## RESEARCH

**Environmental Microbiome** 



# Distinct microbial communities drive methane cycling in below- and above-ground compartments of tropical cloud forests growing on peat



Fahad Ali Kazmi<sup>1\*</sup>, Ülo Mander<sup>1</sup>, Ramita Khanongnuch<sup>1</sup>, Maarja Öpik<sup>2</sup>, Reti Ranniku<sup>1,3</sup>, Kaido Soosaar<sup>1</sup>, Mohit Masta<sup>1</sup>, Salla A. M. Tenhovirta<sup>1,4,5</sup>, Kuno Kasak<sup>1,6</sup>, Claudine Ah-Peng<sup>7,8</sup> and Mikk Espenberg<sup>1</sup>

### Abstract

Cloud forests are unique vet understudied ecosystems regarding  $CH_{4}$  exchange despite their significance in carbon storage. We investigated CH<sub>4</sub> fluxes in peat soil and tree stems of two tropical cloud forests on Réunion Island, one featuring Erica reunionensis and the second a mix of E. reunionensis and Alsophila glaucifolia. The study examined microbiomes across below-ground (soil) and above-ground (canopy soil, leaves, and stems) forest compartments. Metagenomics and gPCR analyses targeted key genes in methanogenesis and methanotrophy in soil and aboveground samples, alongside soil physicochemical measurements. CH<sub>4</sub> fluxes from peat soil and tree stems were measured using gas chromatography and portable trace gas analyzers. Peat soil in both forests acted as a CH<sub>4</sub> sink  $(-23.8\pm4.84 \mu \text{g C m}^{-2} \text{h}^{-1})$  and CO<sub>2</sub> source (55.5±5.51  $\mu \text{g C m}^{-2} \text{h}^{-1})$ , with higher CH<sub>4</sub> uptake in sites dominated by endemic tree species *E. reunionensis*. In forest soils, a high abundance of n-DAMO 16 S rRNA gene  $(3.42 \times 10^7 \pm$  $7 \times 10^{6}$  copies/g dw) was associated with nitrate levels and higher rates of CH<sub>4</sub> uptake and CO<sub>2</sub> emissions. NC-10 bacteria (0.1–0.3%) were detected in only the Erica forest soil, verrucomicrobial methanotrophs (0.1–3.1%) only in the mixed forest soil, whereas alphaproteobacterial methanotrophs (0.1–3.3%) were present in all soils. Tree stems in both forests were weak sinks of  $CH_4$  (-0.94 ± 0.4 µg C m<sup>-2</sup> h<sup>-1</sup>). The canopy soil hosted vertucomicrobial methanotrophs (0.1–0.3%). The leaves in both forests exhibited metabolic potential for CH<sub>4</sub> production, e.g., exhibiting high mcrA copy numbers  $(3.5 \times 10^5 \pm 2.3 \times 10^5 \text{ copies/g dw})$ . However, no CH<sub>4</sub>-cycling functional genes were detected in the stem core samples. Tropical cloud forest peat soils showed high anaerobic methanotrophy via the n-DAMO process, while aerobic methanotrophs were abundant in canopy soils. Leaves hosted methanotrophs but predominantly methanogens. These results highlight the significant differences between canopy and soil microbiomes in the  $CH_4$  cycle, emphasizing the importance of above-ground microbiomes in forest  $CH_4$  gas budgets.

**Keywords** Peatlands, Soil microbiome, Phyllosphere microbiome, Canopy soil microbiome, Leaf microbiome, Stem microbiome

\*Correspondence: Fahad Ali Kazmi fahad.ali.kazmi@ut.ee

Full list of author information is available at the end of the article



© The Author(s) 2025. **Open Access** This article is licensed under a Creative Commons Attribution-NonCommercial-NoDerivatives 4.0 International License, which permits any non-commercial use, sharing, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons licence, and indicate if you modified the licensed material. You do not have permission under this licence to share adapted material derived from this article or parts of it. The images or other third party material in this article are included in the article's Creative Commons licence, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons licence and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this licence, visit http://creativecommons.org/licenses/by-nc-nd/4.0/.

#### Introduction

Methane (CH<sub>4</sub>) is a significant greenhouse gas,  $\sim 25$ times more potent than CO<sub>2</sub> in terms of its global warming potential over a 100-year period [1]. Microbial processes in soils are the major biological sources and sinks of  $CH_4$  [2] with tropical forest soils being the net sinks (average uptake: 4.94 Tg  $CH_4$  yr<sup>-1</sup>) in global  $CH_4$  budgets [3, 4]. Vegetation could also significantly contribute to the global CH<sub>4</sub> cycle via various pathways and processes [5, 6]. For example, tree stems act as conduits for soil CH<sub>4</sub> or function independently as sources or sinks [7], such as tree stems from upland forests are CH4 sinks due to microbe-mediated methanotrophic activity on and within their woody surfaces and tissues [6, 8]. Tree leaves from various ecosystems are reported to be sources [9– 12] and sinks of  $CH_4$  [13, 14]. Similarly, the cryptogamic covers can also be the sources [15] or the sinks of  $CH_{4}$ [16]. Metagenomics analyses have revealed that trees harbor the microbes responsible for both CH<sub>4</sub> production and consumption [17], therefore, the net  $CH_4$  fluxes would depend on the balance between these processes [15, 18]. The fluxes from stems or other vegetative parts can also be influenced by the taxonomy, age, and other tree traits in addition to the soil type and seasons [19, 20]. Following the temperate upland forests, tropical forest soils are the significant net  $CH_4$  sinks [3], but tropical wetland forests can emit CH<sub>4</sub> depending on the soil saturation [21, 22]. However, the precise patterns, magnitudes, and origins of these CH<sub>4</sub> fluxes in different forest ecosystems are not yet fully known [23-25]. Additionally, the microbial role in CH<sub>4</sub> fluxes from above-ground compartments in tropical forests remains less well understood, highlighting that more species- and ecosystemspecific field data is essential.

Tropical cloud forests are mid-elevation forests located in tropical regions, distinguished by their elevated humidity levels due to persistent or frequent groundlevel cloud condensation. According to the hydro-climatic approach (based on cloud coverage), these forests constitute 13-14.5% of the total tropical and subtropical forest area between 35° S and 23.5° N latitude [26-28], and exhibit significantly high levels of endemism and biodiversity [29]. Furthermore, they play an essential role in various ecosystem services, including carbon (C) storage and water and climate regulation [30, 31]. These forests are often on peat soils [32], and tropical peatlands may act as sources of CO<sub>2</sub> or CH<sub>4</sub> depending on natural weather events such as drought or flooding, as well as anthropogenic interventions like drainage, landuse change, and deforestation [33-37]. The CO<sub>2</sub> and CH<sub>4</sub> emission levels from tropical peatlands are also typically higher than other global peatlands [38, 39]. CH<sub>4</sub> emissions may decrease with a lowering water table and reduced soil water content, making peat soil a net  $CH_4$  sink [40]. Meanwhile,  $CO_2$  emissions significantly increase, with the highest levels observed in tropical peat soils [41]. Given the significant amounts of carbon loss through emissions, tropical peatlands are becoming increasingly important to study; however, investigations on peat soils, particularly in tropical cloud forests, have remained limited.

