# Controlling variables and emission factors of methane from global rice fields

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# Abstract

Rice cultivation has long been known as one of the dominant anthropogenic contributors to methane (CH<sub>4</sub>) emissions, yet there is still uncertainty when estimating its emissions at the global/regional scale. An increasing number of rice field measurements have been conducted globally, which allow us to reassess

- 15 the major variables controlling  $CH_4$  emissions and develop region- and country-specific emission factors (EFs). The results of our statistical analysis show that the  $CH_4$  flux from rice fields was closely related to organic amendments, the water regime during and before the rice-growing season, soil properties and agroecological conditions. The average  $CH_4$  flux from fields with single and multiple drainages were 71% and 55% of that from continuously flooded rice fields. The  $CH_4$  flux from fields that were flooded in the
- 20 previous season were 2.4 and 2.7 times that from fields previously drained for a short and long season, respectively. Rice straw applied at 6 t ha<sup>-1</sup> in the preseason can decrease the half amount of CH<sub>4</sub> emission when compared to shortly before rice transplanting. The global default EF was estimated to 1.19 kg CH<sub>4</sub> ha<sup>-1</sup>d<sup>-1</sup> with a 95% confidence interval of 0.80 to 1.76 kg CH<sub>4</sub> ha<sup>-1</sup>d<sup>-1</sup> for continuously flooded rice fields without organic amendment and with a preseason water status of short drainage. The lower EFs were
- 25 found in countries from South Asia (0.85 kg CH<sub>4</sub> ha<sup>-1</sup>d<sup>-1</sup>) and North America (0.65 kg CH<sub>4</sub> ha<sup>-1</sup>d<sup>-1</sup>) relative to other regions, indicative of geographical variations at sub-regional and country levels. We conclude that these default EFs and scaling factors can be used to develop national or regional emission inventories.

## **1** Introduction

- 30 Atmospheric methane (CH<sub>4</sub>) is an important greenhouse gas (GHG), and its global mean concentration has increased by a factor of 2.5 since the pre-industrial era (Dlugokencky et al., 2011). It has long been recognized that rice cultivation is one of the dominant anthropogenic contributors to CH<sub>4</sub> emissions (Ciais et al., 2013; Koyama, 1963). Over the last century, the observed expansion of rice fields was the dominant factor for the increase of global CH<sub>4</sub> emissions from rice cultivation (Fuller et al., 2011; Zhang et al., 2016). Owing to the increasing area of rice grown globally, the increase in CH<sub>4</sub> emission is expected to
- continue in the near future (EPA, 2012; FAO, 2016).

While the total global CH<sub>4</sub> source is relatively well known, the strength of each source component and their trends remain uncertain. Over the last three decades, substantial progress has been made in estimating CH<sub>4</sub> emissions from global rice fields, but large discrepancies in magnitude exist among various studies (range: 20.8 to 170 Tg CH<sub>4</sub> vr<sup>-1</sup>; Cicerone and Oremland, 1988; EPA, 2012; Frankenberg, 40 2005; Neue et al., 1990; Yan et al., 2009). Previous studies have shown that the magnitude of estimated CH<sub>4</sub> emissions from rice cultivation turned out a downward trend, suggesting that the estimated accuracy has been improved. In general, the estimations from top-down approaches (31–112 Tg CH<sub>4</sub> yr<sup>-1</sup>) (IPCC, 2007) were much higher than those from both inventory (25.6–41.7 Tg CH<sub>4</sub> yr<sup>-1</sup>) (EPA, 2012; FAO, 2016; Yan et al., 2009) and bottom-up (18.3–44.9 Tg  $CH_4$  yr<sup>-1</sup>) approaches (Ito and Inatomi, 2012; Spahni 45 et al., 2011; Zhang et al., 2016). These disparities may be the result of the higher estimation of prior information on either rice field distribution or the estimated CH<sub>4</sub> emissions being used in the top-down studies. Furthermore, anthropogenic sources were dominant over natural sources to global CH<sub>4</sub> emissions in the top-down studies, while they were of the same magnitude in the bottom-up models and inventories (Ciais et al., 2013). 50

For national-level reporting of GHG emissions to the United Nations Framework Convention on Climate Change (UNFCCC), a range of methodological approaches was endorsed in IPCC guidelines (i.e., 1996, 2000, 2003, and 2006), which were specified under inventory- (i.e., Tier 1 and Tier 2) or model-based approaches (Tier 3). Accordingly, a range of approaches at various tiers is applied in the UNFCCC GHG dataset, which provides emissions data communicated by member countries (UNFCCC, 2017). At the country level, the inventory-based approach is often used for estimating CH<sub>4</sub> emissions from rice fields. For most countries (i.e., South and Southeast Asian countries), either the Tier 1 or Tier 2 method has been used to compute CH<sub>4</sub> emissions from rice fields in their national communications.

Although the Tier 2 method requires more specific national values, country-specific emission factors (EFs)

- and/or scaling factors (SFs) obtained therein are simply adjusted based on those default values used in the Tier 1 method. In contrast, the Tier 3 method to date has been used by a few countries to estimate CH<sub>4</sub> emissions from rice cultivation in their national GHG inventory reports, including China, the United States, Japan and India (UNFCCC, 2017). Moreover, to estimate the CH<sub>4</sub> emissions from rice fields on a global scale, studies using the IPCC 2006 guidelines showed comparable results (EPA, 2017; FAO, 2016;
- 65 Tubiello et al., 2013; Yan et al., 2009). Thus, these findings indicate that the inventory-based methods are useful in providing a reliable estimate of CH<sub>4</sub> emissions from rice fields.

