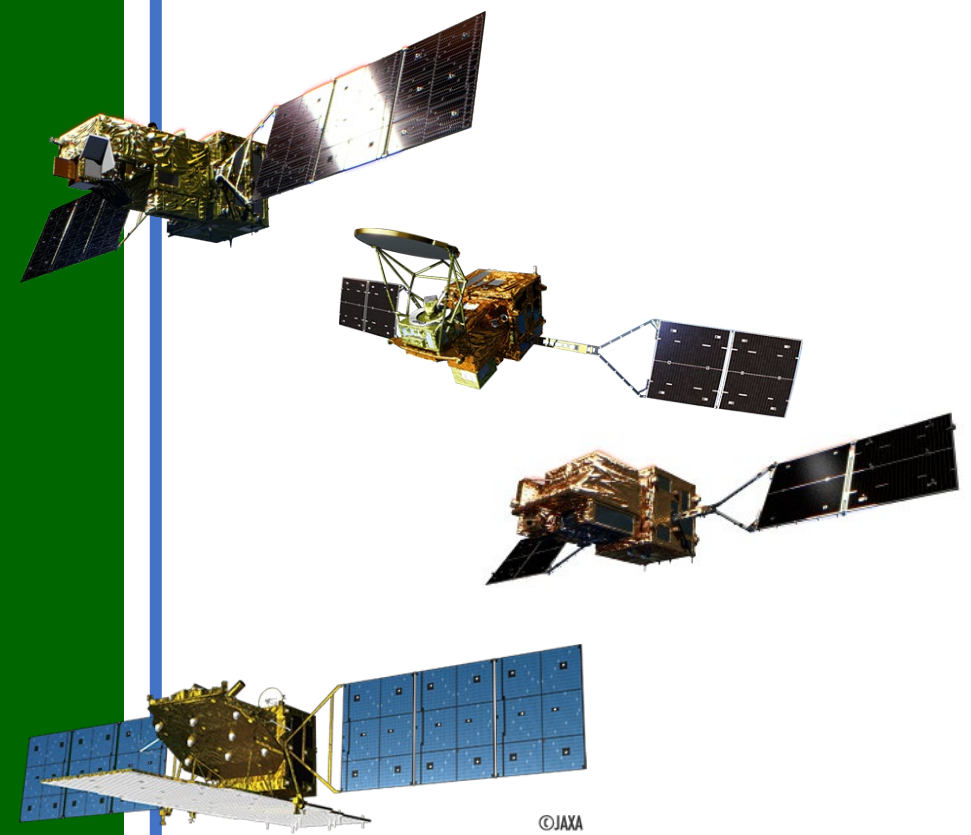


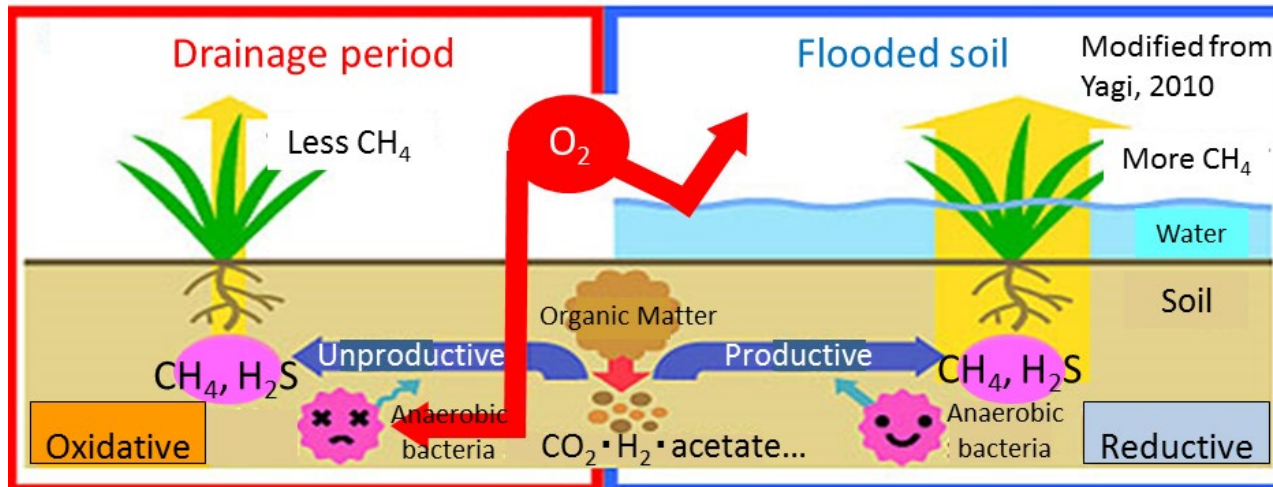
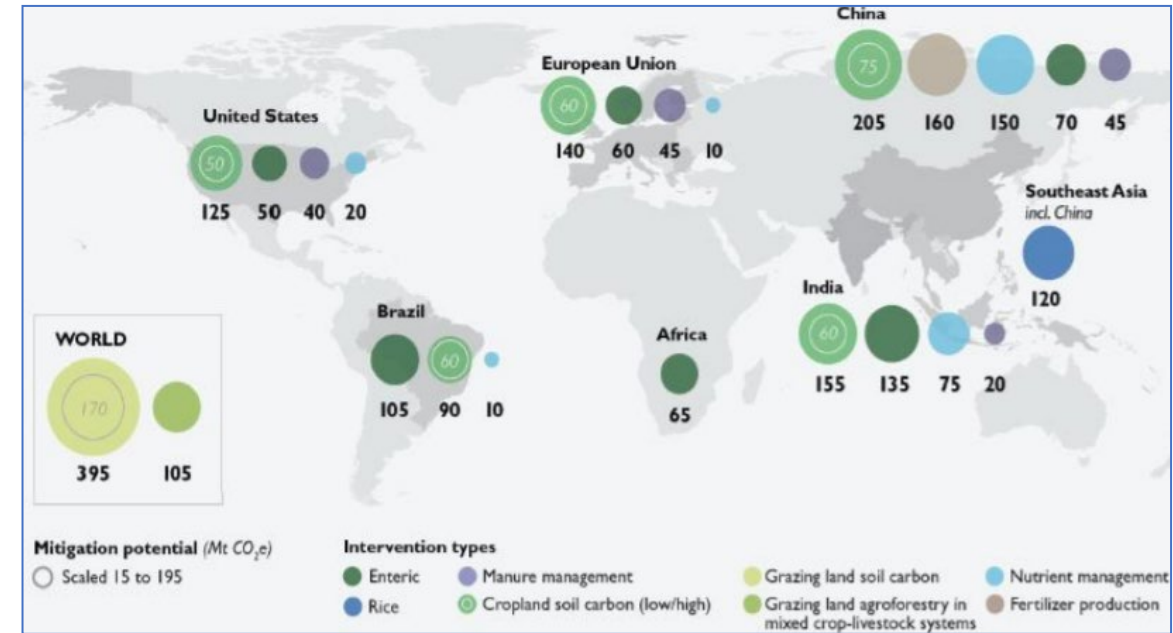
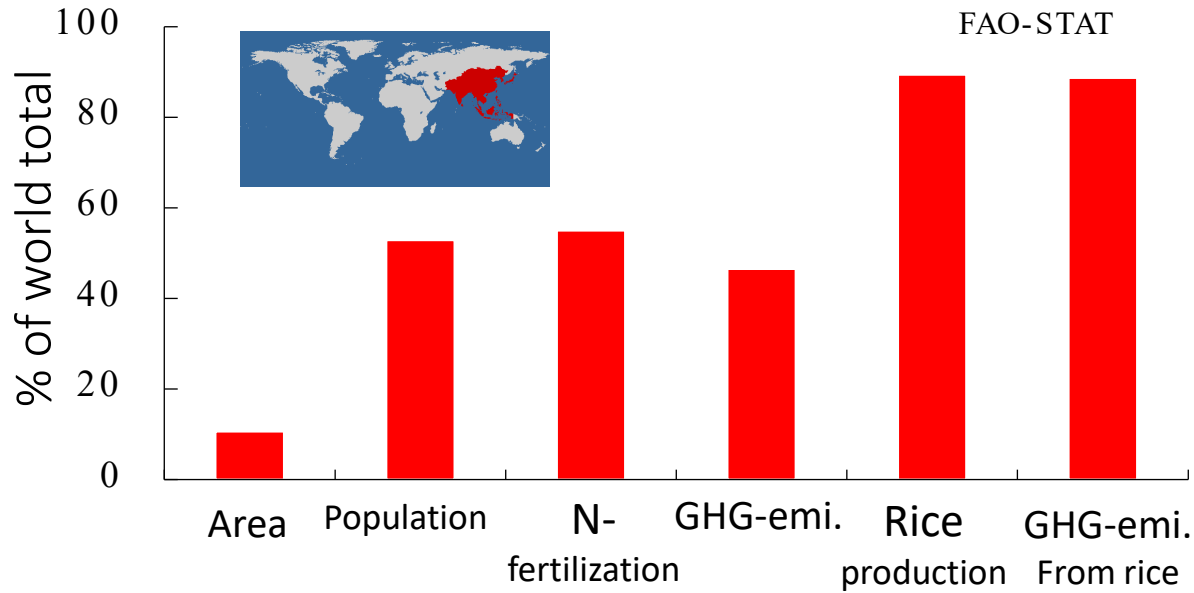
Pixel-based evaluation of rice production and related greenhouse gas emissions in the Mekong delta via a digital-twin system with a simultaneous data assimilation scheme of SAR data and ground observations

Hironori Arai<sup>1)</sup>, Thuy Le Toan<sup>1)</sup>, Mehrez Zribi<sup>1)</sup>,  
Wataru Takeuchi<sup>2)</sup>, Kei Oyoshi<sup>3)</sup>, Lam Dao Nguyen<sup>4)</sup>,  
Tamon Fumoto<sup>5)</sup>, Shinich Sobue<sup>3)</sup>



