



ESA - MOST Dragon 2 Programme

**2011 DRAGON 2 SYMPOSIUM**

中国科技部-欧洲空间局合作“龙计划”二期

“龙计划”二期2011年学术研讨会

# Key Eco-Hydrological Parameters Retrieval and Land Data Assimilation System Development in a Typical Inland River Basin of China's Arid Region (ID. 5322)

**Prof. Xin Li (李新)**

**Cold and Arid Regions**

**Environmental and Engineering**

**Research Institute, CAS**

**Prof. Massimo Menenti**

**Delft University of Technology**

## Chinese Investigators

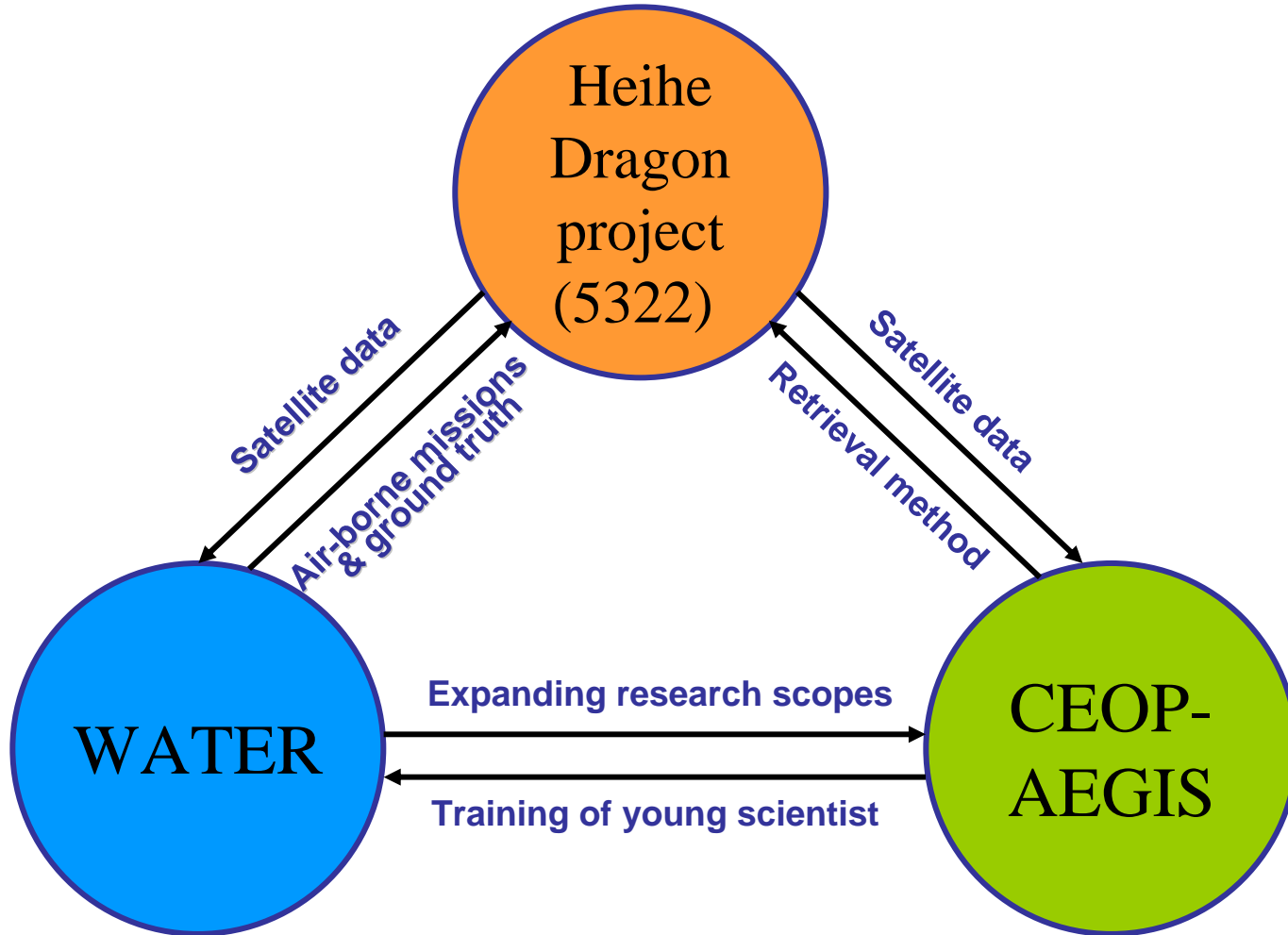
- Xin Li (CAREERI)
- Jian Wang (CAREERI)
- Jiemin Wang (CAREERI)
- Zeyong Hu (CAREERI)
- Ling Lu (CAREERI)
- Mingguo Ma (CAREERI)
- Weizhen Wang (CAREERI)
- Tao Che (CAREERI)
- Rui Jin (CAREERI)
- Qiang Liu (IRSA)