Peatlands in cloud forests have a high capacity for carbon storage [42] and experience dynamic fluctuations in both ambient and soil moisture. These variations can alter oxic conditions above and below ground, influencing CH<sub>4</sub> fluxes. Generally, under anaerobic conditions, autotrophic methanogens produce CH<sub>4</sub> via the methyl-coenzyme M reductase (MCR) enzyme complex [43, 44]. Conversely, in aerobic conditions, methanotrophic microbes oxidize CH<sub>4</sub> using the enzymes particulate methane monooxygenase (pMMO) and the soluble methane monooxygenase (sMMO) [45, 46]. CH<sub>4</sub> can also be oxidized by anaerobic methanotrophs using nitrite/ nitrate as an electron acceptor, coupling the anaerobic CH<sub>4</sub> oxidation with denitrification, and the process is called nitrite/nitrate-dependent anaerobic methane oxidation (n-DAMO) [47]. Two microbial groups mediate n-DAMO: bacteria belonging to the phylum NC-10 and archaea from the ANME-2d cluster [48, 49]. While microbial communities in soils and sediments have been extensively researched, there is a growing recognition of the importance of microbial community composition in above-ground compartments for CH<sub>4</sub> cycling. However, a significant gap exists in data from tropical regions, which limits our understanding of these above-ground compartments' role in the CH<sub>4</sub> cycling in tropical forests.

We selected two cloud forests with peat soils on the tropical island of La Réunion for this study during early spring (dry season). In these forests, we aimed to investigate the microbiomes associated with CH<sub>4</sub> cycling in different forest ecosystem compartments, including the soil, cryptogamic canopy soil, stem cores, and foliage. In addition, we also aimed to determine the  $CH_4$  and  $CO_2$  fluxes from the soil and tree stems. Our hypotheses were as follows: (1) The cloud forest peat soils and tree stems would absorb atmospheric  $CH_4$  due to low soil moisture (2) In the nitrogen (N) rich peat soils of cloud forests, especially where nitrate is abundant, the n-DAMO process would be dominant; (3) The above-ground microbiomes of phyllosphere, cryptogamic canopy soil, and stems of these forests would exhibit distinct CH<sub>4</sub>-cycling microbiome than soils because of varying oxic conditions.

#### **Materials and methods**

#### **Sites description**

Two cloud forests, located between 1500 and 1650 m above sea level within the montane cloud forest vegetation band, were examined on the tropical island of La Réunion, France. The first site was the Plateau de Thym, a 25,000-year-old peatland [50, 51] situated in the Forêt de Bébour region of the commune of Saint-Benoît (21.097139° S, 55.548028° E). The second location is the Plaine des Cafres in the municipality of Le Tampon (21.145343° S, 55.569692° E).

The Plateau de Thym forest was primarily dominated by Erica reunionensis and Hubertia ambavilla. In the understory, the main species were Erica galioides and Juncus effusus, along with patchy populations of Sphagnum species. The Plaine des Cafres forest mainly comprised an endemic shrub species, Erica reunionensis, and an endemic tree fern species, Alsophila glaucifolia. Dominating the epiphytic vegetation included Cordyline mau*ritiana* and various fern species, such as *Hymenophyllum* inaequale, H. capillare, and Blechnum attenuatum. The most prevalent species in the understory included Embelia angustifolia, Anthoxanthum odoratum, and Cynorkis ridleyi. The bryophyte layer was unevenly distributed and predominantly consisted of Sphagnum spp. The Plateau de Thym forest is referred to as the 'Erica forest' in the current study, while the Plaine des Cafres forest is referred to as the 'Mixed forest', primarily characterized by E. reunionensis or A. glaucifolia.

Measurements and sampling were conducted in November 2022, coinciding with the early spring dry season on Réunion Island. In the Erica forest, all points were selected within areas dominated by *E. reunionensis*. In contrast, the mixed forest of Plaine des Cafres contained six points in regions dominated by *E. reunionensis* and six points in areas dominated by *A. glaucifolia*.

#### Soil and stem gas flux sampling and measurement

To quantify the CH<sub>4</sub> and CO<sub>2</sub> fluxes at the soil surface, 65 L polyvinyl chloride chambers (with a surface area of 0.0196 m<sup>2</sup>, a volume of 0.065 m<sup>3</sup>, a diameter of 0.5 m, and a height of 0.4 m) were positioned over the soil using pre-installed chamber collars (n = 24). During a one-hour measurement period, gas samples were collected from the chambers and injected into 50 ml prevacuumed glass bottles at 20-minute intervals [52]. This sampling was done twice daily between 10:00 and 16:00 for two days. The change in concentration of fluxes over a one-hour measurement period was determined using gas chromatographs (GC-2014, Shimadzu, Kyoto, Japan) equipped with a Loftfield-type autosampler [53] in addition to an electron capture detector (GC-ECD) to measure the concentrations of CO<sub>2</sub> and a flame ionization detector (GC-FID) to measure CH<sub>4</sub>.

To measure the CH<sub>4</sub> and CO<sub>2</sub> fluxes on the surfaces of tree stems, static chambers (total area = 0.0108 m<sup>2</sup> stem surface, total volume = 0.00119 m<sup>3</sup>) were installed on the stems of *E. reunionensis* (n = 6 in Erica forest, n = 10 in mixed forest) and *A. glaucifolia* (n = 6 in mixed forest)

at a height of approximately 20 cm above the ground [11]. The chambers were made of transparent plastic (Lock & Lock, Seoul, South Korea), and their bottoms were removed prior to installation. A neoprene band was affixed to the bottom edges to create an airtight seal between the tree surfaces and the chambers. Each chamber was then closed with an airtight removable lid, which offered a connection to a trace gas analyzer (LI-COR LI-7810 CH<sub>4</sub>/CO<sub>2</sub>/H<sub>2</sub>O, Li-Cor Biosciences, Lincoln, NE, USA). CH<sub>4</sub> and CO<sub>2</sub> fluxes were measured by circulating the chamber headspace air between the chambers and the gas analyzer in a closed loop, with measurements taken at ten-minute intervals.

The quality of the manual chamber measurements for  $CO_2$  and  $CH_4$  fluxes was validated using the adjusted  $R^2$  value from a linear regression of gas concentration over time. Fluxes were considered valid and accepted only when the adjusted  $R^2$  value exceeded 0.9. The flux values were calculated by determining the least-squares linear regression of the gas concentration change in the static chambers' headspaces over the sampling time. Equations used for the calculation were adapted from a previous study [54].

#### Soil, canopy soil, and plant sampling

Soil samples were collected from the gas sampling points (n=24) to analyze their chemical properties and for microbial analyses. Composite samples from the topsoil of the upper horizon (0–10 cm depth) were gathered in plastic grip-seal bags with properly disinfected equipment. Additionally, for microbial analyses, canopy soil from mixed forest (n = 19), which consisted of dead epiphytes and cryptogams, was collected and placed in grip-seal bags with active silica gel to absorb moisture. Canopy soil was only present in the mixed forest. Stem core samples (n = 8) from *E. reunionensis* were obtained from both cloud forest sites. Stems were drilled using a 3-threaded increment borer with 400 mm length and 5.15 mm diameter (Haglöf Sweden AB, Langsle, Sweden) from the point of gas sampling. Similarly, leaves of E. *reunionensis* (n = 5 + 6) from both forests and *A. glaucifolia* (n = 6) from mixed forest were collected from different branches of different individuals and packed with silica gel. The silica gel was regularly changed until all moisture from the samples was thoroughly removed.

#### Soil physical and chemical analyses

Soil temperature was measured at each sampling point using probes (Campbell Scientific, Logan, USA) at a depth of 10 cm. Soil water content (SWC) was assessed with the ProCheck moisture sensor (Decagon Devices, WA, USA). The Estonian Environmental Research Centre in Tartu conducted chemical analyses of the soil, which included measurements of total N, total C content, and pH. For the determination of nitrate  $(NO_3^--N)$  levels in the soil samples, extraction was performed using 2 M KCl at a ratio of 1:10. These levels were then analyzed through flow-injection analysis following standard methods [55].

