

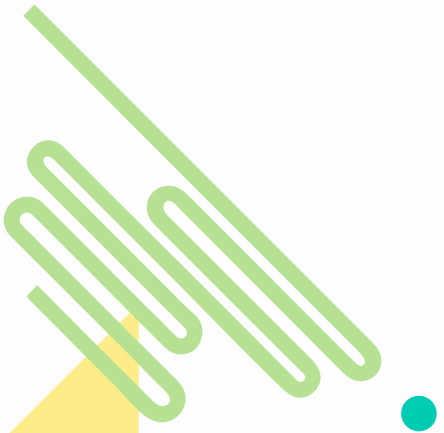


# Assessing climate change impacts on water footprint of crop production and crop yield: a case study of the Wu River basin, Taiwan

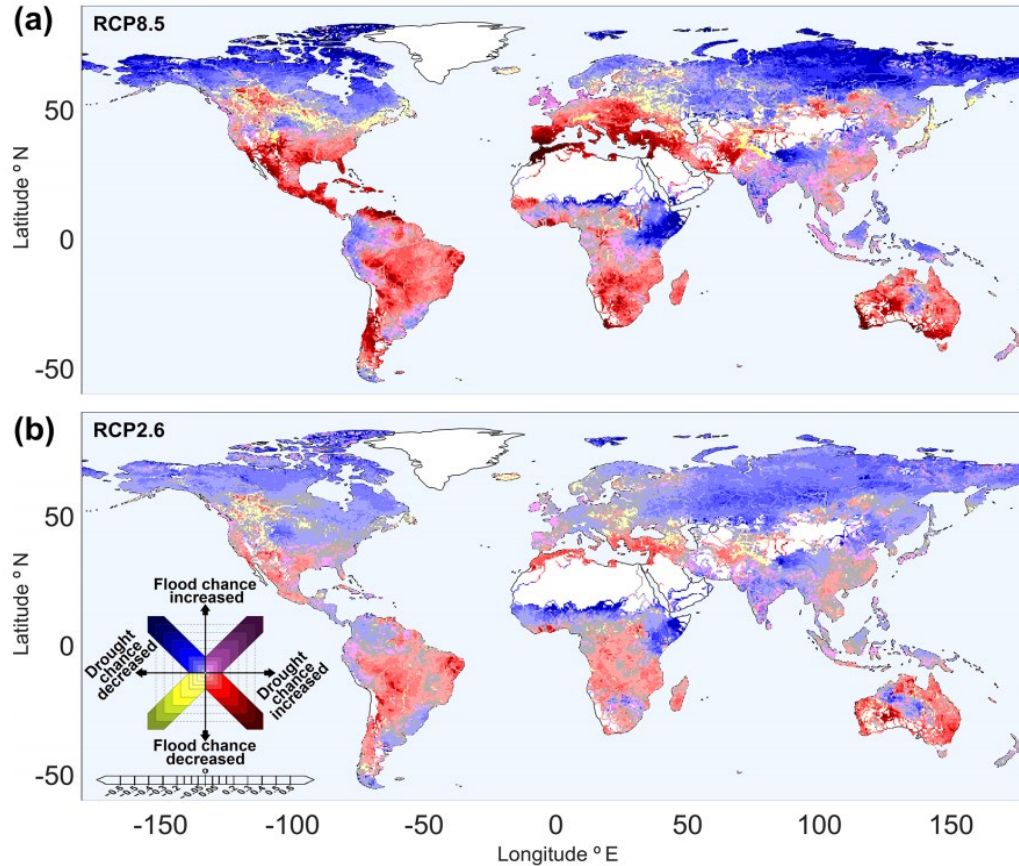
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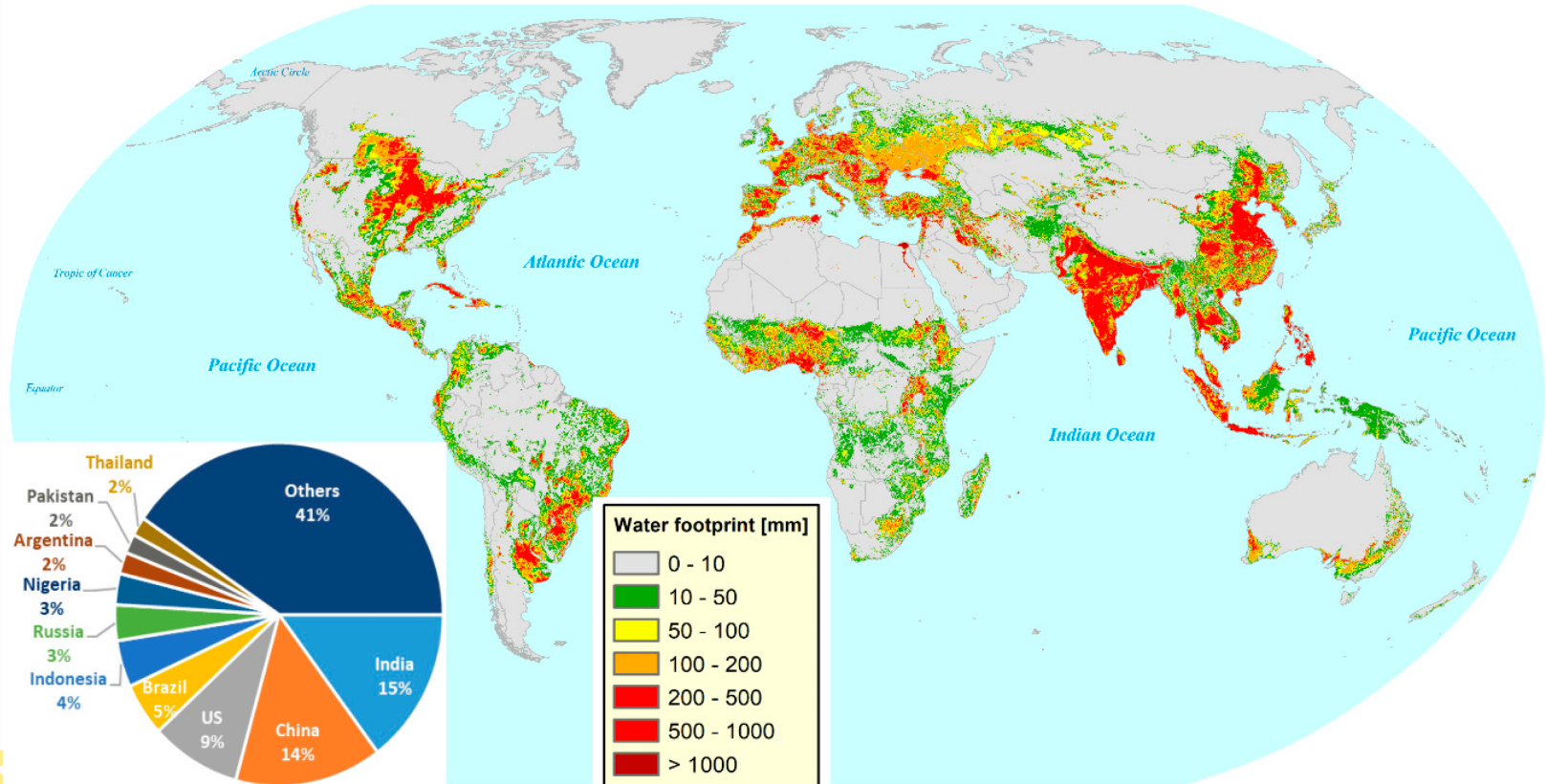
# Increasing frequency of drought and flood under climate change