## European Investigators

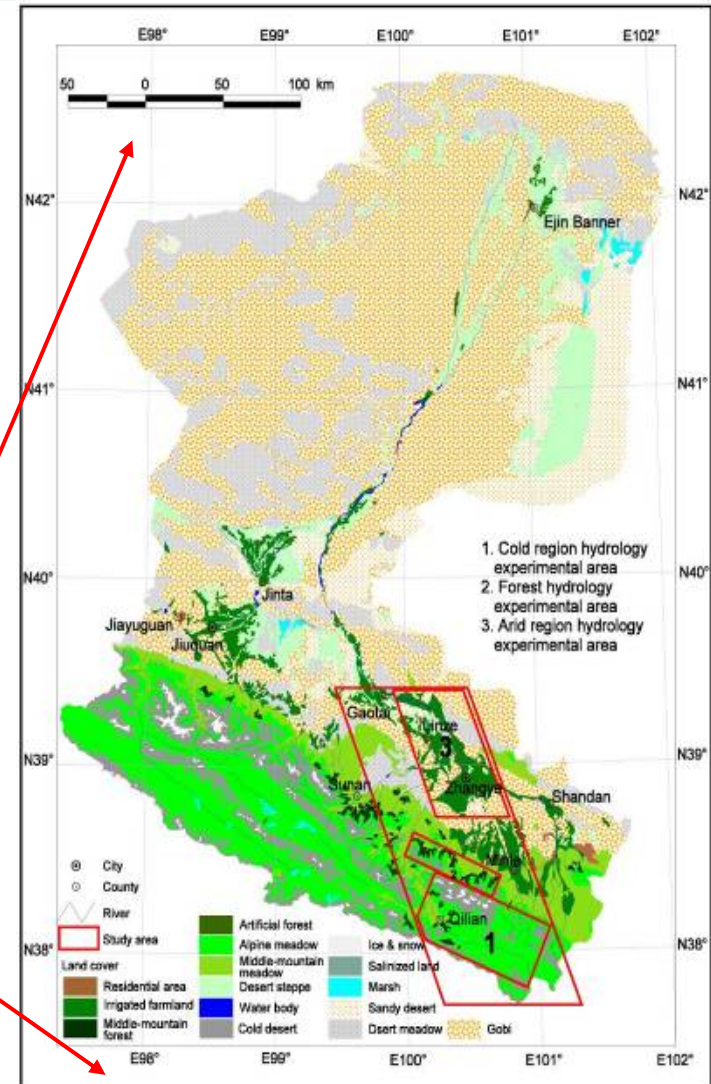
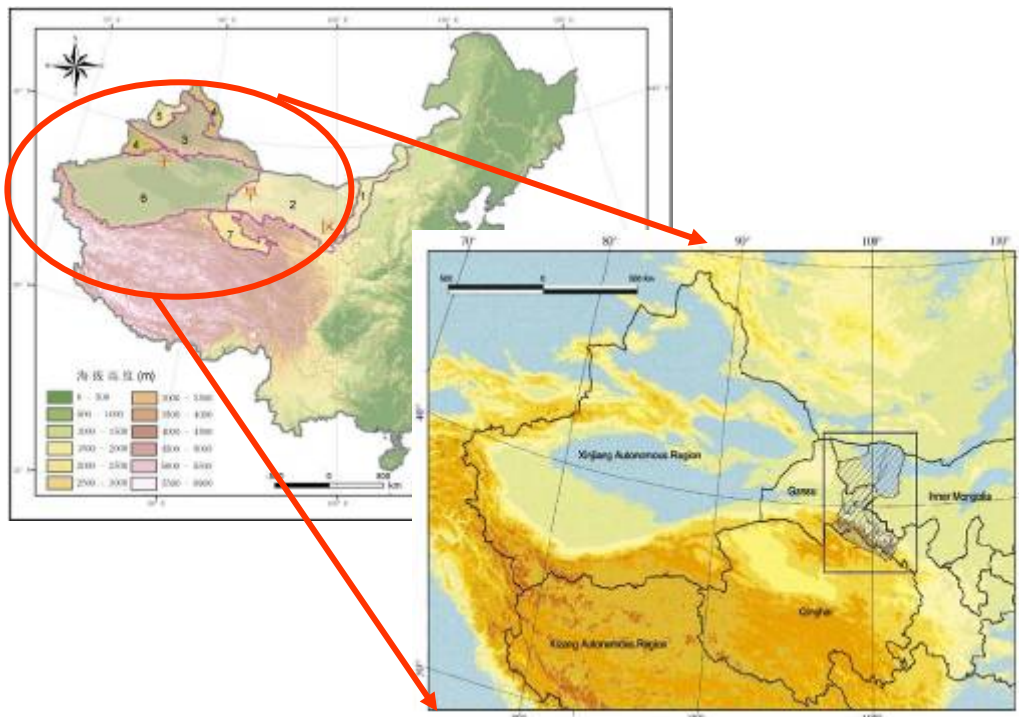
- Massimo Menenti (F, IT, NL)
- Zhongbo Su (NL)
- Li Jia (NL)
- Frank Veroustraete (B)
- Fabio Maselli (IT)
- Sandro Brivio (IT)
- Zhaoliang Li (F)
- Run Wang (G)
- Xin Tian (NL)

- Objective and background
- Progress on key eco-hydrological parameters retrieval
- Progress on HDAS
- Prevue of Hi-WATER
- Summary





# Study area: Heihe River Basin



# The **WATER** Project

## **W**atershed **A**llied **T**elemetry **E**xperimental **R**esearch

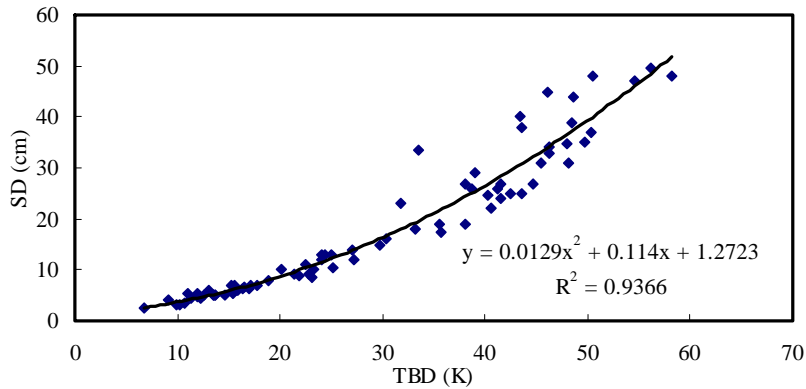
### Watershed Allied Telemetry Experimental Research

