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# More Enhanced Non-growing Season Methane Exchanges under Warming on the Qinghai-Tibetan Plateau

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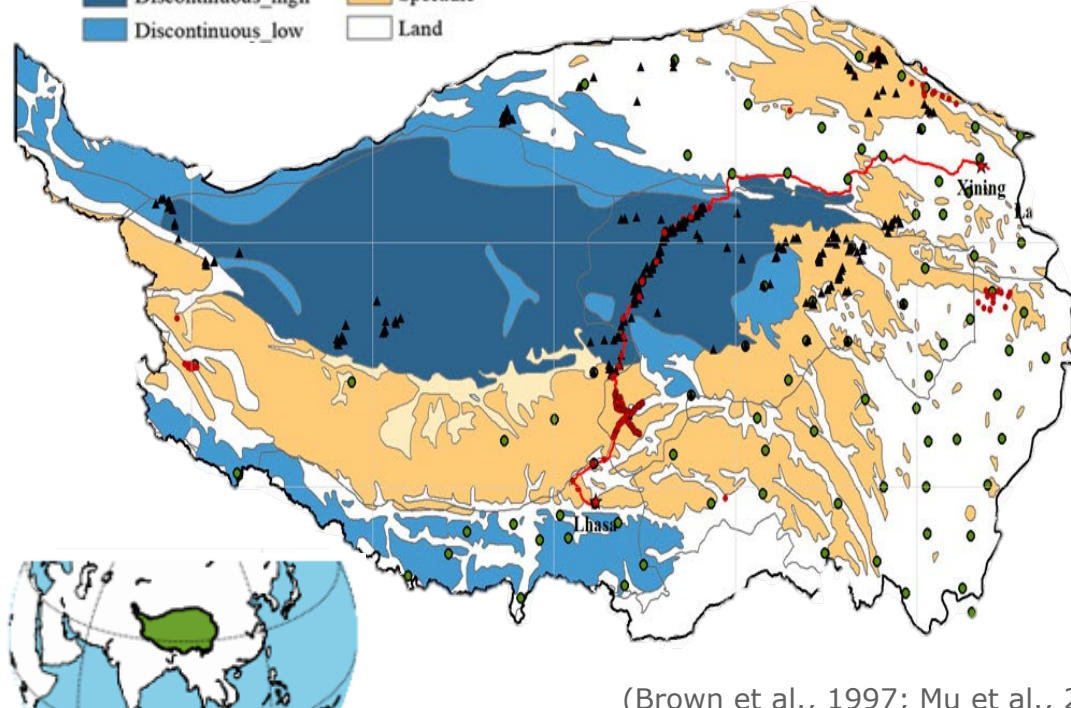
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# The largest area of alpine permafrost in the world

the ground that remains below 0 °C for at least two consecutive years.

— Qinghai-Tibet Railway  
■ Discontinuous\_high  
■ Discontinuous\_low  
■ Isolated  
■ Sporadic  
□ Land



(Brown et al., 1997; Mu et al., 2015)

Permafrost underlies approximately

## 40.2%

Seasonal frozen soil underlies approximately

## 56.0%

on the QTP



QTP permafrost zone contains about

## 28 Pg

of carbon

## 2 x

as much carbon as the atmosphere

## 3 x

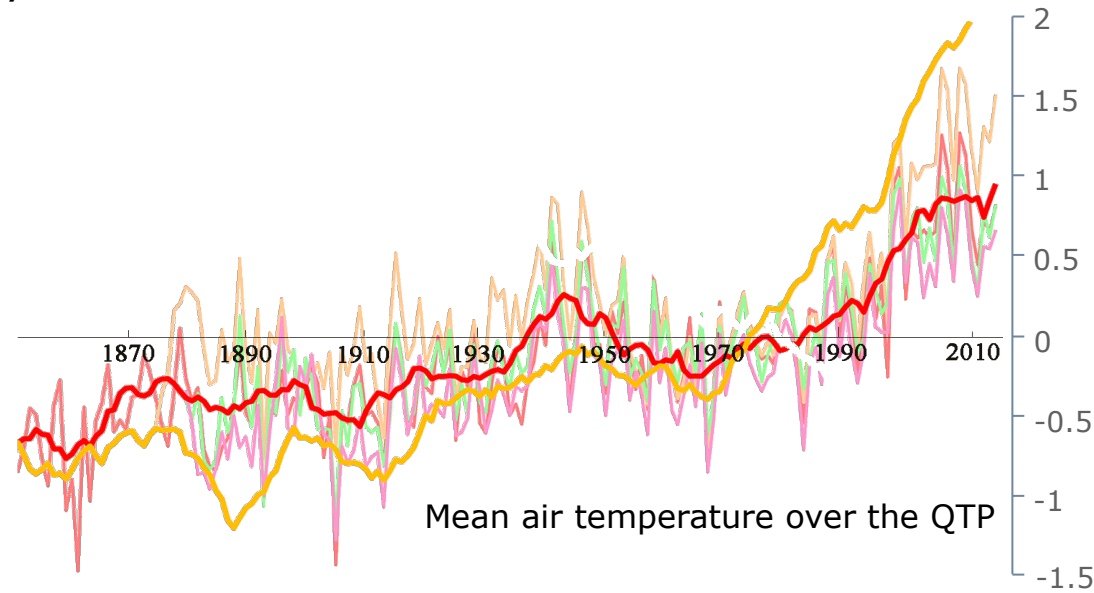
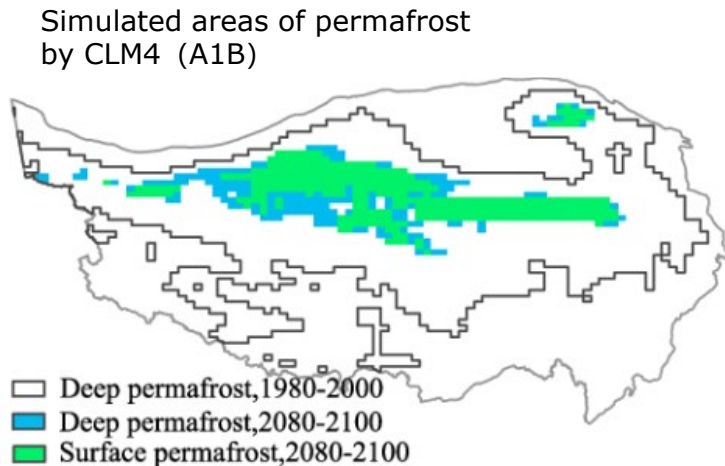
more than is in the terrestrial vegetation



## Carbon pool

# The degradation of permafrost

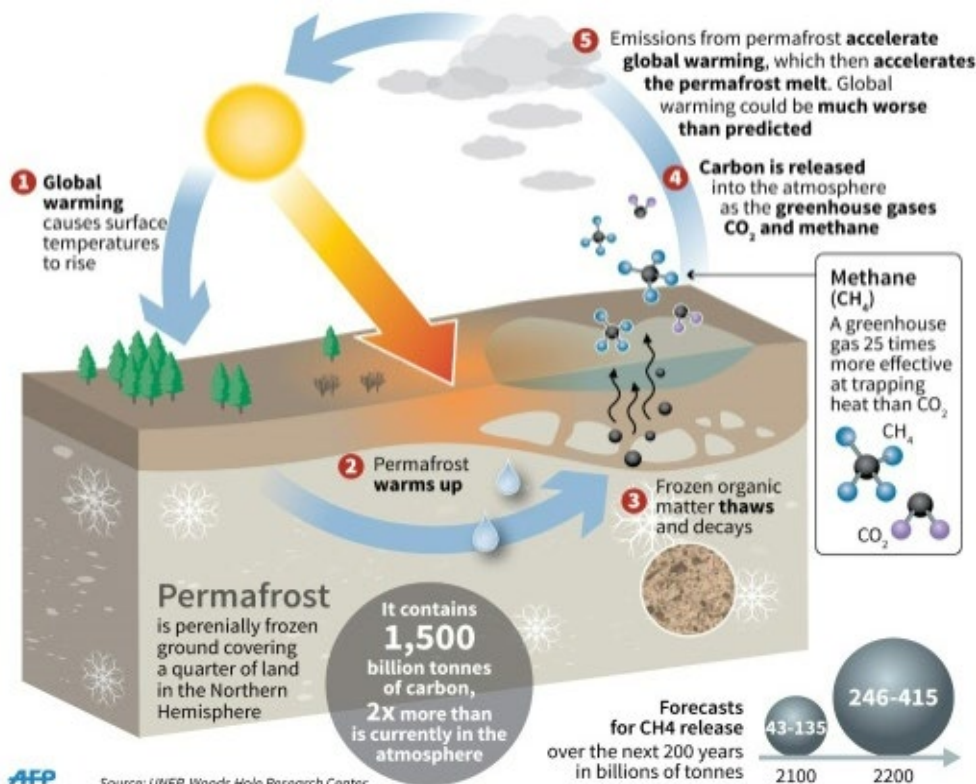
- **Accelerated warming:**  $\sim 0.3 \text{ }^\circ\text{C decade}^{-1}$  from 1960s, faster than the global mean ( $0.05\text{-}0.08 \text{ }^\circ\text{C decade}^{-1}$ ).
- **Continuous degradation:**  $6.6 \times 10^4 \text{ km}^2 \text{ decade}^{-1}$  from 1980s on the QTP.
- **Future reduction:** **81%** for the cumulative reduction of the permafrost area in medium emission scenario (A1B) by 2100.