Hydrology and Earth  
System Sciences  
(Asadieh et al., 2017)

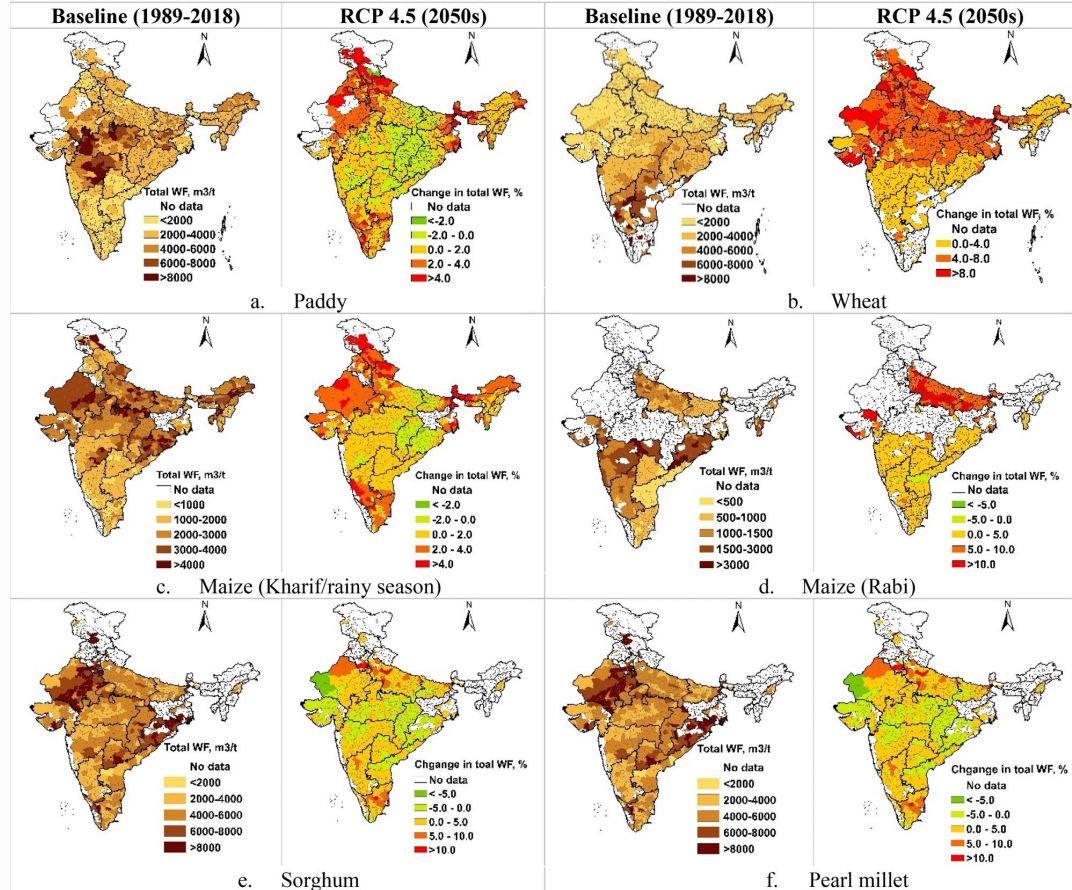


# Water footprint of crop production in the world



Hydrology and earth system sciences  
(Mekonnen & Hoekstra, A. Y. 2011)