The net CH<sub>4</sub> flux is determined by both the production from methanogens and the consumption from methanotrophs (Conrad, 2007). Previous studies have shown that CH<sub>4</sub> emissions from rice fields were influenced by water management (Wang et al., 2012; Zou et al., 2005), nitrogen (N) fertilizer use (Banger et al., 2012), organic input (Feng et al., 2013; Wang et al., 2013) and rice varieties (Jiang et al., 2017;

et al., 2012), organic input (Feng et al., 2013; Wang et al., 2013) and rice varieties (Jiang et al., 2017; Watanabe et al., 1995). Using a statistical analysis of a large data set of field measurements, Yan et al. (2005a) revealed that the primary factors that control CH<sub>4</sub> emissions were organic amendments, the agroecological zone, water regimes during and before the rice -growing season and soil properties. These factors have been accounted for in the current IPCC guidelines, where EFs and SFs for CH<sub>4</sub> emissions
75 from rice cultivation were revised accordingly (Lasco et al., 2006).

After more than a decade since Yan et al. (2005a) was published, numerous field measurements in Asian countries have become available. For the rest of the world, many studies to date have investigated the impact of various factors on  $CH_4$  emissions from rice fields, while they were not included in the previous analysis (Yan et al., 2005a). Through an updated analysis, the objectives of this study were therefore (1) to reassess the impacts of major variables controlling  $CH_4$  emissions from rice fields and (2) to develop the region- and country-specific EFs for which sufficient number of measurements were available.

#### 2 Materials and Methods

#### 2.1 Data compilation

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Since 2004, there has been a large body of field measurements of  $CH_4$  emissions from rice fields across the world. With a cut-off date of June 31, 2017, the data set of Yan et al. (2005a) was updated and expanded to include all available observations of  $CH_4$  emissions from rice fields in the world. We conducted a comprehensive search of the literature reporting the field measurements of  $CH_4$  as described previously (Yan et al., 2005a). This included a keyword search using the ISI Web of Science (Thomson

90 Reuters, New York, NY, USA) and Google Scholar (Google, Mountain View, CA, USA). For individual studies, the following documented information was compiled: the average CH<sub>4</sub> flux in the rice-growing season, integrated seasonal emission, the water regime during and before the rice-growing season, the timing, type and amount of organic amendments, soil properties (i.e., SOC and soil pH), location, the agroecological zone, year, duration and season of measurement. As suggested previously (Yan et al., 2005a), hourly or daily flux can be a better index of emission strength than seasonal integrated emission. When the average seasonal CH<sub>4</sub> flux was not directly reported, it was thus estimated from integrated seasonal emissions and the measurement period, and *vice versa*. The raw data were either obtained

directly from tables and texts or extracted by digitizing graphs using the G3DATA software

(http://www.frantz.fi/software/g3data.php).

- As shown in Table 1, the water regime in the rice-growing season was determined as continuous flooding, single drainage, multiple drainage, wet season rainfed, dry season rainfed, or deep water. The preseason water status was classified as flooded, long drainage, short drainage, two drainage. Note that although we tried our best to judge the water status of rice fields from the papers, the water regimes in both the rice-growing season and preseason could still not be determined for some studies; thus, a level
- 105 of 'unknown' was assigned. For organic amendments, the materials used in the original papers were classified as compost, farmyard manure, green manure or straw. The timing of rice straw application was distinguished as on-season or off-season. The amount of organic amendment was recorded directly from the original papers with dry weight for straw and fresh weight for other materials. To account for the spatial variability of CH<sub>4</sub> emissions on the global scale, experimental sites were classified into different
- 110 zones based on their climatic conditions. On the basis of temperature and rainfall differences, rice fields in Asia were placed into seven agroecological zones (AEZs 1-3 and 5-8) in the FAO zoning system (IRRI, 2002). Rice fields from regions of Latin America, Europe and the United States were grouped into three zones.

Because of the limited availability of information on other properties, only SOC and soil pH as 115 continuous variables were included in our data set. If soil organic matter content rather than SOC was reported, it was converted to SOC using a Bemmelen index value of 0.58. In order to meet the requirement of the statistical model, we excluded these measurements with the absence of available information for these three continuous variables (SOC, soil pH and the amount of organic amendment). Thus, the final data set included 1089 measurements, from 122 rice fields across the world, that were used in our analysis.

120 In this data set, measurements from Asian rice fields increased from 554 (Yan et al., 2005a) to 942, and 147 from the other regions of the world were newly added (Data set S1, Figure 1).

# 2.2 The statistical model for controlling factors

The CH<sub>4</sub> emission data sets did not arise from systematically designed experimental results; rather, we used them because they were available. It has been suggested that a linear mixed model is suitable for analyzing unbalanced data, that is, data having unequal numbers of observations in the subclasses (Speed et al., 2013). For example, Bouwman et al. (2002) and Yan et al. (2005b) used a linear mixed model to analyze log-transformed data of nitrogenous gas emissions from both agricultural and global soils, respectively. The data set of this study is of this nature, therefore, in line with our previous study (Yan et al., 2005a), a linear mixed model is thus used to explore the effect of controlling variables on CH<sub>4</sub> flux

130 from rice fields. Fluxes of CH<sub>4</sub> do not fit a normal distribution, they fit a log-normal distribution. The linear model was used to analyze the log-transformed data of CH<sub>4</sub> flux as follows:

$$\ln(flux) = constant + a \times \ln(SOC) + pH_h + PW_i + WR_j + AEZ_k + OM_l \times \ln(1 + AOM_l),$$
(1)

where *flux* is the average CH<sub>4</sub> flux (mg CH<sub>4</sub> m<sup>-2</sup>h<sup>-1</sup>) during the rice-growing season; *SOC* and *a* represent
the SOC content (%) and its effect, respectively; *pH<sub>h</sub>* is the effect of soil pH which was treated as a categorical variable and grouped into the following classes (*h*): <4.5, 4.5-5.0, 5.0-5.5, 5.5-6.0, 6.0-6.5, 6.5-7.0, 7.0-7.5, 7.5-8.0 and ≥8.0; *PW<sub>i</sub>* is the effect of the preseason water status (*i* is flooded, long drainage, short drainage, double drainage, or unknown); *WR<sub>j</sub>* is the effect of the water regime in the rice-growing season (*j* is continuous flooding, single drainage, multiple drainage, wet season rainfed, dry
season rainfed, deepwater, or unknown); *AEZ<sub>k</sub>* is the effect of the agroecological zone; *OM<sub>l</sub>* is the effect of added organic materials (*l* is compost, farmyard manure, green manure, rice straw used on-season, or

rice straw used off-season); and  $AOM_l$  is the amount of the corresponding organic material added in t ha<sup>-1</sup>. These variables are described in detail in Table 1.