# Timebomb

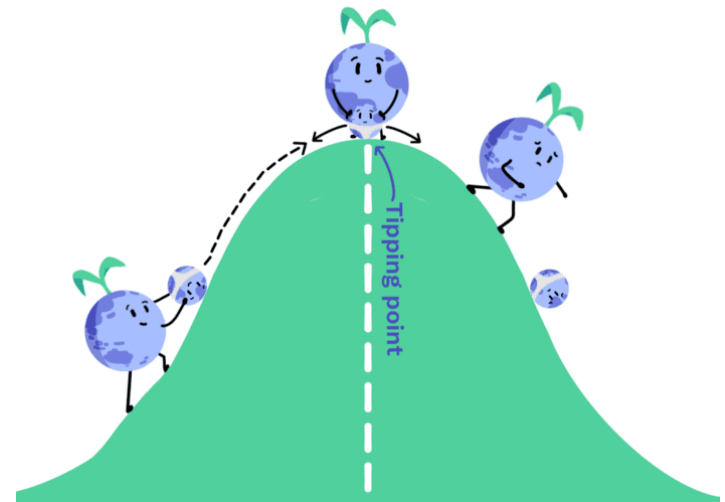
When permafrost thaws it releases carbon into the atmosphere in the form of **Carbon Dioxide (CO<sub>2</sub>)** and **Methane (CH<sub>4</sub>)**.

These greenhouse gases accelerate global warming, which then speeds up the permafrost thaw.



## Tipping point

would lead to uncontrolled climate change



# Methane budget

## Alpine wetlands

~36% of China's natural wetlands area  
fen, marshes, and peatlands

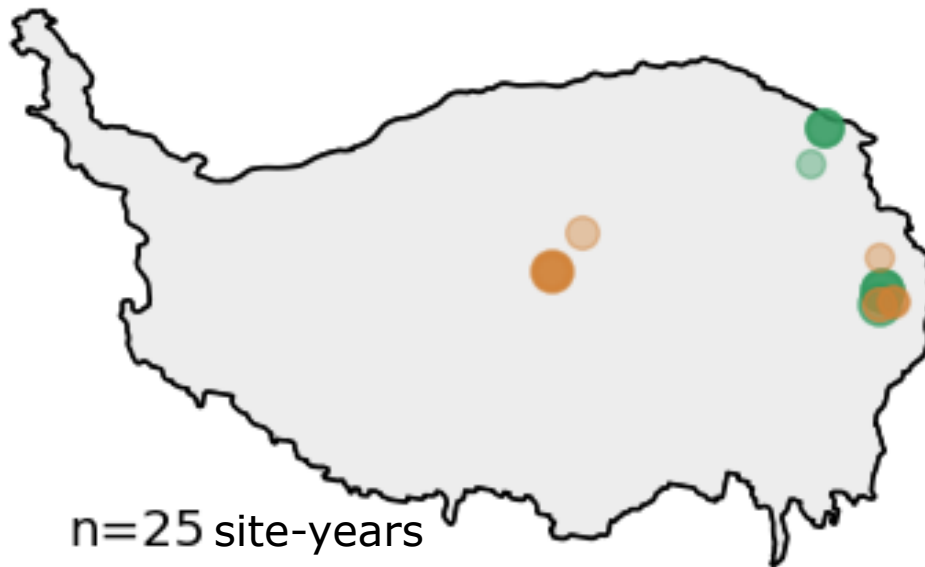
**0.16-2.37 Tg C yr<sup>-1</sup>**  
**Methane source**



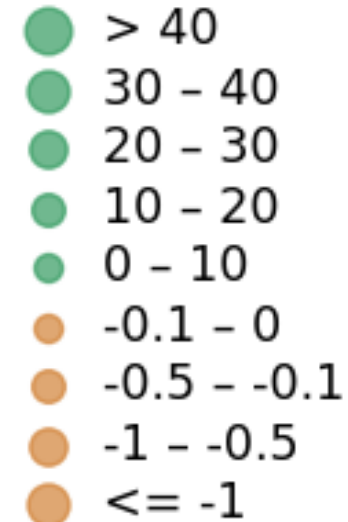
## Alpine grassland

~40% of China's grassland area  
steppes and meadows

**-0.55-0.10 Tg C yr<sup>-1</sup>**  
**Methane sink**



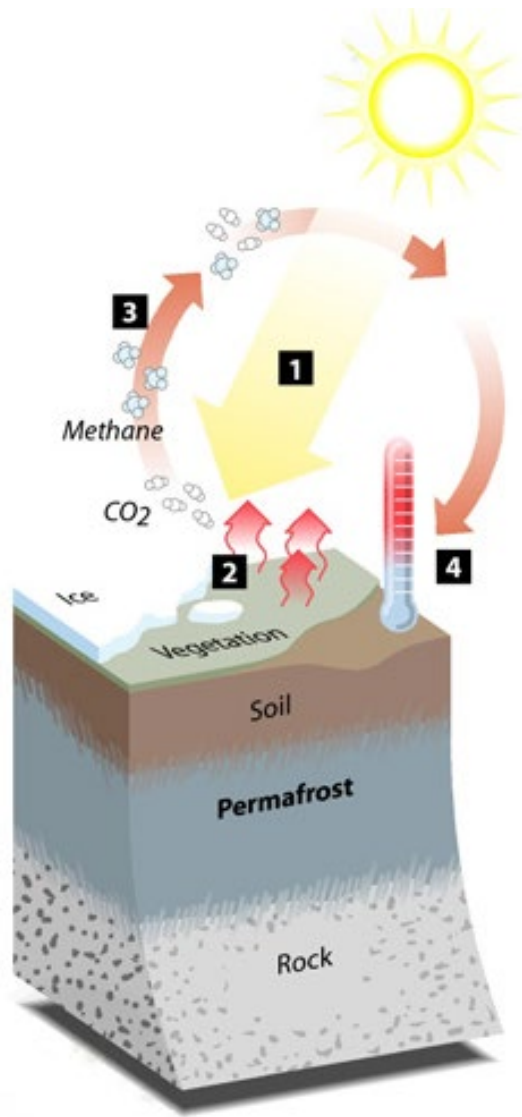
Annual CH<sub>4</sub> flux  
(g C m<sup>-2</sup> a<sup>-1</sup>)



**The methane budget of wetland and grassland  
on the QTP are still uncertain!**



# Increasing uncertainty of CH<sub>4</sub> budget



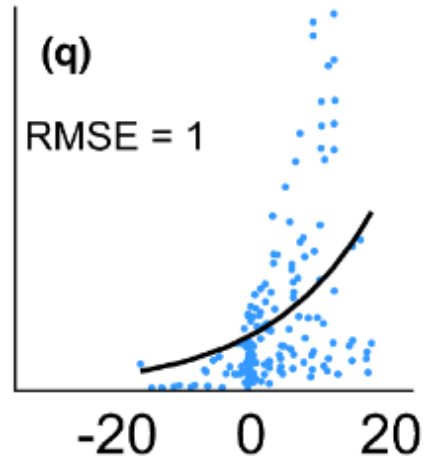
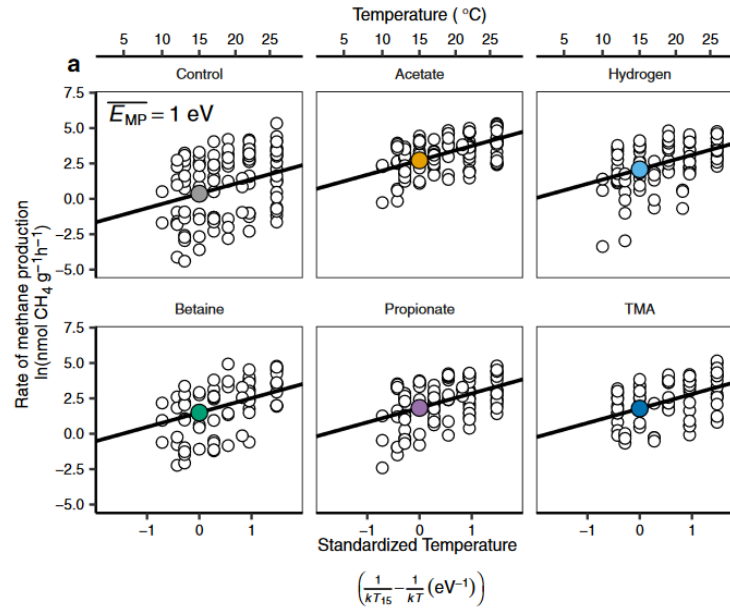
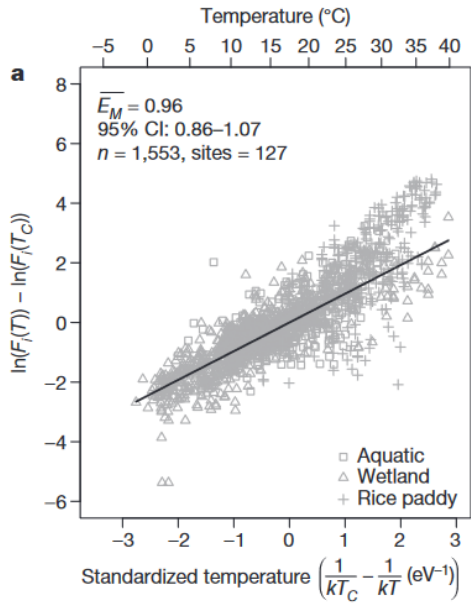
## Climate warming

- Under RCP4.5 and RCP8.5 scenarios, the carbon release in permafrost area of QTP at 2100 is  $\sim 1.86 \pm 0.49$  Pg and  $\sim 3.80 \pm 0.76$  Pg, respectively.

## Permafrost degradation

- Wetlands and grasslands on the QTP both experiencing continued shrinkage or expansion propelled by rapid climate change and permafrost thaw.