# Impact of water footprint under climate change: a case of India



Scientific Reports  
(Mali et al., 2021)



# Research goals



## Water footprint

Calculate the blue, green, grey water footprint of crop production



## Crop yield

Simulate by SWAT



## Climate change

Assess the impact of climate change



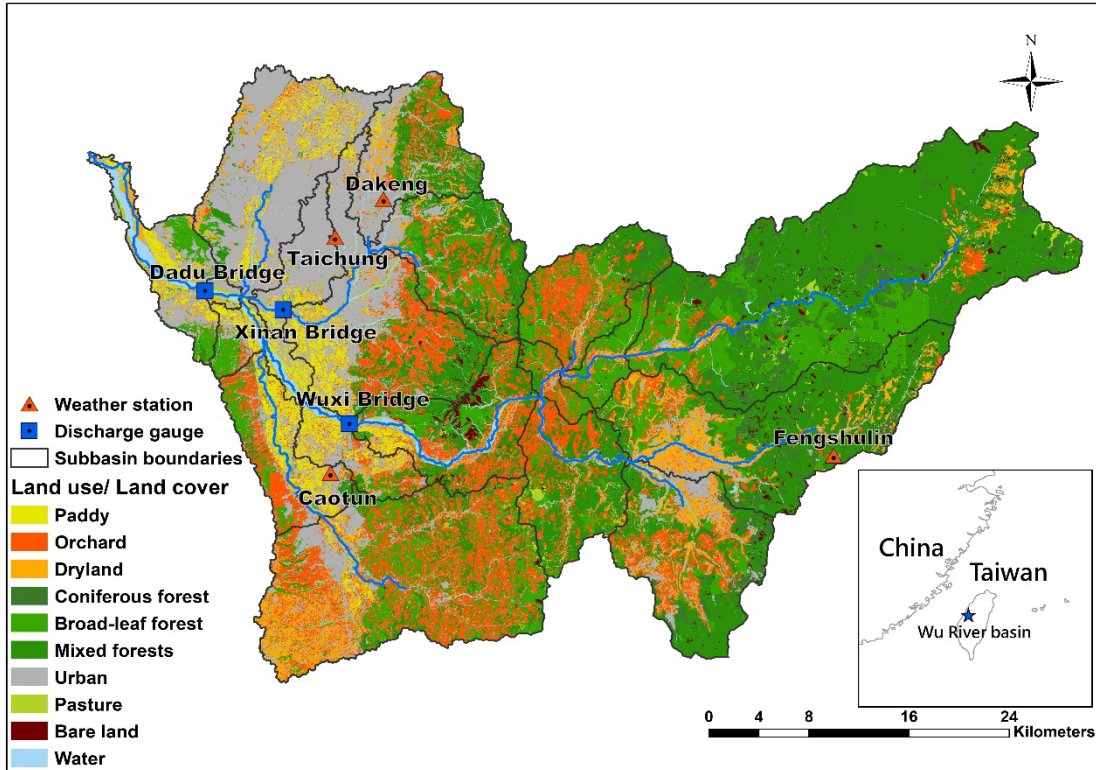
## Adaption suggestion

Provide the suggestion for climate change adaption





# Study area: Wu River basin



Located in central Taiwan,  
a crucial source of irrigation  
water for Taichung and  
Changhua counties  
Area: 2,026 km<sup>2</sup>



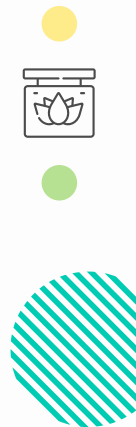
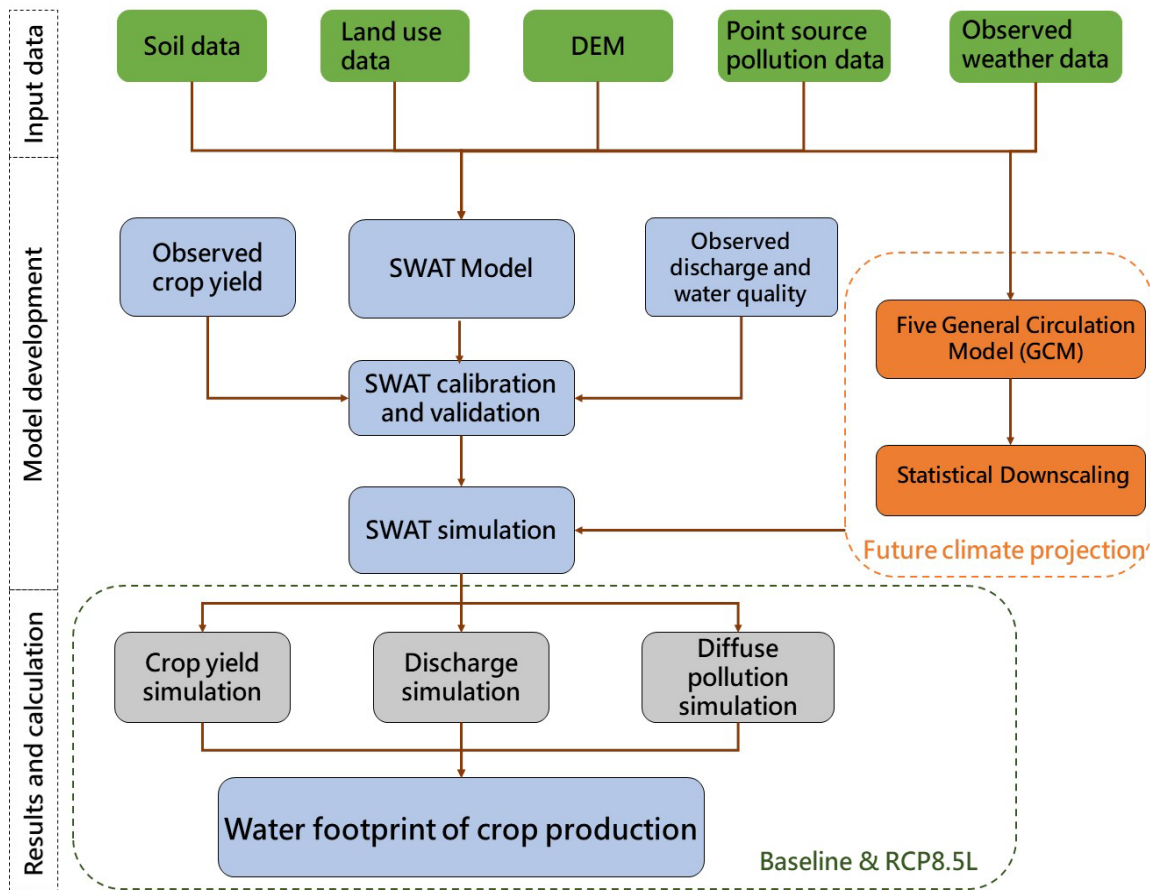
Annual total precipitation :  
2,092 mm  
Average annual flow :  
115.83 m<sup>3</sup>/s