# Counter measure: Intermittent irrigation

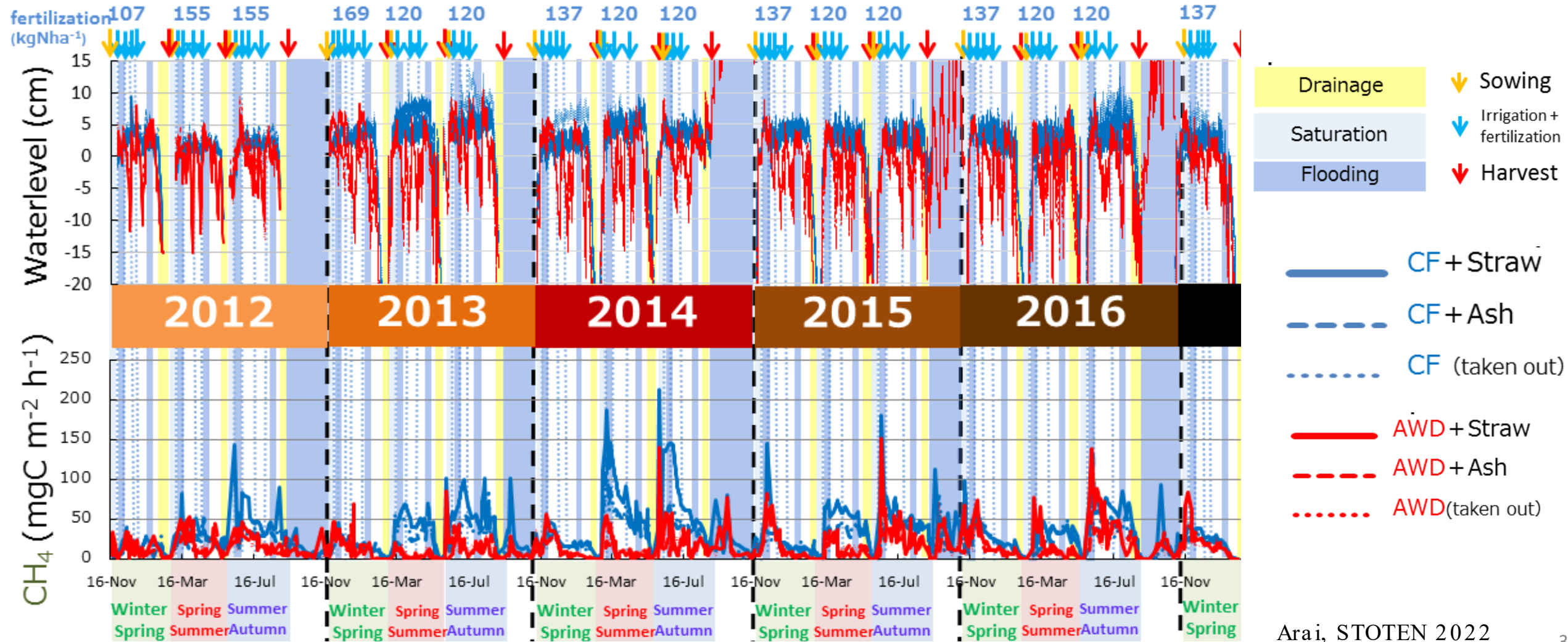
## The necessity of quantifying GHG mitigation effect and rice productivity



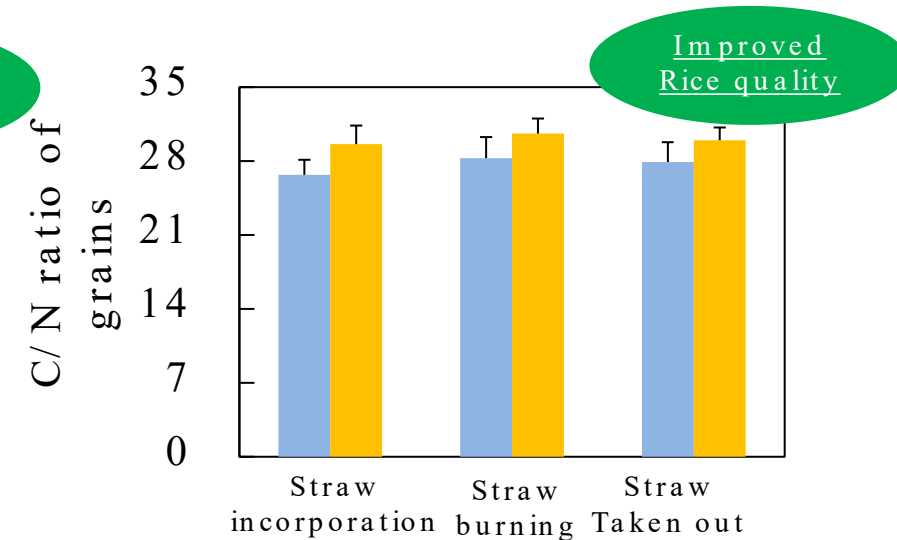
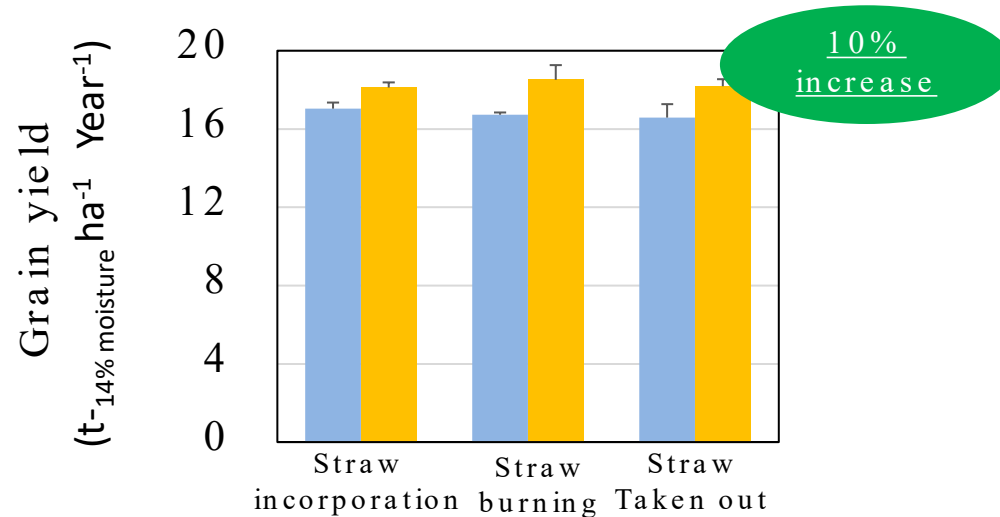
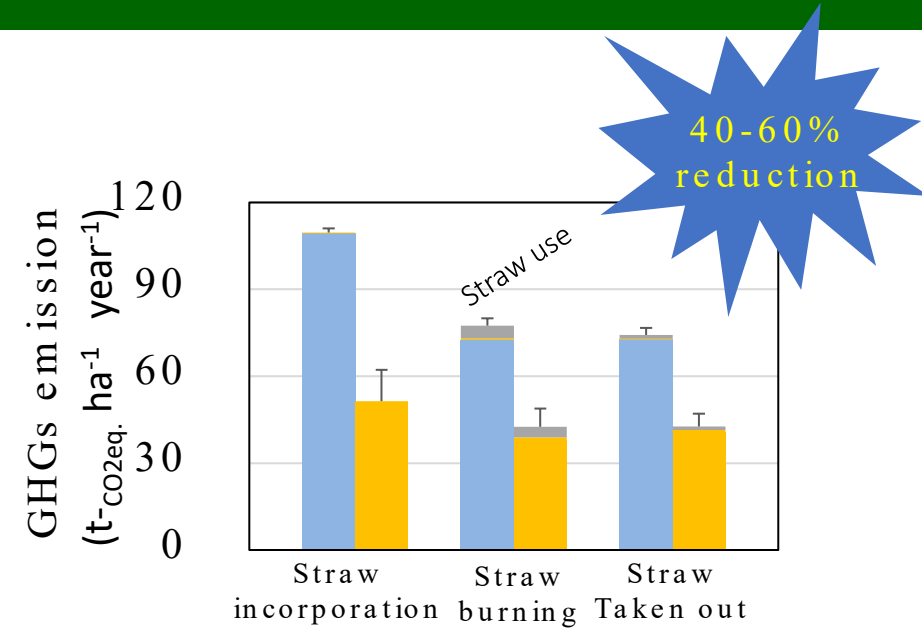
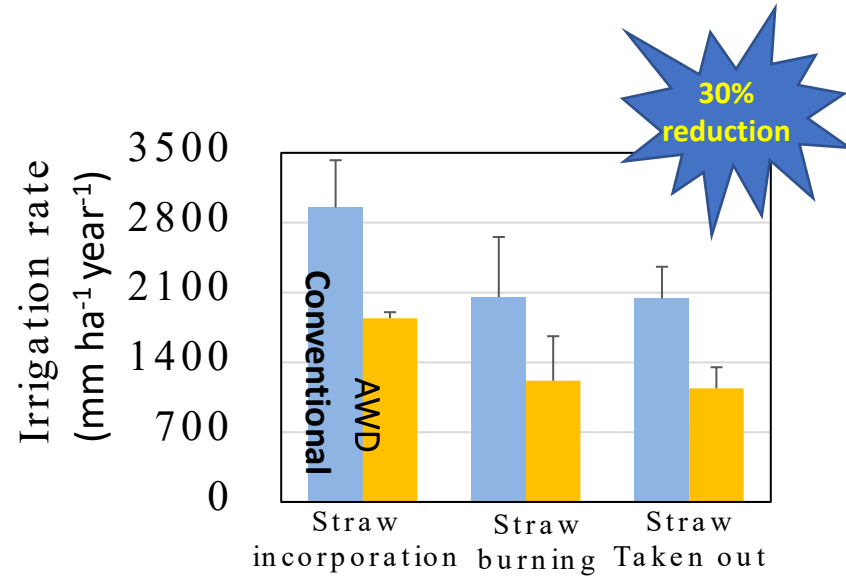
Source: CEA analysis based on: Alexandratos and Bruinsma, 2012  
 Jhanvi Saini and Rajan Bhatt Current Journal of Applied Science and Technology · April 2020