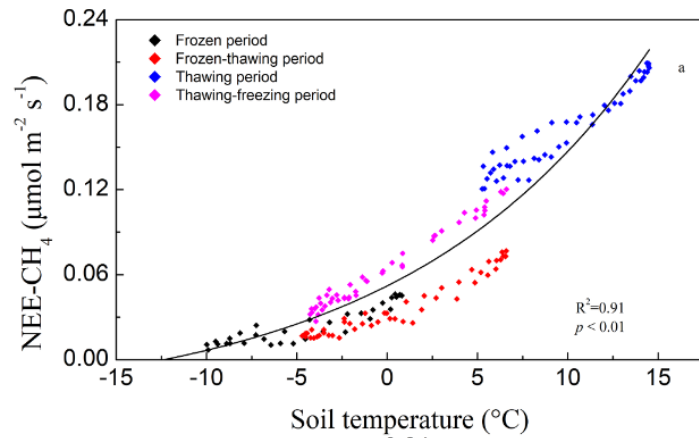
# CH<sub>4</sub> emissions increasing as warming



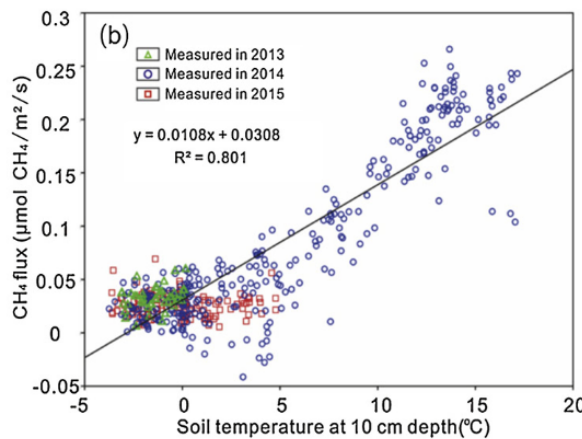
(Yvon-Durocher et al., 2014, *Nature*)

(Zhu et al., 2022, *Nat Commun*)

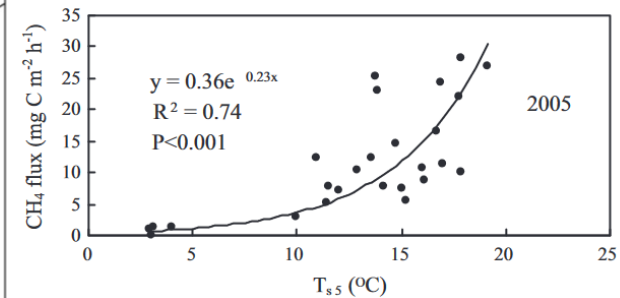
(Watts et al., 2023, *GCB*)



(Chen et al., 2021, *AFM*)



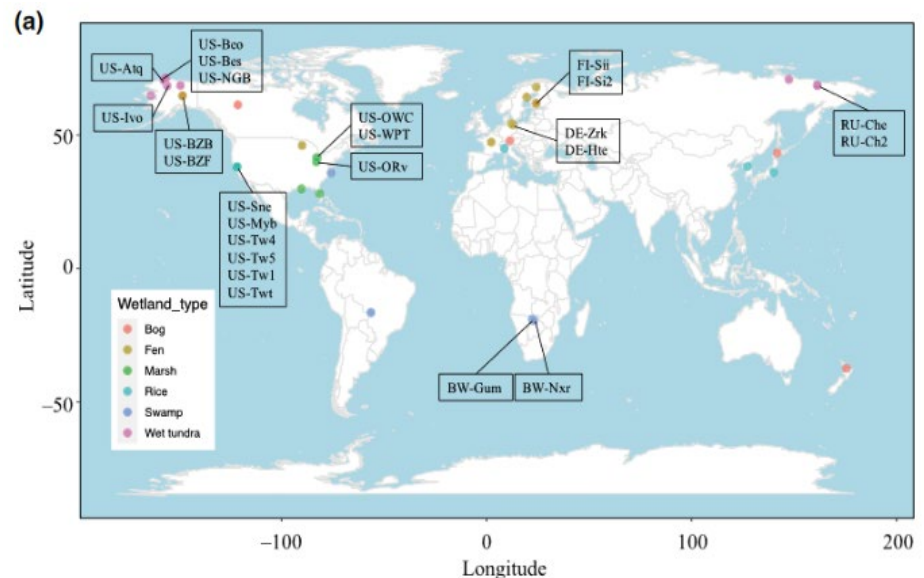
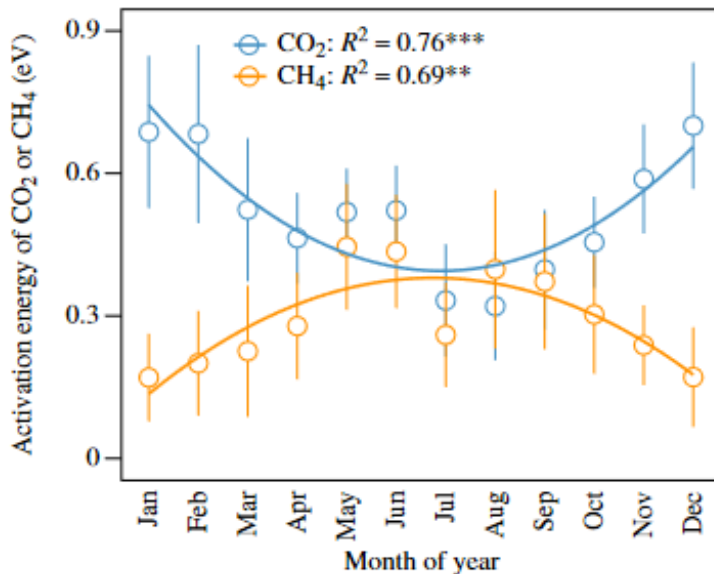
(Peng et al., 2019, *AFM*)



(Song et al., 2011, *AFM*)

# Seasonality of global CH<sub>4</sub> response to warming

- Research based on global measurements shows that **the sensitivity of CH<sub>4</sub> emission from wetlands is correlated with soil temperatures**, and reach the maximum in summer.
- This study is based on FLUXNET database, but **lacking the measurements on the QTP.**

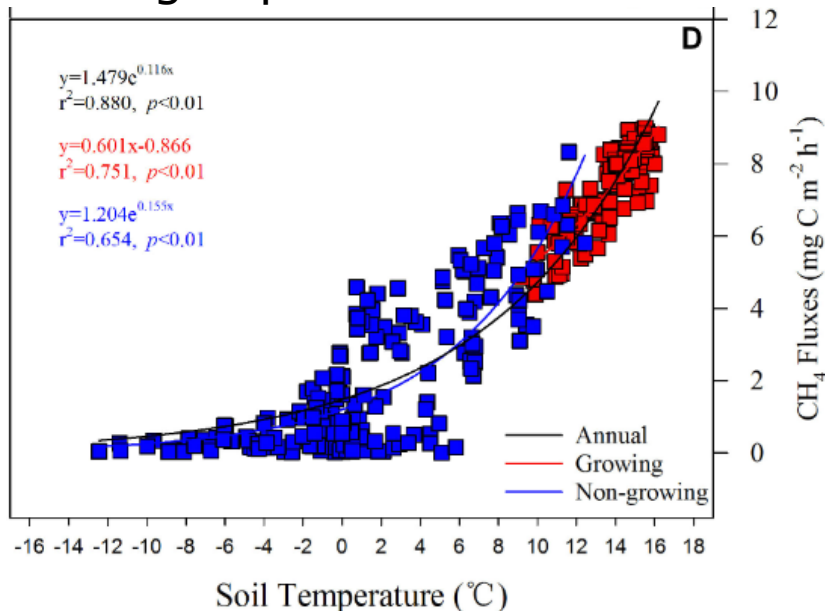




# Seasonality of CH<sub>4</sub> response to warming on the QTP

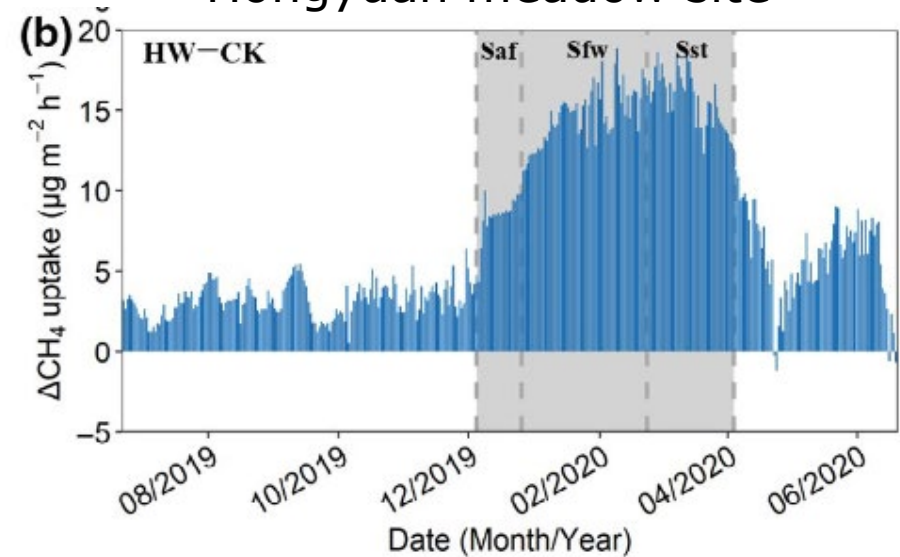
- The warming response of CH<sub>4</sub> exchange in winter and spring was greater than that in summer and autumn.