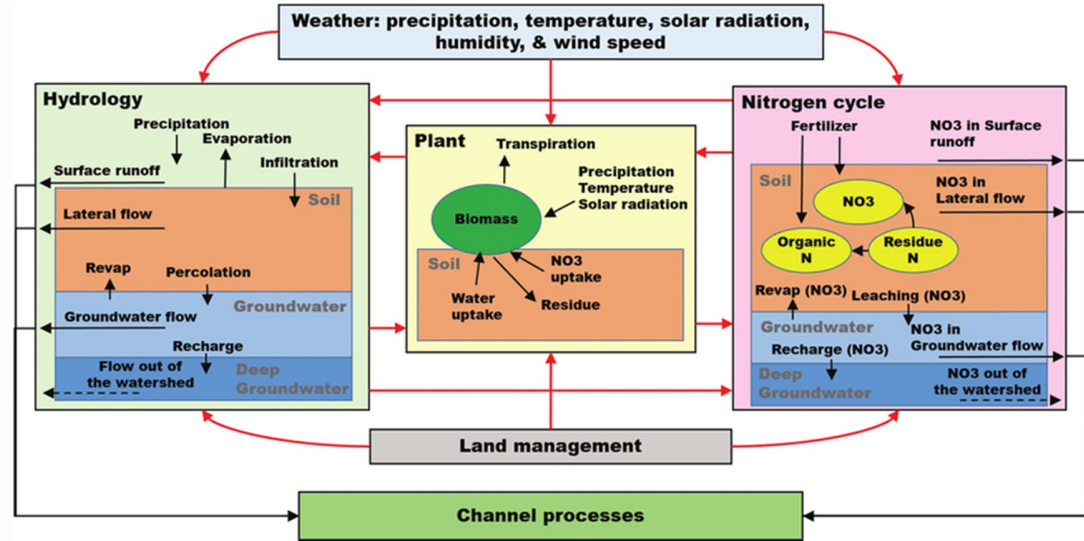
Paddy fields: 4%  
Drylands: 17%  
Orchard: 6%  
Forest: 51%  
Urban: 19%



# Material and Method



# Method: SWAT2012



(Lee et al., 2017)

The SWAT model, a watershed-scale hydrological model, has been widely utilized globally for analyzing the impacts of human activities and climate change on diffuse pollution and crop yield



# Method: Water footprint (1/2)



## Blue water footprint

Major source of irrigation:  
streamflow, ponds,  
groundwater, etc.



## Green water footprint

Rainwater stored in the  
root zone of soil



## Grey water footprint

The amount of fresh water  
needed to dilute  
pollutants to maintain  
water quality standards


The TWN water standard:  
suspended solids: 25 ppm,  
nitrate: 10ppm  
total phosphorus: 0.05ppm.




# Method: Water footprint (2/2)

$$WF = WF_{\text{blue}} + WF_{\text{green}} + WF_{\text{grey}}$$

$$WF_{\text{blue}} = \frac{IR}{Y}$$


$$WF_{\text{green}} = \frac{\min(ET_{\text{crop}}, P_e) \times A}{Y} \times 10$$


$$WF_{\text{grey}} = \frac{L}{C_{\text{max}} - C_{\text{nature}}} / Y$$

WF: total water footprint of the crop (m<sup>3</sup>/ton)

WF<sub>blue</sub>: blue water footprint of the crop (m<sup>3</sup>/ton)

WF<sub>green</sub>: green water footprint of the crop (m<sup>3</sup>/ton)

WF<sub>grey</sub>: grey water footprint of the crop (m<sup>3</sup>/ton)

IR: irrigation water (m<sup>3</sup>)

Y: crop yield (ton)

A: cropping area (ha)

ET<sub>crop</sub>: crop evapotranspiration (mm)

P<sub>e</sub>: effective rainfall (mm)