#### DNA extraction and metagenome sequencing

Prior to DNA extraction, the canopy soil and plant samples were finely crushed using a coffee grinder. The grinder components were sterilized with 70% ethanol between each sample to avoid contamination. The DNeasy PowerSoil Pro kit (Qiagen, Hilden, Germany) was utilized to extract DNA from 0.25 g of soil and 0.12 g of canopy soil and plant material, adhering to the manufacturer's guidelines. All samples—soil, canopy soil, stem, and leaves-were homogenized with lysis buffer using the Precellys 24 Homogenizer (Bertin Technologies, Montigny-le-Bretonneux, France) at 5000 rpm for 20 s. For the canopy soil and plant samples, the amount of lysis buffer (CD1) was increased to 50-70% to enhance the lysate yield. The concentration and quality of the DNA extracted were assessed using a Tecan AG Infinite spectrophotometer before storing the samples at - 20 °C.

Metagenome sequencing was performed on 36 samples from various ecosystems, including soils (n = 12), canopy soils (n = 14), and leaves (n = 10). Library preparation and sequencing were performed by Biomarker Technologies (BMK) GmbH (Münster, Germany). Briefly, the constructed library was sequenced on the Illumina Nova-Seq X platform using a paired end (PE) 150 bp strategy. Details of metagenome data processing are described in the Supplementary material in the 'Extended methods' section.

#### Quantitative polymerase chain reaction (qPCR)

The bacterial and archaeal 16 S rRNA genes were quantified using RotorGene<sup>®</sup> Q equipment (Qiagen, Hilden, Germany). The *mcrA* gene, which encodes the MCR enzyme, was quantified to determine the abundance of methanogenic microbes. Similarly, the *pmoA* gene, which encodes the pMMO subunit, was quantified to assess the abundance of methanotrophic microbes. The n-DAMO 16 S rRNA gene was also quantified to evaluate the presence of nitrate/nitrite-dependent anoxic methane-oxidizing microbes.

Primers and qPCR program settings are described in Table S1. Each qPCR run included both samples and negative controls. The data obtained were analyzed using the RotorGene Series Software program (version 2.0.2, Qiagen, Hilden, Germany) and the LinRegPCR application (version 2020.0). Gene copy numbers were calculated from the samples' threshold cycles and normalized based on the samples' dry weight%. The results are expressed as gene copies per gram of dry weight of the sample (copies

#### Data analysis

For statistical analyses, the primary factor for comparison in soil used was the type of forests (Erica and Mixed). However, within the Mixed forest, we also categorized the sites based on the dominance of tree species to examine the intra-forest variability. The sample type (canopy soil, leaf, and stem) was used as the main factor in the above-ground compartments. Gene copy number data was assessed for normality using Shapiro-Wilk normality tests in Jamovi [57], and was later normalized by  $\log_{10}$ transformation. However, robust analyses were employed to account for any violation of the homogeneity of variances, and Welch's ANOVA was performed coupled with Games-Howell pairwise post hoc tests. The main effect tested was the ecosystem (forest type) in the case of soil fluxes and gene copy numbers in soil samples, while sample type was the main factor in the case of gene copy numbers in above-ground samples. Moreover, species was also tested as a factor regarding tree stem fluxes to observe species-specific differences. Welch's t-test was also employed in cases where ANOVA could not be performed due to insufficient data or the absence of variance in one group. Welch's ANOVA and t-tests were performed in Jamovi and using the ggstatsplot package in RStudio [58], and all figures (boxplots, PCA, and heatmap) were created using the ggplot2 package in RStudio [59]. SEM was performed to observe ecological interactions regarding moisture-temperature regulation, microbial mediation of GHG fluxes, and biogeochemical feedback. For the structural equation model (SEM), we used *lavaan* and *semplot* packages in the R [60]. The Chi test and the comparative fit index (CFI) were used to check the model's performance.

#### Results

#### Soil and tree stem fluxes

The soil in both forests was a net sink of atmospheric CH<sub>4</sub> (Fig. 1a). Mean soil CH<sub>4</sub> flux in the Erica forest was measured at  $-22.4\pm4.20$  (mean $\pm$ SE µg C m<sup>-2</sup> h<sup>-1</sup>). At the location in the mixed forest, where *E. reunionensis* predominated, the uptake was recorded at  $-33.7\pm15$  µg C m<sup>-2</sup> h<sup>-1</sup>, while the mean CH<sub>4</sub> flux in the location dominated by tree fern *A. glaucifolia* was  $-16.7\pm9.88$  µg C m<sup>-2</sup> h<sup>-1</sup>. The mean soil CO<sub>2</sub> fluxes in the Erica forest were recorded at  $61.2\pm7.57$  mg C m<sup>-2</sup> h<sup>-1</sup>. In the mixed forest, the soil at the site dominated by *E. reunionensis* produced a mean flux of  $58.6\pm13.7$  mg C m<sup>-2</sup> h<sup>-1</sup>, whereas the site dominated by *A. glaucifolia* had a mean flux of  $41.1\pm7.93$  mg C m<sup>-2</sup> h<sup>-1</sup> (Fig. 1b). The difference between the two forests was statistically insignificant



**Fig. 1** Boxplot illustrating (a)  $CH_4$  fluxes and (b)  $CO_2$  fluxes from the soil and stems. The colors indicate the dominant plant species in soil and those related to stem fluxes. The box illustrates the interquartile range (IQR), encompassing the 25th and 75th percentiles of the data distribution. The lines extending from the box, referred to as whiskers, show the data range that falls within 1.5 times the IQR. The bars within the box indicate the median. The red dots represent the mean values

regarding the soil CH<sub>4</sub> (F(1, 15.6) = 0.08, p = 0.782) and CO<sub>2</sub> flux (F(1, 21.9) = 1.07, p = 0.312).

The stems of E. reunionensis in the Erica forest exhibited mean CH<sub>4</sub> fluxes of  $-0.31 \pm 0.17$  and  $-0.96 \pm 0.67 \mu g$  $C m^{-2} h^{-1}$  in the mixed forest, while the mean  $CH_4$  flux from the tree fern A. glaucifolia stem was  $-1.53 \pm 1.10 \mu g$  $C m^{-2} h^{-1}$ . Overall, stems in both forests were weak sinks for CH<sub>4</sub>. However, for CO<sub>2</sub>, the mean flux from *E. reunionensis* in the Erica forest was  $20.9 \pm 8.30$  mg C m<sup>-2</sup> h<sup>-1</sup>, while in the mixed forest, it was  $10.5 \pm 2.59$  mg C m<sup>-2</sup> h<sup>-1</sup>. The CO<sub>2</sub> fluxes from the A. glaucifolia stems were lower and recorded at  $-1.10 \pm 2.47$  mg C m<sup>-2</sup> h<sup>-1</sup>. The difference between the two forests was statistically insignificant regarding the overall stem  $CH_4$  (F(1, 17.47) = 2.10, p = 0.165) and CO<sub>2</sub> flux (F(1, 5.80) = 2.93, p = 0.140). The difference between species-specific CO<sub>2</sub> fluxes was significant between E. reunionensis and A. glaucifolia (F(1, 19.46) = 12.69, p = 0.002), while it was insignificant for  $CH_4$  fluxes (F(1, 6.52) = 0.47, p = 0.516).

## Microbial abundance of methanogens and methanotrophs in soil

The gene copy numbers of *mcrA* (methanogenesis) were significantly higher in mixed forest soil as compared to the Erica forest soil (F(1, 21.6) = 16.4, p < 0.001, Fig. 2a). The *pmoA* (aerobic methanotrophy) genes were abundant in the mixed forest soils while not detected in the Erica forest soils (hence Welch's t-test was performed instead of ANOVA), but the difference was statistically insignificant (Welch's t(11.0) = -2.07, p = 0.062). However, the difference was statistically significant when  $\log_{10}$  transformed values of *pmoA* abundance were compared in Welch's t-test (Welch's t(11.0) = -23.63, p < 0.001). In

contrast, the n-DAMO 16 S rRNA (anaerobic methanotrophy) gene was found in greater abundance in the Erica forest soil (F(1, 15.2) = 10.9, p = 0.005, Table S2).