The last part of Eqn. (1) reflects the effect of organic amendments on the CH<sub>4</sub> flux from rice fields,
which is an interaction of the type and amount of organic materials used. In cases where the amount of organic amendment is zero in the analysis, it is assumed to be the result of each type of organic material

at zero application rate. Obviously, this assumption will result in more data points in the analysis than there were in real observations. To ameliorate this problem, the residuals of observations were weighted with organic amendments as 1 and those without as 0.2 (as the observational result was repeated five times for

- 150 the five types of organic materials). The effects of the controlling variables on the CH<sub>4</sub> flux were computed by fitting Eqn. (1) to field observations using the SPSS Mixed Model procedure (version 24.0, SPSS Inc., Chicago, IL, USA).
  - 2.3 Developing global and region-/country-specific emission factors
- The estimated effects of various variables were used to derive a default EF. In the model, the CH<sub>4</sub> emissions from rice fields are a combination of the effects of SOC and soil pH, preseason water status, the water regime in the rice-growing season, organic amendments and the agroecological conditions. An assumption was made to provide a default EF, that is, all observations in the data set have a water regime of continuous flooding, a preseason water status of short drainage and no organic amendments, while keeping other conditions as stated in the original papers. Then, we derived a default EF (kg CH<sub>4</sub> ha<sup>-1</sup>d<sup>-1</sup>)
- 160 for continuously flooded rice fields with a preseason water status of short drainage and without organic amendments using Eqn. (2):

$$EF = e^{constant} \times \left(\frac{1}{n} \sum_{i=1}^{n} SOC_{i}^{a} \times e^{pH_{i}} \times e^{AEZ_{i}}\right) \times e^{PW_{short\,draiange}} \times e^{WR_{continuous\,flooding}} \times 24/100$$
(2)

where '*constant*' and '*a*' are the values estimated in Eqn. (1), *n* is the total number of observations in the 165 data set,  $pH_i$  and  $AEZ_i$  are the effects of pH and agroecological zone of the *i*th observation, respectively, and  $PW_{short\ drainage}$  and  $WR_{continuous\ flooding}$  are the effects of preseason short drainage and continuous flooding in the rice season, respectively.

In the 2006 IPCC guidelines, the Tier 1 method is meant to be applied to countries in which CH<sub>4</sub> emissions from rice cultivation are not a key category or for which country-specific EFs do not exist

170 (Lasco et al., 2006). Thus, in the Tier 2 method the use of country-specific EFs is encouraged. To take advantage of the estimated effects of various variables at the global level, region- or country-specific EFs can be developed for some regions where sufficient number of CH<sub>4</sub> emission measurements from rice fields to date are available.

## **3** Results and Discussion

#### 175 3.1 The advantages of the statistical model

An advantage of this linear mixed model is that it can handle many variables together, and makes use of the large number of unsystematic field measurements (Jørgensen and Fath, 2001; Yan et al., 2005a). The results of our previous modeling analysis (Yan et al., 2005a) have been adopted by the 2006 IPCC guidelines as the inventory-based (i.e., Tier 1 and 2 methods) approaches in which a baseline default EF 180 and various SFs were estimated (Lasco et al., 2006). Moreover, the results of Yan et al. (2009) suggest that the estimated global CH<sub>4</sub> inventory from rice cultivation using the 2006 IPCC guidelines was comparable to other estimations (Tubiello et al., 2013; EDGAR, 2017). Although empirical or mechanistic models are also encouraged to be used for estimating CH<sub>4</sub> emissions during rice cultivation, only a few countries such as China (CH4MOD) (Huang et al., 2004), the United States (DAYCENT) (Cheng et al., 2014) and Japan (DNDC-Rice) (Katayanagi et al., 2016) used this approach in their 185 submitted national communications to the Conference of the Parties (UNFCCC, 2017). For most countries, either the default or country-specific EFs (if available) are used to develop their national inventories of CH<sub>4</sub> emissions from rice fields. Thus, it is still necessary to develop a global default or region-/countryspecific EFs with statistical modeling.

190 The variables considered in the present model were SOC, soil pH, the preseason water status, water regime in the rice-growing season, organic amendments and the agroecological conditions (Table 2). Although the CH<sub>4</sub> emissions from rice fields can also be influenced by many other factors such as other soil properties, N fertilization, and the rice cultivar (Aulakh et al., 2001; Banger et al., 2012; Conrad, 2007), those factors were not considered here because either contradictory reports on their effects or very limited information on the variables per se are available. For instance, to date there is no single consensus 195 on the impacts of N fertilization on CH<sub>4</sub> emissions from rice fields. It is likely attributed to the highly complex nature of the effect of N fertilizer on CH<sub>4</sub> emissions, which can strongly interact with other factors such as the amount and type of N fertilizer and the water regime (Schimel, 2000; Banger et al., 2012). Furthermore, very few countries (i.e., Indonesia) considered the effects of soil type and rice cultivar on CH<sub>4</sub> emissions from rice fields in their national communications. There is also large inter-200 annual variability in the CH<sub>4</sub> flux (Shang et al., 2011; Wang et al., 2012), which cannot be reflected in the current model. Nevertheless, the selected variables in the current model can account for 50% of the

variability in CH<sub>4</sub> emissions on the global scale.