# AWD has been carried out based on research works in last decades

Multi-year study conducted on a farmer's fields in the Mekong Delta

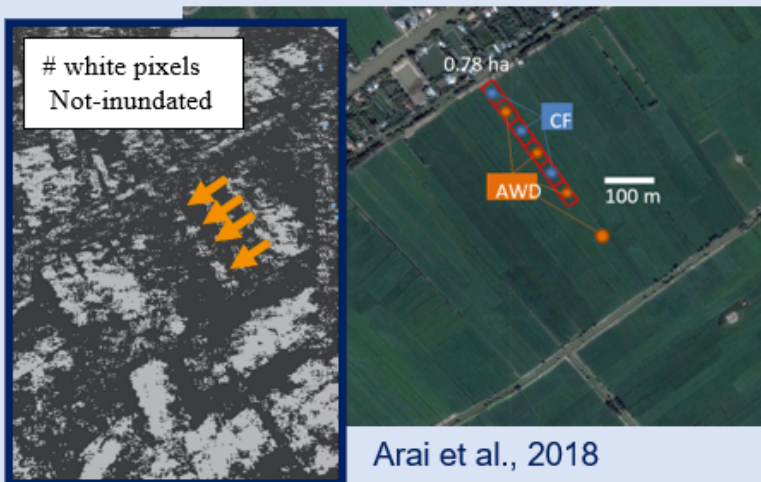


# AWD reduces methane emission, water demand, with slightly improved grain yield and quality (2012-2016 experiment)



## L-SAR observation on inundation

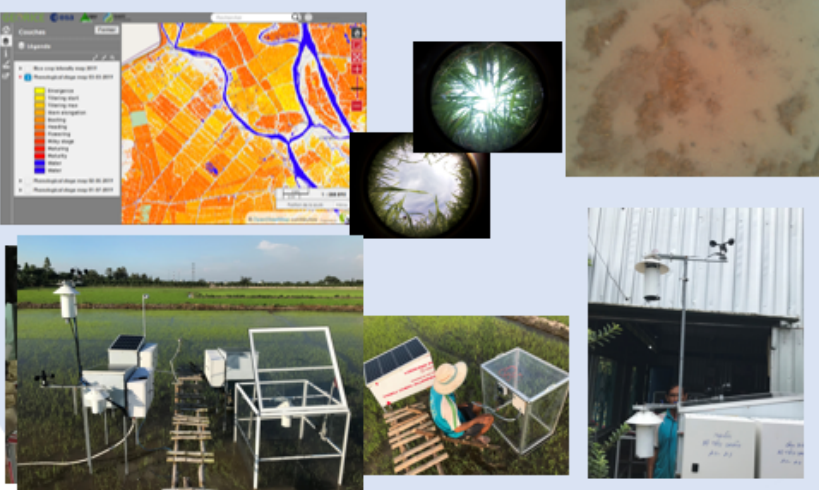
ALOS-2/4, NISAR, ROSE-L



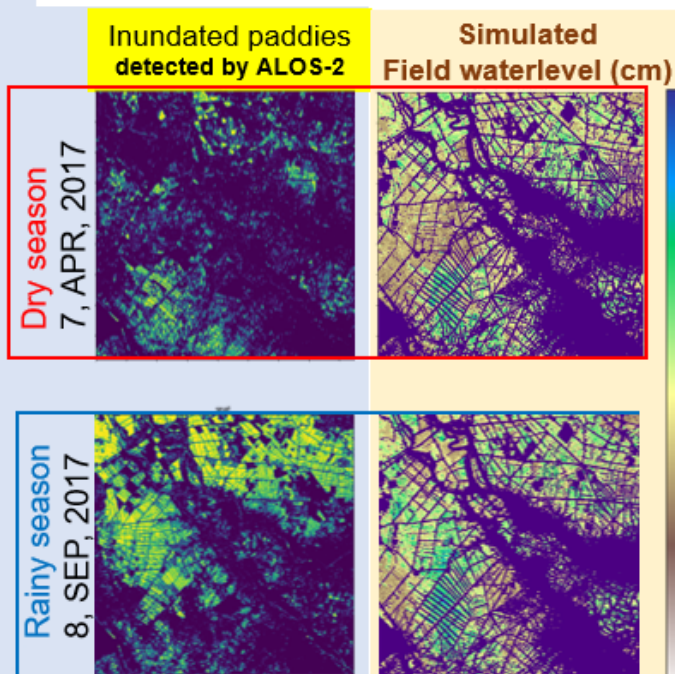
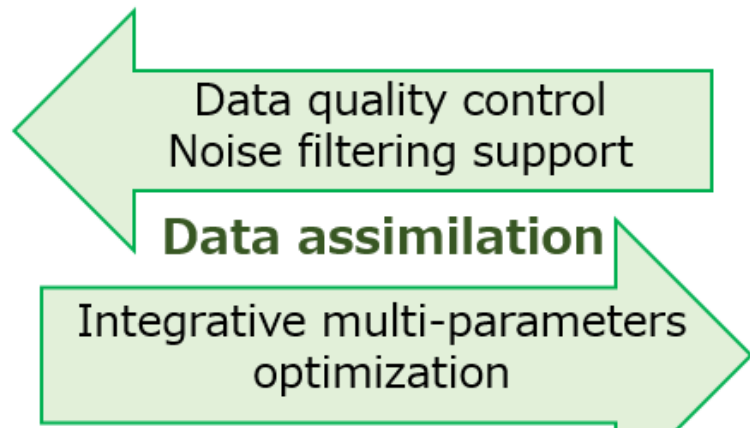
Arai et al., 2018

## GeoRice & IoT tech.

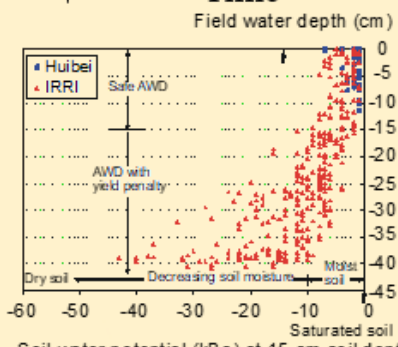
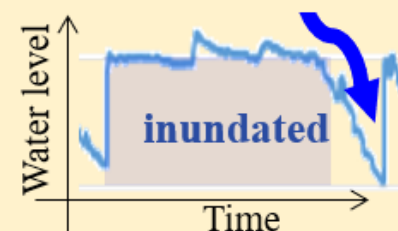
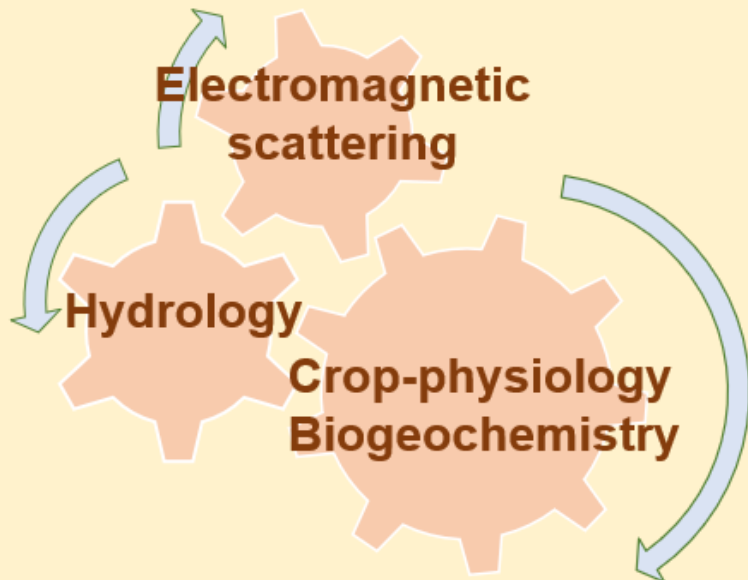
Regional Rice monitoring in S E Asia with Sentinel-1  
<http://www.georice.net/lm/index.php/>



## Pixel-based (50m-res.) Inversion of Daily waterlevel/GHGfluxes, rice growth/yield and Nitrogen-usage

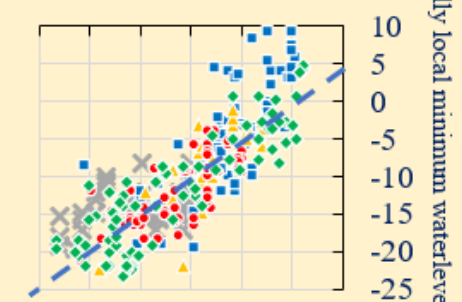


## Cyber-LCA coupling system w/ high spatio-temporal resolution models



Lampayan et al., 2015

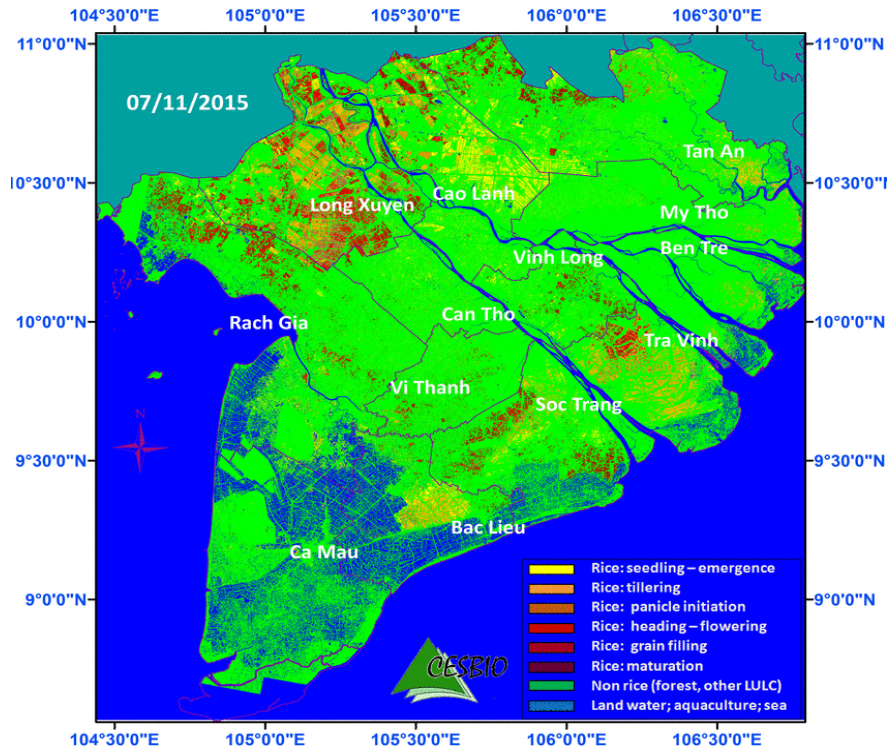
Soil-surface Simulated values of water level (cm below soil surface)  
 -25 -20 -15 -10 -5 0 5



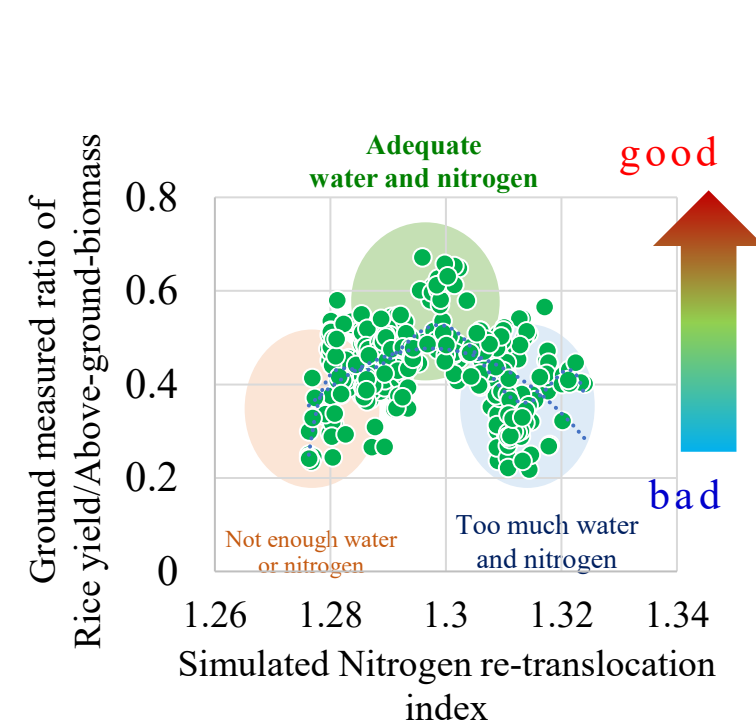
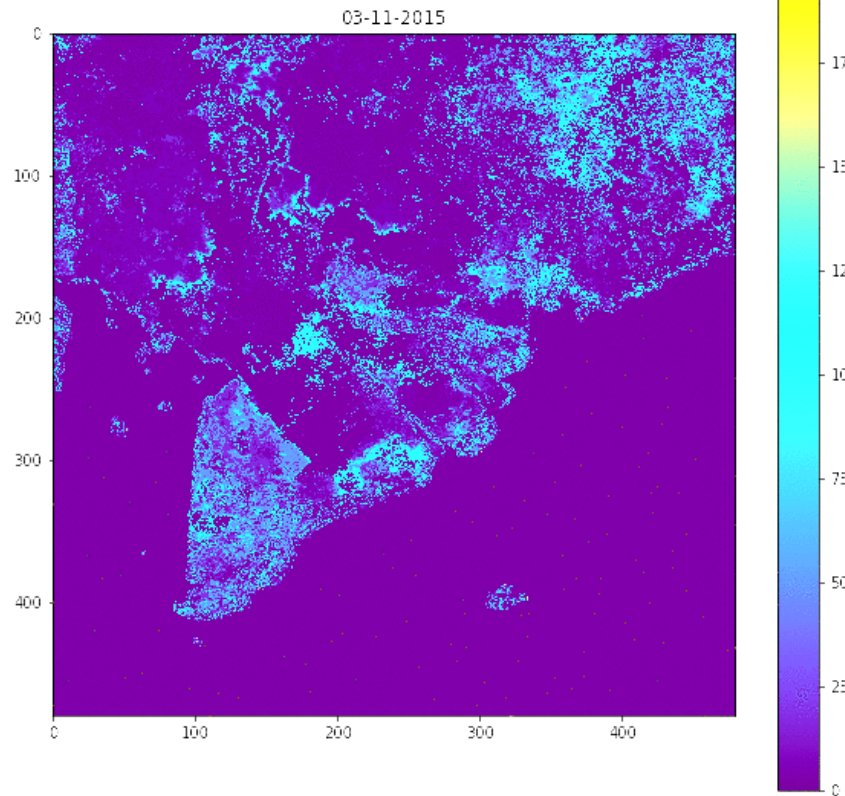
Data from 5 sites x 5 plots x 10 seasons  
 Arai et al., 2021 RSE submitted