The metagenomic analyses show that key genes involved in CH<sub>4</sub> oxidation, *pmoAB*, encoding pMMO, are observed in only soil samples, irrespective of the forest type, while *mmoC*, encoding soluble methane monooxygenase (sMMO) are present across all samples (Fig. 3). Furthermore, among key genes for methanol oxidation, xoxF encoding lanthanide-dependent methanol dehydrogenase, was found to be the most abundant in all soil samples. These circumstances are likely associated with the abundance of n-DAMO 16 S rRNA quantified from qPCR. Across different forests, all soil samples show a similar pattern of relative abundance of key genes for methanogenesis (including mcr/mcrA, mtbC, mtmC, *mtr/mtrABCR*, and *mttBC*). It was observed that *mtrAB*, involved in CH<sub>4</sub> production via hydrogenotrophic or acetoclastic methanogenesis, showed a higher relative abundance than mtbC, mtmC, and mttBC (Fig. 3), which is associated with CH<sub>4</sub> production via the methylotrophic pathway.

#### Microbial abundance of methanogens and methanotrophs in above-ground samples

In the mixed forest, high gene copy numbers of the *mcrA* gene were found in canopy soil samples (Table S3). The *pmoA* gene was also detected in the canopy soils but in less abundance than the *mcrA* and n-DAMO 16 S rRNA genes. Additionally, n-DAMO exhibited high gene copies in the canopy soils as well. The gene copy numbers were higher in canopy soils than in leaves and stems for *mcrA*, *pmoA*, and n-DAMO 16 S rRNA (Fig. 2d-f).



**Fig. 2** Abundances of genes ( $g^{-1}$  dry weight) involved in methanogenesis (*mcrA*) and methanotrophy (*pmoA* and n-DAMO 16 S rRNA) in soil (**a-c**) and plant samples (**d-f**) quantified in qPCR. Different colors represent the species dominant in the sites in a-c, while the related species in d-f. The box depicts the interquartile range (IQR), which captures the 25th and 75th percentiles of the data. The whiskers that extend from the box represent the data range within 1.5 times the IQR. Inside the box, a line indicates the median value of the data set, while the red dots represent the mean values. Black dots are the outliers. The pairwise relationships are indicated by *ns* (not significant), \* ( $p \le 0.05$ ), \*\* ( $p \le 0.01$ ), \*\*\* ( $p \le 0.001$ ), and \*\*\*\* ( $p \le 0.0001$ )

The leaves of *A. glaucifolia* showed a high abundance of the *mcrA* gene. In the Erica forest, the *mcrA* gene was detected in the leaves of *E. reunionensis*. The *pmoA* gene was not found at the detectable limit for qPCR in any above-ground sample from this forest; however, the n-DAMO 16 S rRNA gene was detected in two leaf samples. However, the *mcrA* gene was not detected in the leaves of *E. reunionensis* in this forest.

The metagenomics analyses of the above-ground samples revealed that the leaves of *E. reunionensis* had a higher relative abundance of the *mtr* gene as compared to the leaves of *A. glaucifolia*. However, the leaves of *A. glaucifolia* contained a higher abundance of *mtrA* and *mtrB* genes (Fig. 3). All these genes are involved in methanogenesis and were consistently abundant in the aboveground samples. Canopy soils showed the highest read counts of the methanogenic genes (*mcrA, mtr, mtrA*, and *mtrB*) as compared to leaves or soil samples.

In the cloud forests' soils, the ratio of the quantified *mcrA* gene to the product of *pmoA* and n-DAMO 16 S rRNA genes was found to be less than one, indicating a relatively higher abundance of methanotrophic genes in the soil as compared to methanogenic gene *mcrA* (Fig. 4a). However, in plant samples and canopy soil, the *mcrA* gene exhibited a higher abundance compared to the *pmoA* and n-DAMO genes.

Relative abundance of key  $CH_4$ -cycling microbial genera.

Based on the classification of small subunit (SSU) rRNA gene sequences obtained from metagenomes, more CH<sub>4</sub>-cycling microbial genera (e.g., methanogens, methylotrophs, and methanotrophs) were detected in soil and canopy soil compared to leaf samples (Fig. 5a). It should be noted that these estimations may be biased by the potential fragmentation of SSU rRNA sequences and the limited coverage inherent to metagenomic data. The relative abundance of alphaproteobacterial methane oxidation bacteria (alpha-MOB) (0.1-3.3%) was observed across all samples from both forests, while verrucomicrobial MOB (the relative abundance of 0.1-3.1%) was observed in soil and canopy soil samples across Mixed forests. The NC-10 phylum (the relative abundance of 0.1-0.3%, Fig. 5a), associated with the n-DAMO process, was detected only in soil samples from Erica forest dominated by E. Reunionensis. Regarding leaf samples obtained from different forests, the abundance of CH<sub>4</sub> cycling microbial genera was detected only in leaf samples from the mixed forests dominated by A. glaucifolia, showing the presence of alpha-MOB and methylotrophs. Furthermore, the relative abundance of alpha-MOB shows a negative relationship with  $CH_4$  fluxes, while positive relationships were observed between the relative



Fig. 3 Functional gene abundance across soil, canopy soil, and leaves samples. The row-scaled heatmap represents the log<sub>2</sub>-transformed normalized read counts for key functional genes for methanogenesis, aerobic methanotrophy, and methanol oxidation



Fig. 4 The ratios of the microbial methanogenic (*mcrA*) to methanotrophic genes (*pmoA* and n-DAMO 16 S rRNA) (a) in peat soil and (b) in above-ground samples

abundance of NC-10 phylum and soil  $NO_3^-$  and  $NH_4^+$  (Fig. 5b).

The SEM (Fig. 5c) had CFI=0.984, Root Mean Square Error of Approximation (RMSEA)=0.046, and Standardized Root Mean Square Residual (SRMR)=0.109,

demonstrating an excellent fit. It revealed a significant negative covariance between  $CH_4$  and  $CO_2$  (Estimate = -0.39, p=0.038), indicating an inverse relationship between these two gas fluxes. SWC and the soil temperature were also inversely related (Estimate = -0.50,



**Fig. 5** (a) Relative abundance of small subunit rRNA (SSU) sequence of key CH<sub>4</sub> cycling microbial genera (including methanogenic archaea, methanotrophs, and methylotrophs) in soil, canopy soil, and leaves across tropical cloud forests: Erica Forest dominated by *E. reunionensis* (Erica\_ER), Mixed Forest dominated by *E. reunionensis* (Mixed\_ER), and dominated by *A. glaucifolia* (Mixed\_AG). (b) Clustering of the forest sites based on principal component analysis biplot of soil variables, including physiochemical properties, gene copy numbers, and microbial functional groups. Big triangles represent the mean values, and colors represent the forest sites. (c) Structural Equation Model (SEM) for the soil CH<sub>4</sub> and CO<sub>2</sub> fluxes, including key controlling factors, i.e., SWC, soil NO<sub>3</sub><sup>-</sup>, n-DAMO, and *pmoA* gene abundances. Red lines show negative correlations, while green lines show positive correlations. Asterisks represent the significant relationships

p = 0.004). The n-DAMO abundance had an insignificant negative correlation with CH<sub>4</sub> while a positive correlation with CO<sub>2</sub> (Estimate = -0.40, p = 0.05). Soil NO<sub>3</sub><sup>-</sup> had a significant positive effect on n-DAMO abundance (Estimate = 0.70, p = 0.0001). The relationship between pmoA and CH<sub>4</sub> was also negative (Estimate = -0.262, p = 0.130), yet there was no correlation between pmoA and CO<sub>2</sub> resulting from soil respiration.

