



Article

Evaluation of CH₄ Emission in Two Paddy Field Areas, Khonkaen and Ayutthaya, in Thailand

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Simple Summary: In anthropogenic activities, flooded paddy field is one of those events that emits CH₄ and that comes the necessity of leveling down CH₄ production from soil so the study on mechanisms of CH₄ production in paddy soil is vital. This study was conducted for an aim of investigating CH₄ influential factors in wide range of soil texture in paddy soil in Thailand and interrogating a model for predicted CH₄ production potential map. Our result showed that soil carbon and sandy soil are the important factors generating CH₄ production. To be exact, soil carbon works as a provider that implements an energy to soil microorganism to anoxically produce CH₄ and sandy soil, that carries less iron oxide, accelerates the CH₄ production. In conclusion, CH₄ production in paddy field under flooding period is triggered when large amount of soil carbon exists, and the reduction being processed quickly due to a smaller number of iron oxide in the soil, especially sandy soil. The knowledge of factors influencing CH₄ production brings about a better crop and water management. Further than that, predicted map of CH₄ production potential can be utilized to identify whereabouts of highly emitted CH₄ production potential, which attention should be paid.



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Abstract: It is well known that submerged soils emit high levels of methane (CH₄) due to oxygen deprivation and free iron oxide causing a quick reduction. However, there are other soil properties that control the reduction processes in soil, especially the amount of soil organic carbon (SOC). This study aimed to investigate the major factors controlling CH₄ production potential (CH₄PP) in Thai paddy fields. Two provinces, Ayutthaya, a clay soil region, and Khonkaen, a sandy soil region, were selected to represent a wide range of soil textures. Soil characteristic analysis pre- and post-incubation, and weekly gas detection in an incubation experiment over two months, was conducted. Stepwise multiple regression analysis was employed to analyze major soil factors controlling CH₄PP. For the regional prediction of CH₄PP, a map dataset of Ayutthaya and Khonkaen by the Land Development Department, Thailand, and a soil texture map (with intersected point data using the soil property map in ArcGIS) by OpenLandMap, were used. CH₄PP was correlated with 1:10 pH, Fe²⁺, and water-soluble organic carbon (WSOC) measured after incubation. Although CH₄PP showed no significant correlation with any soil properties measured before incubation, CH₄PP was correlated with SOC, 1:10 electrical conductivity (EC), exchangeable ammonium (ExNH₄), and sand content. It was thought that SOC and ExNH₄ were related to organic matter decomposition, 1:10 EC was related to SO₄²⁻ reduction and sand content was related to free oxides. Predicted regional CH₄PP was similar in Ayutthaya and Khonkaen, although SOC, ExNH₄ and 1:10 EC was higher, and sand content was lower in Ayutthaya than in Khonkaen. In both regions, the distribution of CH₄PP corresponded to SOC, and CH₄PP was lower with lower sand content and higher 1:10 EC. In clayey Ayutthaya, higher CH₄PP was observed in the area with higher ExNH₄. This indicates that soil properties other than soil texture and SOC influence CH₄PP in the paddy fields in Thailand.

Keywords: CH₄ production potential; incubation study; paddy field; mollisols; ultisols

1. Introduction

In recent decades, causes and mitigation issues related to global warming have become controversial. Methane (CH₄) is a stronger greenhouse gas (GHG) than CO₂ because it has a higher radiative trapping ability [1]. Submerged soils emit high levels of CH₄ due to free iron oxides causing rapid reduction reactions. In agriculture, paddy fields are an important source of atmospheric CH₄, as flooded conditions are preferable for proper rice growth [2,3]. Globally, rice cropping is considered to account for 5 to 20% of total CH₄ emission from anthropogenic actions [4]. Paddy fields in Thailand cover almost half the total agricultural land and are mostly located in the central and northeastern parts of the country. These regions have different soil types, with clayey soil in the central region, and sandy soil in the northeastern part [5,6]. Rice cultivation in Thailand was ranked as the fourth highest global CH₄ emitter, contributing an average of 1756.6 Gg CH₄ between 2010 and 2017 [7].

Several factors controlling CH₄ emissions have been studied, particularly in relation to plant species, cultivation practices, climate, and soil properties [8]. CH₄ production in the anaerobic environment of water-saturated soil depends on a variety of soil properties, both chemical and physical [8]. Under anaerobic soil conditions, methanogens process CH₄ through the reduction of soil oxides [2,3]. Following the depletion of oxygen, when soil microbes initiate anaerobic respiration, the order of electron acceptors use is NO₃⁻, MnO₂, Fe₂O₃, SO₄²⁻, and CO₂, while organic matter acts as the electron donor [9]. Inubushi et al. reported that hexose (an easily decomposable carbon component in soil organic matter) was positively correlated with the production of CH₄ in an experiment on 23 soil samples in paddy fields from four different, southeast Asian countries [10]. This result indicated the importance of soil organic carbon, and indeed, soil organic carbon is a significant factor controlling CH₄ production in paddy fields. Sass et al. showed that CH₄ emissions during the growing season in paddy fields with different soil textures were positively correlated to the percentage of sand (R² = 0.999) during a four-year study, and indicated that CH₄ production was higher in sandy soils than clayey soils when the same amount of organic carbon was applied to the field [11]. Wang et al. observed the relationship between CH₄ emission and soil physicochemical properties of 16 paddy fields from USA, India, Thailand, and Liberia in an incubation experiment, and revealed that the decrease in redox potential (Eh) was correlated with biologically reducible Fe, Mn, and soil pH [12]. Moreover, Mitra et al. showed that Eh was correlated with cation exchange capacity (CEC) and available potassium [13].

Even though the knowledge of processes that contributes to the CH₄ emission is well-reported academically, understanding of upscaling or spatial level of the emission is still inadequate [14]. Moreover, The U.S. Environmental Protection Agency (USEPA) reported in 2006 that the increasing world population affects the demand of rice which lays an impact on methane emission. Specifically, three-fourths of the emission is emitted from south east Asian countries [15]. This means the assessment of methane production potential is highly essential as it implies how soil reduction processes perform [16]. With the reliable CH₄ production equation that is put into potentiality and represented in spatial level, the result can imply the possibility of a future amount of CH₄ emitted from paddy fields in wide scale.

Therefore, by determining the major soil properties that dominate CH₄ production, a strategy for soil amendment can be determined to reduce CH₄ emissions from paddy fields. In Thailand, the soil texture of major rice paddies ranges widely from sandy to clayey. In this study, topsoil collected from paddy fields in the central and northeastern parts of Thailand were used to measure CH₄ production potential (CH₄PP) in an anaerobic incubation experiment, and multiple regression models with several soil properties were

made. By interrogating the regression model, the regional difference in CH₄PP between sandy and clayey soil areas was evaluated to investigate the effect of soil properties on CH₄ production in paddy soil.

2. Materials and Methods

2.1. Site Description

This study was conducted in the Ayutthaya province (14°21'6" N, 100°34'38.6" E), and in the Khonkaen (16°26'22.6500" N, 102°49'43.4208" E) and Mahasarakam provinces (16°11'05" N, 103°18'02" E) (Figure 1). Soil samples were randomly collected from a total of 44 paddy fields during June 2018, of which 20 samples (AY1 to AY20) were from Ayutthaya, and 24 samples (KK1 to KK24) were from Khonkaen and Mahasarakam (Table 1). Approximately 1 kg of composite soil from a depth of 0–15 cm was taken from five places in each field, mixed well, sealed in a plastic bag, brought back to the laboratory, air-dried, and used for the experiment. Separately, soil was sampled from a depth of 10 cm for the measurement of bulk density, and undisturbed core soil was sampled with a 100 mL stainless steel cylindrical tube.