Riganqiao wetland site



(Zhang et al., 2020, *Frontiers in Earth Science*)

Hongyuan meadow site



(Peiyan Wang et al., 2020, *GCB*)

**We suspect that seasonality of CH<sub>4</sub> response to warming on the QTP differs from that from global measurements.**

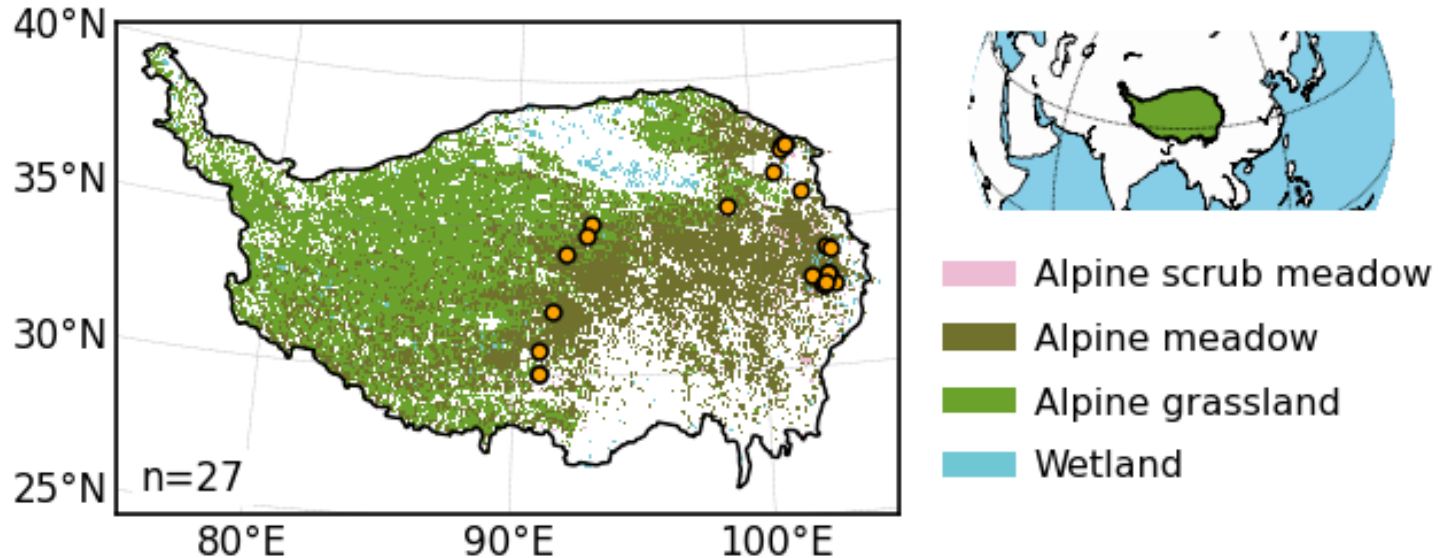
# Questions

- What is the general pattern of seasonal temperature dependencies of wetland and grassland CH<sub>4</sub> fluxes on the QTP?
- How does the seasonality affect CH<sub>4</sub> source/sink in wetlands and grasslands on the QTP with soil warming?

# Meta analysis

**11 wetland sites, 16 grassland sites**

9,745 daily observations



## Variations of CH<sub>4</sub> fluxes with Ts

- ① Soil temperature-CH<sub>4</sub> fitting
- ② Temperature dependent calculation

## Warming impacts on CH<sub>4</sub> exchange

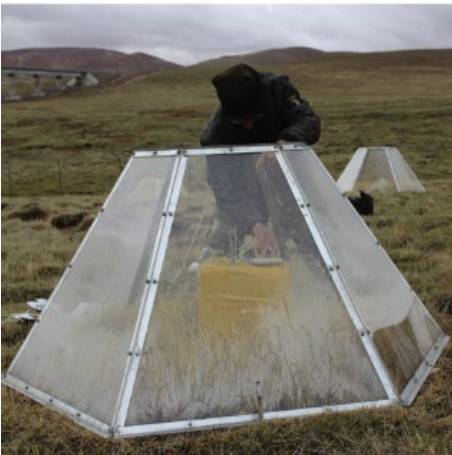
- ③ Control experiment
- ④ Machine learning modeling

# Data collection

## Manual Static Chamber (MSC)

17 sites

once per day, once per week, or once per month



## Continuous Automated Chamber (CAC)

2 sites

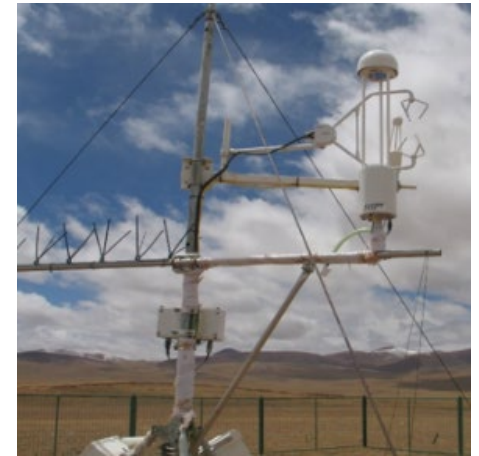
Once per 30 minutes or every per hour



## Eddy Covariance (EC)

8 sites

Once per 30 minutes or every per hour

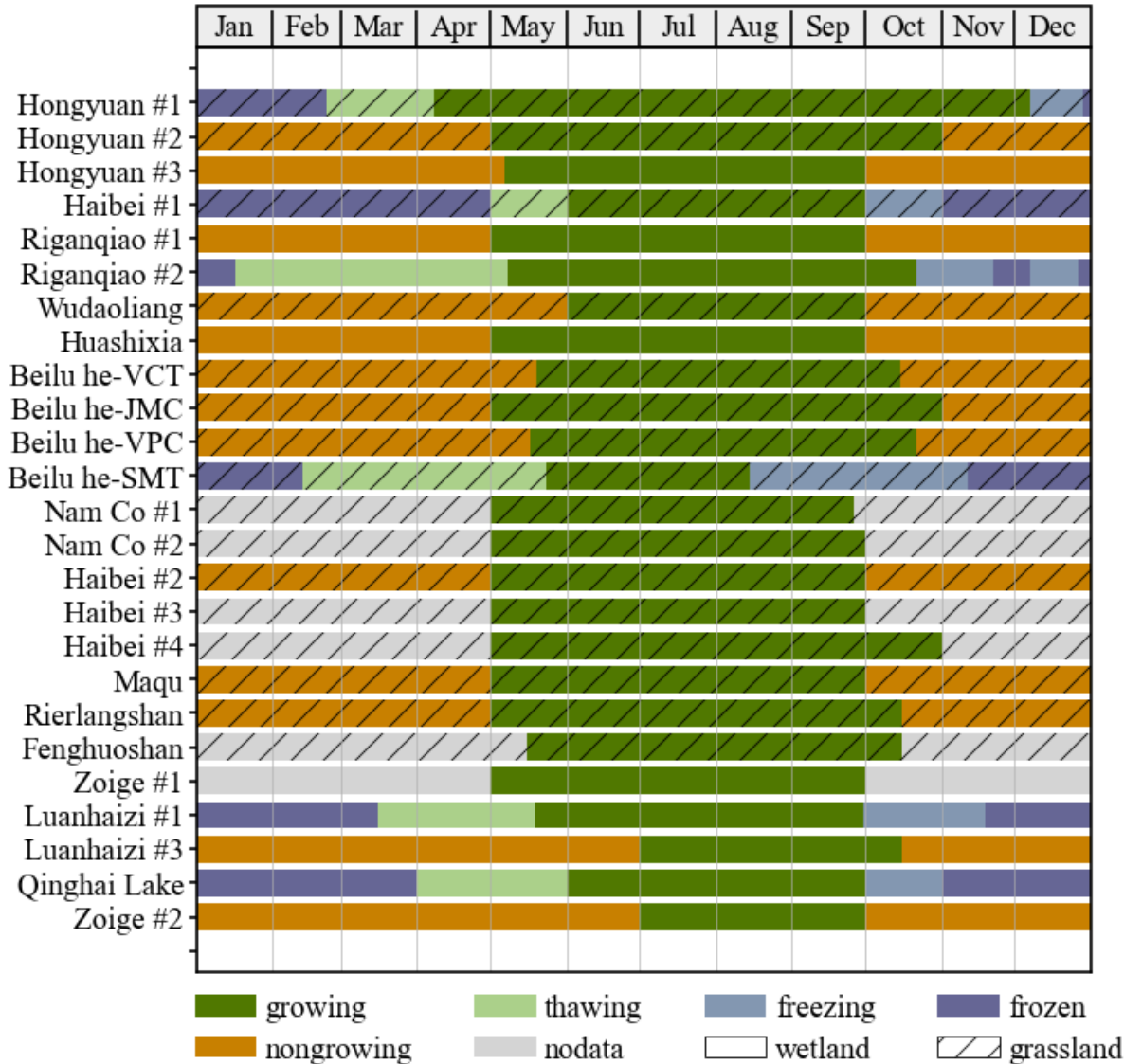


7 sites: raw data

2 sites: replicable text

18 sites: extracted by GetData

# Seasonal division



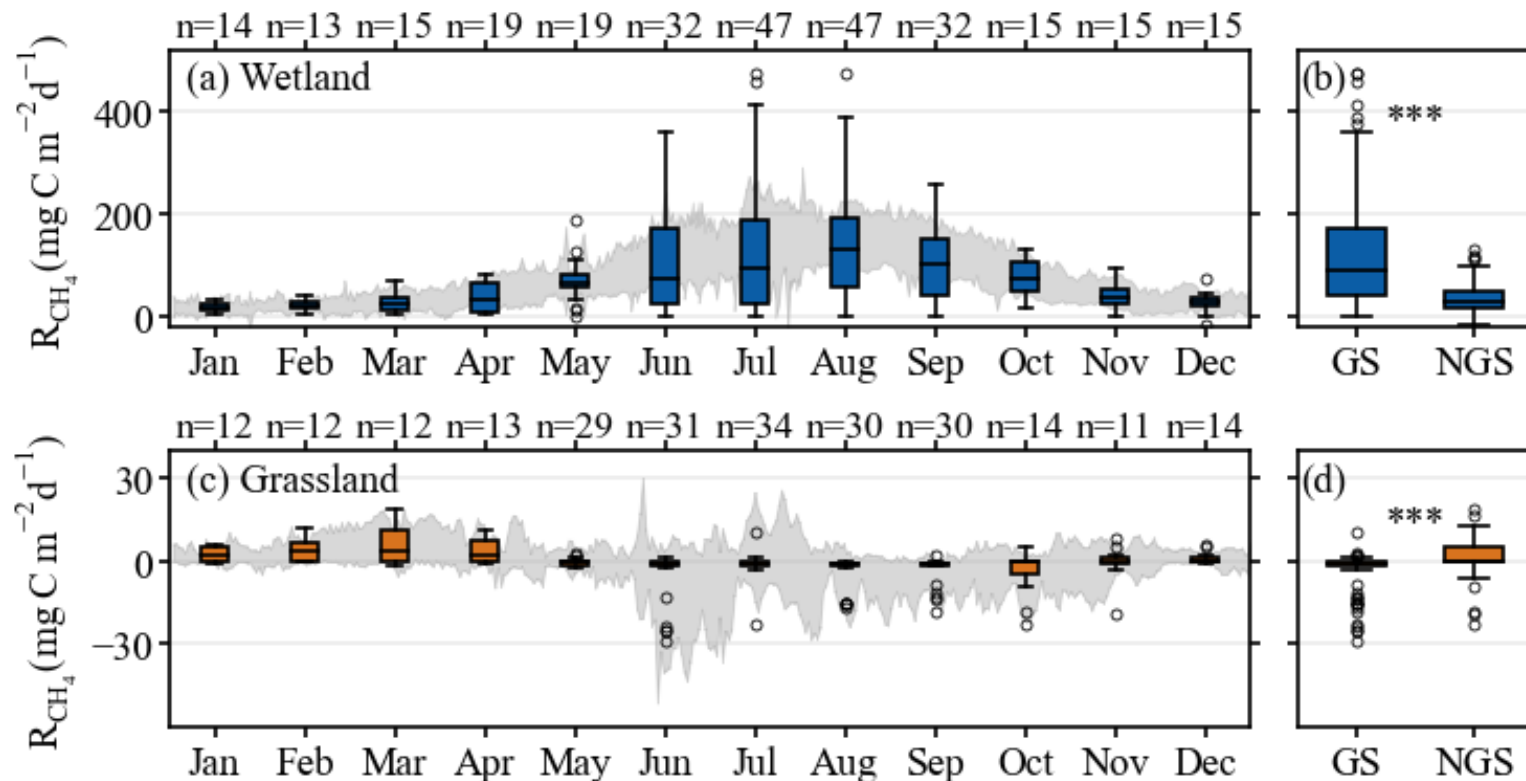
## Major seasonal division methods for CH<sub>4</sub>-related studies in the QTP:

- Soil temperature variation
- Julia day
- Vegetation phenological
- microbial activity



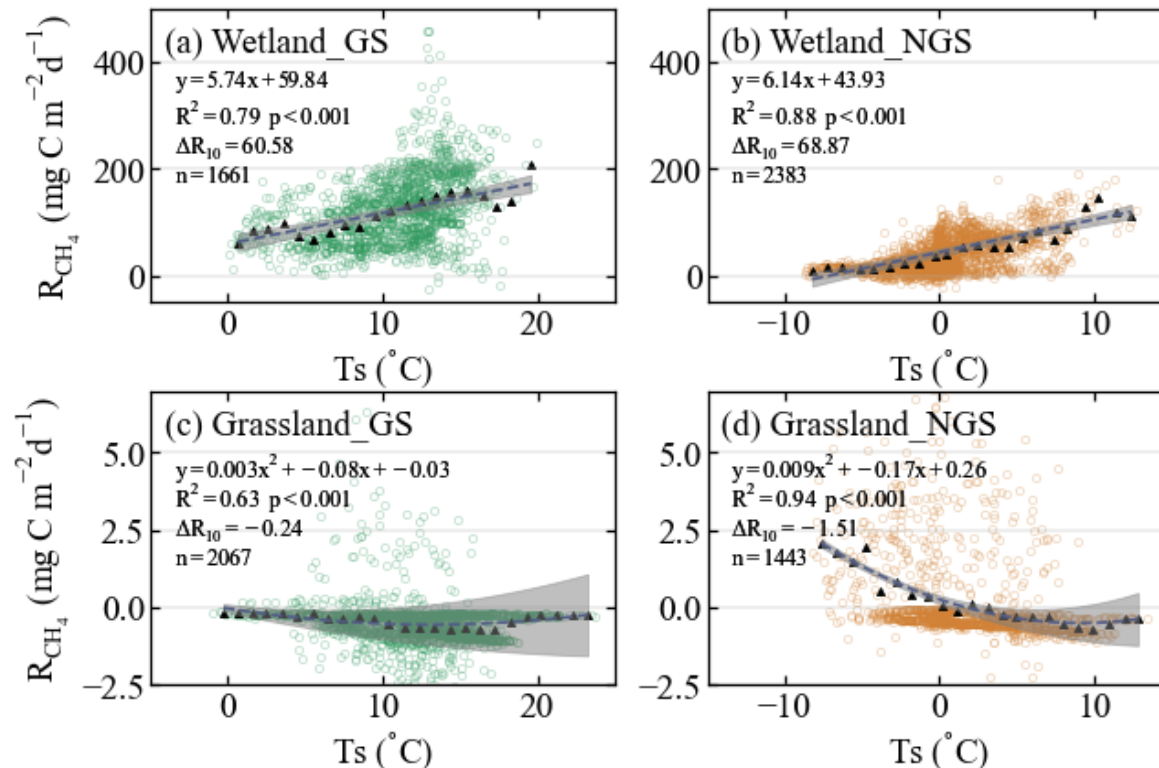
# Source and sink of CH<sub>4</sub> on the QTP

- Wetland is the CH<sub>4</sub> source;
- Grassland is the CH<sub>4</sub> sink in the growing season and the CH<sub>4</sub> source in the non-growing season.



# Soil temperature-CH<sub>4</sub> fitting

- CH<sub>4</sub> flux showed significant linear or nonlinear relationship with soil temperature in both growing and non-growing season.
- The absolute value of  $\Delta R_{10}$  in non-growing season was greater than that in growing season.



$\Delta R_{10}$ : the changes of CH<sub>4</sub> exchange for every 10°C rise in the soil temperature.

# Temperature dependence

## Boltzmann-Arrhenius function

$$\ln R_i(T) = (\bar{E} + \epsilon_E^i) \left( \frac{1}{kT_C} - \frac{1}{kT} \right) + \overline{\ln R(T_C)} + \epsilon_R^i$$

- The mixed-effects models could make up for the shortcomings of fitting analysis that is not conducive to multi-site integration analysis and **find the consistent law from the differences of multi-sites.**
- A larger activation energy indicates higher sensitivity to temperature changes.

Published: 19 March 2014

## Methane fluxes show consistent temperature dependence across microbial to ecosystem scales

[Gabriel Yvon-Durocher](#) , [Andrew P. Allen](#), [David Bastviken](#), [Ralf Conrad](#), [Cristian Gudasz](#), [Annick St-Pierre](#), [Nguyen Thanh-Duc](#) & [Paul A. del Giorgio](#)

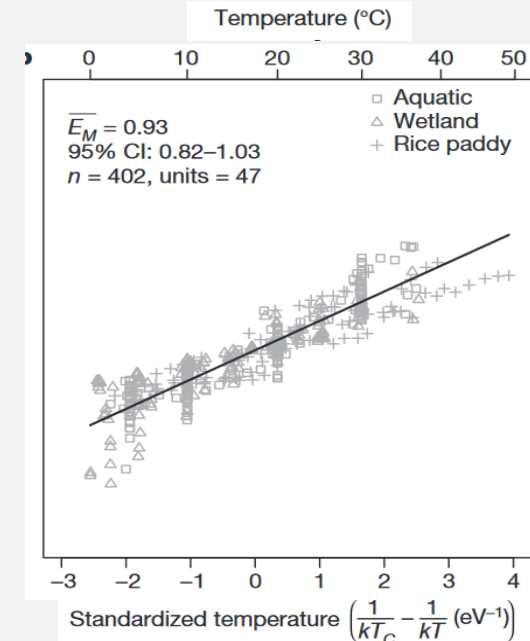
*Nature* 507, 488–491 (2014) | [Cite this article](#)

Article | Published: 09 August 2021

## Differences in the temperature dependence of wetland CO<sub>2</sub> and CH<sub>4</sub> emissions vary with water table depth