#### Discussion

#### The cloud forest peat soils are CH<sub>4</sub> sinks

In this study, we observed  $CH_4$  uptake by the peat soil of the cloud forests. Meanwhile, these soils emitted  $CO_2$ (Fig. 1). The mean uptake values in the sites dominated by *E. reunionensis* were consistent in both forests and greater than the sites dominated by *A. glaucifolia*. Soil and tree stem  $CH_4$  fluxes were similar to those from a previous study conducted on the same island but in a different ecosystem [16]. Soil moisture in other ecosystems is a critical factor influencing the forest soil's capacity to function as a  $CH_4$  sink [61]. In our study, the SWC varied between 0.2 and 0.6 (m<sup>3</sup> m<sup>-3</sup>); however, no correlation was found between SWC and CH44 flux values. Conversely, the SWC showed a positive correlation with all microbial genes (mcrA, pmoA, and n-DAMO 16 S rRNA) as well as the relative abundance of key CH<sub>4</sub>-cycling microbes (NC-10 and methylotrophs), indicating that microbial abundance was higher in moderately moist soil (Fig. 5b). The high soil moisture affects both methanogens and methanotrophs abundance and community structures [62]. Previous studies have demonstrated that, globally, temperature affects the soil emission of  $CH_4$  rather than its uptake [3, 63]. Elevated temperatures often result in drier soil conditions, creating more oxic conditions in soil that enhance  $CH_4$  oxidation through methanotrophic processes. However, very low SWC can also decrease the activity of these microbes. Research indicates that at temperatures below or above the optimum (ca. 25 °C), both the abundance [64] and the activity of methanotrophs tend to decrease [65]. The influence of temperature increase has also been shown to shift CH<sub>4</sub>-cycling community composition in upland forest soils [66]. Our study demonstrated negative correlations between soil temperatures and gene abundances (Fig. 5b), indicating that warmer and drier soils contained fewer microbes involved in both methanogenesis and methanotrophy. The highest gene abundances were found at the SWC between 0.5 and 0.6  $m^3 m^{-3}$ , which is in accordance with the previous studies in tropical forests [67].

In soils of cloud forest, the n-DAMO 16 S rRNA gene showed a strong positive correlation with SWC and  $NO_3^{-}$  levels (Fig. 5c). The relative abundance of NC-10 phylum also had a positive relationship with soil NH<sub>4</sub><sup>+</sup> and NO<sub>3</sub><sup>-</sup> levels, indicating the potential for nitratedependent methanotrophy in soil. In this pathway, the microbes involved would obtain oxygen from the reduction process of the nitrogen oxides  $(NO_3^- \text{ and } NO_2^-)$  to  $N_2$  and  $O_2$  (denitrification) and use this oxygen to oxidize the CH<sub>4</sub> [48, 49]. In peatlands rich in inorganic nitrogen, most of the n-DAMO process occurs within the topsoil [68]. We observed elevated soil  $NO_3^{-}$  levels in forest soils dominated by E. reunionensis. This could be due to high archaeal nitrification rates, coupled with E. reunionensis preference for NH<sub>4</sub><sup>+</sup> as its N source [69]. Consequently, soils in the forests dominated by E. reunionensis provide a conducive environment for the n-DAMO process. In both erica and mixed forests, the soil  $CH_4$  sink values remained similar in sites dominated by E. reunionensis. This indicates that CH<sub>4</sub> oxidation is primarily influenced by the NO<sub>3</sub><sup>-</sup> levels in the soil, suggesting that n-DAMO may serve as a key driver of this process.

SEM analysis was utilized to understand the processes explaining  $CH_4$  fluxes, particularly focusing on the contributions of aerobic methanotrophy and n-DAMO in CH<sub>4</sub> oxidation. In general, the pmoA gene-driven methanotrophy is considered the main player for CH<sub>4</sub> oxidation, but due to recent research on the n-DAMO process' contribution to  $CH_4$  oxidation in peat soils [68], we were interested in investigating this in our data. The SEM analysis revealed a negative correlation between n-DAMO gene abundance and CH<sub>4</sub> flux values while positively correlated with soil CO<sub>2</sub> flux values, indicating CH<sub>4</sub> oxidation. The correlation was also positive between NO<sub>3</sub><sup>-</sup> and n-DAMO gene abundances, showing that the main source of oxygen was NO<sub>3</sub><sup>-</sup> in this CH<sub>4</sub> oxidation pathway. We also observed a negative correlation between the abundance of pmoA and CH<sub>4</sub> flux, but it did not show any contribution to CO<sub>2</sub> production via oxidation (Fig. 5c). This shows that n-DAMO was a major contributor to the overall CH<sub>4</sub> oxidation process, followed by the aerobic CH<sub>4</sub> oxidation. Moreover, under sporadic anaerobic conditions, which could occur due to increased soil moisture (in the wet season or precipitation), n-DAMO can remain the dominant process until the ammonia oxidation (nitrification) is ceased due to prevailing anoxic conditions in the soil, and when the remaining soil  $NO_3^{-1}$ is denitrified. In such conditions, if the pH becomes less acidic, the activity of n-DAMO also can increase [70].

While the Erica forest soil contained the highest gene copies of the 16 S rRNA gene and relative abundance of NC-10 phylum bacteria, the mixed forests had pmoAcontaining verrucomicrobial MOB and alphaproteobacterial MOB as their dominant methanotrophic groups in different samples, followed by methylotrophs (Figs. 2 and 5a). Verrucomicrobial MOB are a very common type of methanotroph in tropical soils [71], and some of these bacteria have also been found to be active in extremely acidic environments [72, 73]. Our studied sites also had acidic pH ranging between 3 and 5. Alphaproteobacterial MOB are also very common methanotrophs, usually living in the junction zones of oxic and anoxic parts of soils, and can survive the shortage or the excess of CH<sub>4</sub> by showing facultative as well as mixotrophic capabilities [74, 75]. MOB can vary through the soil depths, but the highest potential is found to be in the top 15 cm [76], which was also similar to the depth where we sampled. In both cloud forest soils, the mcrA to pmoA and n-DAMO 16 S rRNA gene ratios remained consistently below 1 (Fig. 4). This highlights an overall dominance of methanotrophs in these soils, further supported by the relative abundance of methanotrophic groups.

#### The role of above-ground compartments in CH<sub>4</sub> cycling

In our study, we observed that the stems of both species in the two forests functioned as weak sinks for  $CH_4$ . Despite the absence of methanotrophic genes in their core samples, stems of *A. glaucifolia* absorbed more  $CH_4$  than those of *E. reunionensis*. This may indicate

that the microorganisms living on the bark are responsible for the methanotrophy instead of those living inside of stems. Notably, the canopy soil on the surfaces of A. glaucifolia stems contained a significant abundance of pmoA and n-DAMO genes. Previous research has indicated that microbial communities residing on stem surfaces or within wood crevices can oxidize atmospheric  $CH_4$  [8], and it has been reported in many upland forests globally where the wood was found to be a significant CH<sub>4</sub> sink [6]. Additionally, *pmoA* and n-DAMO genes were also detected within the canopy soils on the stems of E. reunionensis, indicating their potential to oxidize CH<sub>4</sub>. No functional gene was detected in the stem core samples which shows that the microbial activity is more likely to occur on the stem surfaces, cryptogams, and in the wood crevices. This finding is inconsistent with the findings of a study where methanogenic communities were detected in the heartwood of Populus deltoides [18]. The variability between different tree species in terms of functional gene presence or abundance may arise from the diverse tree physiology traits (stem moisture content, stem density, and bark characteristics) [77].