# Rice phenology and satellite data pixel based simulation of CH<sub>4</sub> emission

## Sentinel-1 to monitor rice growth

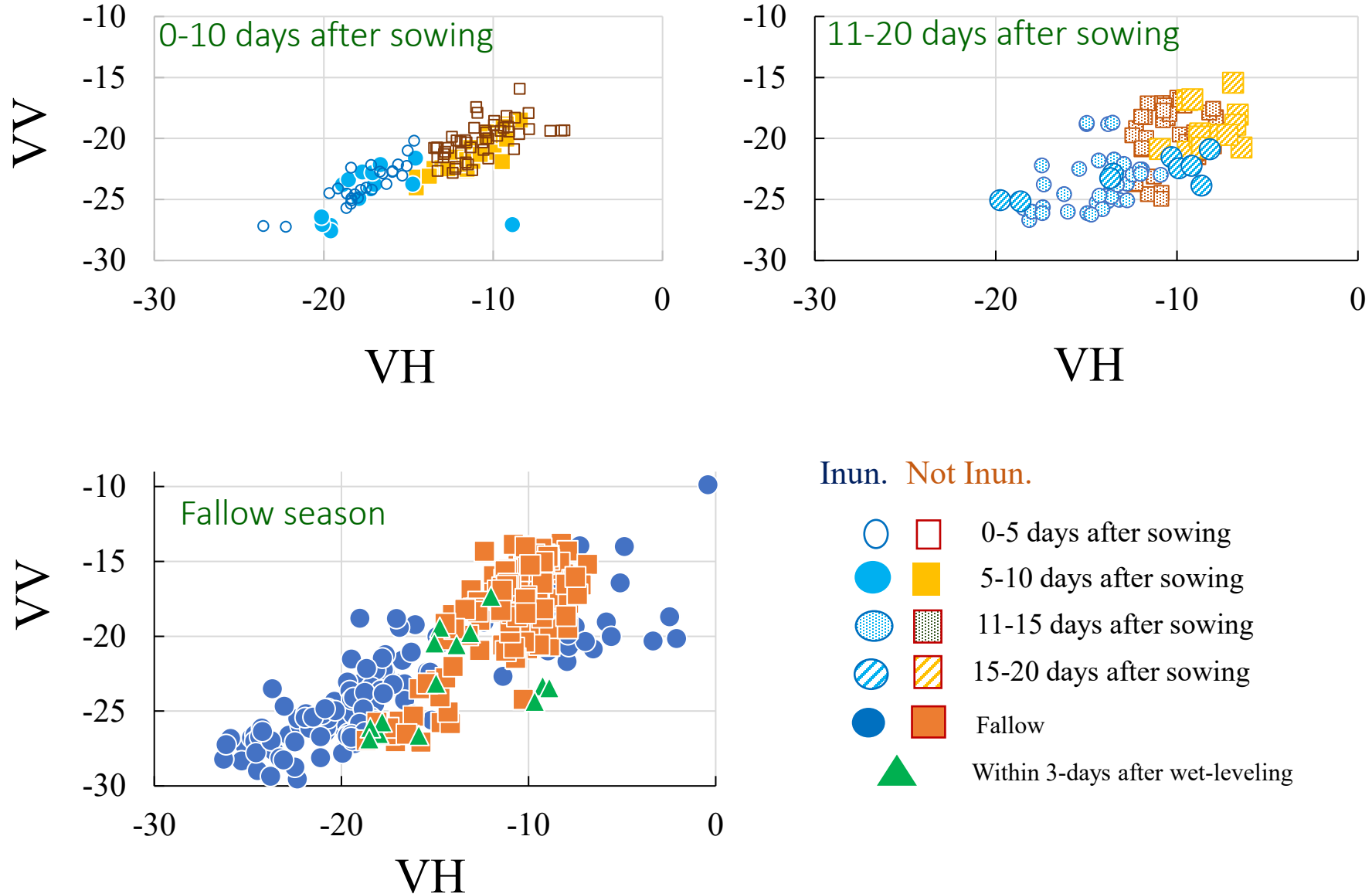


## Simulated daily CH<sub>4</sub> fluxes (kg C km<sup>-2</sup> h<sup>-1</sup>)

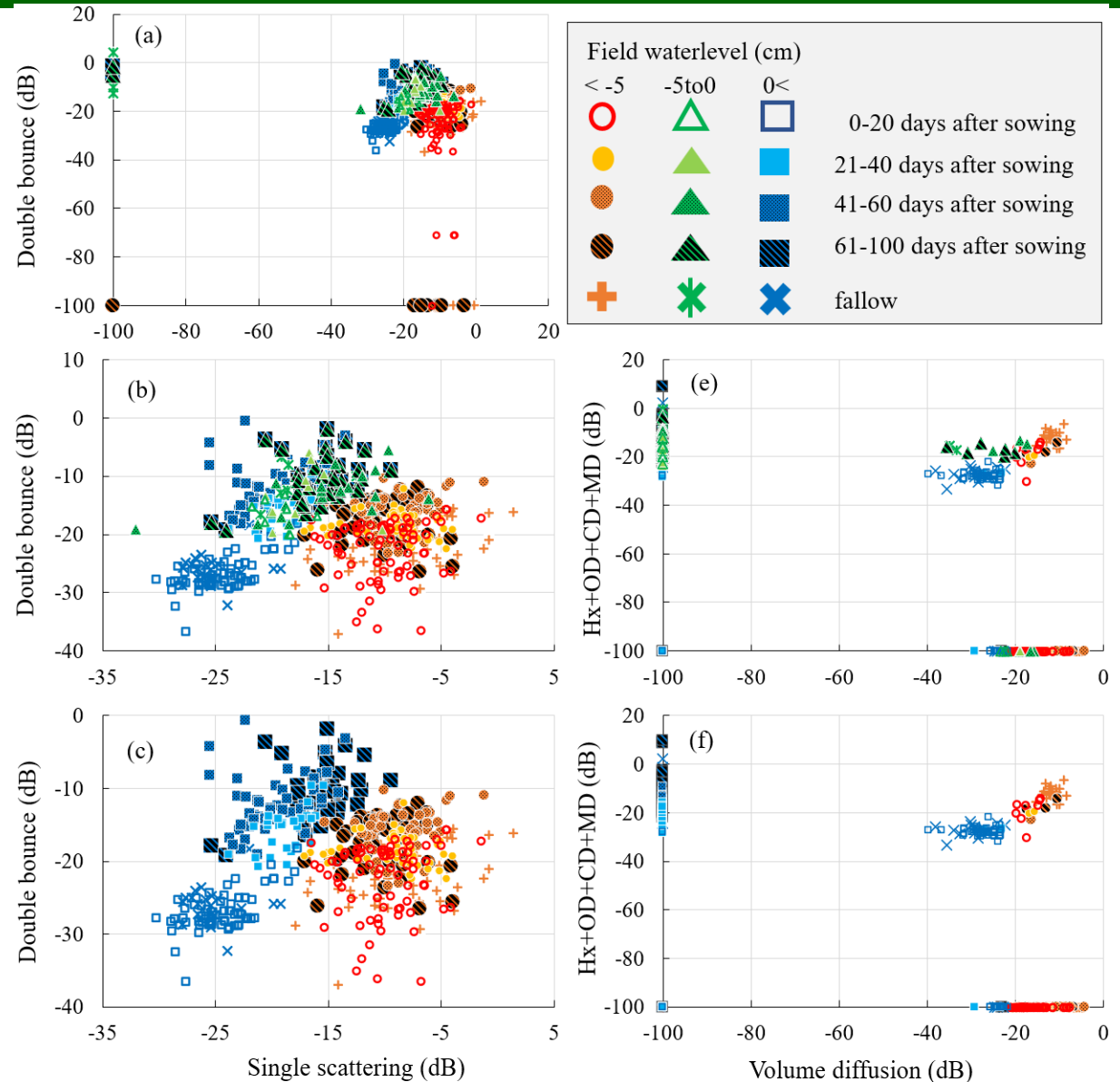
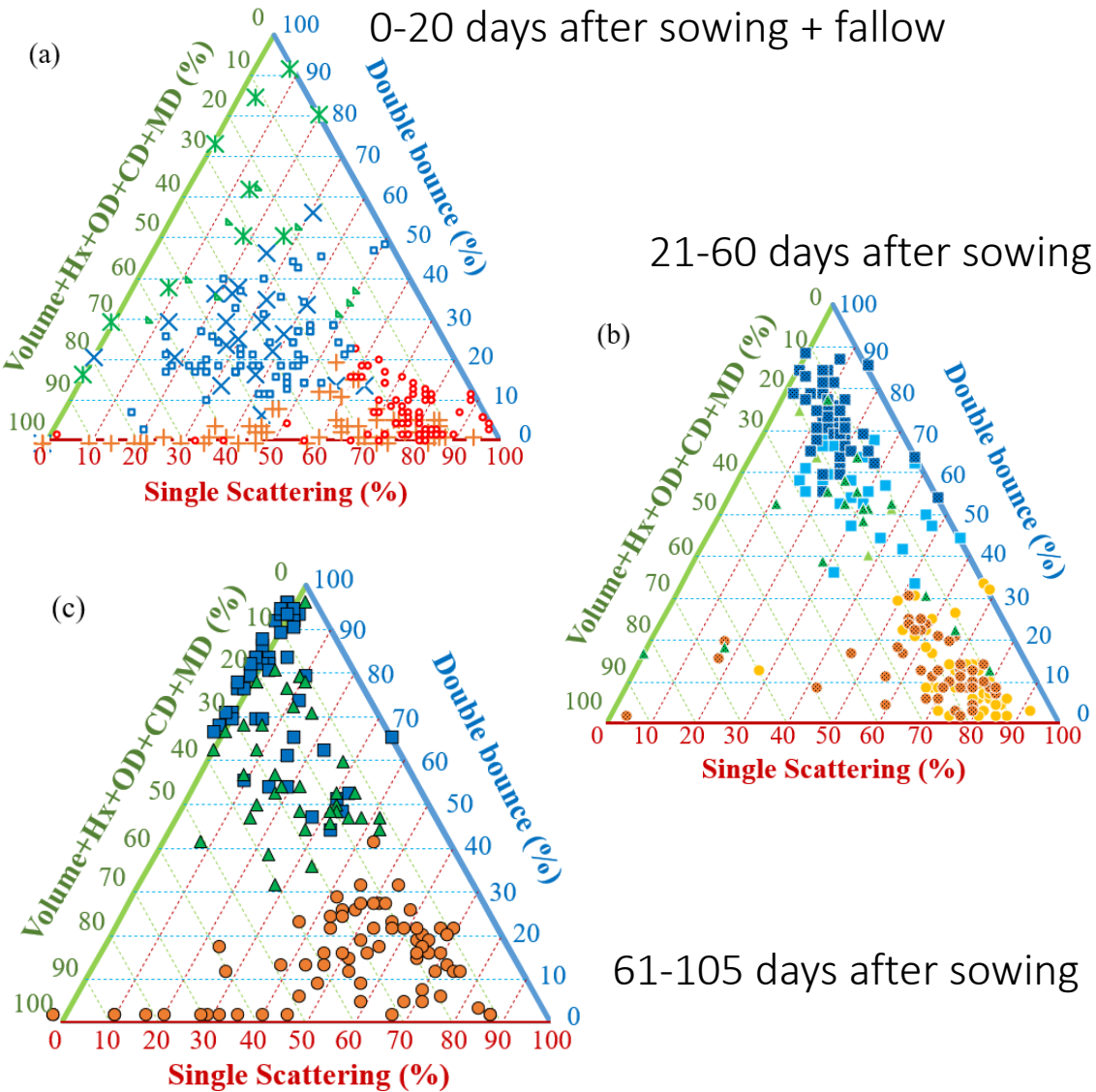