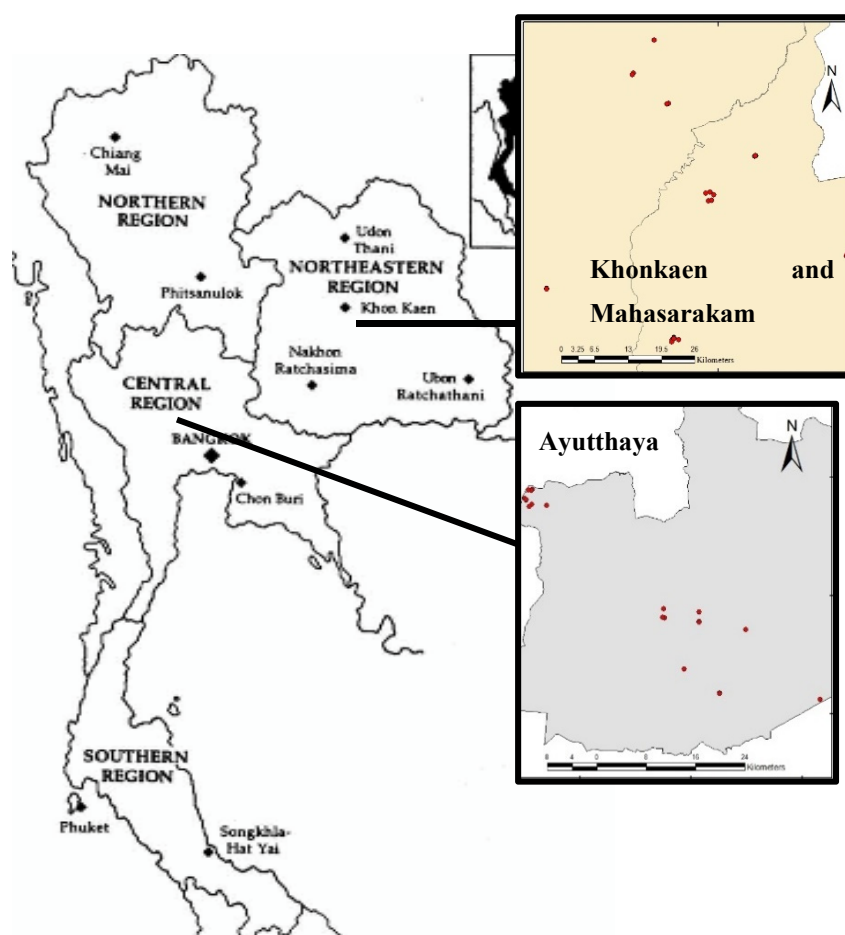


Figure 1. Study sites—Khonkaen, Mahasarakam, and Ayutthaya, Thailand.

Table 1. Sampling sites from Khonkaen, Maharakam, and Ayutthaya.

Khonkaen and Maharakam		Ayutthaya	
Site No.	Location	Site No.	Location
KK1	16°10'50.142" N, 102°41'57.3396" E	AY1	14°11'12.48" N, 100°41'41.28" E
KK2	16°10'51.9024" N, 102°41'56.6268" E	AY2	14°11'45.3372" N, 100°32'36.7764" E
KK3	16°32'38.4072" N, 102°50'55.8384" E	AY3	14°18'40.68" N, 100°30'48.24" E
KK4	16°32'47.0112" N, 102°51'2.6712" E	AY4	14°27'41.76" N, 100°15'32.76" E
KK5	16°36'9.8244" N, 102°53'13.6356" E	AY5	14°27'51.84" N, 100°15'46.08" E
KK6	16°29'38.4612" N, 102°54'34.8696" E	AY6	14°28'16.68" N, 100°15'16.56" E
KK7	16°29'40.9776" N, 102°54'44.46" E	AY7	14°28'14.52" N, 100°15'16.56" E
KK8	16°19'48.9864" N, 102°59'19.068" E	AY8	14°17'8.1816" N, 100°35'1.3992" E
KK9	16°19'47.424" N, 102°58'56.8992" E	AY9	14°29'6.72" N, 100°15'28.44" E
KK10	16°20'39.4728" N, 102°59'6.1764" E	AY10	14°28'22.08" N, 100°15'7.92" E
KK11	16°20'33.0396" N, 102°58'39.6048" E	AY11	14°29'3.84" N, 100°15'45" E
KK12	16°20'24.5868" N, 102°59'31.9704" E	AY12	14°29'7.8" N, 100°15'49.32" E
KK13	16°5'41.4924" N, 102°55'48.4356" E	AY13	14°27'47.16" N, 100°17'7.8" E
KK14	16°5'47.2848" N, 102°55'18.7572" E	AY14	14°11'47.04" N, 100°32'36.96" E
KK15	16°5'49.56" N, 102°55'18.9264" E	AY15	14°18'14.76" N, 100°27'32.04" E
KK16	16°5'52.746" N, 102°55'19.7364" E	AY16	14°18'56.88" N, 100°27'36.72" E
KK17	16°5'27.0492" N, 102°55'4.9908" E	AY17	14°18'11.16" N, 100°27'41.76" E
KK18	16°5'39.4548" N, 102°55'9.0732" E	AY18	14°17'49.2" N, 100°30'50.04" E
KK19	16°24'21.294" N, 103°3'52.5852" E	AY19	14°17'52.08" N, 100°30'48.6" E
KK20	16°24'19.8252" N, 103°3'50.8968" E	AY20	14°13'50.52" N, 100°29'25.44" E
KK21	16°24'23.4972" N, 103°3'58.3884" E		
KK22	16°14'19.1796" N, 103°13'29.9748" E		
KK23	16°14'16.5192" N, 103°13'31.6776" E		
KK24	16°14'12.6996" N, 103°13'29.406" E		

Ayutthaya province has an area of 2556.64 km² in total and is in the central plain of Thailand. It is surrounded by rivers (JICA, 2007) and has mean annual precipitation, annual raining days, and maximum rain amount of 1023.7 mm·year⁻¹, 107 days, and 60.6 mm, respectively [17]. Khonkaen province is in a mountainous area, covering a total area of 10,886 km² [18] with a mean annual precipitation of 1304 mm·year⁻¹, total raining days of 112 days, and 64.4 mm maximum rainfall [17]. Maharakam province is next to Khonkaen province and has an area of 5292 km² with 1225.1 mm of annual rainfall,

102 raining days per year, and a maximum rainfall of 65.7 mm [19]. Based on soil texture analysis of the samples using the pipette method [20], Ayutthaya has clayey soil, and Khonkaen and Mahasarakam have sandy soil. For the purposes of classification of soil texture and location, Khonkaen and Mahasarakam were amalgamated as one province named Khonkaen. Sampling was conducted in June 2018.