Xin Li<sup>1</sup>, Xiaowen Li<sup>2,3</sup>, Zengyuan Li<sup>4</sup>, Mingguo Ma<sup>1</sup>, Jian Wang<sup>1</sup>, Qing Xiao<sup>2</sup>, Qiang Liu<sup>2</sup>,  
Tao Che<sup>1</sup>, Erxue Chen<sup>4</sup>, Guangjian Yan<sup>3</sup>, Zeyong Hu<sup>1</sup>, Lixin Zhang<sup>3</sup>, Rongzhong Chu<sup>1</sup>, Peixi  
Su<sup>1</sup>, Qinhua Liu<sup>2</sup>, Shaomin Liu<sup>3</sup>, Jindi Wang<sup>3</sup>, Zheng Niu<sup>2</sup>, Yan Chen<sup>5</sup>, Rui Jin<sup>1</sup>, Weizhen  
Wang<sup>1</sup>, Youhua Ran<sup>1</sup>, Xiaozhou Xin<sup>2</sup>, Huazhong Ren<sup>3</sup>

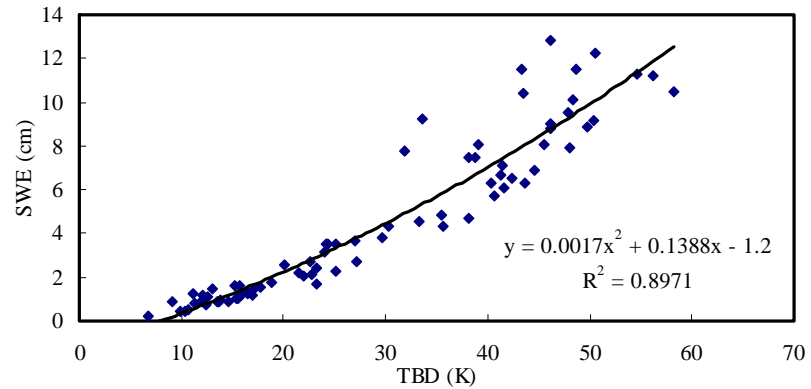
**Li Xin et al., 2009, JGR**

## 2. Progress on key eco-hydrological parameters retrieval



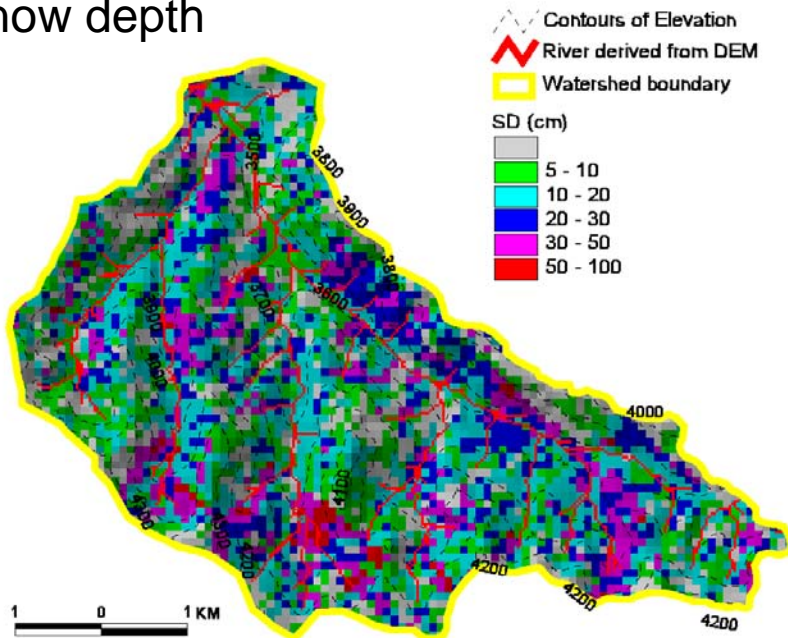


$$SD = 0.0129 * TBD^2 + 0.114 * TBD + 1.2723$$

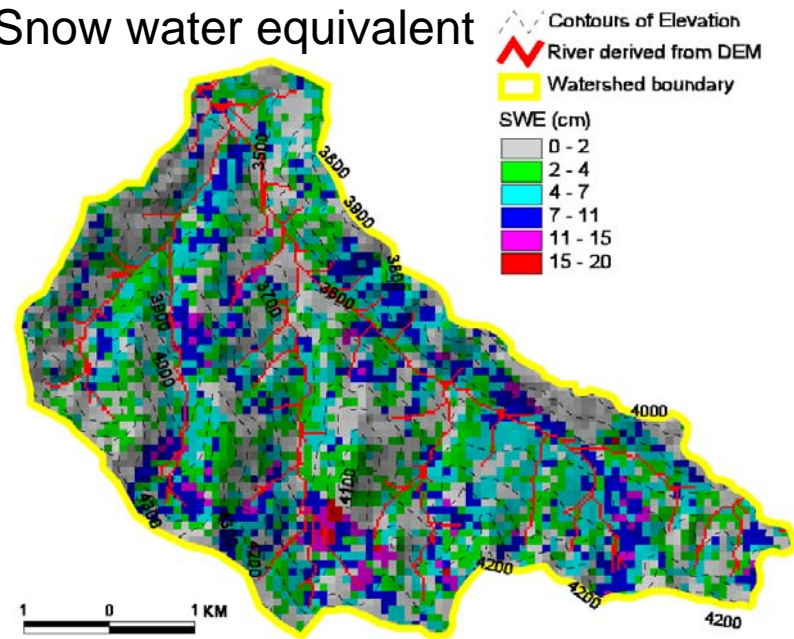


$$SWE = 0.0017 * TBD^2 + 0.1388 * TBD - 1.2$$

## Snow depth



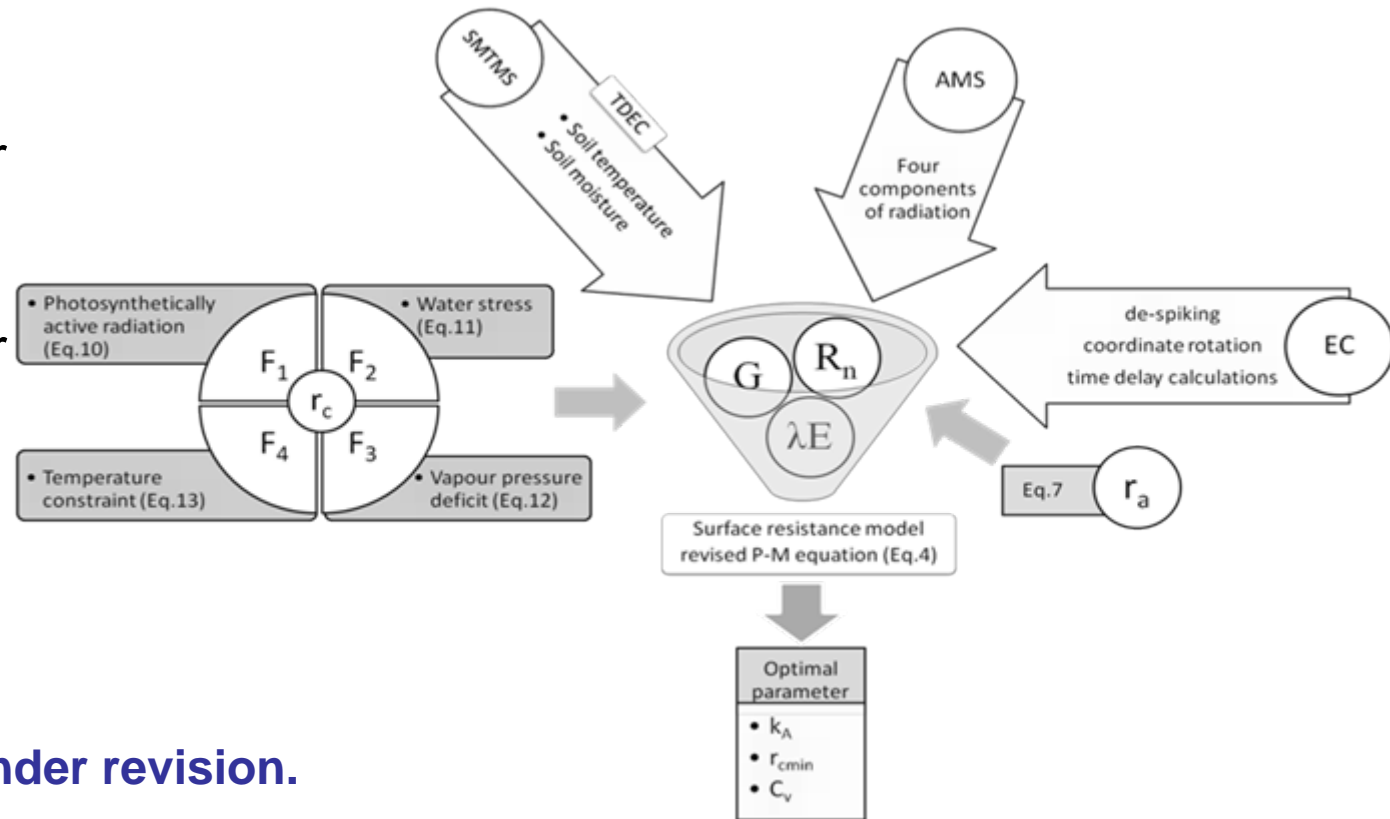
## Snow water equivalent



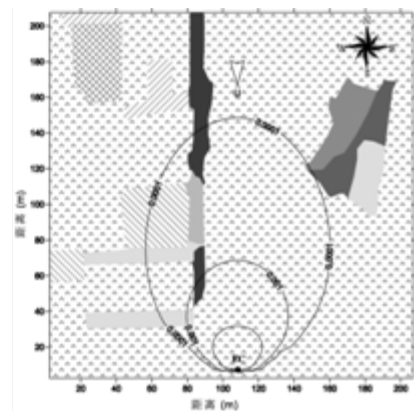
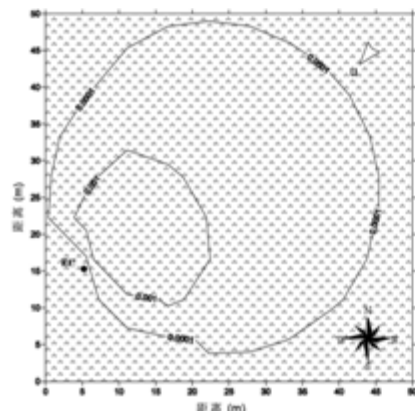