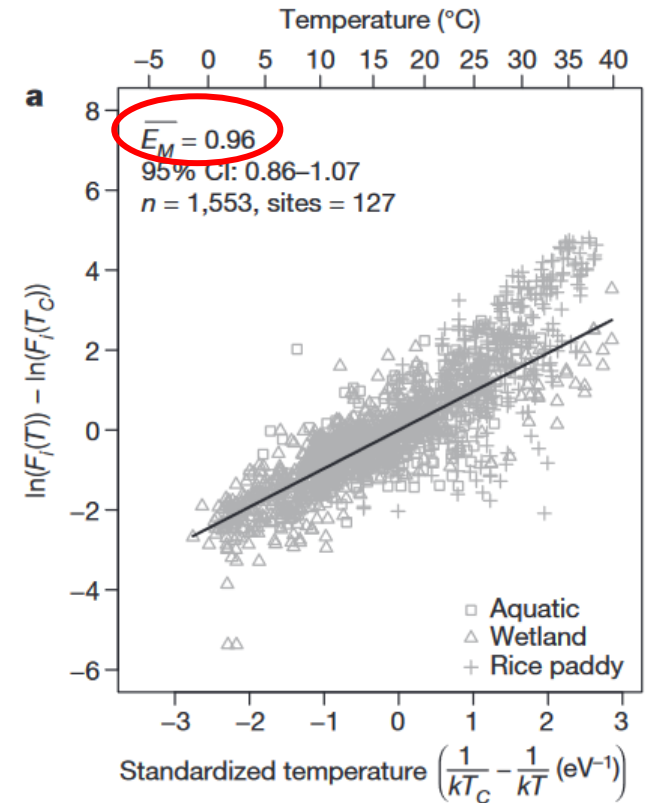
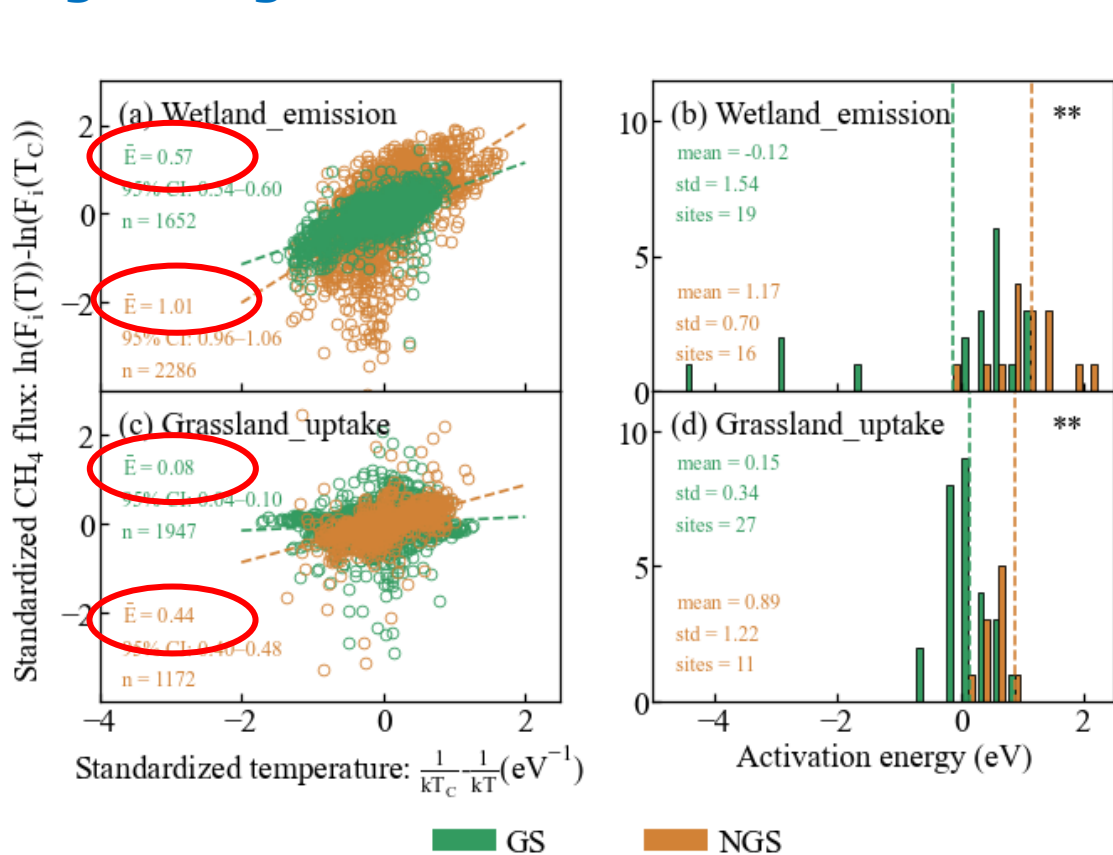
[Hongyang Chen](#), [Xiao Xu](#), [Changming Fang](#), [Bo Li](#) & [Ming Nie](#) 

*Nature Climate Change* 11, 766–771 (2021) | [Cite this article](#)



# Temperature dependence

- The temperature dependence of **wetland CH<sub>4</sub> emission and grassland CH<sub>4</sub> absorption** was stronger in non-growing season than in growing season.



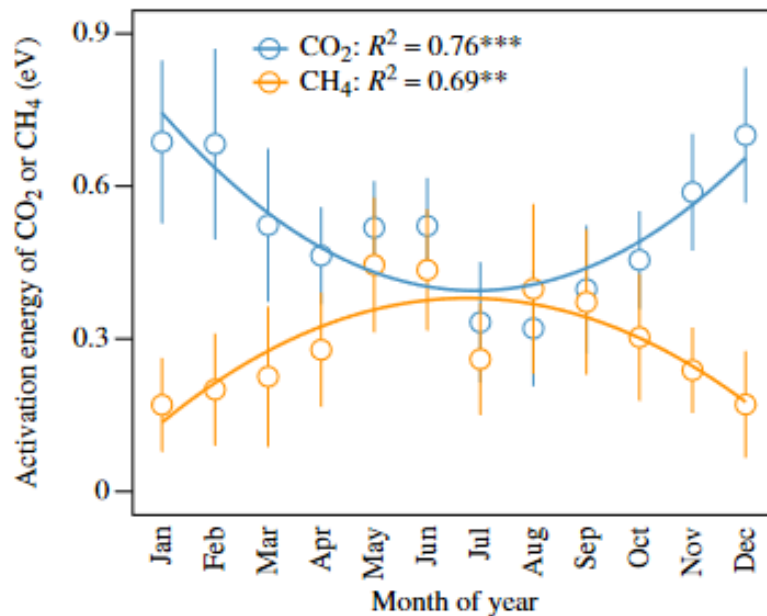
(Yvon-Durocher et al., 2014, *Nature*)

**QTP**

**Global**

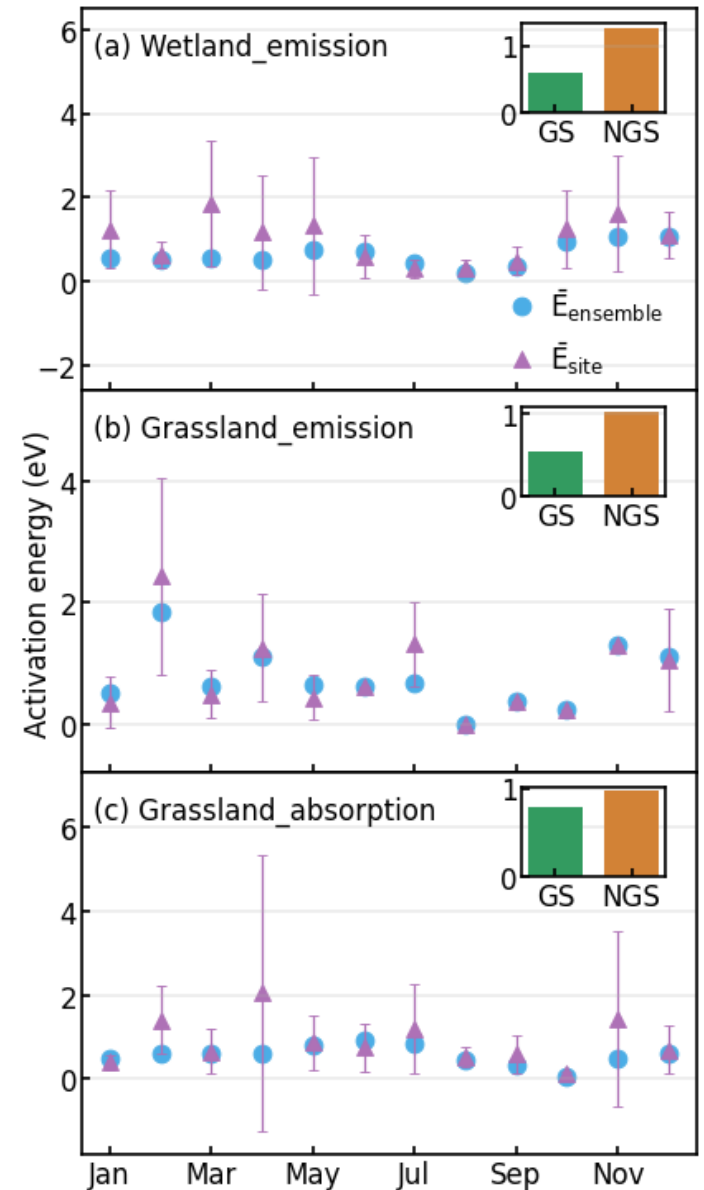
# Temperature dependent seasonality differ with global

- The  $\text{CH}_4$  temperature dependence of QTP wetland and grassland was stronger than that in the non-growing season.



(Li et al., 2023, GCB)

**Global (without QTP)**



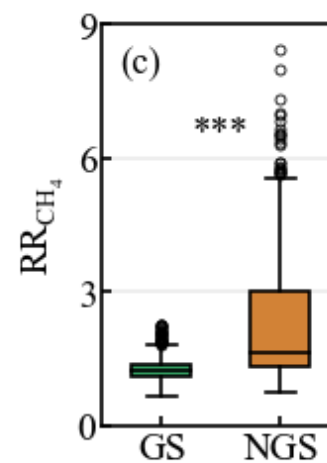
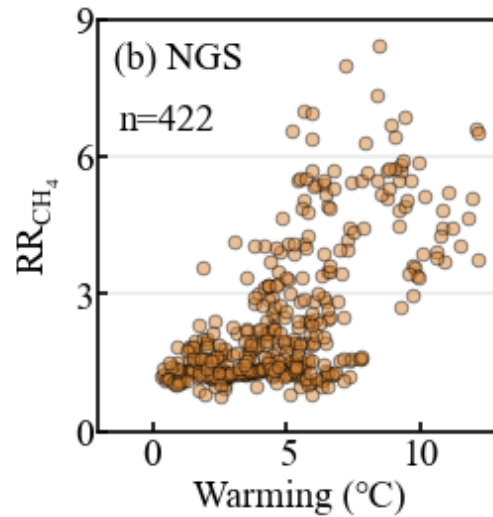
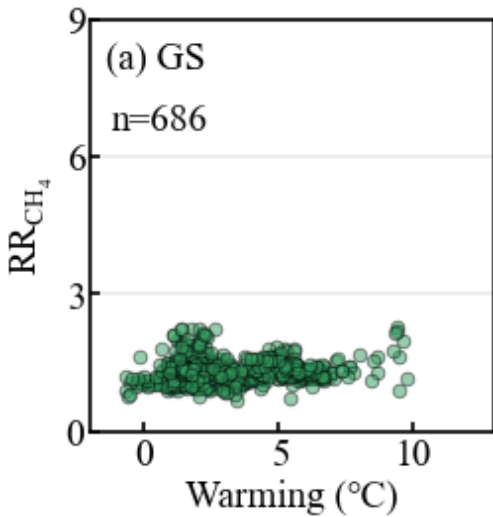
**QTP**



# Control experiment

- **Integrated analysis of three warming experiments on grasslands;**

|                                        | <b>growing season</b> | <b>non-growing season</b> |
|----------------------------------------|-----------------------|---------------------------|
| average warming magnitude              | 2.90±1.78°C           | 4.26±2.33°C               |
| average change rate of CH <sub>4</sub> | 1.29±0.24 times       | 1.77±0.93 times           |