# C-band Sentinel-1 rice monitoring

-inundation detectable at early rice growing stages-



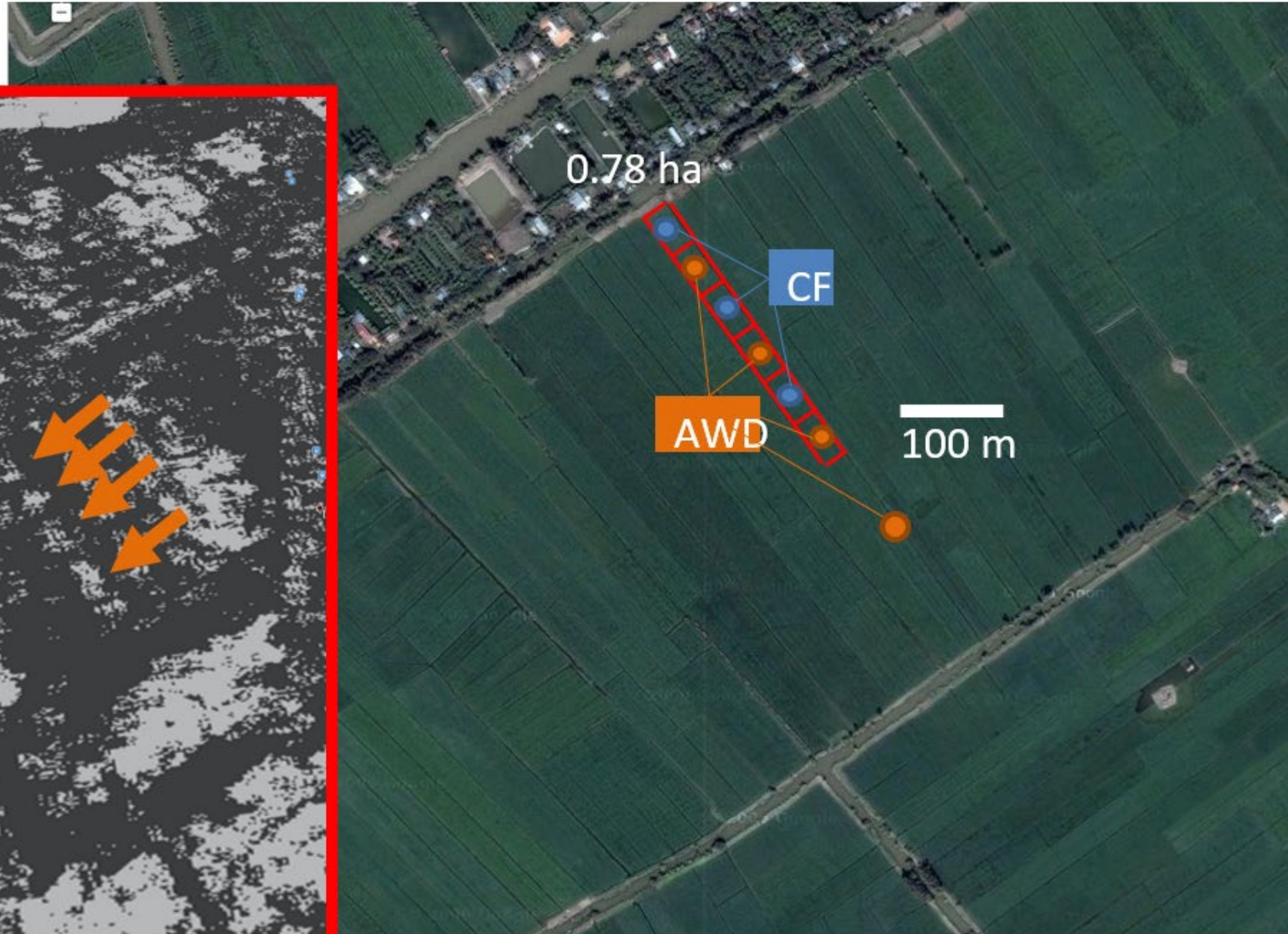
# L-band PALSAR-2 rice monitoring -inundation detectable in the whole stages-





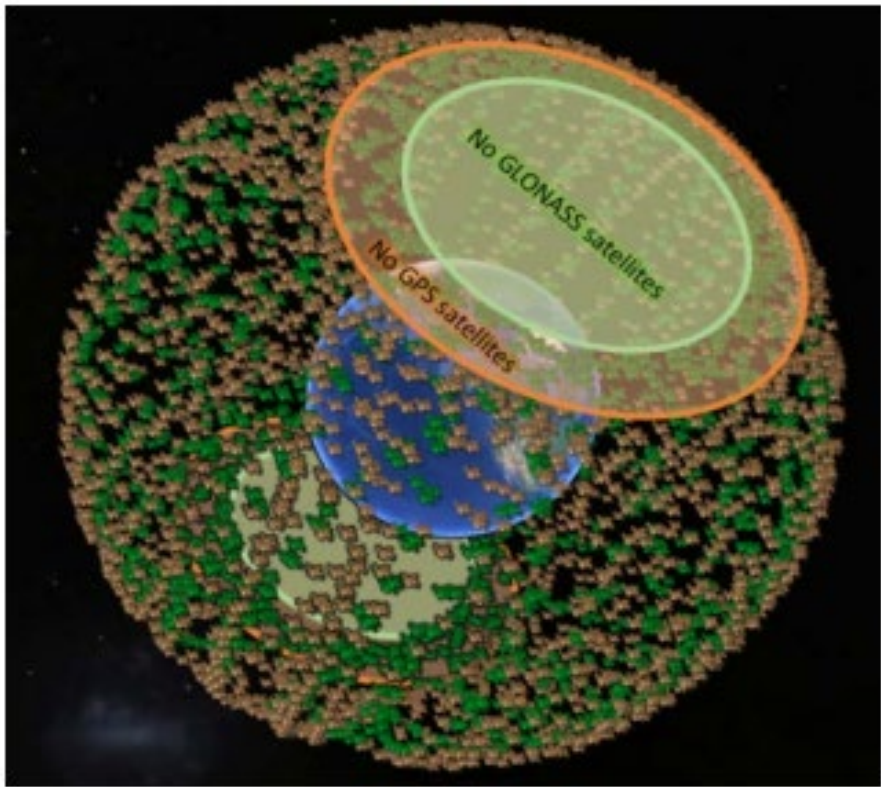
$\sigma^0$  based  
inundation  
detection  
with  
ALOS2-HR  
data