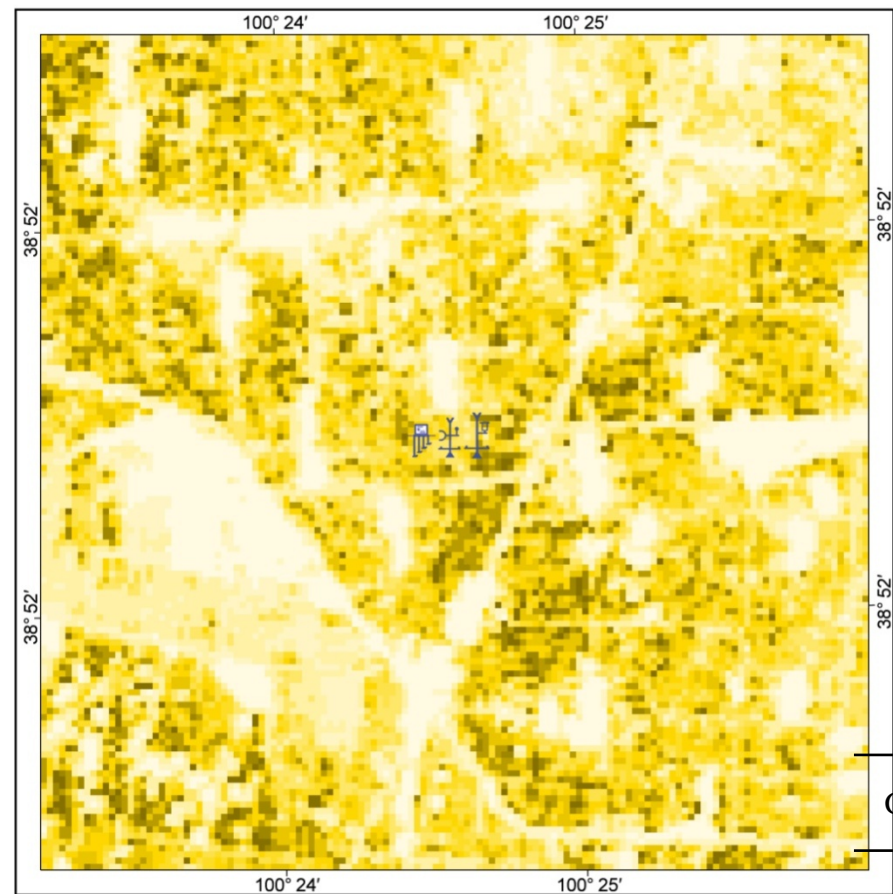


# A biophysics-based surface resistance model for estimating latent heat flux from remotely sensed data

Four factors (radiation, soil water content, saturated vapour pressure deficit (VPD) and air temperature) that affect the ET are taken into the algorithm.



Song, *et al.*, JAG, Under revision.



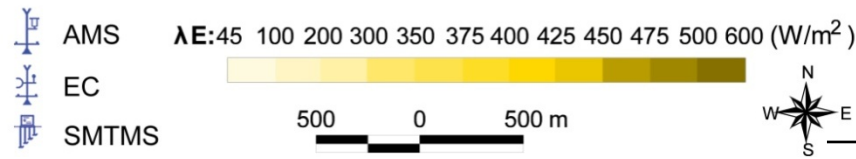
(080629 11:42)

(080707 11:42)

图4 EC 足迹 Fig. 4 EC footprint

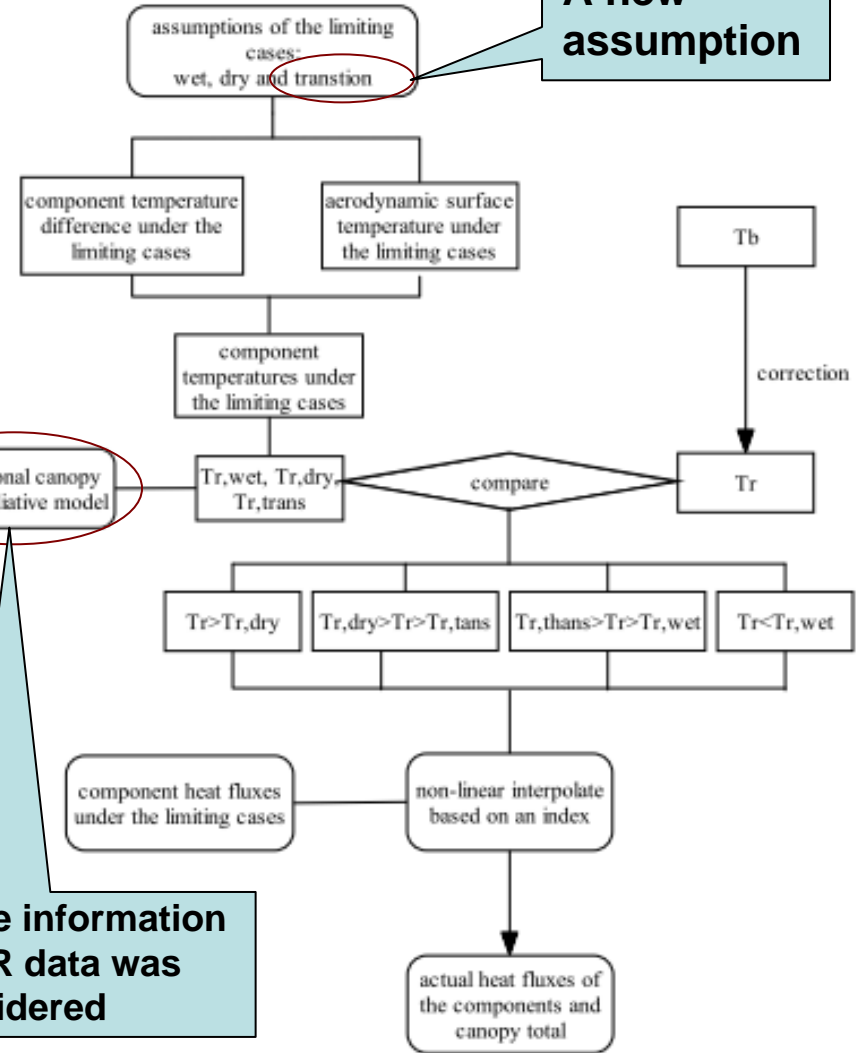
### Validation of $\lambda E$ ( $Wm^{-2}$ )