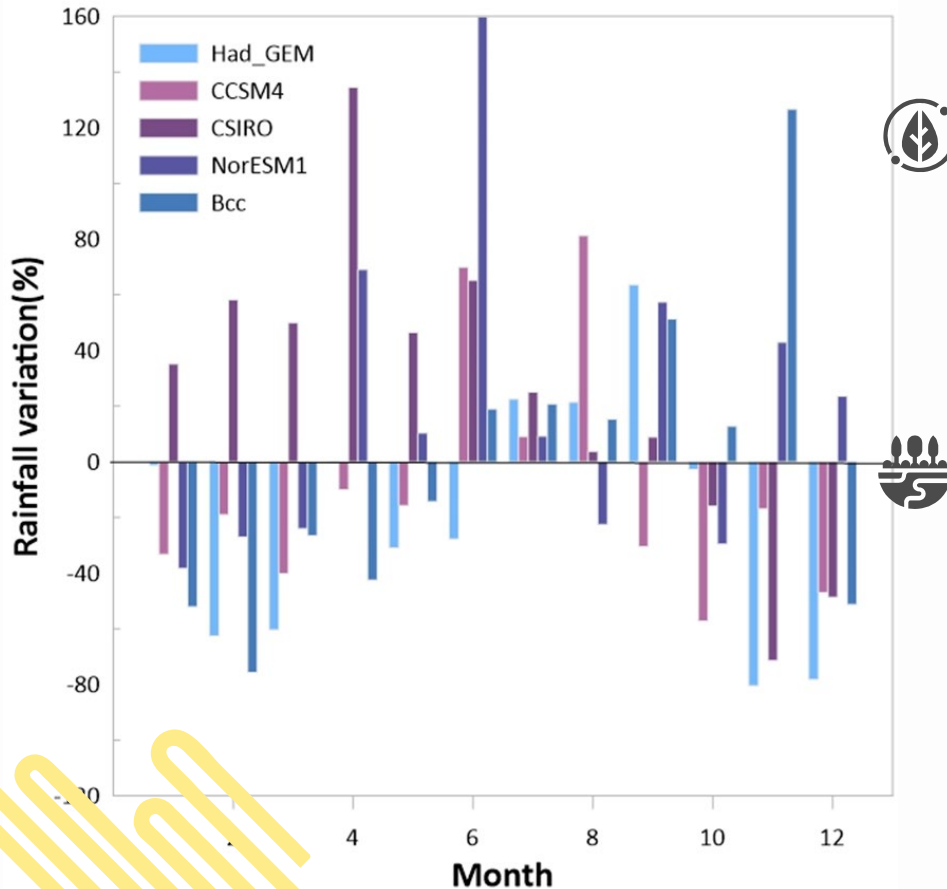
L: The diffuse pollution during the crop cultivation process (kg)

C<sub>max</sub>: the maximum diffuse pollution concentration acceptable in rivers (kg/m<sup>3</sup>)

C<sub>nature</sub>: the natural background output (kg/m<sup>3</sup>)



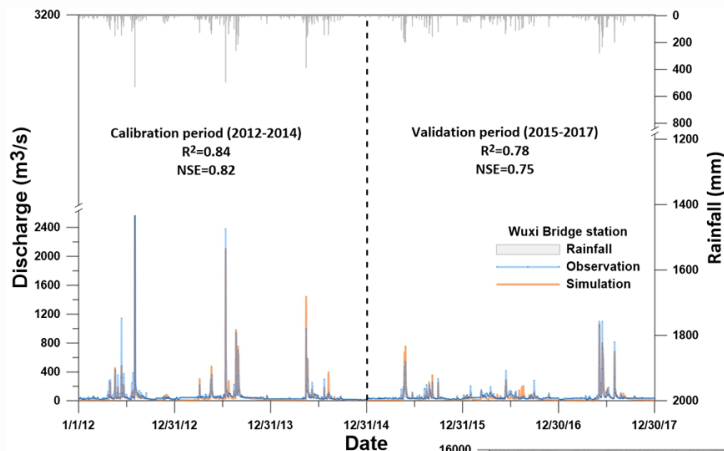
# Method: Climate change scenarios



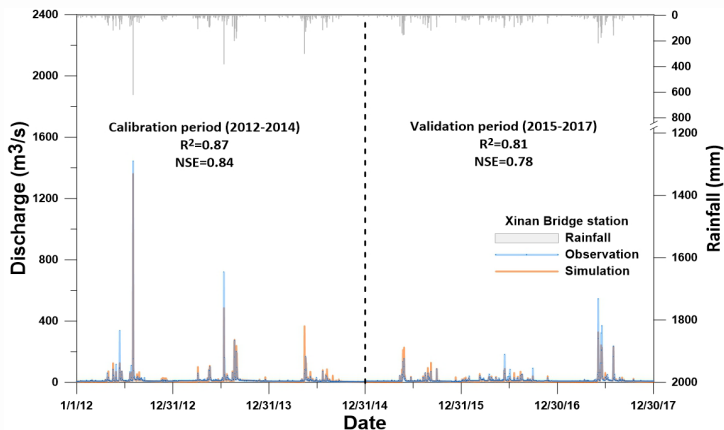
Five GCMs: HadGEM2-AO, NorESM1-ME, CSIRO-Mk3-6-0, CCSM4, and bcc-csn1.1n

Average decrease of approximately **12%** during the dry season and increase of about **18%** during the wet season.