#### 3.2 Effects of controlling variables

- At the global scale, SOC and soil pH were the soil properties controlling CH<sub>4</sub> emissions from rice fields, while the contribution of SOC to the variance was the smallest among all variables considered here ( $F_{(1, 3391)} = 39.8$ , P < 0.0001; Table 2). This finding may indicate that the controlling effect of SOC on CH<sub>4</sub> emissions from rice fields on a global scale may be outweighed by other variables (i.e., organic amendments). For example, although a recent synthesis by Banger et al. (2012) showed a positive but
- 210 weaker ( $R^2 = 0.21$ ) relationship between the SOC content and the CH<sub>4</sub> flux, they did not consider CH<sub>4</sub> emissions from rice fields with organic amendments. Furthermore, in a Chinese double rice-cropping system, the long-term (*c*. 11 yr) organic amendment-induced increase in SOC may be responsible for the observed significant correlation between SOC and CH<sub>4</sub> emissions (Shang et al., 2011). Previous studies have also suggested that the content of readily mineralizable carbon rather than SOC was significantly
- 215 correlated with CH<sub>4</sub> emissions from rice fields (Yagi and Minami, 1990). Thus, we believe that a weak relationship between SOC and CH<sub>4</sub> emissions at the global scale can be largely attributed to the fact that the dominant factors controlling CH<sub>4</sub> emissions are labile C substrates derived from inherent and exogenous sources (Wang et al., 2013; Yagi and Minami, 1990).

The effect of soil pH on controlling CH<sub>4</sub> emission from rice fields was not monotonic ( $F_{(8, 3391)}$  = 220 75.3, P < 0.0001; Table 2), which was consistent with the previous results (Yan et al., 2005a). It is often accepted that  $CH_4$  production under anoxic conditions is very sensitive to variations in soil pH, as the activity of methanogens is usually optimum around neutrality or under slightly alkaline conditions (Aulakh et al., 2001; Garcia et al., 2000). However, soils with a pH of 5.0-5.5 showed much higher emissions than other soils, which corroborates the observed relationship between soil pH and CH<sub>4</sub> emissions in Indonesian rice fields (Yan et al., 2003). The largest effects of soil pH below 4.5 may not be 225 reliable because of limited observations from only two studies with distinct water regimes, soil properties and organic amendments. Given that methanogens and methanotrophs are tolerant to pH variations in soil (Dunfield et al., 1993), and CH<sub>4</sub> emission is the result of its production, consumption and transfer in soil to the atmosphere (Conrad, 2007), we suppose that it is not soil pH itself, but some other soil properties or microbial activities correlated with soil pH that control these processes. Thus, we conclude that such 230 correlation between soil pH and CH<sub>4</sub> emission at the global scale may be reasonable.

As expected, water regime in the rice-growing season was a main factor controlling CH<sub>4</sub> emissions from rice fields ( $F_{(6, 3391)} = 80.5$ , P < 0.0001; Table 2). Relative to continuous flooding, the average

seasonal CH<sub>4</sub> flux in the rice-growing season can be reduced by 29% and 45% by single and multiple

- 235 drainage, respectively (Table 3). In the updated data set, the magnitude of reducing CH<sub>4</sub> emissions following single drainage was smaller than in previous results (Yan et al., 2005a). This may be due not only to *c*. 3-fold increment of available observations (Data set S1) but also to the inevitable confusion in identifying the water regime from different studies. The average CH<sub>4</sub> fluxes from wet-season and dryseason rainfed rice fields were 54% and 16%, respectively, of that from continuously flooded fields, lower
- than the IPCC values of 80% and 40% for flood-prone rainfed and drought-prone rainfed rice fields, respectively (IPCC, 1997). Compared with the previous results (Yan et al., 2005a), the greater average CH<sub>4</sub> flux from wet-season rice fields was mainly attributed to the observed high fluxes from rainfed rice fields in Thailand and India (Kaewpradit et al., 2008; Kantachote et al., 2016; Rath et al., 1999). However, the CH<sub>4</sub> flux from deep water rice, only 6% of that from continuously flooded rice fields, remained less
  reliable due to the lack of sufficient observational data in the current analysis.

This statistical model clearly identified the effects of preseason water status on CH<sub>4</sub> emissions in the rice-growing season ( $F_{(4, 3391)} = 94.9$ , P < 0.0001; Table 2). A negative correlation was found between CH<sub>4</sub> emissions and the drainage period before the rice season, such that the average CH<sub>4</sub> flux from a rice field that was flooded in the previous season was 2.4–4.1 times as high as that from fields that experienced different durations of drained season (Table 3). As shown in Table 1, the preseason water status was determined mainly by the crop rotation system, except in rice fields that are flooded during the fallow season. This effect of preseason water conditions can explain some of the regional and seasonal differences of CH<sub>4</sub> emissions from rice fields and suggested that crop rotation of rice and upland crops have the potential to mitigate CH<sub>4</sub> emissions from rice fields.