2.2. Anaerobic Incubation Experiment

A 15 g sample of air-dried soil and 30 mL of deionized water were placed in a 100 mL bottle, 4 cm in diameter and 12 cm in height, following which the headspace was purged using N₂ (Hokkaido Air Water Inc., Hokkaido, Japan) to create anaerobic conditions (Figure 2). Two replicates were incubated during a period of 2 months at a temperature of 25 °C. During the incubation period, CH₄ was measured weekly using gas chromatography with a flame ionization detector (GC-14B, Shimadzu, Kyoto, Japan), and the vial bottles were flushed with N₂ after each gas detection to retain anoxic conditions. CH₄ production potential was calculated from fluctuation of gas concentration in the incubation bottle as follows in Formulas (1)–(3):

$$F = \rho \times (\text{gas concentration} \times V) / D \times W \times \alpha \times 1000 \quad (1)$$

where, F is the gas emission (mg·C·kg⁻¹·day⁻¹); ρ is the density of gas at the standard condition (CH₄ = 0.717 kg m⁻³); gas concentration (ppmv); V(m³) is volume of the bottle; W(g) is dry soil weight; α = is the conversion of factor for CH₄ to C (12/16). To calculate average cumulative CH₄ emission, the gas emission was utilized in the formular below:

$$\text{Average cumulative CH}_4 \text{ emission (gC}\cdot\text{kg}^{-1}) = F + (C \times D) \quad (2)$$

where, C is the last cumulative gas result; D is the number of days in the sampling interval.

$$\text{CH}_4 \text{ production potential (CH}_4\text{PP)} = \frac{\text{Average cumulative CH}_4 \text{ emission (mgC}\cdot\text{kg}^{-1})}{\text{Number of incubation week}} \quad (3)$$

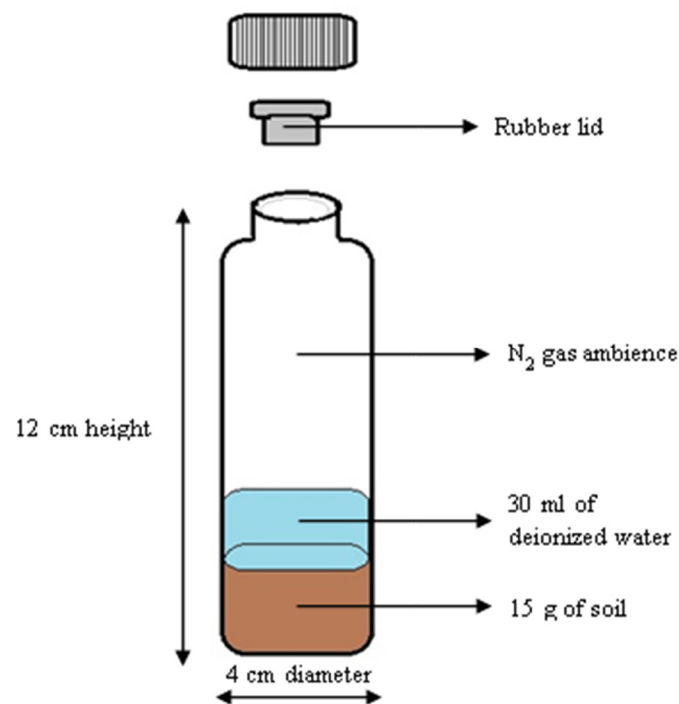


Figure 2. Anaerobic incubation.

2.3. Soil Properties Analysis

Soil was analyzed before and after incubation. Before incubation (BI), air-dried soil and deionized water were placed in a plastic container for the recording of 1:10 pH_{BI} using a pH meter (pH meter F-22, Horiba, Kyoto, Japan), and electrical conductivity (1:10 EC_{BI}) using a conductivity meter (CM-30V, TOA-DKK). After filtration of the 1:10 water suspension, water-soluble anions (SO_4^{2-} , NO_3^- , Cl^- , and PO_4^{3-}) were analyzed by using ion chromatography (C-R8A chromato-processor, Shimadzu, Kyoto, Japan). Cation exchange capacity (CEC), exchangeable base cations (ExCa, ExMg, ExK, and ExNa) and base saturation (BS) were measured by the Schollenberger method [21]. Exchangeable base cations were examined using an atomic absorption spectrophotometer (200 Series AA, Agilent Technologies, Malaysia). Exchangeable NH_4 (Ex NH_4 (b)), extracted by 1 M KCl, was analyzed by the colorimetric method (Bolleter W. T., 1961) using a UV-VIS spectrophotometer (Shimadzu UV-1280, Shimadzu, Kyoto, Japan). Available phosphorus was analyzed using spectrophotometry (Spectronic Genesys 20, Becthai Bangkok Equipment & Chemical Co., Ltd., Bangkok, Thailand). Soil organic carbon (SOC) was obtained by the Walkley-Black acid digestion method (Walkey A.; Black, 1943), and the content of soil organic matter (SOM) was estimated by multiplying SOC content by 1.72. Total nitrogen was determined by the Kjeldahl method [22] (Table S2 in supplementary).

After incubation (AI), soil samples were moved to a plastic container, and 120 mL of deionized water were added, after which 1:10 pH_{AI} and 1:10 EC_{AI} were measured. The suspension was then filtered, and water-soluble anions, water-soluble organic carbon (WSOC), and inorganic carbon (IC) were analyzed using a TOC analyzer (TOC-5000A, Shimadzu, Kyoto, Japan). Soil samples were further extracted with 120 mL of 1M KCl to measure exchangeable ammonium (Ex NH_4 (AI)), ferrous iron (Fe^{2+}), and manganese (Mn^{2+}). Ex NH_4 and Fe^{2+} were analyzed by colorimetric methods with a UV-VIS spectrophotometer (Shimadzu UV-1280, Shimadzu, Kyoto, Japan), and Mn^{2+} was analyzed by using an atomic absorption spectrophotometer (Z-5010, Hitachi, Tokyo, Japan).

2.4. Regression Model for CH_4 PP

Significant factors controlling CH_4 PP were analyzed using the Pearson's correlation matrix and a step-wise multiple regression analysis in IBM SPSS Statistics for Windows, version 21 [23]. The comparison of variable means between the areas was determined using one-way ANOVA at 95% confidential level.

Multicollinearity usually occurs with a number of independent values that are highly correlated. To overcome this problem, one each of the highly correlated paired independent parameters (at $R^2 > 0.7$) was removed, and the variance inflation factor (VIF) was calculated for the remaining parameters. Multicollinearity was prevented in independent variables with a VIF of less than 10 [24]. Therefore, the variables with VIF less than 10 were included in the stepwise regression to predict CH_4 PP.

2.5. Evaluation of the Regional Differences in CH_4 Production Potential

In order to compare the CH_4 production potential between the Ayutthaya clayey soil area and the Khonkaen sandy soil area, spatial CH_4 production potential was predicted according to Figure 3. Two experimental area map datasets and one in vitro predicted soil dataset were employed in order to invent predicted regional CH_4 PP map: (1) the soil properties map in point data was provided by the Land Development Department (LDD) of Thailand [25] consisting of organic matter (%), 1:1 pH, organic carbon (%), available phosphorus ($\text{mg}\cdot\text{kg}^{-1}$), and exchangeable potassium ($\text{mg}\cdot\text{kg}^{-1}$), and (2) Online OpenLandMap from GitHub (© LandGIS contributors, n.d.) in a raster data structure that represented sand content (%), and clay content (%). Ayutthaya and Khonkaen map datasets consisted of 1490 points and 4253 points, respectively. Because the map dataset of GitHub was in a raster data structure, the datasets were interpreted in ArcGIS Desktop version 10.1 [26].