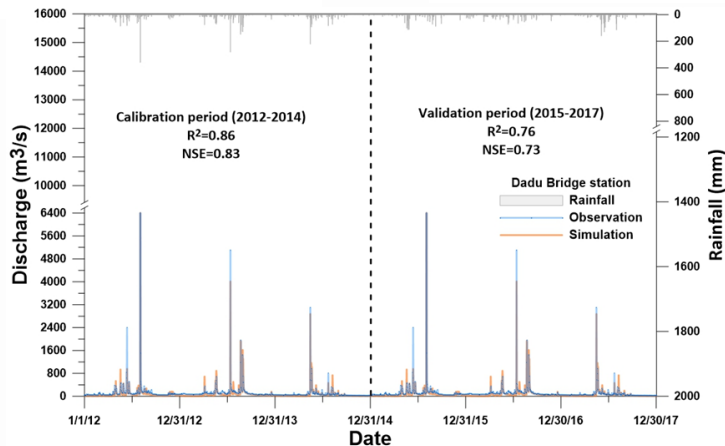
# SWAT Calibration: Discharge



Wuxi Bridge station



Xinan Bridge station



Dadu Bridge station

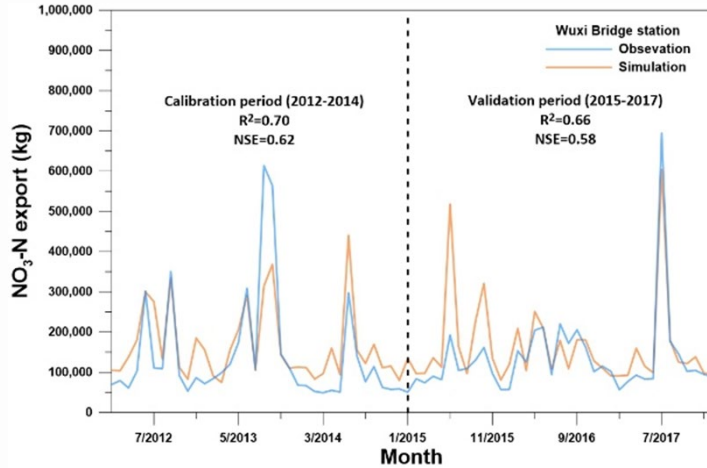


Calibration:  $R^2 > 0.8$  and  $NSE > 0.7$



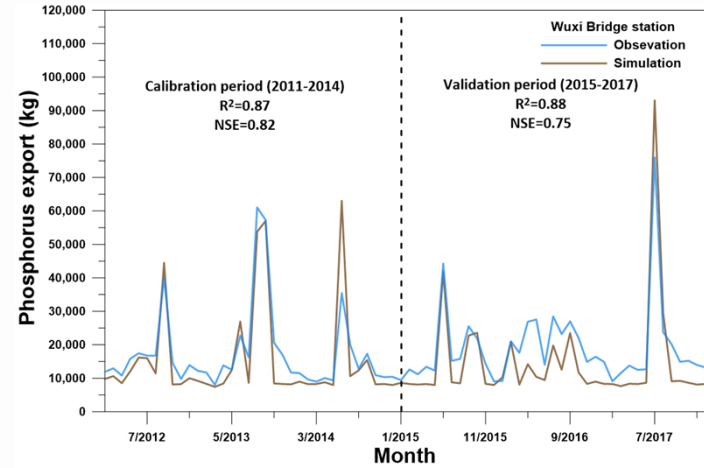
Validation:  $R^2 > 0.75$  and  $NSE > 0.73$

# SWAT Calibration: Diffuse pollution



NO<sub>3</sub>-N

The monthly nitrate calibration and validation results:  
 $R^2 > 0.65$  and  $NSE > 0.5$



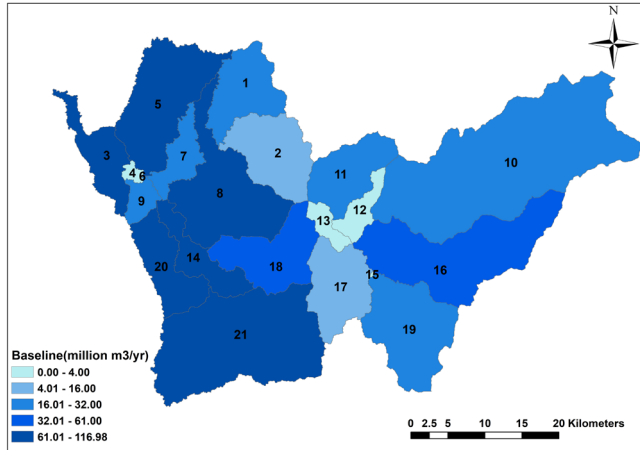
TP

The monthly phosphorus calibration and validation results:  
 $R^2 > 0.8$  and  $NSE > 0.75$