Ground truth (EC)	Estimate (footprint)	Estimate (one pixel)	Ground truth (EC)
20080629 11:45 ( Beijing Time )	448	479	441
20080707 11:42 ( Beijing Time )	407	476	396



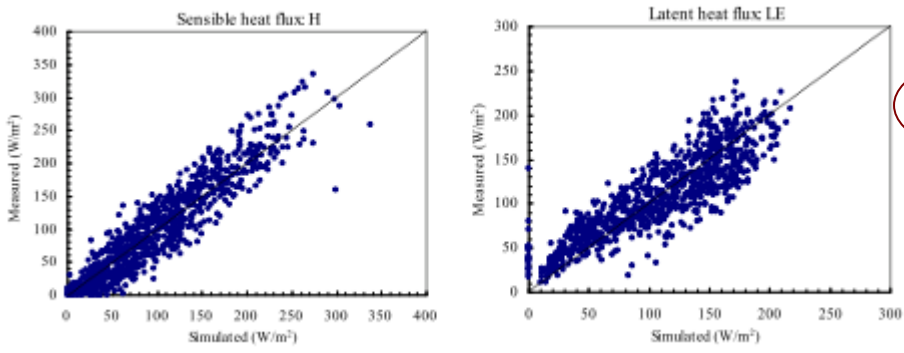
# Heat fluxes estimation using directional thermal-infrared (TIR) data and the two-layer model