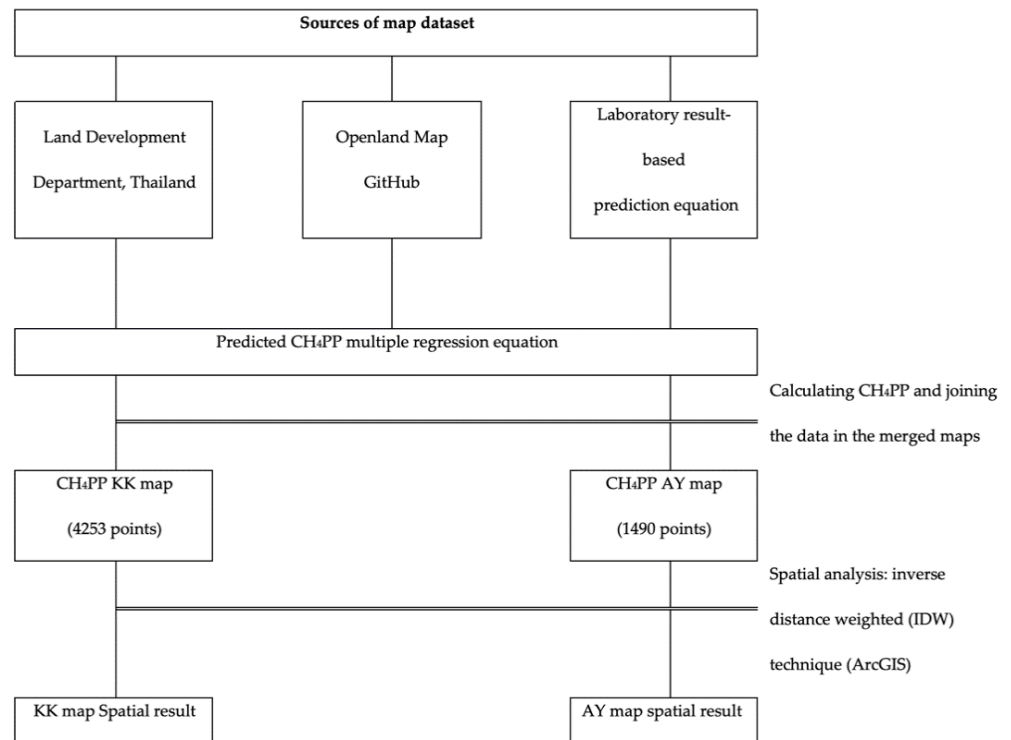


Figure 3. Workflow schematic of map spatial analysis.

The multiple regression analysis for CH₄PP showed that CH₄PP was significantly correlated with SOC, 1:10 EC_{BI}, ExNH_{4(BI)}, and sand content. However, 1:10 EC_{BI} and ExNH_{4(BI)} were not available in LDD. Therefore, regression equations were produced to predict those parameters using the available soil properties in LDD. The equations were obtained as follows in Formula (4) and (5):

$$\text{ExNH}_{4(\text{BI})} \left(\text{mg} \cdot \text{kg}^{-1} \right) = 0.19\text{Silt}(\%) + 6.2 \left(R^2 = 0.17, p < 0.01 \right) \quad (4)$$

$$1 : 10 \text{ ECBI} \left(\text{mS} \cdot \text{m}^{-1} \right) = 3.1 \text{ SOM}(\%) - 5.03\text{pH}_{\text{BI}} + 33.56 \left(R^2 = 0.74, p < 0.01 \right) \quad (5)$$

The CH₄PP prediction equation was used to predict CH₄ production potential at the sampling points in each province. An inverse distance weighted technique (IDW) was run in ArcGIS 10.1 for regional CH₄ production potential in the provinces. IDW was also appointed to display the significant soil properties of the areas spatially.

3. Results

As shown in Figure 4a, there was no significant difference in the average CH₄PP between Ayutthaya and Khonkaen (2012.31 and 1742.81 mg·C·kg⁻¹·week⁻¹, respectively, $p > 0.05$). For the soil properties measured before incubation, Ayutthaya was significantly greater than Khonkaen ($p \leq 0.05$) in 1:10 EC_{BI} (10.69 and 1.97 mS·m⁻¹), SOM (4.26% and 1.27%), SOC (2.46% and 0.74%), ExNH_{4(BI)} (17.07 and 12.38 mg·kg⁻¹), ExK, ExCa, ExMg, ExNa, Total N, CEC, SO₄²⁻-S_{BI}, and silt. On the other hand, Ayutthaya was significantly lower than Khonkaen in 1:10 pH_{BI} (6.08 and 6.75), sand (4.38% and 44.62%) and NO₃⁻-N_{BI}. For the soil characteristics measured after incubation, Ayutthaya was significantly higher than Khonkaen in 1:10 EC_{AI}, SO₄²⁻-S_{AI}, ExNH_{4(AI)} and IC, while Mn²⁺ was significantly lower in Ayutthaya than in Khonkaen (Figure 5). There was no significant difference between Ayutthaya and Khonkaen in Fe²⁺ and WSOC (Figure 5c,j).