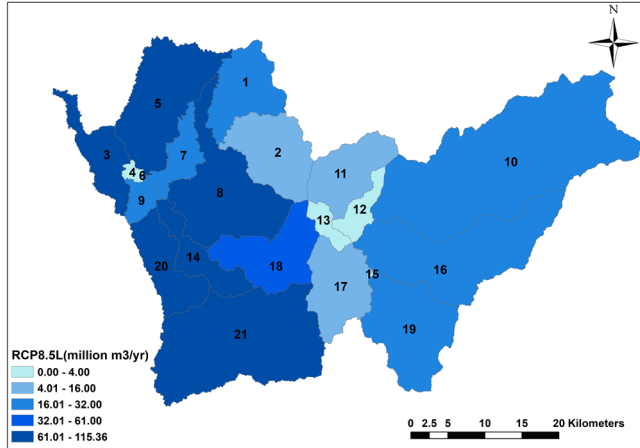




# Spatial variations in blue-green water footprint



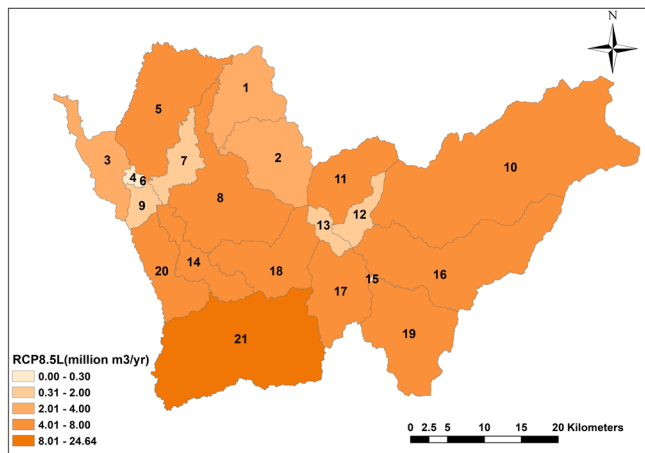
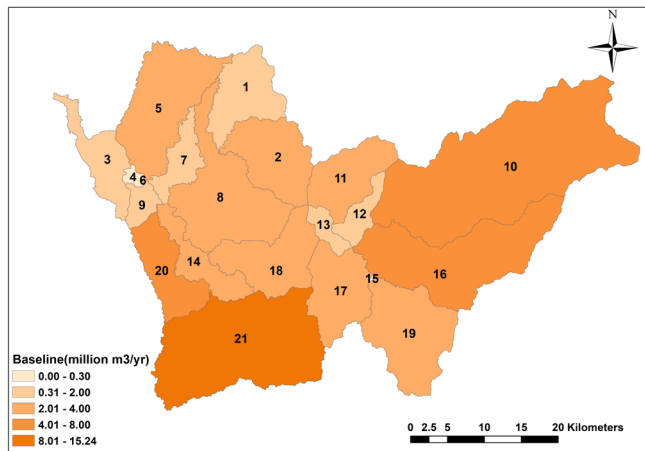
Subbasins 3, 5, 8, 14, 20, and 21 exhibit blue and green water consumption exceeding 61 million tons/year in baseline scenario.



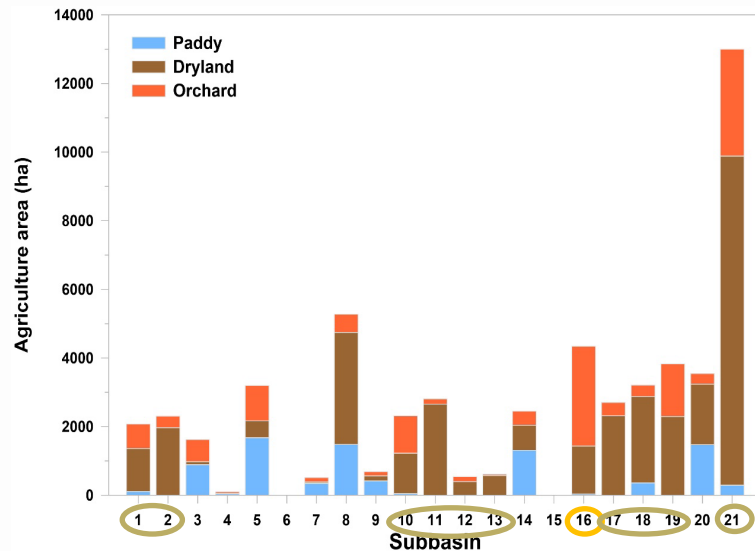
Most subbasins demonstrate marginal change in the range of blue and green water consumption.



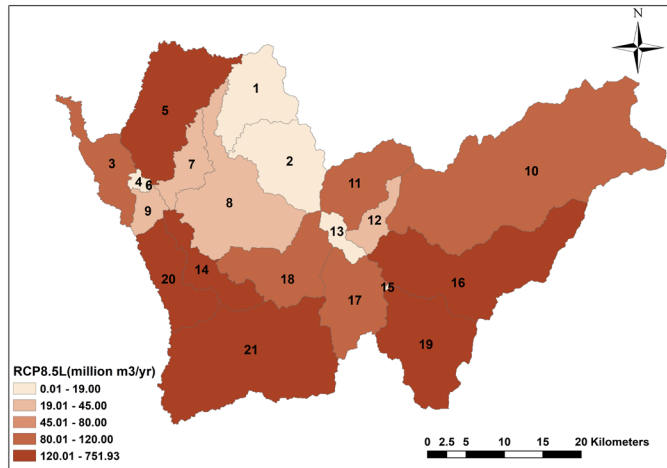
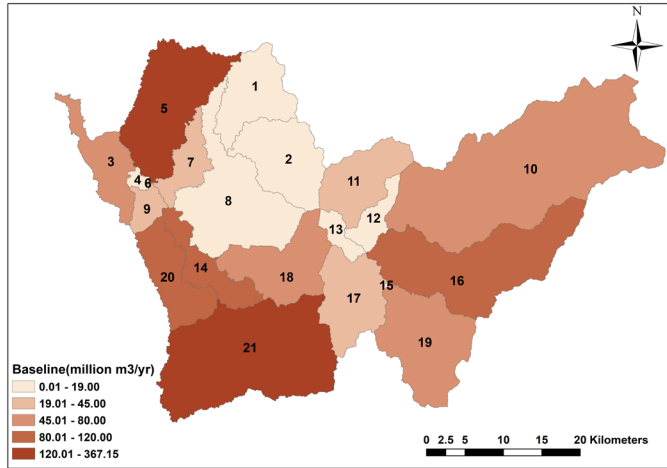
# Spatial variations in NO<sub>3</sub>-N grey water footprint