A new assumption

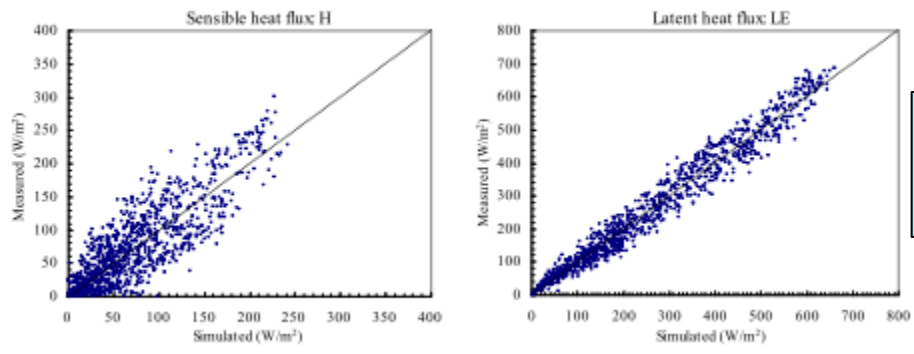


directional canopy TIR radiative model

Angle information of TIR data was considered

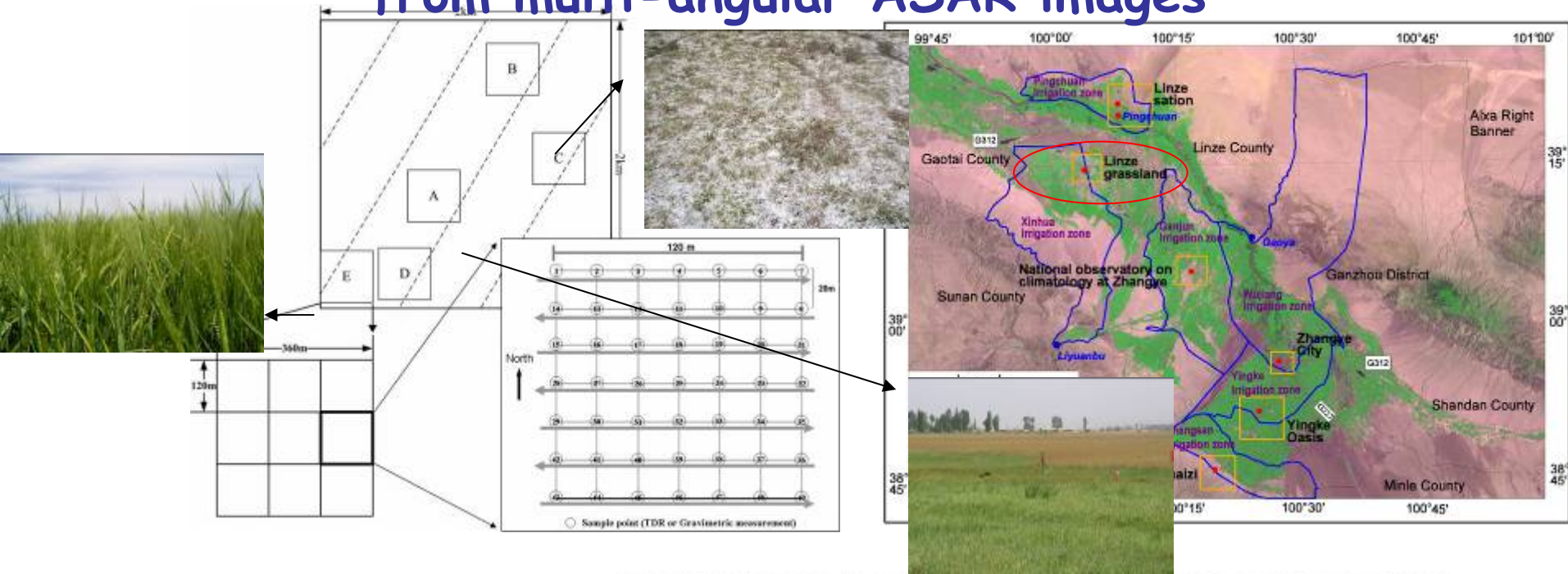


Winter wheat

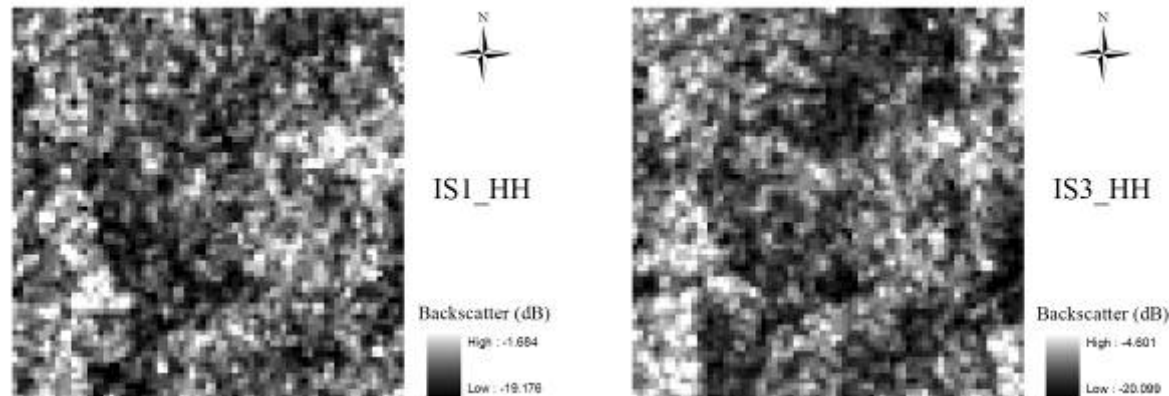


Maize

# Estimation of surface soil moisture and roughness from multi-angular ASAR images

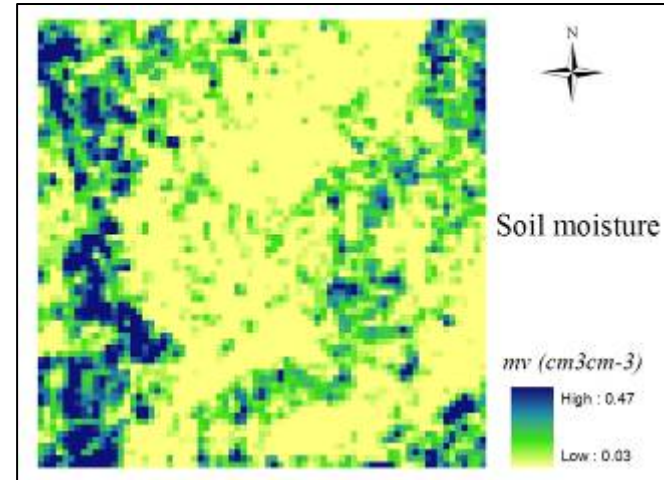
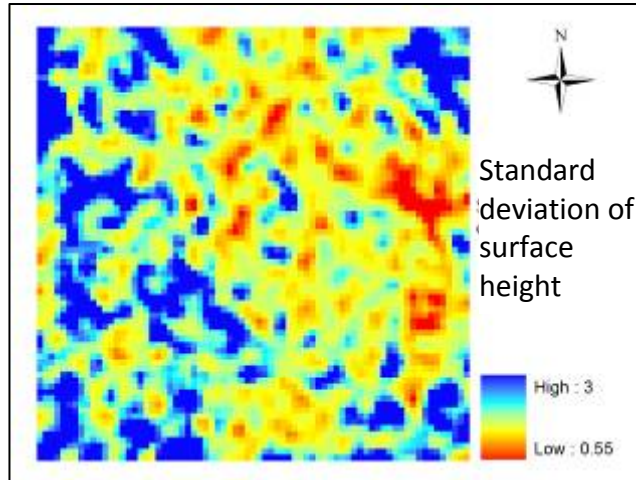


This study develops and evaluates an operational method that explores surface roughness based solely on multi-angle ASAR data.

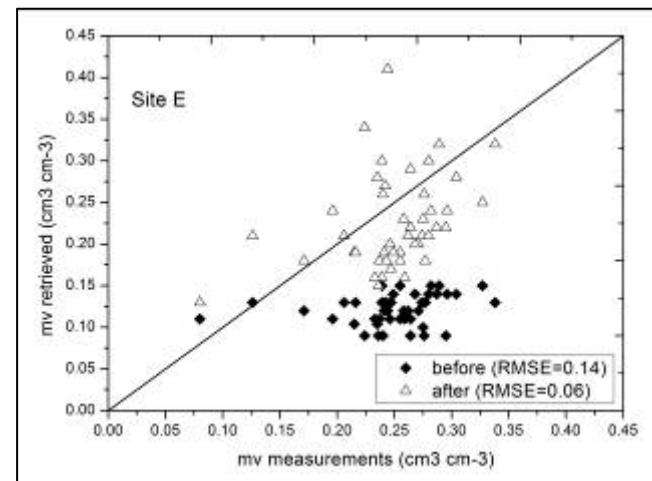
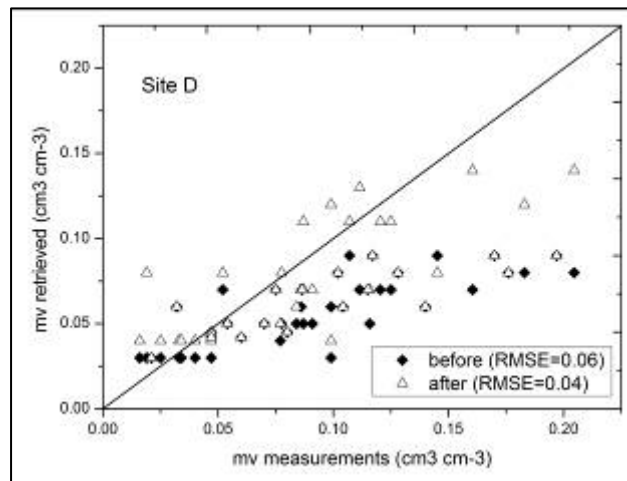