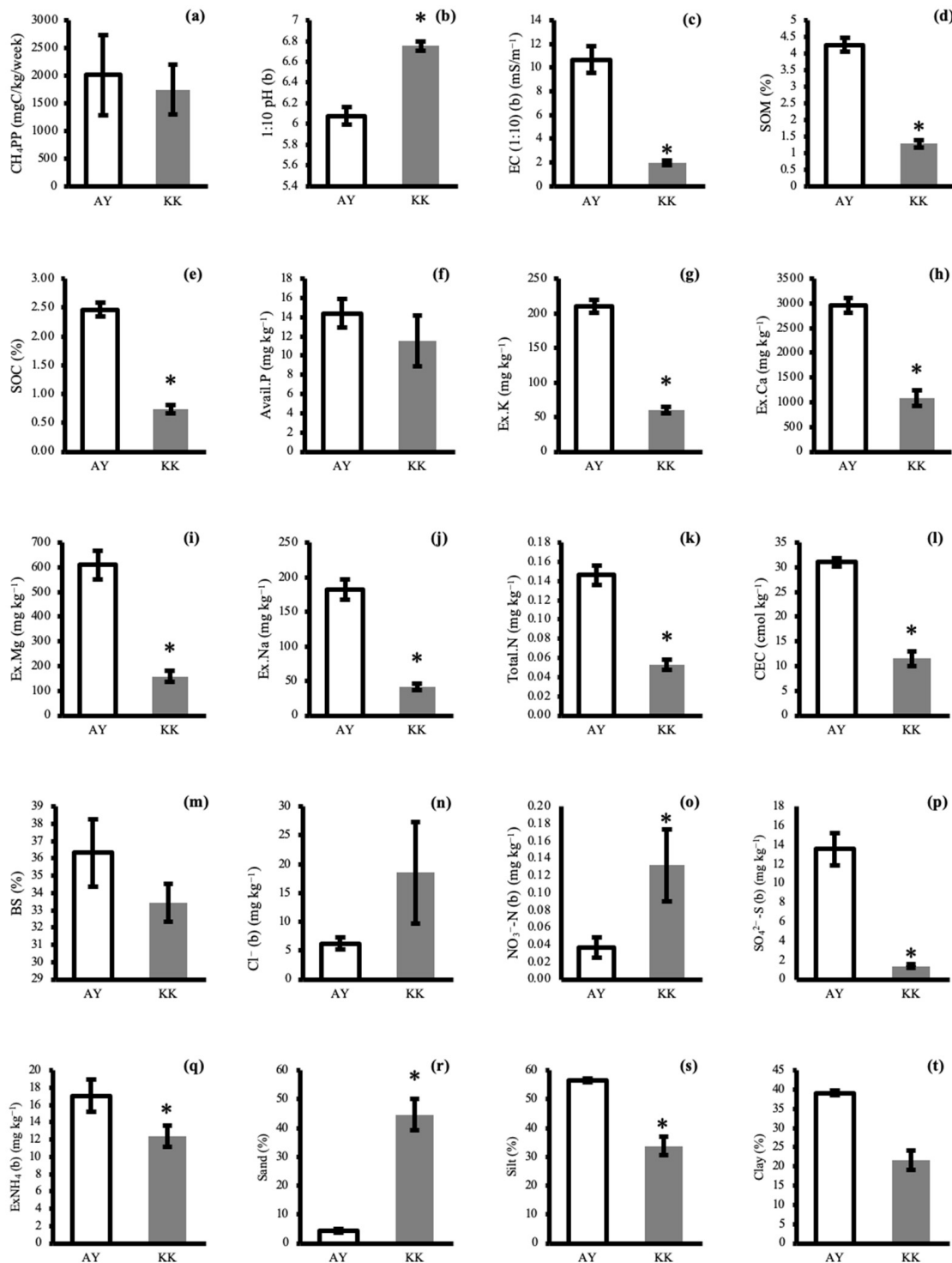


Figure 4. A comparison of average differences in CH₄ production potential and soil properties before incubation in Ayutthaya and Khonkaen. CH₄PP = CH₄ production potential (a); 1:10 pH(b) (b); 1:10 EC(b) = 1:10 electronic conductivity (c); SOM = Soil organic matter (d); SOC = Soil organic carbon (e); Avail.P = Available phosphorus (f); Ex.K = exchangeable potassium (g); Ex.Ca = Exchangeable calcium (h); Ex.Mg = Exchangeable magnesium (i); Ex.Na = Exchangeable sodium (j); Total.N = Total nitrogen (k); CEC = Cations exchange capacity (l); BS = Base saturation (m); Cl⁻ = Chloride (n); NO₃⁻-N = Nitrate (o); SO₄²⁻-S = Sulfate (p); ExNH₄ = Exchangeable ammonium (q); Sand(%) (r); Silt(%) (s); Clay(%) (t). Asterisk (*) represents a significant difference at the $p < 0.05$ level between the 2 areas. PO₄³⁻-P is not shown.

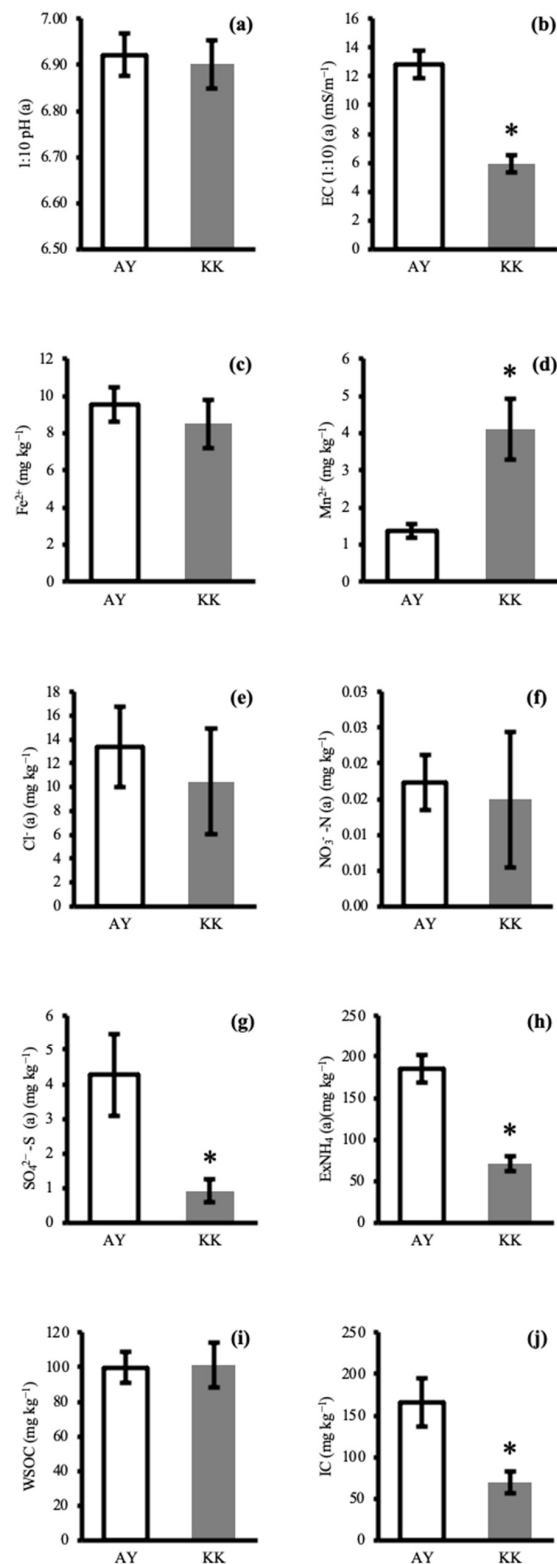


Figure 5. A comparison of average differences in soil properties after incubation in Ayutthaya and Khonkaen. 1:10 pH(a); 1:10 EC(a) = 1:10 electronic conductivity (b); Fe²⁺ = Ferrous ion (c); Mn²⁺ = Manganese ion(d); Cl⁻ = Chloride (e); NO₃⁻-N = Nitrate (f); SO₄²⁻-S = Sulfate (g); ExNH₄ = Exchangeable ammonium (h); WSOC = Water soluble organic carbon (i); IC = Inorganic carbon (j). Asterisk (*) represents a significant difference at the $p < 0.05$ level between the 2 areas. Figures of PO₄³⁻-P and NO₂⁻-N are not shown.

Soil properties after incubation were higher than before incubation in 1:10 EC (9.06 and $5.9 \text{ mS}\cdot\text{m}^{-1}$, respectively), 1:10 pH, ExNH_4 . In contrast, anions after incubation were lower than before incubation in PO_4^- , SO_4^{2-} , NO_3^- , and Cl^- .

Results of the simple regression analysis showed that although there was no significant correlation between CH_4PP and each soil property measured before incubation, except for $\text{ExNH}_{4(\text{BI})}$ (Table S3), CH_4PP was significantly correlated with 1:10 pH_{AI} , Fe^{2+} , and WSOC measured after incubation (Table 2). Using the soil characteristics measured before incubation, the result of step-wise multiple regression analysis showed that CH_4PP was significantly correlated with 1:10 EC_{BI} , SOC , $\text{ExNH}_{4(\text{BI})}$, and sand content (Figure 6), and the multiple regression equation indicated that all of the soil properties except for 1:10 EC_{BI} were positively correlated with CH_4PP without multicollinearity due to a $\text{VIF} < 10$ (Table 3). After incubation, however, the result of multiple regression analysis showed that only 1:10 pH_{AI} was significant ($R^2 = 0.22$, $p < 0.01$).

Table 2. Correlation matrix among CH_4 Production Potential (CH_4PP) and soil properties (after incubation).

	CH_4PP	pH (AI)	EC(AI)	Fe^{2+}	Mn^{2+}	Cl^- (AI)	NO_3^- (AI)	SO_4^{2-} (AI)	$\text{ExNH}_4(\text{AI})$	TOC	IC
CH_4PP											
pH_{AI}	-0.49 **										
EC_{AI}	-0.07	0.02									
Fe^{2+}	0.30 *	-0.49	-0.15								
Mn^{2+}	-0.17	0.23	-0.16	-0.28							
Cl^-_{AI}	-0.16	0.16	0.26	-0.2	0.01						
$\text{NO}_3^-_{(\text{AI})}$	-0.13	-0.01	0.06	-0.05	0.04	0.03					
$\text{SO}_4^{2-}_{(\text{AI})}$	-0.02	-0.25	0.69 **	-0.02	-0.21	0.04	-0.02				
$\text{ExNH}_4(\text{AI})$	0.07	-0.12	0.46 *	0.16	-0.19	0.02	0.12	0.23			
WSOC	0.35 *	-0.31	-0.01	0.13	-0.25	-0.15	-0.19	0.99	-0.17		
IC	-0.25	0.42 **	0.32 *	-0.21	-0.15	0.317 *	0.25	-0.08	0.55 **	-0.29	

* Correlation is significant at the 0.05 level (2-tailed). ** Correlation is significant at the 0.01 level (2-tailed).