Like soil, canopy soil also had fewer *pmoA* than n-DAMO genes (16 S rRNA). Nitrogen deposition and microbial nitrification have been reported in forest canopies in different ecosystems [78–80]. The NO<sub>3</sub><sup>-</sup> in the canopy can be utilized by the n-DAMO in canopy soils to oxidize the CH<sub>4</sub>. The canopy soil also had a significant abundance of the methanogenesis genes *mtrA*, *mtrB*, *mcr*, and *mcrA*, which indicates that during anoxic conditions, the stems that carry the cryptogamic canopy soil may be a source of CH<sub>4</sub> as the ratio of methanogenic to methanotrophic gene abundances was greater than one in the canopy soils (Fig. 4b).

The surfaces of leaves, or the phyllosphere, host a variety of microbial communities that play a significant role in ecosystem functions and contribute to nutrient cycling [81]. This field of study needs exploration because its contributions to global greenhouse gas budgets are largely overlooked. Our study found the mcrA and pmoA genes through qPCR in several individual samples, although their gene copy numbers varied across the samples. Notably, all leaves of *A. glaucifolia* from the mixed forest exhibited a significant abundance of the mcrA and mtr genes in qPCR as well as metagenomics (Fig. 3). Furthermore, the ratio of mcrA to the combined levels of pmoA and n-DAMO was higher in these leaves than in all other above-ground samples (Fig. 4). This finding suggests that the phyllosphere of A. glaucifolia has metabolic potential to emit CH4. Additionally, the mtr gene was consistently found abundant in all leaf samples from the cloud forests, further indicating a potential for methanogenesis in the phyllosphere of other leaves. A similar trend was also found in the phyllosphere of Norway spruce (Picea abies) in the boreal ecosystem, where metagenomic analyses revealed the presence of methanogenic archaea and methanotrophic bacteria in the phyllosphere [17]. In addition to the detection of methanogenic genes in leaves by qPCR, the analysis of the SSU rRNA revealed that the leaves of A. glaucifolia also contained methanotrophic genera (Fig. 5a), highlighting a potential role of leaves in both microbial CH<sub>4</sub> production and consumption. Previously, the 16 S rRNA gene sequencing has revealed significant differences in the communities of methanotrophs found in the phyllosphere of different tree species [82]. The presence of methanotrophic microbes in the phyllosphere has been confirmed by isolation and culturing previously; however, like ours, many studies could not amplify the pmoA gene in the DNA extracted from leaves [83].

This study combined qPCR and metagenomics approach to target the phyllosphere microbiome, and the findings regarding the presence of methanogens and methanotrophs are unprecedented in terms of  $CH_4$  cycling in tropical forests. This warrants further research focusing on the phyllosphere microbial communities and the shoot flux measurements to estimate the activity of methanogens or methanotrophs based on the oxic or anoxic conditions resulting from different climatic conditions.

#### Conclusion

Our study found that peat soil and tree stems in cloud forests act as sinks for CH<sub>4</sub> and exhibit high methanotrophic potential. However, the microbial methanotrophic genera detected in the soil differ from those in the above-ground forest compartments. In the peat soil, NC-10 bacteria were in high abundance in the forest featuring E. reunionensis, which suggests that the anaerobic methanotrophy (n-DAMO) may primarily drive  $CH_4$ oxidation there. Meanwhile, peat soil and the canopy soils in the mixed forest are mainly dominated by aerobic alphaproteobacterial and verrucomicrobial methanotrophs, respectively. Additionally, leaves from both types of forests show a high abundance of the mtr gene, while leaves of A. glaucifolia exhibited an abundance of the mcrA gene alongside the detected methanotrophic genera. Our results indicate that soil in the Erica forest, which is abundant in the NC-10 phylum, can act as a  $CH_{4}$ sink even under anaerobic conditions induced by precipitation (during the wet season). In contrast, the phyllosphere in these forests can release CH<sub>4</sub> under similar conditions due to the presence of methanogens.

#### Supplementary Information

The online version contains supplementary material available at https://doi.or g/10.1186/s40793-025-00718-1.

Supplementary Material 1

#### Acknowledgements

We would like to express our gratitude to the Doctoral School of Earth Sciences and Ecology of the University of Tartu for organizing the research expedition to Réunion Island. We extend our thanks to the Observatory of the Science of the Universe - Réunion (OSU-R) for granting us access to the facilities at the Mare Longue Research field station during the fieldwork campaign, and we appreciate the National Park of La Réunion for providing the collecting permit DIR-I-2022-28. We would also like to acknowledge Dr. Alar Teemusk for analyzing the gas samples in the GC-ECD laboratory.

#### Author contributions

FAK, ÜM, and ME conceptualized and designed this study. FAK, ÜM, ME, RR, MÖ, KS, CAP, and KK participated in sampling. FAK, RK, and ME performed laboratory procedures, data analyses, bioinformatics, and visualization. FAK prepared the first draft of the manuscript, and all co-authors, including MM and SAMT, participated in the editing and preparation of the final draft.

#### Funding

This study received support from the European Research Council (ERC) under the grant agreement No 101096403 (MLTOM23415R) and the European Union HORIZON-CSA project No 101079192 "Living Labs for Wetland Forest Research" (LiWeFoR). MÖ and ÜM are supported by the Estonian Research Council (grants no PRG1789 and PRG2032, respectively). KK was supported by the Estonian Research Council (grant no PSG714) and The Estonian Ministry of Education and Research, Centre of Excellence for Sustainable Land Use (FutureScapes, TK232).

#### Data availability

The metagenomic sequencing data that support the findings of this study has been deposited in NCBI's SRA under Bioproject number PRJNA1217467 https://www.ncbi.nlm.nih.gov/bioproject/PRJNA1217467. The processed metagenomic data is accessible at https://www.ebi.ac.uk/biostudies/studies/ S-BSST1945.

#### Declarations

#### **Competing interests**

The authors declare no competing interests.

#### Author details

<sup>1</sup>Department of Geography, University of Tartu, Tartu 51003, Estonia <sup>2</sup>Department of Botany, University of Tartu, Tartu 50409, Estonia <sup>3</sup>Department of Biological and Agricultural Engineering, University of

Arkansas, Fayetteville, AR 72701, USA

<sup>4</sup>Department of Agricultural Sciences, Environmental Soil Science, University of Helsinki, Helsinki, Finland

<sup>5</sup>Institute for Atmospheric and Earth System Research, University of Helsinki, Helsinki, Finland

<sup>6</sup>Department of Environmental Science, Policy and Management, University of California, Berkeley, USA

<sup>7</sup>UMR PVBMT, Université de La Réunion, Saint-Pierre, La Réunion 97410. France

<sup>8</sup>OSU-Réunion, Université de La Réunion, Saint-Denis, La Réunion 97400, France

#### Received: 12 February 2025 / Accepted: 10 May 2025 Published online: 19 May 2025

#### References

- IPCC. Climate Change 2023: Synthesis Report. Contribution of Working Groups I, II and III to the Sixth Assessment Report of the Intergovernmental Panel on Climate Change. Geneva, Switzerland: IPCC; 2023.
- 2. Conrad R. The global methane cycle: recent advances in Understanding the microbial processes involved. Environ Microbiol Rep. 2009;1:285–92.