Hongyuan: Western QTP  
(Wang et al., 2021, AFM)  
(Wang et al., 2022, GCB)

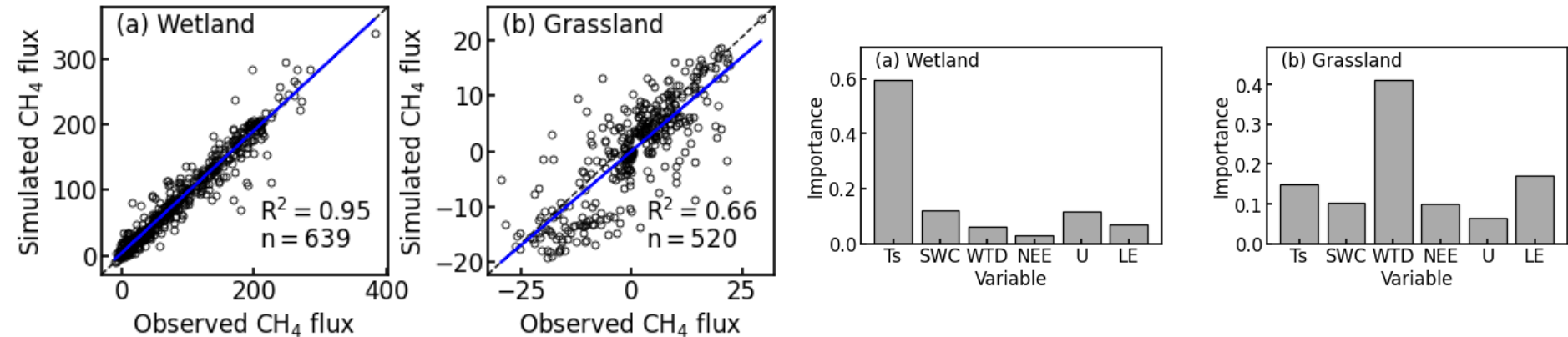
FenghuoShan: Central QTP  
(Chen et al., 2017, STTE)

$$RR_{CH_4} = R_{CH_4\_warming} / R_{CH_4\_control}$$

**Soil warming and the response of CH<sub>4</sub> in non-growing season were stronger than those in growing season.**

# Machine learning modeling

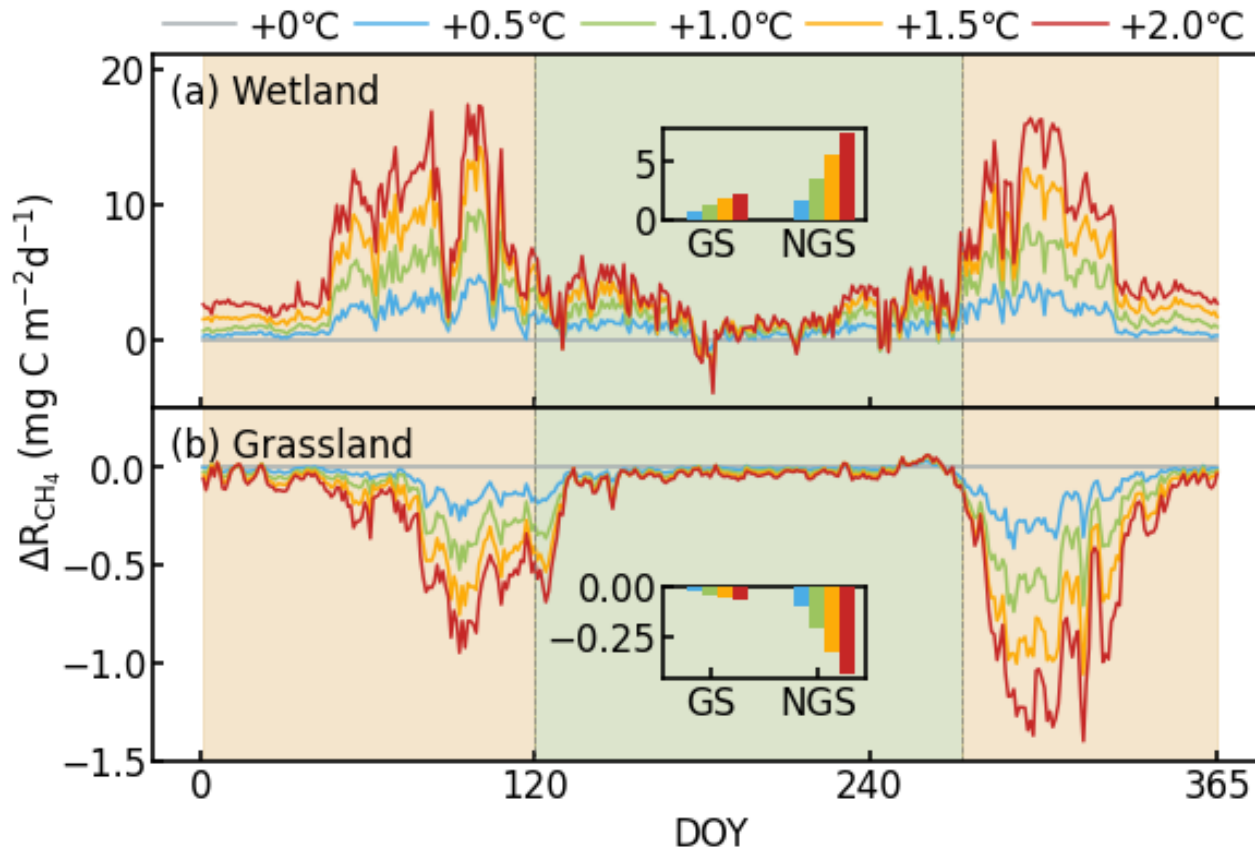
**Random forest** method was used to train and fit the relationship between environmental impact indicators and methane flux.



| Variables | Mechanistic relationship                                                              | Description of regional data                                                        |
|-----------|---------------------------------------------------------------------------------------|-------------------------------------------------------------------------------------|
| NEP       | Net ecosystem productivity (carbon substrates and respiration)                        | Net ecosystem productivity simulated by BEPS model (daily, 1981–2019; 8 km, global) |
| WTH       | Water table height (anaerobic condition or barrier for the CH <sub>4</sub> transport) | Groundwater table depth (monthly, single year; 1 km, global)                        |
| SWC       | Soil water content                                                                    | ERA5-Land volumetric soil water layer 1 (hourly, 1950–2023; 0.1°, global)           |
| Ts        | Soil temperature (enzyme kinetics)                                                    | ERA5-Land soil temperature level 1 (hourly, 1950–2023; 0.1°, global)                |
| U         | Friction velocity (CH <sub>4</sub> transport related to turbulence)                   | CRU-JRA v2.2 wind speed (6-hourly, 1901–2019; 0.5°, global)                         |
| LE        | Latent heat flux (plant-mediated CH <sub>4</sub> transport related to transpiration)  | MODIS MOD16A2 Version 6 Latent Heat Flux (8-day, 2001–2023; 500 m, global)          |

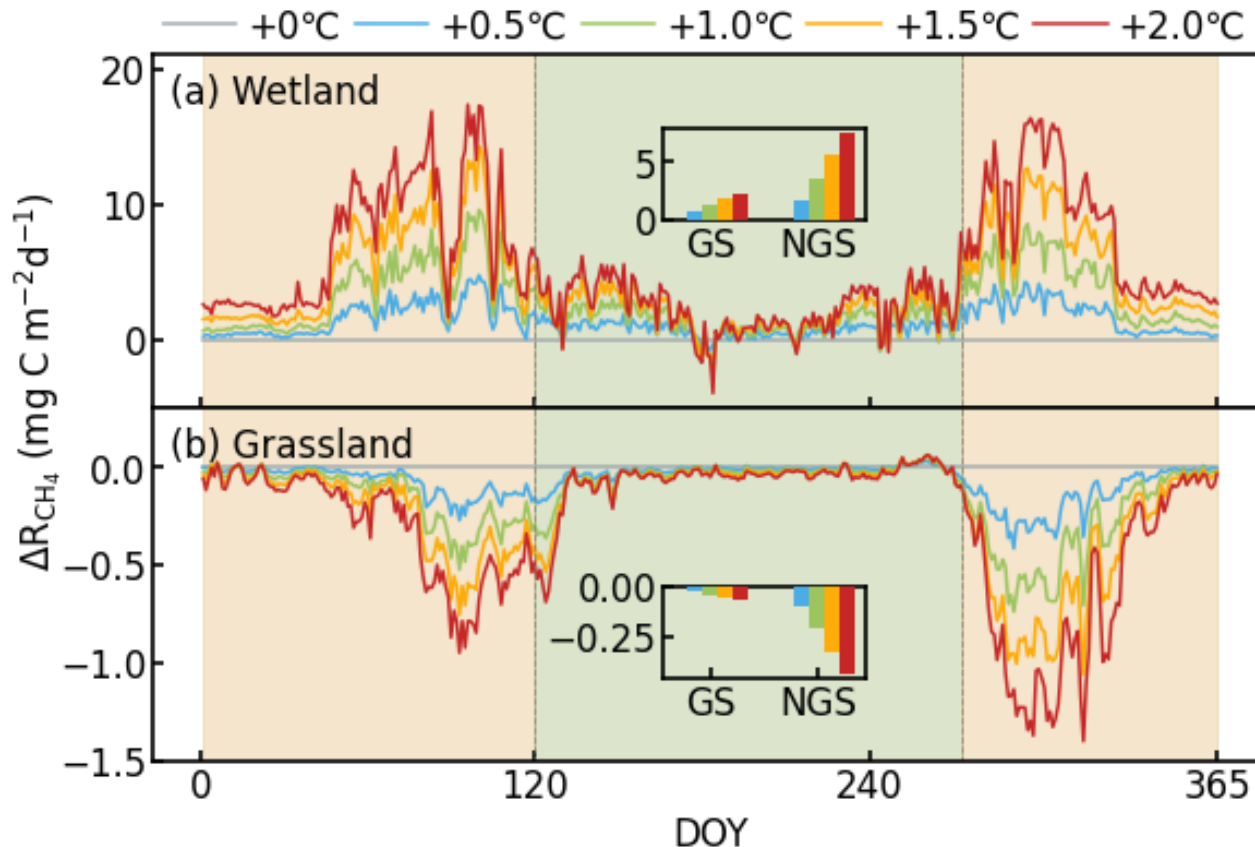
# Machine learning modeling

Five simulation schemes were designed with daily soil temperature increasing by +0°C (control), +0.5°C, +1.0 °C, +1.5 °C and +2.0 °C, respectively, to simulate the temporal and spatial changes of methane fluxes in wetland and grassland areas on the QTP.