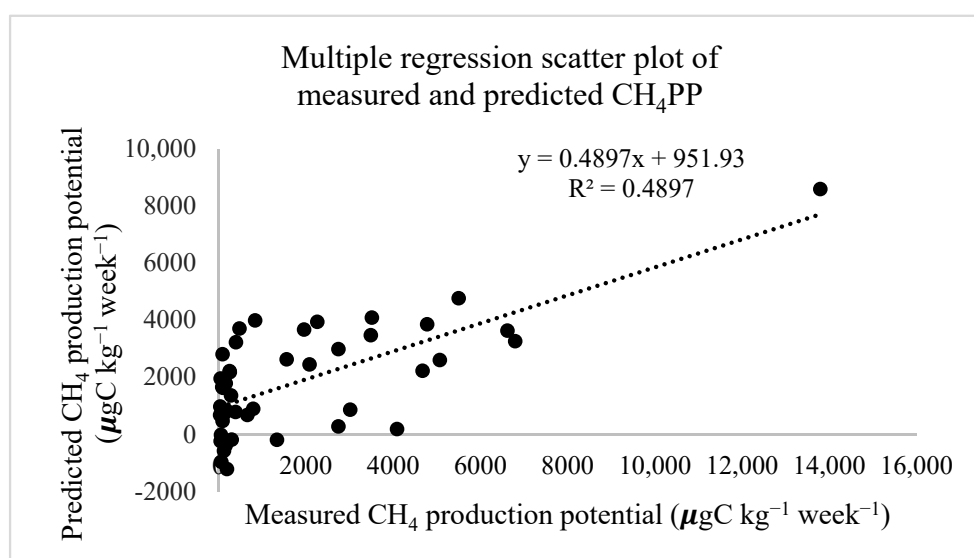


Figure 6. Multiple regression scatter plot between CH_4 production potential (CH_4PP) and major soil properties before incubation.

Table 3. Significant predictors in the regression before incubation (BI).

Predictors	Beta	Significant	Regression Equation	R ² (p Value)	VIF
SOC (%)	1.3	0.00003	CH ₄ PP(μg C/kg/week) = 3649.1(SOC) + 120.7(ExNH _{4(BI)}) + 89.5(Sand) – 328.5(1:10 EC _{BI}) – 5845.7	0.50 (0.00002)	8.3
ExNH _{4(BI)} (mg·kg ⁻¹)	0.3	0.01			1.3
Sand (%)	0.9	0.00005			4.7
1:10 EC _{BI} (mS·m ⁻¹)	−0.7	0.002			3.3

The regional CH₄PP predicted by the multiple regression equation using the map parameter values was not different between Ayutthaya and Khonkaen (Table 4). The differences in SOC, ExNH_{4(BI)} and 1:10 EC_{BI} were significantly larger in Ayutthaya than in Khonkaen. Consistently, the sand content in Khonkaen was more than twice that of Ayutthaya (49.76 and 21.01%). In Ayutthaya, 1490 variables were used, and 4253 variables were used in Khonkaen.

Table 4. Map datasets: Average and standard deviation of CH₄ production potential (CH₄PP) and major soil properties and significant level for the difference between Ayutthaya and Khonkaen by ANOVA.

Variables	Ayutthaya	Khonkaen	p Value
CH ₄ PP (μg·Ckg ⁻¹ ·week ⁻¹)	329.9 ± 956.32	370.37 ± 1061.15	0.19
SOC (%)	1.54 ± 0.68	0.46 ± 0.47	<0.001
ExNH _{4(BI)} (mg·kg ⁻¹)	12.60 ± 0.48	11.23 ± 0.52	<0.001
Sand (%)	21.01 ± 6.03	49.76 ± 6.63	<0.001
1:10 EC _{BI} (mS·m ⁻¹)	13.5 ± 4.25	7.41 ± 4.06	<0.001

The distribution map of predicted CH₄PP and the soil properties as the significant controlling factors of CH₄PP in Ayutthaya and Khonkaen are shown in Figures 7 and 8, respectively. The distribution patterns of CH₄PP corresponded well to that of SOC in both regions (Figure 7a,b and Figure 8a,b), but corresponded less to ExNH_{4(BI)} in Khonkaen than Ayutthaya (Figures 7c and 8c). There was an inverse relationship between 1:10 EC_{BI} and CH₄PP (Figures 7d and 8d), especially in the area of low sand content (Figures 7e and 8e).

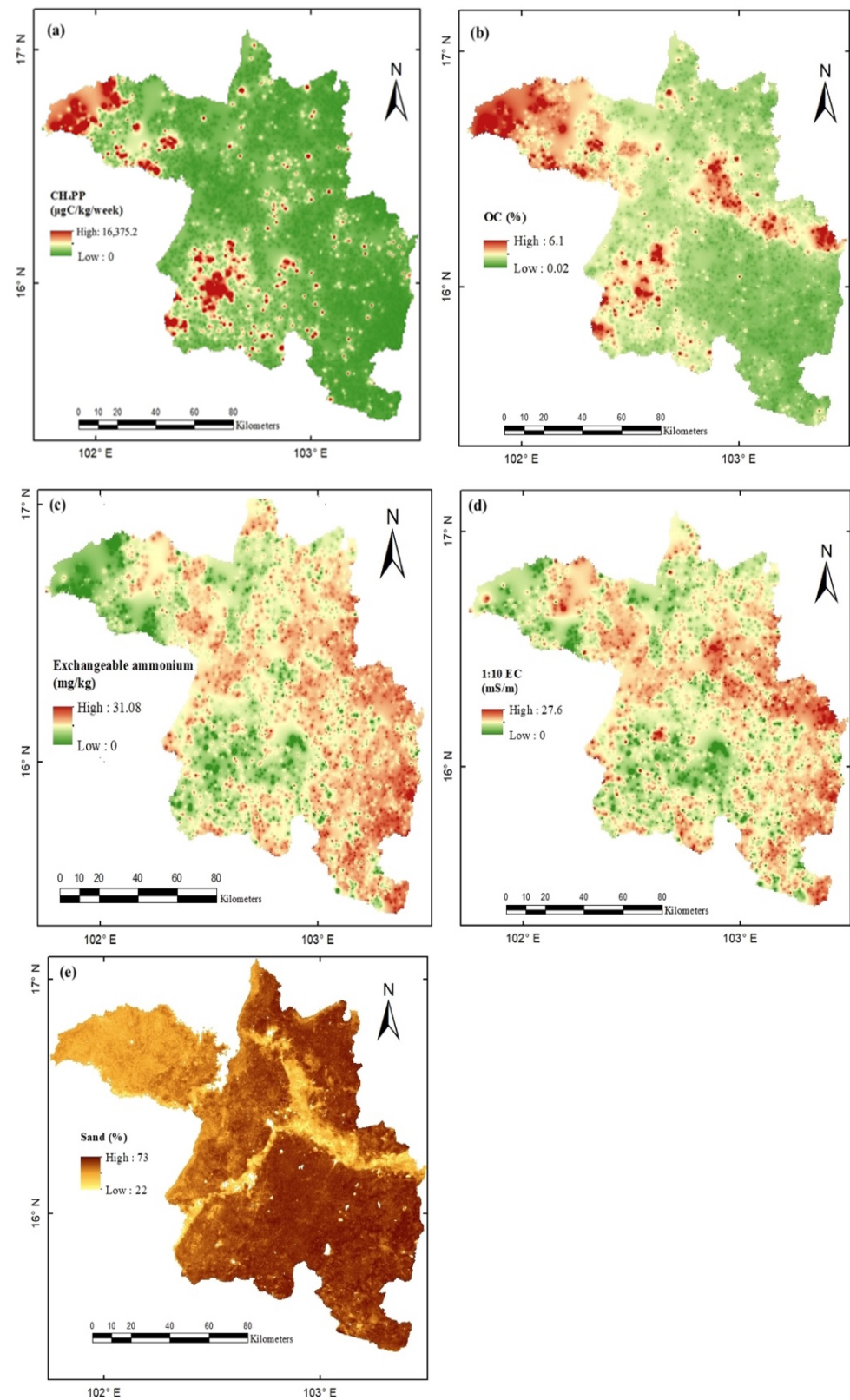


Figure 7. Spatial map of predicted CH₄ production potential (a), soil organic carbon (b), predicted exchangeable ammonium (c), 1:10 predicted electrical conductivity (d), and sand content (e) in Khonkaen province.