- Feng H, Guo J, Peng C, Ma X, Kneeshaw D, Chen H, et al. Global estimates of forest soil methane flux identify a temperate and tropical forest methane sink. Geoderma. 2023;429:116239.
- Dutaur L, Verchot LV. A global inventory of the soil CH4 sink. Glob Biogeochem Cycles. 2007;21.
- Bastviken D, Treat CC, Pangala SR, Gauci V, Enrich-Prast A, Karlson M, et al. The importance of plants for methane emission at the ecosystem scale. Aquat Bot. 2023;184:103596.
- Gauci V, Pangala SR, Shenkin A, Barba J, Bastviken D, Figueiredo V, et al. Global atmospheric methane uptake by upland tree Woody surfaces. Nature. 2024;631:796–800.
- Covey KR, Megonigal JP. Methane production and emissions in trees and forests. New Phytol. 2019;222:35–51.
- Jeffrey LC, Maher DT, Chiri E, Leung PM, Nauer PA, Arndt SK, et al. Bark-dwelling methanotrophic bacteria decrease methane emissions from trees. Nat Commun. 2021;12:2127.
- Keppler F, Hamilton JTG, Braß M, Röckmann T. Methane emissions from terrestrial plants under aerobic conditions. Nature. 2006;439:187–91.
- Bruhn D, Mikkelsen TN, Rolsted MMM, Egsgaard H, Ambus P. Leaf surface wax is a source of plant methane formation under UV radiation and in the presence of oxygen. Plant Biol. 2014;16:512–6.
- Machacova K, Bäck J, Vanhatalo A, Halmeenmäki E, Kolari P, Mammarella I, et al. Pinus sylvestris as a missing source of nitrous oxide and methane in boreal forest. Sci Rep. 2016;6:23410.
- Tenhovirta SAM, Kohl L, Koskinen M, Patama M, Lintunen A, Zanetti A, et al. Solar radiation drives methane emissions from the shoots of Scots pine. New Phytol. 2022;235:66–77.
- Gorgolewski AS, Caspersen JP, Vantellingen J, Thomas SC. Tree foliage is a methane sink in upland temperate forests. Ecosystems. 2023;26:174–86.
- 14. Karim MR, Halim MA, Thomas SC. Foliar methane and nitrous oxide fluxes in tropical tree species. Sci Total Environ. 2024;954:176503.
- Lenhart K, Weber B, Elbert W, Steinkamp J, Clough T, Crutzen P, et al. Nitrous oxide and methane emissions from cryptogamic covers. Glob Change Biol. 2015;21:3889–900.
- Machacova K, Borak L, Agyei T, Schindler T, Soosaar K, Mander Ü, et al. Trees as net sinks for methane (CH4) and nitrous oxide (N2O) in the lowland tropical rain forest on volcanic réunion Island. New Phytol. 2021;229:1983–94.
- Putkinen A, Siljanen HMP, Laihonen A, Paasisalo I, Porkka K, Tiirola M, et al. New insight to the role of microbes in the methane exchange in trees: evidence from metagenomic sequencing. New Phytol. 2021;231:524–36.
- Yip DZ, Veach AM, Yang ZK, Cregger MA, Schadt CW. Methanogenic Archaea dominate mature Heartwood habitats of Eastern cottonwood (Populus deltoides). New Phytol. 2019;222:115–21.
- Vainio E, Haikarainen IP, Machacova K, Putkinen A, Santalahti M, Koskinen M, et al. Soil-tree-atmosphere CH4 flux dynamics of boreal Birch and Spruce trees during spring leaf-out. Plant Soil. 2022;478:391–407.
- Moisan M-A, Lajoie G, Constant P, Martineau C, Maire V. How tree traits modulate tree methane fluxes: A review. Sci Total Environ. 2024;940:173730.
- 21. Gauci V. Forests and methane: looking beyond carbon for nature-based climate solutions. Environ Res Lett. 2024;19:081005.
- Barthel M, Bauters M, Baumgartner S, Drake TW, Bey NM, Bush G, et al. Low N2O and variable CH4 fluxes from tropical forest soils of the congo basin. Nat Commun. 2022;13:330.
- 23. Megonigal JP, Guenther AB. Methane emissions from upland forest soils and vegetation. Tree Physiol. 2008;28:491–8.
- 24. Pitz S, Megonigal JP. Temperate forest methane sink diminished by tree emissions. New Phytol. 2017;214:1432–9.
- Barba J, Bradford MA, Brewer PE, Bruhn D, Covey K, van Haren J, et al. Methane emissions from tree stems: a new frontier in the global carbon cycle. New Phytol. 2019;222:18–28.
- Bruijnzeel LA, Mulligan M, Scatena FN. Hydrometeorology of tropical montane cloud forests: emerging patterns. Hydrol Process. 2011;25:465–98.
- 27. Salinas N, Cosio EG, Silman M, Meir P, Nottingham AT, Roman-Cuesta RM et al. Editorial: Tropical montane forests in a changing environment. Front Plant Sci. 2021;12.
- Mulligan M. Modeling the tropics-wide extent and distribution of cloud forest and cloud forest loss, with implications for conservation priority. In: Tropical montane cloud forests: Science for conservation and management. 2010:16–38.
- Karger DN, Kessler M, Lehnert M, Jetz W. Limited protection and ongoing loss of tropical cloud forest biodiversity and ecosystems worldwide. Nat Ecol Evol. 2021;5:854–62.

- Bubb P, May I, Miles L. Cloud forest agenda. UNEP-WCMC Biodiversity Series 20. 2004;2004.
- Toledo-Aceves T, Toledo-Garibaldi M. Tree species diversity increases carbon stocks in tropical montane cloud forests across successional stages. Ecol Manag. 2025;578:122480.
- Kappelle M. Tropical montane forests. In: Evans J, Youngquist JA, editors. Encyclopedia of forest sciences. Oxford, United Kingdom: Elsevier; 2004.
- Hooijer A, Page S, Canadell JG, Silvius M, Kwadijk J, Wösten H, et al. Current and future CO<sub>2</sub> emissions from drained peatlands in Southeast Asia. Biogeosciences. 2010;7:1505–14.
- Page SE, Rieley JO, Banks CJ. Global and regional importance of the tropical peatland carbon pool. Glob Change Biol. 2011;17:798–818.
- Leng LY, Ahmed OH, Jalloh MB. Brief review on climate change and tropical peatlands. Geosci Front. 2019;10:373–80.
- Ribeiro K, Pacheco FS, Ferreira JW, de Sousa-Neto ER, Hastie A, Krieger Filho GC, et al. Tropical peatlands and their contribution to the global carbon cycle and climate change. Glob Change Biol. 2021;27:489–505.
- Wong GX, Hirata R, Hirano T, Kiew F, Waili JW, Mander Ü, et al. Impact of land conversion on environmental conditions and methane emissions from a tropical peatland. Sci Total Environ. 2025;962:178466.
- Leifeld J, Menichetti L. The underappreciated potential of peatlands in global climate change mitigation strategies. Nat Commun. 2018;9:1071.
- Mander Ü, Öpik M, Espenberg M. Global peatland greenhouse gas dynamics: state of the art, processes, and perspectives. New Phytol. 2025. https://doi.org /10.1111/nph.20436
- Danevčič T, Mandic-Mulec I, Stres B, Stopar D, Hacin J. Emissions of CO2, CH4 and N2O from Southern European peatlands. Soil Biol Biochem. 2010;42:1437–46.
- Prananto JA, Minasny B, Comeau L-P, Rudiyanto R, Grace P. Drainage increases CO2 and N2O emissions from tropical peat soils. Glob Change Biol. 2020;26:4583–600.
- de Jesús YC, Pavón NP, Briones O, Sánchez-González A, Rodríguez-Laguna R. Belowground carbon stored in a tropical mountain cloud forest of eastcentral Mexico. J Trop Ecol. 2024;40:e20.
- Thauer RK. Biochemistry of methanogenesis: a tribute to marjory Stephenson:1998 marjory Stephenson prize lecture. Microbiology. 1998;144:2377–406.
- Borrel G, Adam PS, McKay LJ, Chen L-X, Sierra-García IN, Sieber CMK, et al. Wide diversity of methane and short-chain alkane metabolisms in uncultured archaea. Nat Microbiol. 2019;4:603–13.
- McDonald IR, Murrell JC. The particulate methane monooxygenase gene PmoA and its use as a functional gene probe for methanotrophs. FEMS Microbiol Lett. 1997;156:205–10.
- Koo W, Rosenzweig CC. Biochemistry of aerobic biological methane oxidation. Chem Soc Rev. 2021;50:3424–36.
- Raghoebarsing AA, Pol A, van de Pas-Schoonen KT, Smolders AJP, Ettwig KF, Rijpstra WIC, et al. A microbial consortium couples anaerobic methane oxidation to denitrification. Nature. 2006;440:918–21.
- Ettwig KF, Butler MK, Le Paslier D, Pelletier E, Mangenot S, Kuypers MMM, et al. Nitrite-driven anaerobic methane oxidation by oxygenic bacteria. Nature. 2010;464:543–8.
- Haroon MF, Hu S, Shi Y, Imelfort M, Keller J, Hugenholtz P, et al. Anaerobic oxidation of methane coupled to nitrate reduction in a novel archaeal lineage. Nature. 2013;500:567–70.
- Margenat H, Le Roux G. POST EXPEDITION REPORT Field Expedition La Réunion Island, France ATMO-PLASTIC Project. Zenodo; 2023.
- Roux GL, Ah-Peng C, Liu R, Hagelskjaer O, Margenart H, Sonke J, et al. Sphagnum peatlands of reunion Island: potential and limitations as environmental archives for the quaternary of the Indian ocean. Copernicus Meetings; 2024.
- Soosaar K, Mander Ü, Maddison M, Kanal A, Kull A, Lõhmus K, et al. Dynamics of gaseous nitrogen and carbon fluxes in riparian alder forests. Ecol Eng. 2011;37:40–53.
- Loftfield N, Flessa H, Augustin J, Beese F. Automated gas chromatographic system for rapid analysis of the atmospheric trace gases methane, carbon dioxide, and nitrous oxide. J Environ Qual. 1997;26:560–4.
- Ranniku R, Mander Ü, Escuer-Gatius J, Schindler T, Kupper P, Sellin A, et al. Dry and wet periods determine stem and soil greenhouse gas fluxes in a Northern drained peatland forest. Sci Total Environ. 2024;928:172452.
- APHA-AWWA-WEF. editor. Standard methods for the examination of water and wastewater. 23rd edition. Washington, DC: American Public Health Association; 2005.

