJ, Yang JG, Gao P, Zhang JB, Jin WH (2013) Determining minimum data set for soil quality assessment of typical salt-affected farmland in the coastal reclamation area. Soil Till Res 128:137–148
- Zhu QQ, Liu Z (1981) The status of microelements in relation to crop production in paddy soils of China: III. Zinc. In: Proceeding of Symposium on paddy soils. Springer, Berlin, pp 635–640