# Machine learning modeling

- Wetland CH<sub>4</sub> emission and grassland CH<sub>4</sub> absorption increased with soil warming.
- With the increase of control warming, the difference of CH<sub>4</sub> between growing and non-growing season gradually increased.
- The transition period (melting and freezing), the change was the largest.



# Outlook

- With climate warming and permafrost degradation, wetlands and grasslands on the QTP have been experiencing continued expansion and shrinking and this will result in increasing uncertainty of CH<sub>4</sub> emissions and uptakes on the QTP.

**Permafrost degradation -> humidification**

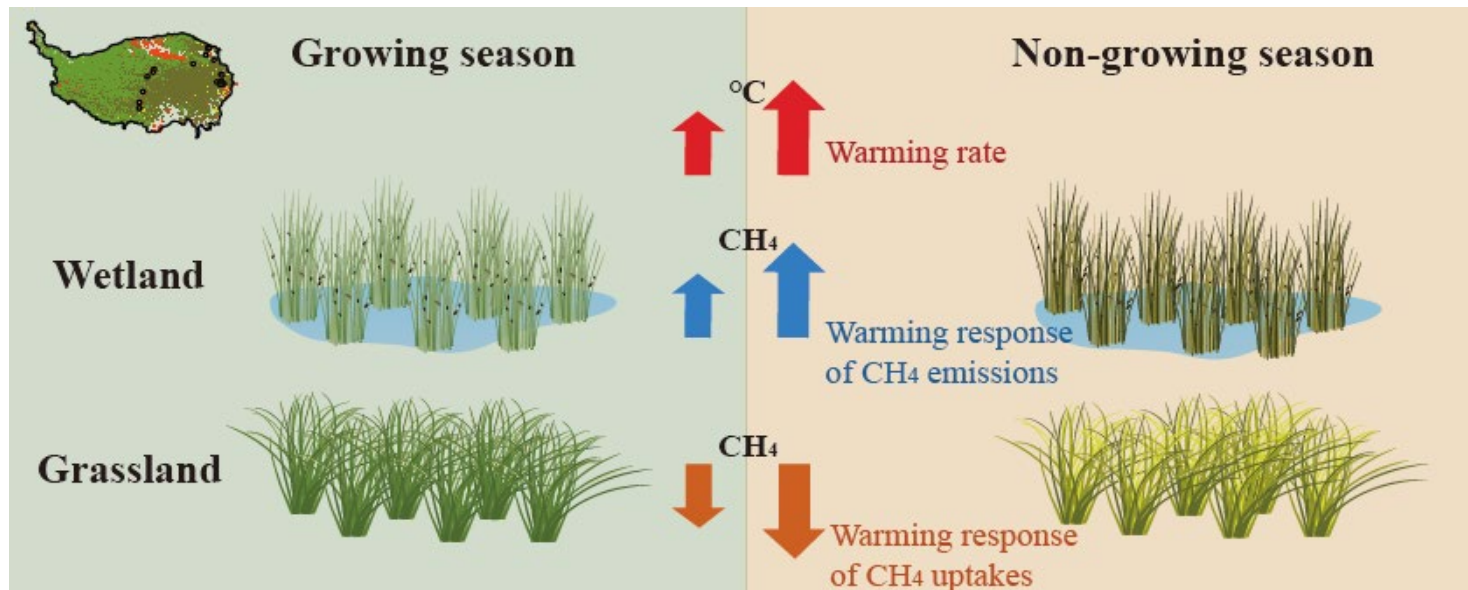
**Seasonal frozen soil degradation -> desertification**

- Therefore, a clear understanding of the seasonality of CH<sub>4</sub> exchange and its response to soil warming will be beneficial to the estimation of the CH<sub>4</sub> budget over the QTP.



# Conclusions

- Our study highlights that warming promoted  $\text{CH}_4$  emissions in wetlands and uptakes in grasslands on the QTP.
- $\text{CH}_4$  exchange has stronger response to warming in the non-growing than growing season.
- The temperature dependencies of  $\text{CH}_4$  exchange of the QTP exhibit different seasonality with the global wetlands, which are stronger during the warmer growing season (Li et al., 2023a).
- Uneven seasonal warming and responses of  $\text{CH}_4$  exchange jointly regulate QTP being an ecosystem  $\text{CH}_4$  source or sink.



# THANK YOU

| Data type                | Location     | Lat. (°N) | Lon. (°E) | Alt. (m)       | Ecosystem                | Dominant plant species                                        | Source                       |
|--------------------------|--------------|-----------|-----------|----------------|--------------------------|---------------------------------------------------------------|------------------------------|
| Raw data                 | Hongyuan #1  | 32.80     | 102.97    | 3500           | Alpine meadow            | <i>Deschampsia caespitosa</i>                                 | (Wang et al., 2022)          |
|                          | Hongyuan #2  | 32.8      | 102.55    | 3500           | Alpine meadow            | <i>Anemone rivularis</i>                                      | (Wang et al., 2021)          |
|                          | Hongyuan #3  | 32.77     | 102.50    | 3510           | Alpine wetland           | <i>Carex mulieensis</i> and<br><i>Kobresia tibetica</i>       | (Peng et al., 2021,<br>2019) |
|                          | Haibei #1    | 37.62     | 101.32    | 3250           | Alpine meadow            | <i>Kobresia humilis</i>                                       | (Li et al., 2022)            |
|                          | Luanhaizi #1 | 37.58     | 101.33    | 3250           | Alpine wetland           | <i>Carex pamirensis</i>                                       | (Song et al., 2015)          |
|                          | Riganqiao #1 | 33.11     | 102.64    | 3646           | Alpine wetland           | <i>Carex mulinesis</i>                                        | (Zhang et al., 2020)         |
|                          | Riganqiao #2 | 33.10     | 102.65    | 3460           | Fen                      | <i>Carex muliensis</i>                                        | (Chen et al., 2021)          |
| Literature based (table) | Wudaoliang   | 35.12     | 93.05     | 4767           | Alpine steppe            | <i>Stipa purpurea</i>                                         | (Pei et al., 2003)           |
|                          | Huashixia    | 35.65     | 98.80     | 4400           | Alpine wetland           | -                                                             | (Jin et al., 1999)           |
| Literature based         | Beilu' he    | 34.15     | 92.06     | 4765           | Alpine steppe            | <i>Carex moorcroftii</i>                                      | (Yun et al., 2018)           |
|                          | Nam Co #1    | 30.77     | 90.99     | 4730           | Alpine steppe            | <i>Stipa purpurea</i>                                         | (Wei et al., 2012)           |
|                          | Nam Co #2    | 30.00     | 90.98     | 4730           | Alpine steppe            | <i>Stipa purpurea</i>                                         | (Wei et al., 2015)           |
|                          | Naqu         | 32.17     | 91.47     | 4620           | Alpine steppe            | <i>Stipa purpurea</i>                                         | (Wan et al., 2010)           |
|                          | Haibei #2    | 37.62     | 101.33    | 3250           | Alpine meadow            | -                                                             | (Jiang et al., 2010)         |
|                          | Haibei #3    | 37.62     | 101.32    | -              | Alpine meadow            | <i>Kobresia humilis</i>                                       | (Fang et al., 2014)          |
|                          | Haibei #4    | 37.62     | 101.32    | -              | Alpine meadow            | <i>Kobresia humilis</i>                                       | (Zhang et al., 2013)         |
|                          | Maqu         | 35.97     | 101.88    | 3650           | Alpine meadow            | -                                                             | (Liu et al., 2012)           |
|                          | Nam Co #3    | 30.00     | 91.02     | 4900           | Alpine meadow            | <i>Kobresia pygmaea</i>                                       | (Wei et al., 2015)           |
|                          | Rierlangshan | 34.04     | 102.72    | 3326           | Alpine meadow            | <i>Deschampsia littoralis</i>                                 | (Yao et al., 2019)           |
|                          | Fenghuoshan  | 34.73     | 92.89     | 4763           | Swamp meadow             | <i>Kobresia tibetica</i>                                      | (Chen et al., 2017)          |
|                          | Luanhaizi #2 | 37.58     | 101.33    | 3250           | Alpine marsh             | <i>Carex pamirensis</i>                                       | (Jin et al., 2015)           |
|                          | Zoige #1     | 32.78     | 102.53    | 3470           | Alpine marsh             | <i>Carex muliejsis</i> and <i>Carex meyeriana</i>             | (Wang et al., 2002)          |
|                          | Huahu Lake   | 33.10     | 102.03    | 3430           | Alpine wetland           | -                                                             | (Chen et al., 2009)          |
|                          | Luanhaizi #3 | 37.48     | 101.20    | 3250           | Alpine wetland           | -                                                             | (Hirota et al., 2004)        |
|                          | Qinghai Lake | 36.70     | 100.78    | 3228           | Alpine wetland           | <i>Kobresia tibetica</i> and<br><i>Blysmus sinocompressus</i> | (Wu et al., 2021)            |
| Riganqiao #3             | 33.11        | 102.64    | 3646      | Alpine wetland | <i>Carex mulinesis</i>   | (Zhang et al., 2020)                                          |                              |
| Zoige #2                 | 33.93        | 102.87    | 3430      | Fen            | <i>Kobresia tibetica</i> | (Chen et al., 2013)                                           |                              |