# white pixels  
Not-inundated

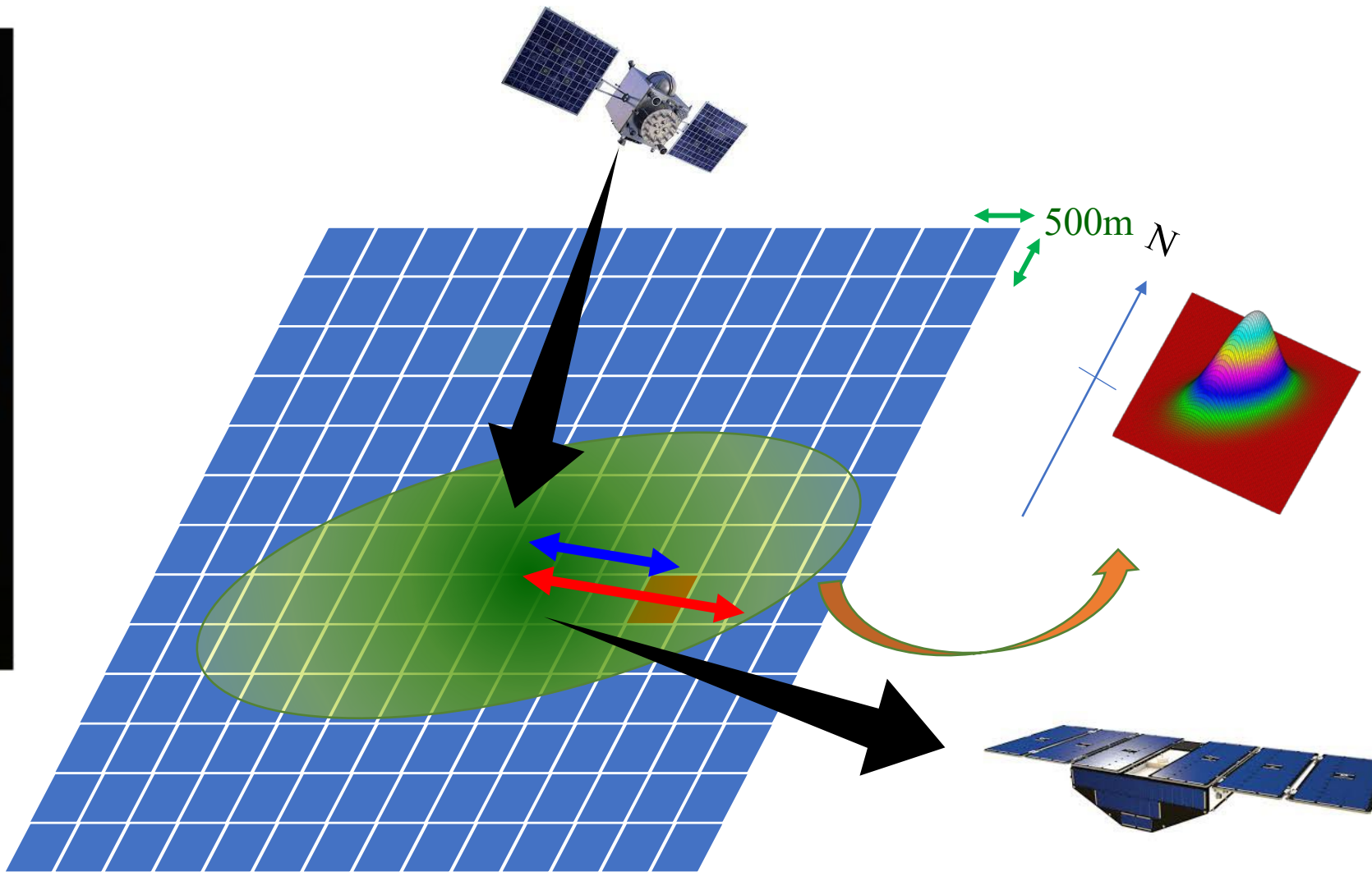


69 days after sowing, 6<sup>th</sup> May 2016

# GNSS signals available for inundation detection



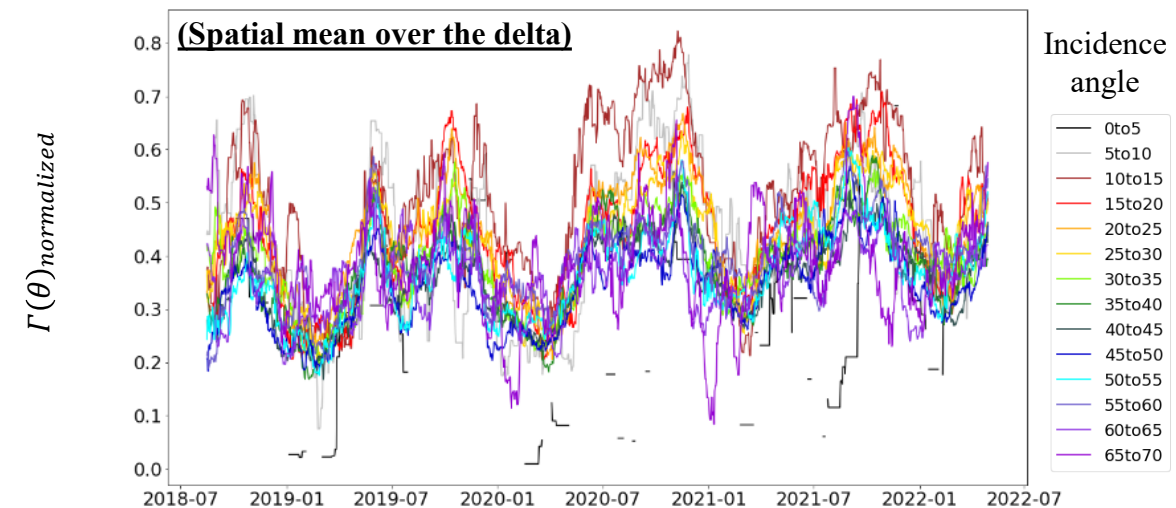
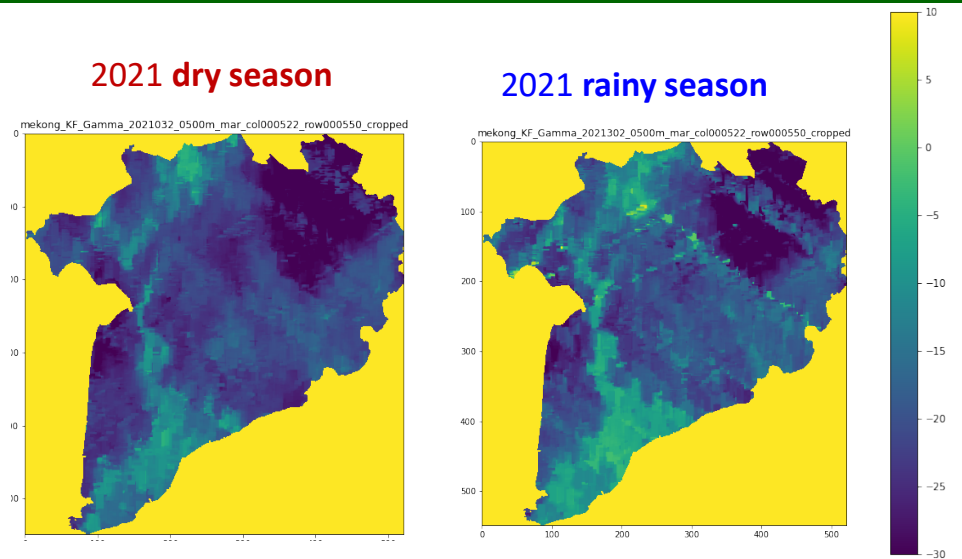
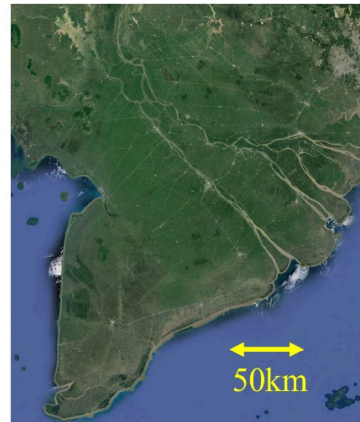
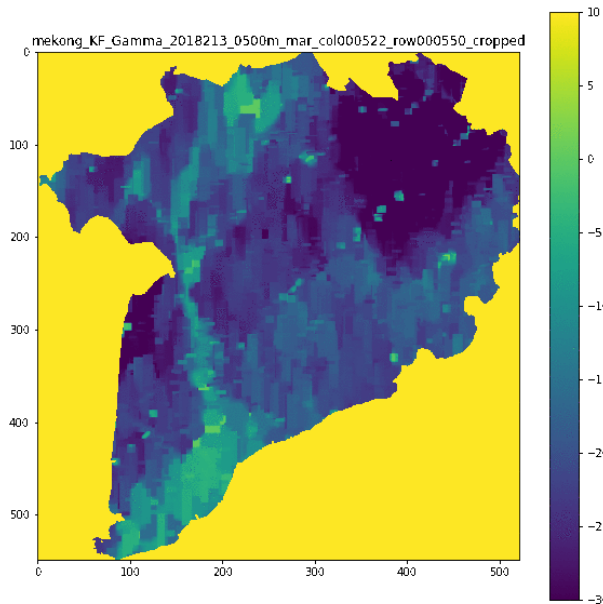
Here we can see the dense coverage of the two oldest GNSS constellations: the American GPS (orange) and the Soviet system GLONASS (green).



# Kalman filter product (500m\_res, 15-days resolution)

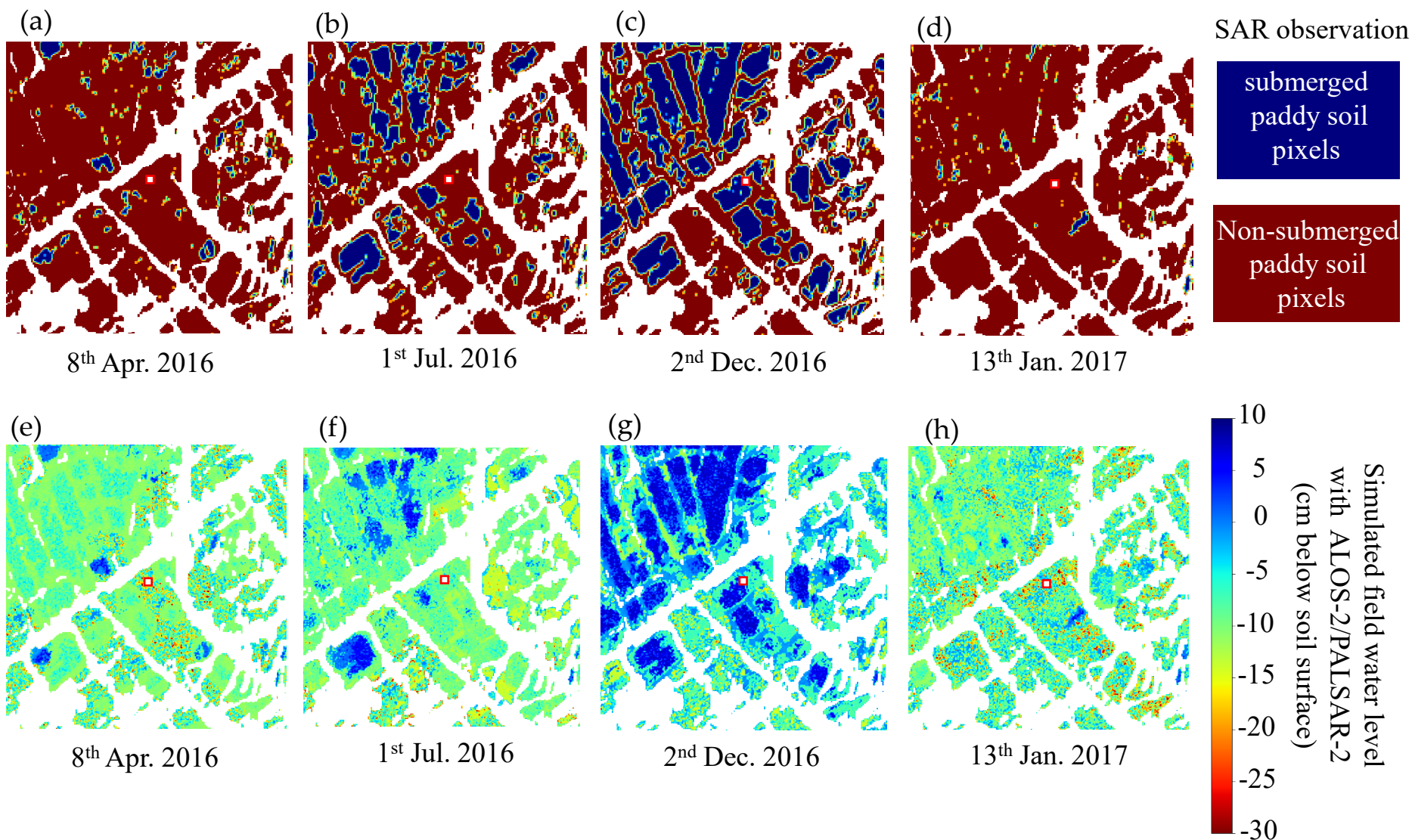


$\Gamma$  (dB)



No more ad hoc parameter setting! Everything adaptive!  
We can use all specular signals !  
Spatio-temporal pattern clearly appears!