- Among all the selected variables, the effect of organic amendments was the largest ( $F_{(5, 3391)} = 181.5$ , P < 0.0001), suggesting that the use of organic materials is the main variable controlling CH<sub>4</sub> emissions from rice fields. Among all the organic materials, straw used on-season showed the strongest stimulating effect on CH<sub>4</sub> emissions, followed by green manure. Such a difference may be attributed not only to the decomposition but also to the different moisture contents of organic materials recorded in the literature (Table 1). If rice straw was applied at a rate of 6 t ha<sup>-1</sup> (dry weight) before rice transplanting, the CH<sub>4</sub>
- emissions were 3.2 times that from fields without any organic amendment (Figure 2). However, when this amount of rice straw was incorporated into the soil immediately after harvest in the previous year and left unflooded, the stimulating effect on CH<sub>4</sub> emissions was only 1.6 times. This indicates that straw

applied off-season was an effective way to reduce CH<sub>4</sub> emissions from rice fields. The stimulating effects of compost and farmvard manure were comparable to that of rice straw applied off-season. 265

Although the agroecological zones affected CH<sub>4</sub> emission significantly ( $F_{(9,3391)} = 52.4, P < 0.0001$ ), their contribution to the variance was smaller than other factors considered in the model. This was probably because the model considered soil properties and the water regime during and before the ricegrowing season, which partially reflected the effect of agroecological conditions. As shown in Table 2,

the highest effect of AEZ 1 with extremely large variability was still unreliable, because there was no 270 new data added in our data set. The higher CH<sub>4</sub> emissions can be identified clearly for AEZ 2 and 6 and Europe as the 95% confidence intervals of their effects did not overlap with others.

# 3.3 Region- or country-specific emission factors

- Globally, for continuously flooded rice fields with the preseason water status of short drainage without organic amendment, the EF was estimated to be 1.19 kg  $CH_4$  ha<sup>-1</sup>d<sup>-1</sup> with an error range of 0.80-1.76 kg 275  $CH_4$  ha<sup>-1</sup>d<sup>-1</sup> (Table 4). We find that our estimate is lower and has relatively small variation when compared with the latest IPCC default EF (mean: 1.30 CH<sub>4</sub> ha<sup>-1</sup>d<sup>-1</sup>, error range: 0.80-2.20 kg CH<sub>4</sub> ha<sup>-1</sup>d<sup>-1</sup>) (Lasco et al., 2006; Yan et al., 2005a). Such a difference could be mainly attributed to the number of field measurements in the present data set, approximately two times greater than in the previous study. As shown in Table 4, we estimated the region- or country-specific EFs for which sufficient number of CH<sub>4</sub> 280 emission measurements from rice fields were available.

East Asia Approximately 90% of the world's rice fields are located in Asia, of which 23% occur in East Asia (FAO, 2016). In our data set, about half of CH<sub>4</sub> emission measurements were compiled from this region (Figure 1; Data set S1). The region-specific EF for East Asia is estimated to 1.32 kg  $CH_4$  ha<sup>-1</sup>d<sup>-1</sup>, and there were differences in the country-specific EF in the order of South Korea > China > Japan (Table 285 4). For China, as the largest rice producer in the world, there is a growing body of CH<sub>4</sub> emission measurements from rice fields since the late 1980s (Figure 1). We collated 388 field observations conducted on more than 40 sites in China, which allowed us to make a relatively reliable estimate of the country-specific EF. Although the EF of 1.30 kg CH<sub>4</sub> ha<sup>-1</sup>d<sup>-1</sup> (error range: 0.88-1.93 kg CH<sub>4</sub> ha<sup>-1</sup>d<sup>-1</sup>) is the same as the latest IPCC default EF, its variability is smaller than the latter one with an error range of 290  $0.80-2.20 \text{ kg CH}_4 \text{ ha}^{-1} \text{d}^{-1}$  as noted above (Lasco et al., 2006). This was supported by the evidence that the CH<sub>4</sub> emissions from Chinese rice fields estimated using the Tier 1 method in the 2006 IPCC guidelines

or country-specific EF were almost identical (7.22-8.64 Tg yr<sup>-1</sup>) (Yan et al., 2003, 2009). Even though the estimate of CH<sub>4</sub> emission is beyond the scope of this study, we believe, to some extent, that developing

and using the country-specific EF should be a promising approach for national CH<sub>4</sub> inventory. For example, using the process-based model (CH4MOD) and empirical methods to account for different EFs in various rice ecosystems, CH<sub>4</sub> emissions from rice cultivation in year 2012 were estimated to be 8.46 Tg yr<sup>-1</sup> in China's First Biennial Update Report (BUR) to its National Communications (NDRC of China, 2016). These estimates accounting for various EFs under different conditions, fall into the range of 4.98-300 14.19 Tg yr<sup>-1</sup> from other reports (EDGAR, 2017; EPA, 2017; FAO, 2016).

In the latest National Communication under the Convention of Japan, country-specific EFs for rice fields under different water regimes during the rice-growing season were estimated using the DNDC-Rice model (Katayanagi et al., 2016; MoE of Japan, 2017). For comparison, the length of the single rice season in East Asia was assumed to be 130 days (Yan et al., 2005a), and we found that our estimate (1.06 kg CH<sub>4</sub> ha<sup>-1</sup>d<sup>-1</sup>, error range: 0.72-1.56 kg CH<sub>4</sub> ha<sup>-1</sup>d<sup>-1</sup>) falls into a range of the model-derived EF ranging from 0.06 to 1.79 kg CH<sub>4</sub> ha<sup>-1</sup>d<sup>-1</sup> for continuously flooded rice fields without organic amendment across Japan (Katayanagi et al., 2016). Likewise, using the Tier 1 method Yan et al. (2009) estimated the CH<sub>4</sub> emission in year 2000 from Japanese rice fields to be 407 Tg yr<sup>-1</sup>, which was lower than the 510 Tg yr<sup>-1</sup> in their latest report (MoE of Japan, 2017). We argued that such a discrepancy may be primarily related to different classifications for intermittently flooded (i.e., single drainage vs. multiple drainage) and type and amount of organic amendments used in their estimations. As such, we believe that when reliable information regarding water management and organic amendment becomes available, there is still merit

in using the current country-specific EF for national CH<sub>4</sub> emission from rice cultivation. Additionally, it could be the case for South Korea, because CH<sub>4</sub> emission estimate using the Tier 1 method appears
comparable to that of their National Communications (Yan et al., 2009).