- Subbasins 10, 16, 20, and 21 in the upstream regions, where **sweet potatoes** and **oranges** predominate, exhibit higher nitrate nitrogen grey water demand in baseline scenario.
- Substantial increase in nitrate nitrogen grey water demand in field within the middle and upper stream subbasins, surpassing 4 million tons/year in RCP8.5 scenario.



# Spatial variations in TP grey water footprint



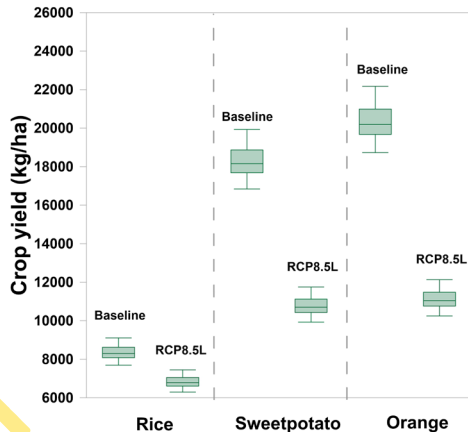
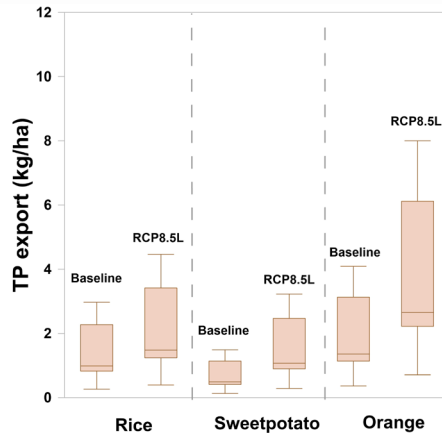
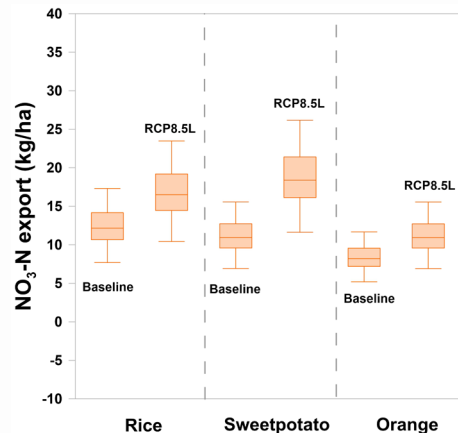
Total phosphorus grey water demand in subbasins 5, 14, 16, 20, and 21, where agriculture predominantly involves **sweet potatoes** and **oranges** cultivation .



Significant increase in total phosphorus grey water demand in the middle and upper stream subwatersheds, especially in larger **orchard** cultivation areas .



# Diffuse pollution and Crop yield under climate change



The diffuse pollution will be increased by 33%~116% across different crops under climate change.



The crop yield will be decreased by 18%~45% across different crops under climate change.



# Comparison with world water footprints

	Crop	Wu river	World				
			10 <sup>th</sup> percentile	20 <sup>th</sup> percentile	25 <sup>th</sup> percentile	50 <sup>th</sup> percentile	Average
Blue-Green water footprint (m <sup>3</sup> /ton)	Rice	7456	599	859	952	1476	1486
	Sweet potato	354	203	219	224	249	330
	Orange	369	303	333	343	383	510
NO <sub>3</sub> -N Grey water footprint (m <sup>3</sup> /ton)	Rice	145	71	129	162	215	187
	Sweet potato	60	14	50	50	50	53
	Orange	42	14	15	16	42	49

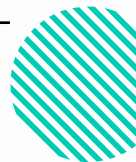
(Mekonnen & Hoekstra, 2014)



Paddy fields exceed the global average water footprint **5 times**, primarily due to intensive irrigation practices in Taiwan.



The nitrate grey water footprint for each crop is nearly equal to the global average.





# Proposed solutions for cultivation adaptation

## Crop conversion

Evaluate the crop conversion in the middle and upper subbasin.

## Increase nutrient use efficiency

Assess the crop growth demand during the growth period.



## Fertilizer application

Adjust the fertilizer application practices (e.g., timing, amount, types)

## Evaluate the impact of climate change

Identify the hotspots of variations under various climate change scenarios.



# Conclusions



## Variation in water footprints in Taiwan

- The water blue-green water footprint of paddy fields are approximately **5 times** higher than other rice field regions in the world.
- Grey water footprint will surge by approximately **33% to 116%** under climate change scenarios.

## Impact of climate change in Taiwan

- Sweet potato and orange cultivation showed the most significant increase in nutrient export, potentially **surpassing 50%**.
- Crop yield are anticipated to decline by **18% to 45%**.

## Cultivation adaptation is needed in the future

- For examples: Effective water resource management, strategic allocation, and conversion of crop types that consume less water and generate less nutrient exports.



# Thank you for your attention

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