- Espenberg M, Truu M, Mander Ü, Kasak K, Nõlvak H, Ligi T, et al. Differences in microbial community structure and nitrogen cycling in natural and drained tropical peatland soils. Sci Rep. 2018;8:4742.
- 57. The jamovi. project. jamovi. 2023.
- 58. Patil I. Visualizations with statistical details: the Ggstatsplot approach. J Open Source Softw. 2021;6:3167.
- 59. Posit team. RStudio: Integrated Development Environment for R. 2024.
- 60. Rosseel Y. Lavaan: an R package for structural equation modeling. J Stat Softw. 2012;48:1–36.
- Liu L, Estiarte M, Peñuelas J. Soil moisture as the key factor of atmospheric CH4 uptake in forest soils under environmental change. Geoderma. 2019;355:113920.
- 62. Tian W, Wang R, Wang H, Xiang X, Huang X. Hydrology drives Spatiotemporal patterns of methane microbial communities and methane emissions in a sub-alpine peatland, central China. Agric Meteorol. 2024;353:110050.
- Abdalla M, Hastings A, Truu J, Espenberg M, Mander Ü, Smith P. Emissions of methane from Northern peatlands: a review of management impacts and implications for future management options. Ecol Evol. 2016;6:7080–102.
- Nazaries L, Karunaratne SB, Delgado-Baquerizo M, Campbell CD, Singh BK. Environmental drivers of the geographical distribution of methanotrophs: insights from a National survey. Soil Biol Biochem. 2018;127:264–79.
- Aronson E, Allison S, Helliker BR. Environmental impacts on the diversity of methane-cycling microbes and their resultant function. Front Microbiol. 2013;4.
- 66. Gontijo JB, Paula FS, Bieluczyk W, França AG, Navroski D, Mandro JA, et al. Methane-cycling microbial communities from Amazon floodplains and upland forests respond differently to simulated climate change scenarios. Environ Microbiome. 2024;19:48.
- 67. Gong Y, Sun F, Wang F, Lai DYF, Zhong Q, Li Y, et al. Seven years of wetter and delayed wet season enhanced soil methane uptake during the dry season in a tropical monsoon forest. CATENA. 2021;203:105276.
- Shi Y, Ma Q, Kuzyakov Y, Sheng L, Liu H, Wang Z. Nitrite-dependent anaerobic oxidation decreases methane emissions from peatlands. Soil Biol Biochem. 2022;169:108658.
- 69. Pornon A, Escaravage N, Lamaze T. Complementarity in mineral nitrogen use among dominant plant species in a subalpine community. Am J Bot. 2007;94:1778–85.
- Lou J, Lv J, Yang D. Effects of environmental factors on Nitrate-DAMO activity. Water Air Soil Pollut. 2020;231:263.
- Bergmann GT, Bates ST, Eilers KG, Lauber CL, Caporaso JG, Walters WA, et al. The under-recognized dominance of *Verrucomicrobia* in soil bacterial communities. Soil Biol Biochem. 2011;43:1450–5.
- Dunfield PF, Yuryev A, Senin P, Smirnova AV, Stott MB, Hou S, et al. Methane oxidation by an extremely acidophilic bacterium of the phylum Verrucomicrobia. Nature. 2007;450:879–82.
- Pol A, Heijmans K, Harhangi HR, Tedesco D, Jetten MSM. Op Den camp HJM. Methanotrophy below pH 1 by a new Verrucomicrobia species. Nature. 2007;450:874–8.
- Hakobyan A, Liesack W. Unexpected metabolic versatility among type II methanotrophs in the Alphaproteobacteria. Biol Chem. 2020;401:1469–77.
- Cantera S, Rodríguez E, Santaella Vecchini N, López JC, García-Encina PA, Sousa DZ, et al. Resilience and robustness of alphaproteobacterial methanotrophs upon methane feast-famine scenarios. Environ Res. 2023;239:117376.
- Tian W, Wang H, Xiang X, Loni PC, Qiu X, Wang R, et al. Water table level controls methanogenic and methanotrophic communities and methane emissions in a Sphagnum-dominated peatland. Microbiol Spectr. 2023;11:e01992–23.
- Wang Z-P, Han S-J, Li H-L, Deng F-D, Zheng Y-H, Liu H-F, et al. Methane production explained largely by water content in the Heartwood of living trees in upland forests. J Geophys Res Biogeosciences. 2017;122:2479–89.
- Guerrieri R, Vanguelova El, Michalski G, Heaton THE, Mencuccini M. Isotopic evidence for the occurrence of biological nitrification and nitrogen deposition processing in forest canopies. Glob Change Biol. 2015;21:4613–26.
- Guerrieri R, Cáliz J, Mattana S, Barceló A, Candela M, Elustondo D, et al. Substantial contribution of tree canopy nitrifiers to nitrogen fluxes in European forests. Nat Geosci. 2024;17:130–6.
- Watanabe K, Kohzu A, Suda W, Yamamura S, Takamatsu T, Takenaka A, et al. Microbial nitrification in throughfall of a Japanese Cedar associated with archaea from the tree canopy. SpringerPlus. 2016;5:1596.
- Vacher C, Hampe A, Porté AJ, Sauer U, Compant S, Morris CE. The Phyllosphere: Microbial jungle at the plant–climate interface. Annu Rev Ecol Evol Syst. 2016;47 Volume 47, 2016:1–24.

- Moisan M-A, Maire V, Morency M-J, Martineau C. Tree tissues and species traits modulate the microbial methane-cycling communities of the tree phyllosphere. 2025.
- Iguchi H, SATO, Izuru SAKAKIBARA, Maiko YURIMOTO, Hiroya. Distribution of methanotrophs in the phyllosphere. Biosci Biotechnol Biochem. 2012;76:1580–3.

#### **Publisher's note**

Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.