South Asia The rice harvest area of countries in South Asia accounts for 42% of the Asian total rice harvest for the year 2010 (FAO, 2016). India is currently thought to have the second largest  $CH_4$  emissions from rice cultivation in the world. In the present study, the estimated EF of  $CH_4$  from Indian rice fields was 0.85 kg  $CH_4$  ha<sup>-1</sup>d<sup>-1</sup> (error range: 0.57-1.25 kg  $CH_4$  ha<sup>-1</sup>d<sup>-1</sup>). We find that our estimate agrees with

320 the overall average of  $0.59 \pm 0.35$  kg CH<sub>4</sub> ha<sup>-1</sup>d<sup>-1</sup> ( $\pm$  standard deviation, the length of the rice season was assumed to be 125 days), which was used for the CH<sub>4</sub> emission inventory from Indian rice cultivation (MoEFCC of India, 2015). Interestingly, if the SFs (Table 3) were applied for subcategories of water regime during the rice-growing season as in the Tier 1 method (Lasco et al., 2006), our estimates for irrigated rice fields were almost identical to those of Manjunath et al. (2009), which have been

- 325 consistently used in their national CH<sub>4</sub> inventory. By contrast, the values for rainfed and deep water fields were greatly underestimated. This discrepency is primarily because peer-reviewed studies from India were only considered in our current data set, while 471 observations collected from farmers' fields over India were used by Manjunath et al. (2009). The aforementioned limited data points from wet and dryseason rainfed rice fields may also lead to biased estimates, despite the fact that approximately about half
- 330 of rice cultivation is under rainfed conditions in India's first BUR. Therefore, further available observations of CH<sub>4</sub> emissions from rainfed and deep water rice fields are required to improve the statistical estimates.

For Bangladesh, albeit based on one study, the estimated EF (0.97 kg CH<sub>4</sub> ha<sup>-1</sup>d<sup>-1</sup>) of CH<sub>4</sub> emission from rice fields became available forthe first time. Previous studies often used an EF value from neighboring countries for CH<sub>4</sub> emission estimates from rice cultivation (FAO, 2016; Manjunath et al., 2014; Yan et al., 2003, 2009). Interestingly, our estimate was similar to the seasonally integrated EF value of 10 g CH<sub>4</sub> m<sup>-2</sup> used in their national communications (MoEF of Bangladesh, 2012) or other reports (FAO, 2016). Furthermore, previous studies have shown that the national CH<sub>4</sub> estimates were comparable when using the EF from their neighboring countries (Manjunath et al., 2014; Yan et al., 2009). Thus,
either the region (0.85 kg CH<sub>4</sub> ha<sup>-1</sup>d<sup>-1</sup>) or these country-specific EFs could be used for CH<sub>4</sub> emission estimates from the rest of the countries of South Asia, *viz.*, Pakistan, Sir Lanka and Nepal where direct measurements to date were not available or insufficient (Table 4).

Southeast Asia In Southeast Asia, the total CH<sub>4</sub> emission from rice cultivation accounted for 21.5% of the world total (Yan et al., 2009). The EF of 1.22 kg CH<sub>4</sub> ha<sup>-1</sup>d<sup>-1</sup> for this region was close to the global default value but differed among countries (Table 4). Country-specific EFs (kg CH<sub>4</sub> ha<sup>-1</sup>d<sup>-1</sup>) for each country were estimated to be *viz*. Indonesia (1.18), the Philippines (0.60) and Viet Nam (1.13). For Indonesia, an EF with an average of 160.9 kg CH<sub>4</sub> ha<sup>-1</sup>season<sup>-1</sup> was used for CH<sub>4</sub> inventory from rice cultivation, despite the existence of large variation in field measurements (6.7-798.6 kg CH<sub>4</sub> ha<sup>-1</sup>season<sup>-1</sup>) (MoEF of Indonesia, 2015). Given that the length of the rice season in Southeast Asian countries varies

from 99 to 115 days, our estimate was close to the default EF used in their first BUR (MoEF of Indonesia, 2015). For the Philippines, our estimate was much lower than 3.46 kg  $CH_4$  ha<sup>-1</sup>d<sup>-1</sup> estimated by Yan *et al.* (2003) based on observations from only two sites. Using the Tier 1 method in the 2006 IPCC guidelines,

Yan et al. (2009) found the estimates of  $CH_4$  emission from rice fields in the Philippines and Viet Nam agreed reasonably well with the values reported in their National Communications. The larger EFs

355 estimated for Thailand and Cambodia (data not shown) had big uncertainties because they were essentially developed from very limited observations.

*Americas* Rice cultivation in Brazil and the United States accounts for approximately 60% of the total in the Americas (FAO, 2016). In our data set, there were only three countries from this region that had available measurements which allowed us to make country-specific EF estimates (Table 4). The country-specific EFs were estimated to be 0.65, 1.62 and 0.80 kg CH<sub>4</sub> ha<sup>-1</sup>d<sup>-1</sup> for the United States, Brazil and Uruguay, respectively. By contrast, the assigned values of the seasonally integrated EF for the corresponding countries were 35, 6.5 and 28 g CH<sub>4</sub> m<sup>-2</sup> in the FAOSTAT emission database (FAO, 2016). Using the IPCC Tier 1 method, the CH<sub>4</sub> emission estimate for these countries tends to be lower than that of their national inventory reports (NIRs), suggesting the importance of the country-specific EFs since
differential conditions for rice cultivation being considered. For example, in the United States' latest NIR, there was an approximately 25% increase in CH<sub>4</sub> emission from rice cultivation relative to the previous estimates (EPA, 2017). This change could be the result of unified continuous flooding in the rice season and the impact of winter flooding considered in the IPCC Tier 3 method (DAYCENT model). Thus, the