# SAR data assimilation of field water level simulation -binding cyber space and real space-

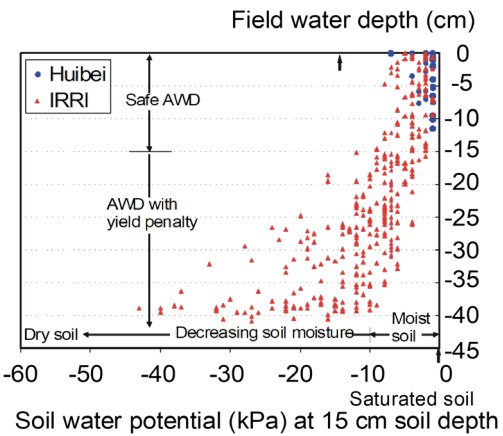
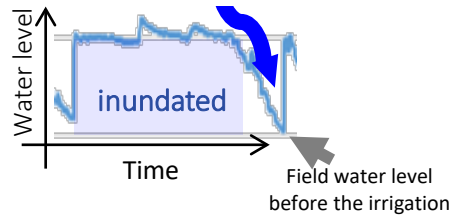


# Note Lite blue: Not submerged (i.e., water level is lower than 0)

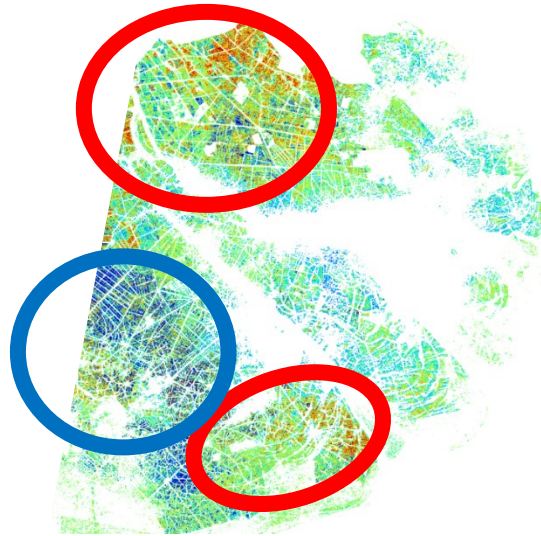
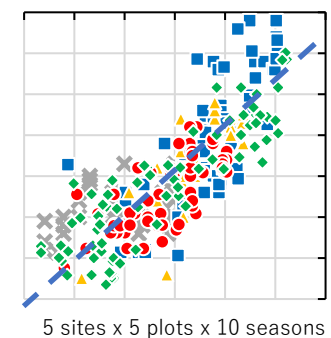
Blue: submerged (i.e., water level is taller than 0)

# How deep the field water was dropped by next irrigation?

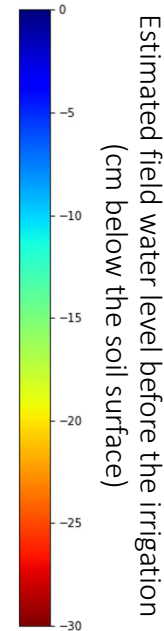
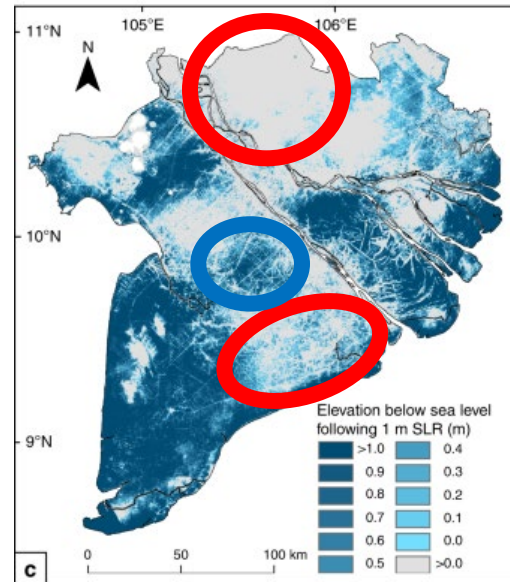
– Estimation by DA model parameter estimation –



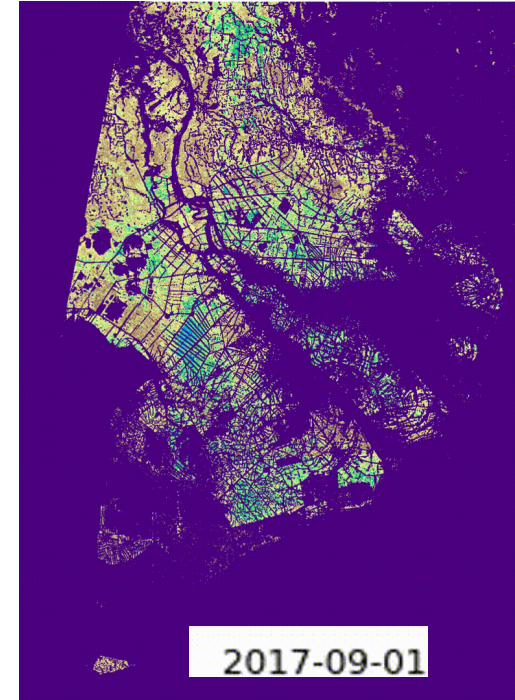
Estimated field water level before the irrigation (cm below the soil surface)