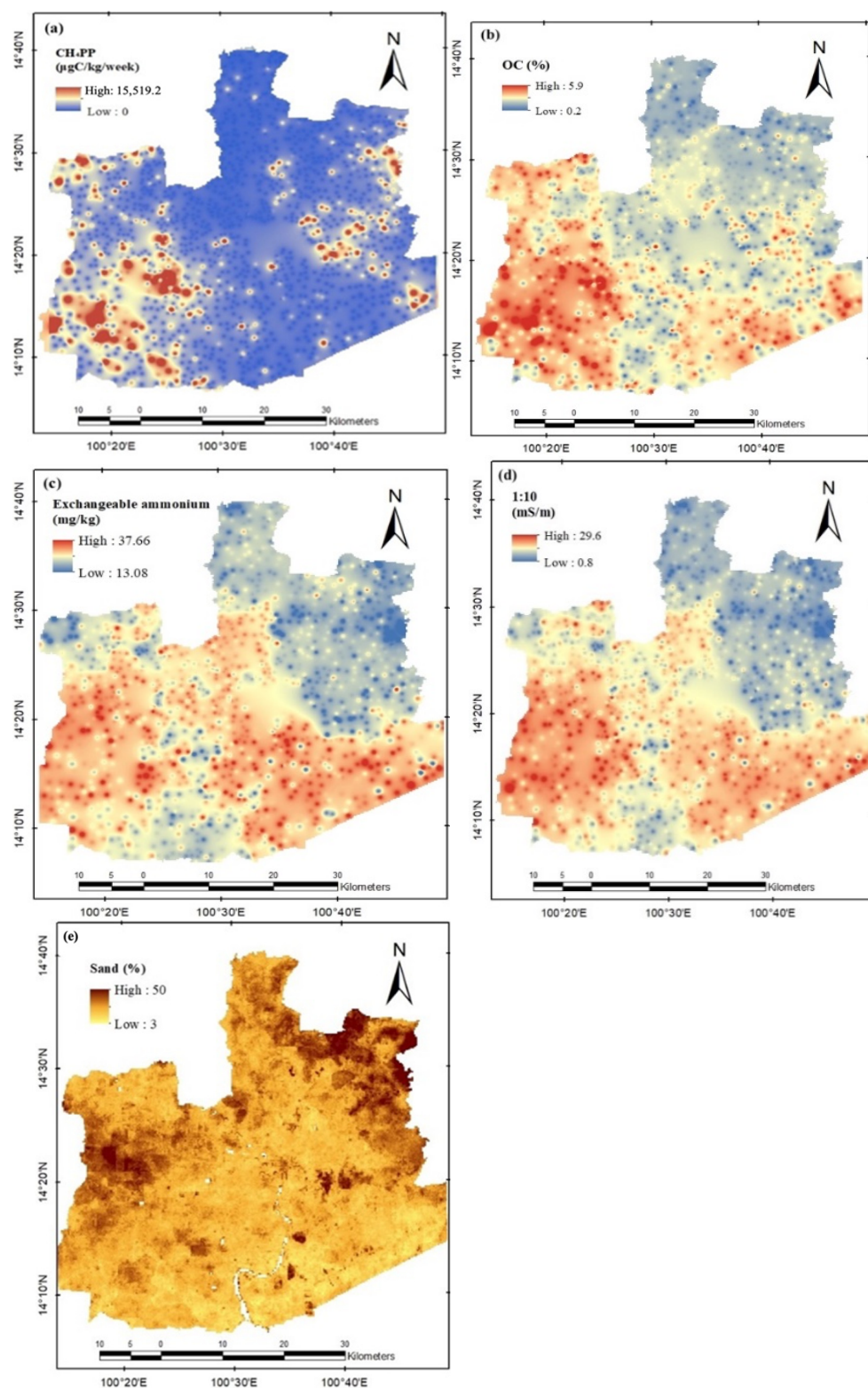


Figure 8. Spatial map of predicted CH₄ production potential (a), soil organic carbon (b), predicted exchangeable ammonium (c), 1:10 predicted electrical conductivity (d), and sand content (e) in Ayutthaya province.

4. Discussion

Sand content has been suggested as a significant factor controlling CH₄ emissions because of the low oxide content [11,27]. However, SOC and other soil properties re-

lated to redox potential have also been reported as significant factors controlling CH₄ emissions [28,29]. In the current study, the mean value of CH₄PP and more than half of the soil properties were statistically higher in Ayutthaya clayey soil than in Khonkaen sandy soil (Figures 4 and 5). Therefore, soil properties is significantly related to CH₄ emission [3]. Soil properties measured before incubation did not correlate with CH₄PP in simple regression (Table S3). A regression equation was obtained by stepwise multiple regression analysis relating CH₄PP to the soil properties (Table 3). In the regression equation, SOC, sand, and ExNH_{4(BI)} contributed positively to CH₄PP, but 1:10 EC_{BI} contributed negatively to CH₄PP (Table 3). Within the soil properties measured after incubation, CH₄PP showed significant negative correlations with 1:10 pH_{AI}, and a significant positive correlation with Fe²⁺ and WSOC (Table 2). These observations are reasonable because the rise in pH indicates the presence of free iron, which suppresses CH₄ production. Increases in WSOC provide evidence of the decomposition of OC, leading to the production of CH₄. Moreover, the incline of Fe²⁺ implies the high reduction of Fe³⁺, which organic carbon is acting as electron donor causing CH₄ production. On average, of the properties 1:10 EC, 1:10 pH, ExNH₄, and anions (PO₄⁻, SO₄²⁻, NO₃⁻, Cl⁻) measured before incubation, 1:10 EC, 1:10 pH, and ExNH₄ increased, but anions decreased after incubation.

The SOC in submerged soil acts as an electron donor in the reduction process, enabling methanogens to generate CH₄ by decomposing SOC [3]. It is well known that direct incorporation of rice straw into paddy field soils increases CH₄ significantly, and the application of cow manure contributes to higher CH₄ emission than inorganic fertilizer only [19,30,31]. Chidthaisong et al. observed the response in CH₄ production under anaerobic incubation to different fertilizer inputs, and found that CH₄ formation was the highest for plots with cow manure, following by rice straw, rice straw with chemical fertilizer, and chemical fertilizer alone [32]. These decomposed organic carbons can not only perform as electron donor to generate CH₄ production, but also can induce Fe²⁺ production which can be speculated from increasing amount of Fe³⁺ reduction [33].