370 different assumptions made for water regimes in rice cultivation (Yan et al., 2009). Nevertheless, our results should be treated with caution, because very limited observations are available for these countries.

underestimated CH<sub>4</sub> emission using the IPCC Tier 1 method for United States can be explained by

*Europe* As the major rice cultivating countries in Europe, the country-specific EFs for Italy and Spain were estimated to be 1.66 and 1.13 kg CH<sub>4</sub> ha<sup>-1</sup>d<sup>-1</sup>, respectively (Table 4). However, a seasonally integrated EF of 50.4 g CH<sub>4</sub> m<sup>-2</sup> was assigned for these two countries in the FAOSTAT emission database (FAO, 2016), which was far higher than our estimates as well the values used in their NIRs. In the Italy's NIR (National Inventory Report of Italy, 2017), the EFs for continuously flooded fields without organic amendments for single and multiple drainage were 2.0 and 2.7 kg CH<sub>4</sub> ha<sup>-1</sup>d<sup>-1</sup>, respectively. It is interesting to note that these values contradict our expectation that the CH<sub>4</sub> emission should be lower from rice fields with multiple compared to single drainage (Table 3). A possible reason for this was that

380 they were based on experimental measurements from different rice field studies in Italy (Leip et al., 2002; Meijide et al., 2011). In the latest NIR of Spain (National Inventory Report of Spain, 2017), the global default EF (1.30 kg  $CH_4$  ha<sup>-1</sup>d<sup>-1</sup>) is used for  $CH_4$  emission estimate from rice cultivation, which is close to our estimate.

# **4** Conclusions

- 385 Through extending the database of CH<sub>4</sub> emission from global rice fields, we present the update of the findings of Yan et al. (2005a). In the statistical model those selected variables that had significant effects on CH<sub>4</sub> emission from global rice fields agree well with results of the previous analysis. In the updated data set, the estimated values of default EF and SFs have changed in some cases; for instance, the average CH<sub>4</sub> fluxes from rice fields with single drainage was 71% rather than 58% of that from continuously
- 390 flooded rice fields. More importantly, not only the global default EF was updated but also the region- or country-specific EFs were for the first time developed for countries where sufficient number of CH<sub>4</sub> emission measurements from rice fields were available. Overall, these default EFs and SFs for different water regimes and organic amendments can be used to develop national or regional emission inventories.

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Figure 1. Global distribution of field experiments measuring the  $CH_4$  flux from rice fields. The circle and triangle indicate experimental sites newly added in this study and included in Yan et al. (2005a), respectively.



Figure 2. Simulated effect of different organic amendments on  $CH_4$  emissions from rice fields. The  $CH_4$ 





Variables	Description
Preseason water status	<u>۵</u>
Flooded	Permanently flooded rice fields are assumed to have a preseason water regime of 'flooded'. Late
	rice in China is usually planted immediately after early rice on the same field and is therefore
	regarded as having a preseason water regime of 'flooded'.
Long drainage	If rice is planted once a year and the field is not flooded in the non-rice growing season, the
	preseason water regime is classified as long drainage.
Short drainage	Rice is planted more than once a year, but there is more than one month fallow time between the
	two seasons, short drainage is usually taken as preseason drainage.
Two drainage	For measurements conducted on rice fields that are preceded by two upland crops or an upland
	crop and a drained fallow season, the preseason water of such experiments is classified as two
	drainage.
Water regime in the rice-	growing season
Continuous flooding	Rice is cultivated under continuously flooded condition but sometimes an end-season drainage
	before rice harvest included.
Single drainage	One mid-season drainage and an end-season drainage are adopted over the entire rice-growing
	season.
Multiple drainage	It refers to the water regime is called 'intermittent irrigation' but the number of drainages was not
	clear. Alternate wetting and drying (AWD) is included in multiple drainage.
Rainfed, wet season	Rice cultivation rely on rainfall for water, in this case the field is flood prone during the rice-
	growing season.
Rainfed, dry season	Rice cultivation rely on rainfall for water, in this case the field is drought prone during the rice-
	growing season.
Deep water	Rice grown in flooded conditions with water depth more than 50 cm deep.
Organic amendment	

# Table 1. Description of the selected variables controlling the CH<sub>4</sub> emission from rice fields

Straw on-season	Straw applied just before rice transplanting as on-season; straw that is left on the soil surface in						
	the fallow season and incorporated into the soil before the next rice transplanting is also						
categorized as on-season. The amount of straw return is expressed in dry weight.							
Straw off-season	Straw incorporated into soils in the previous season (upland crop or fallow) is categorized as off-						
	season. The amount of straw return is expressed in dry weight.						
Compost, farmyard							
manure, green manure	The amount of organic materials is expressed in fresh weight.						
Agroecological zone							
AEZ 1	Warm arid and semiarid tropics						
AEZ 2	Warm subhumid tropics						
AEZ 3	Warm humid tropics						
AEZ 5	Warm arid and semiarid subtropics with summer rainfall						
AEZ 6	Warm subhumid subtropics with summer rainfall						
AEZ 7	Warm/cool humid subtropics with summer rainfall						
AEZ 8	Cool subtropics with summer rainfall						