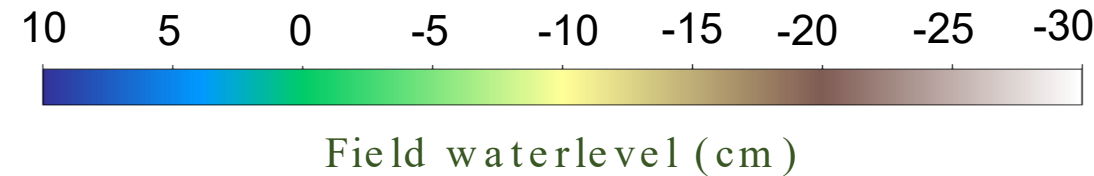
(d) 30<sup>th</sup> June, 2017



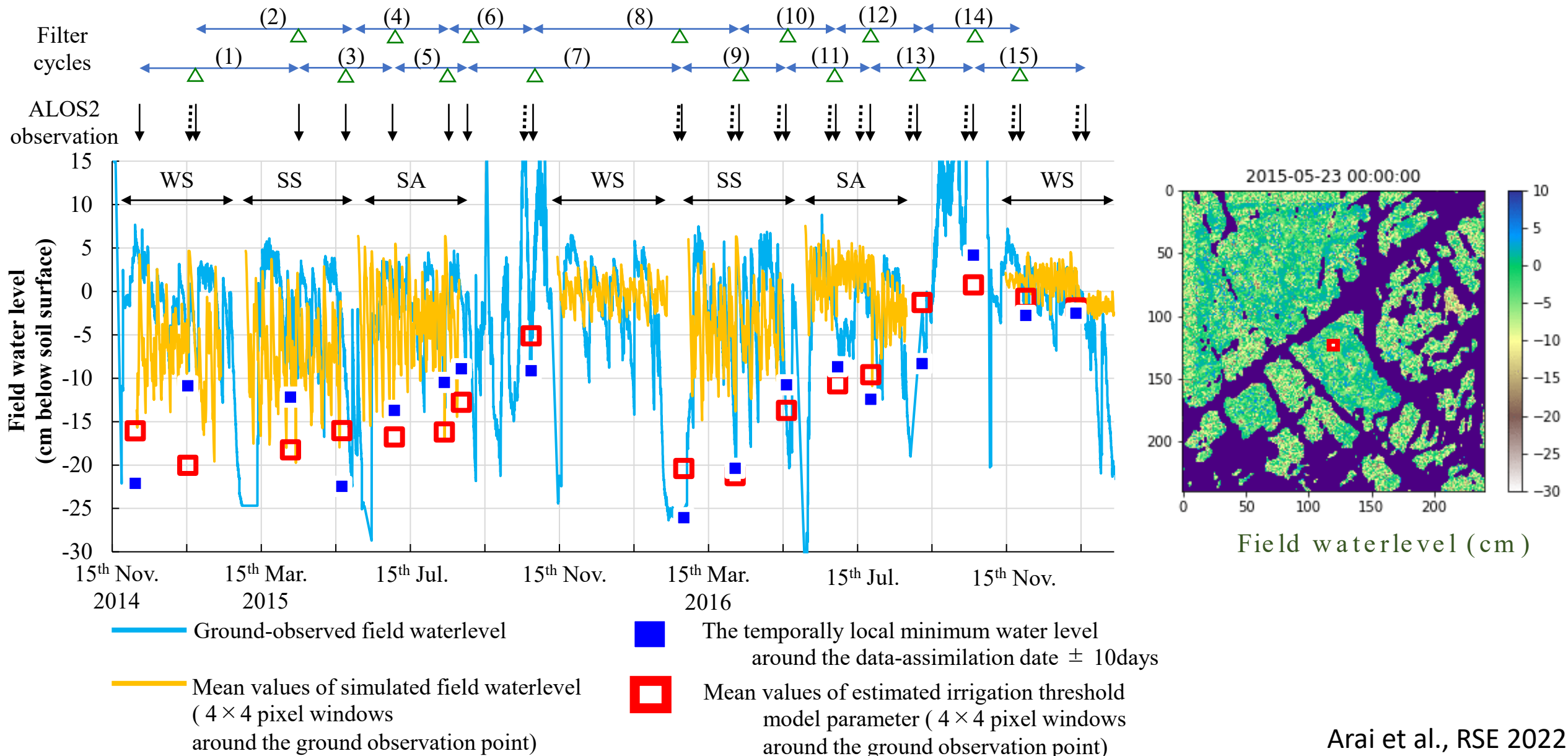
Dry season



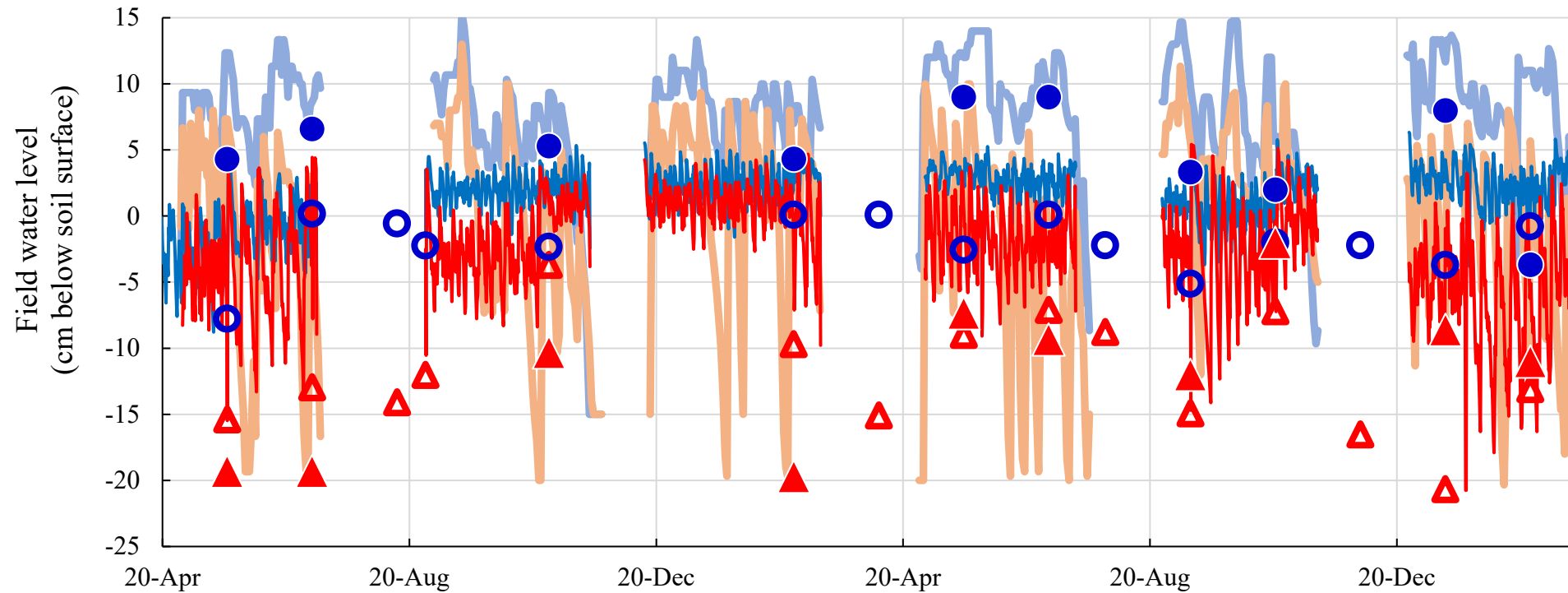
Rainy season



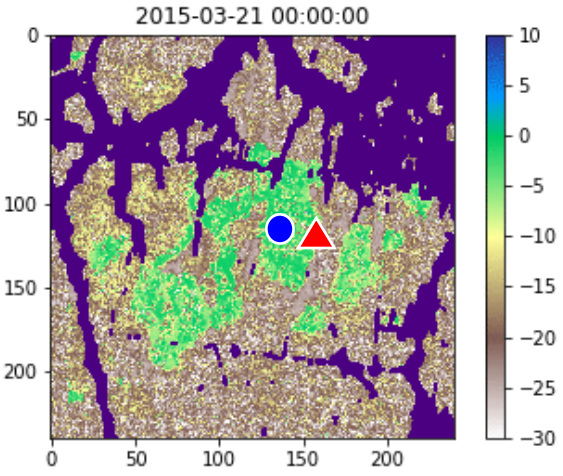
# A sample of validation result with ground observation data -semi dyke system-



# A sample of validation result with ground observation data -full dyke system-



Simulated field water level  
(cm below soil surface)



Ground-observed field waterlevel

- Continuously inundated paddy
- Paddy with intermittent drainage

Mean values of simulated field waterlevel  
( 4 × 4 pixel windows around the ground observation point)

- Continuously inundated paddy
- Paddy with intermittent drainage

The temporally local minimum waterlevel

- Continuously inundated paddy
- ▲ Paddy with intermittent drainage

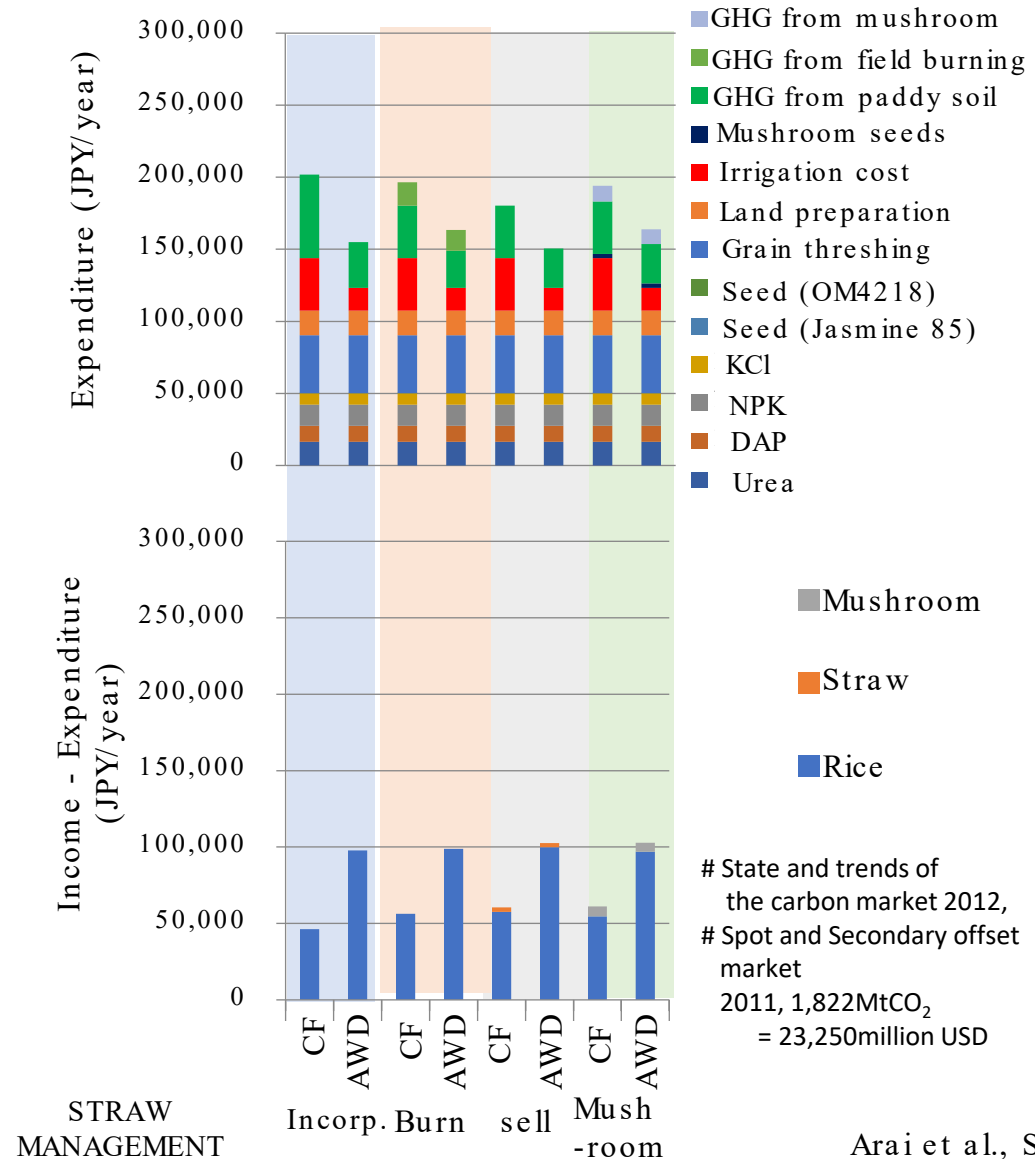
Mean values of estimated  $D_{\text{before irrigation}}$   
( 4 × 4 pixel windows around the ground observation point)

- Continuously inundated paddy
- △ Paddy with intermittent drainage

# Economic assessment of GHG mitigation measures under large uncertainties

Clear cost/benefits and actual farmers' participation are the keys to the adoption of new technologies by farmers.

Transparent MRV system on baselines/mitigation-effects with EO data should be enhanced.





## Drought

Irrigation status / soil moisture

- SAR/GNSS-R (QZSS)

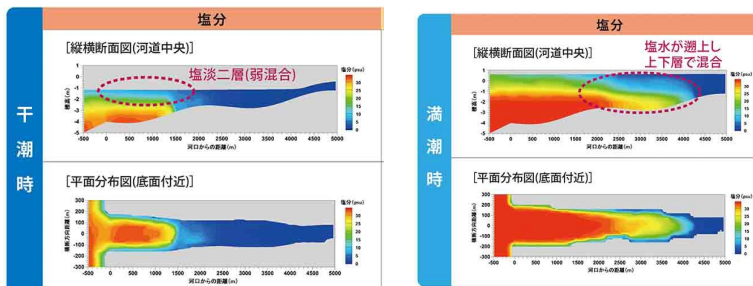
Land surface temperature

- Advanced Himawari Imager

## Saline intrusion

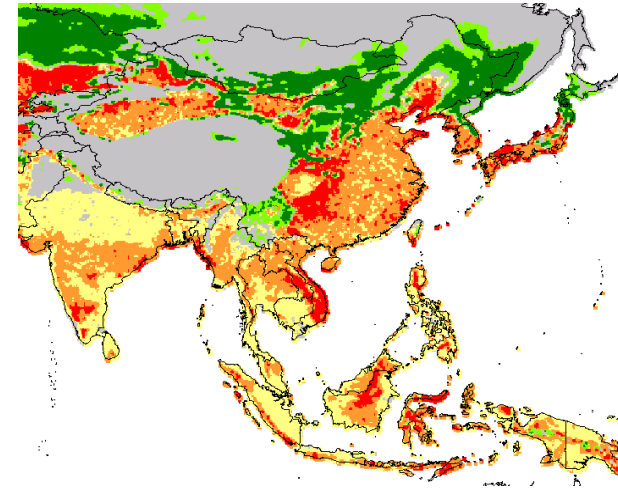
3D salt intrusion simulation coupling with crop/soil model

- bathymetry data around river mouth
- vertical profile of salt concentration in river
- **discharge**

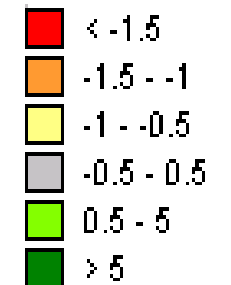


Courtesy of idea co. ltd

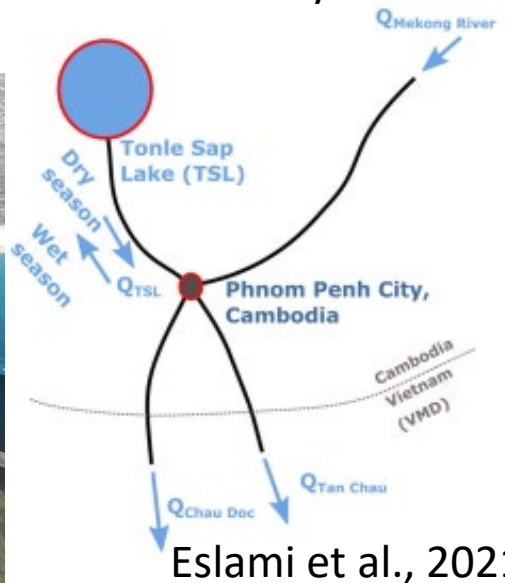
## Effect of 2 C warming on potential rice yield in Asia



Yield change (t/ha)



Courtesy of IRRI



Eslami et al., 2021