Sass et al. observed CH₄ emissions in paddy fields in a wide range of soil textures and reported that an increase in sand content elevated CH₄ emission in anaerobic conditions [11]. In a comparison of flooded fields of clayey soil and sandy soils with the same organic carbon application, sandy soil emitted more CH₄ than a clayey soil [27]. Following oxygen depletion, when CH₄ is produced, the sequence of electron acceptor use is NO₃⁻, MnO₂, Fe₂O₃, SO₄²⁻ and CO₂, where organic matter acts as the electron donor [9]. Usually, sandy soil has a lower amount of free MnO₂ and Fe₂O₃ as compared to clayey soil [34]. Thus, the reduction process occurs more quickly in sandy soil than in clayey soil. In the current study, CH₄PP was similar between Ayutthaya and Khonkaen, and Fe²⁺ production was not significantly different between Ayutthaya and Khonkaen (Figure 5c), and a higher amount of Mn²⁺ production was shown in Khonkaen than in Ayutthaya (Figure 5d). On the other hand, SO₄²⁻ was reduced more in Ayutthaya than in Khonkaen. Therefore, SO₄²⁻ reduction might be a main suppressor of CH₄PP in this study.

The electrical conductivity of soil water extraction is a significant indicator of water-soluble ion concentrations [35]. In the present study, only SO₄²⁻ correlated significantly with 1:10 EC (Table 2). Figure 9 shows a positive relationship between 1:10 EC_{BI} and SO₄²⁻_{BI} (R² = 0.34, p = 0.00003). As SO₄²⁻ reduction would occur immediately before the production of CH₄ [9], this clearly supports the negative influence that 1:10 EC_{BI} has on CH₄PP as shown in the multiple regression (Table 3). The significant positive relationship between ExNH_{4(BI)} and CH₄PP may be due to NH₄⁺ being the product of organic matter decomposition. This is supported by the significant positive relationship between WSOC and CH₄PP (Table 2).

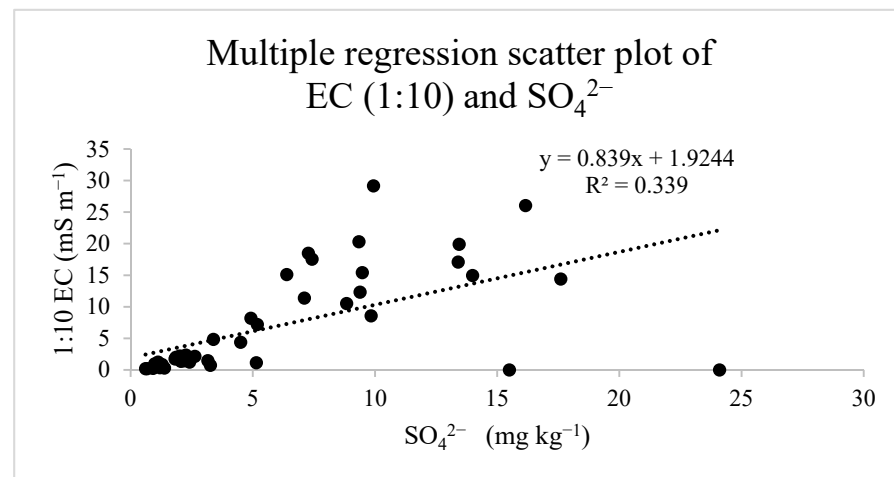


Figure 9. Multiple regression scatter plot between 1:10 EC_{BI} and SO₄²⁻ (BI = before incubation). 1:10 EC = 1:10 electronic conductivity; SO₄²⁻ = Sulfate.

As shown in Figures 7 and 8, the distribution pattern of the predicted CH₄PP was strongly influenced by SOC in Ayutthaya, and sand content in Khonkaen. Higher CH₄PP tended to be shown at higher SOC content in Ayutthaya because it acts as electron donor which supports anaerobic reduction process. A large amount of CH₄PP found in areas with high sand content in Khonkaen indicates that sandy soil that contain lowest free ion among other soils can perform poorly at slowing down the reduction process [11]. Moreover, in Ayutthaya, CH₄PP tended to correspond to ExNH₄, which could be because ExNH₄ is a product of organic matter decomposition which organic matter is an important electron donor in soil anaerobic reduction providing energy for microbial metabolism. Elevated CH₄PP occurred at low 1:10 EC_{BI}, but 1:10 EC_{BI} in Ayutthaya fluctuated more than Khonkaen. This is because 1:10 EC_{BI} was influenced by SO₄²⁻ reduction, one of the reduced substrates in the process indicating that lower electron contained in soil would accelerate soil reduction anaerobically. Ayutthaya soil contained a wide range of SO₄²⁻.

A digital soil map (DSM) attributes soil properties and provides pedological knowledge to users [36]. Pedotransfer functions (PTFs) provide a means of using little soil information to create a meaningful and larger soil data image in DSM. A prediction equation from stepwise regression was determined in the current study, and the result is a form of PTF, but improved, in that it works on the prediction process and simultaneously enables users to learn pedologically fundamental knowledge.

Uncertainty in mapping prediction is a threat and leads to invalid conclusions. To avoid uncertainty, sufficient predictors, and a high density of data points are essential. A reliable regression prediction, which implies a statistically acceptable relationship between predictors and the predicted value, is required [36]. Referring to Table 2 and Figure 3, our study utilized various soil properties as well as sufficient points from the soil database. In addition, using multiple regression (a PTF) as a tool to predict unavailable soil properties in map data with a 99.99% confidence level ($R^2 = 0.50$), with VIF less than 10 at all predictors (Table 3), meant that half of sampling results confidently met the prediction made in the course of this study.

5. Conclusions

This study demonstrated the importance of soil properties on CH₄ emission in Thai paddy fields. The spatial prediction result showed SOC, EC, ExNH₄, and sand content are CH₄ production influential factors in the study area. Moreover, our incubation experiment showed that CH₄ production in this study is influenced by SOC, EC, ExNH₄, sand content, Fe²⁺, SO₄²⁻, and pH. The above interaction of each soil property and CH₄ production can be explained as follows: Because SOC is a derived form of organic matter, the increases in WSOC provides evidence of the decomposition of SOC which is important as it acts

as electron donor in reduction process resulting the production of CH₄. Referring to the role of SOC as electron donor, NH₄⁺ indirectly supports the CH₄ production because it is the product of organic matter decomposition. Furthermore, both CH₄PP and Fe²⁺ were found increasing simultaneously due to the increase of Fe²⁺ which implies the increase of Fe³⁺ reduction rate while additional SOC acting as an extra electron donor acceleratively causing CH₄ production. As sand content has the least iron oxide compared to other soil texture, it, therefore, leads to quick consumption of electron acceptors causing CH₄ production to increase. On the other hand, SO₄²⁻ is one of electron acceptors reduced in reduction process and the reduction of SO₄²⁻ implies the reduction of EC. This means the decrease of EC in soil increases CH₄ production. pH in soil implied the presence of iron oxide in soil. At higher pH, soil would attach more iron oxides which helps delaying reduction process which suppresses CH₄ production. To conclude, soil properties related to reduction reactions, as well as soil texture, are strongly influential in accounting for CH₄PP in the paddy fields in the two regions in Thailand. Further than that, this study showed that the result of the multiple regression analysis exploring the soil properties that controls CH₄ production can be used as a pedotransfer function, which is able to predict a map of regional CH₄ production using the map data sets of soil properties.

Supplementary Materials: The following are available online at <https://www.mdpi.com/article/10.3390/agriculture11050467/s1>, Table S1: Details of reagents used in the study, Table S2: Soil characteristics and analysis method before and after soil incubation, Table S3: Correlation matrix for CH₄ production potential (CH₄PP) and soil properties (before incubation).

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