						95% confidence interval	
Effect	Estimate	Standard error	df	<i>t</i> -value	P-value	Lower	Upper
Constant	-0.478	0.171	3391	-2.79	0.005	-0.814	-0.142
$\mathrm{SOC}^a$	0.190	0.030	3391	6.31	0.000	0.131	0.249
рН							
< 4.5	2.045	0.210	3391	9.75	0.000	1.634	2.456
4.5-5.0	1.124	0.106	3391	10.60	0.000	0.916	1.332
5.0-5.5	1.299	0.094	3391	13.88	0.000	1.116	1.483
5.5-6.0	0.825	0.091	3391	9.09	0.000	0.647	1.004
6.0-6.5	0.312	0.084	3391	3.69	0.000	0.146	0.477
6.5-7.0	0.151	0.088	3391	1.73	0.085	-0.021	0.323
7.0-7.5	0.181	0.097	3391	1.86	0.063	-0.010	0.372
7.5-8.0	0.099	0.093	3391	1.07	0.285	-0.083	0.280
$\geq 8.0$	$0^d$						
Preseason water status							
Flooded	0.763	0.064	3391	11.94	0.000	0.638	0.888
Long drainage	-0.228	0.054	3391	-4.20	0.000	-0.335	-0.122
Short drainage	-0.116	0.061	3391	-1.90	0.058	-0.237	0.004
Two drainages	-0.648	0.184	3391	-3.52	0.000	-1.008	-0.287
Unknown	$0^d$						
Water regime							
Continuous flooding	0.851	0.138	3391	6.16	0.000	0.580	1.122
Deepwater	-1.897	0.309	3391	-6.14	0.000	-2.503	-1.291
Multiple drainage	0.247	0.142	3391	1.74	0.082	-0.032	0.525
Single drainage	0.505	0.147	3391	3.45	0.001	0.218	0.793
Rainfed, wet season	0.236	0.161	3391	1.46	0.144	-0.081	0.552
Rainfed, dry season	-0.972	0.199	3391	-4.89	0.000	-1.361	-0.582
Unknown	$0^{a}$						

**Table 2.** Statistical results for fixed effects obtained by fitting the model to the observed log-transformed  $CH_4$  fluxes (mg  $CH_4$  m<sup>-2</sup>h<sup>-1</sup>)

Organic amendment							
Compost	0.218	0.047	3391	4.65	0.000	0.126	0.309
Farmyard manure	0.247	0.028	3391	8.90	0.000	0.193	0.302
Green manure	0.400	0.026	3391	15.47	0.000	0.349	0.450
Straw on-season <sup>b</sup>	0.591	0.022	3391	27.49	0.000	0.549	0.633
Straw off-season <sup>b</sup>	0.228	0.036	3391	6.39	0.000	0.158	0.299
Unknown	$0^d$						
Agroecological zone <sup>c</sup>							
AEZ 1	1.523	0.508	3391	3.00	0.003	0.528	2.518
AEZ 2	1.005	0.089	3391	11.24	0.000	0.829	1.180
AEZ 3	0.307	0.074	3391	4.17	0.000	0.163	0.451
AEZ 5	0.525	0.098	3391	5.38	0.000	0.334	0.717
AEZ 6	1.127	0.070	3391	16.00	0.000	0.989	1.265
AEZ 7	0.605	0.076	3391	7.94	0.000	0.455	0.754
AEZ 8	0.526	0.078	3391	6.76	0.000	0.373	0.678
South America	0.403	0.150	3391	2.68	0.007	0.108	0.697
Europe	1.321	0.101	3391	13.08	0.000	1.123	1.520
North America	$0^d$						

<sup>*a*</sup>Soil organic carbon is expressed as % in the model.

<sup>*b*</sup>The effect of the organic amendment is the interaction of organic material type and application rate (t  $ha^{-1}$ ). Straw on-season indicates straw applied shortly before rice transplanting, and straw off-season indicates straw applied in the previous season. Note that rice straw that was left in situ

580 and incorporated into soil just before rice transplanting is classified as straw on-season.

<sup>c</sup>Experimental sites are classified as one of the agroecological zones according to the FAO zoning system.

<sup>*d*</sup>For each categorical variable, the effect of one subclass is set to zero.

Table 3. Relative fluxes for different water regimes in the rice-growing season and for different preseason

water statuses

		95% confidence interval		
Variables	Relative flux	Lower	Upper	
Water regime in rice season				
Continuously flooded	$1^a$			
Deepwater	0.06	0.03	0.12	
Multiple drainage	0.55	0.41	0.72	
Single drainage	0.71	0.53	0.94	
Rainfed, wet season	0.54	0.39	0.74	
Rainfed, dry season	0.16	0.11	0.24	
Preseason water status				
Short drainage	$1^a$			
Long drainage	0.89	0.80	0.99	
Two drainages	0.59	0.41	0.84	
Flooded	2.41	2.13	2.73	

585 <sup>*a*</sup>Supposing the fluxes of 'continuously flooded' and 'short drainage' to be 1.

# **Table 4.** The regional- and country-specific emission factors for $CH_4$ emission (kg $CH_4$ ha<sup>-1</sup>d<sup>-1</sup>) from flooded rice

			95% confidence				95% confidence		
			interval	a	_		interval	nterval <sup>a</sup>	
Region		Emission factor	Lower	Upper	Country	Emission factor	Lower	Upper	
World		1.19	0.80	1.76					
Asia	East Asia	1.32	0.89	1.96	China	1.30	0.88	1.93	
					Japan	1.06	0.72	1.56	
					South Korea	1.83	1.24	2.71	
	South Asia	0.85	0.58	1.26	India	0.85	0.57	1.25	
					Bangladesh	0.97	0.65	1.43	
	Southeast Asia	1.22	0.83	1.81	Philippines	0.60	0.41	0.89	
					Viet Nam	1.13	0.76	1.67	
					Indonesia	1.18	0.80	1.74	
America	North America	0.65	0.44	0.96	USA				
	South America	1.27	0.86	1.88	Brazil	1.62	1.10	2.40	
					Uruguay	0.80	0.54	1.18	
Europe		1.56	1.06	2.31	Spain	1.13	0.77	1.68	
					Italy	1.66	1.12	2.46	

fields with a preseason water status of short drainage and without organic amendments

<sup>*a*</sup>Including the uncertainties of the effects of continuous flooding and preseason water status