# Estimation of surface soil moisture and roughness from multi-angular ASAR images

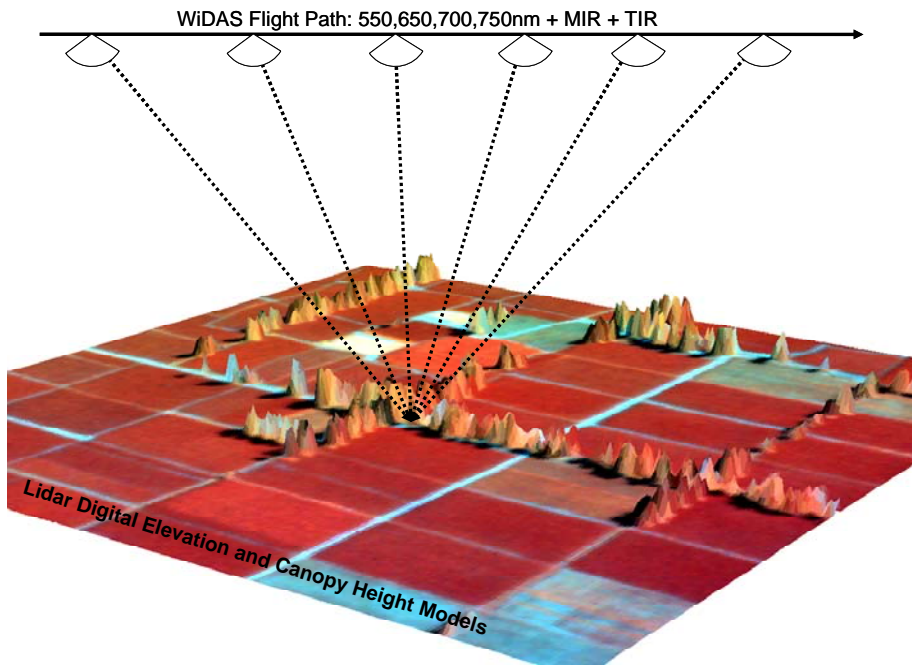
Retrieved results



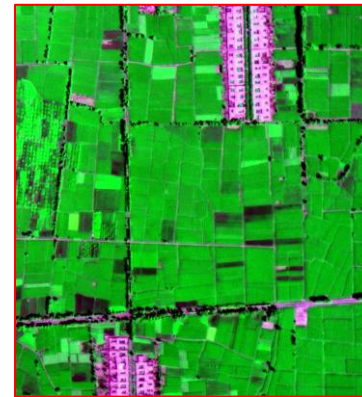
Soil moisture validation



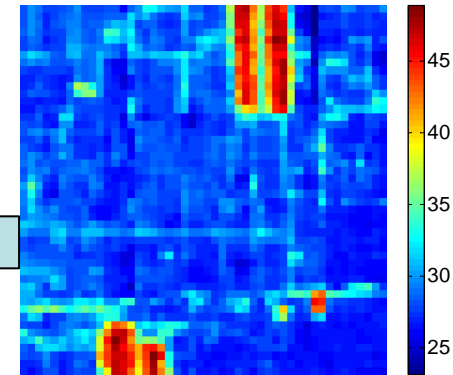
# Separating vegetation and soil temperatures using airborne multi-angular remote sensing image data



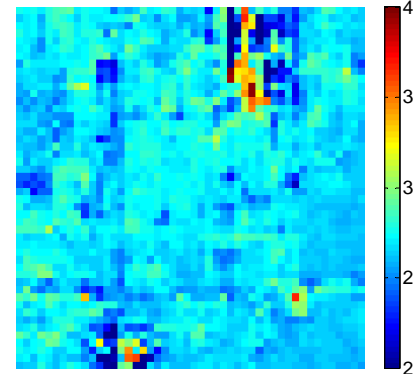
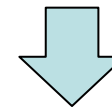
Multi-angular measurements for a given target of known 3D structure



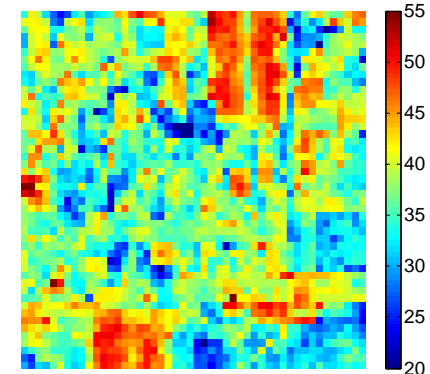
WiDAS VNIR image  
(Resolution 1.25 m)



WiDAS TIR image  
(Resolution 7.5 m)

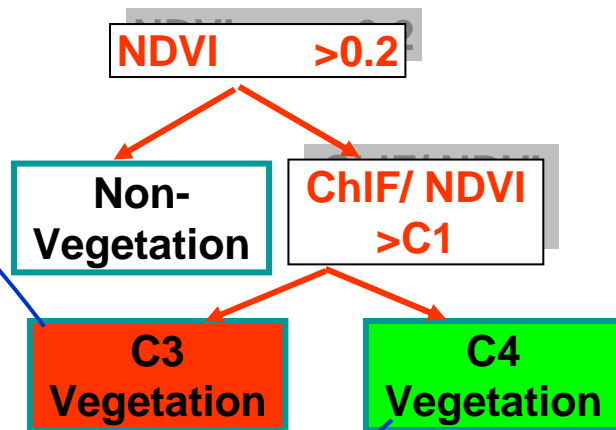
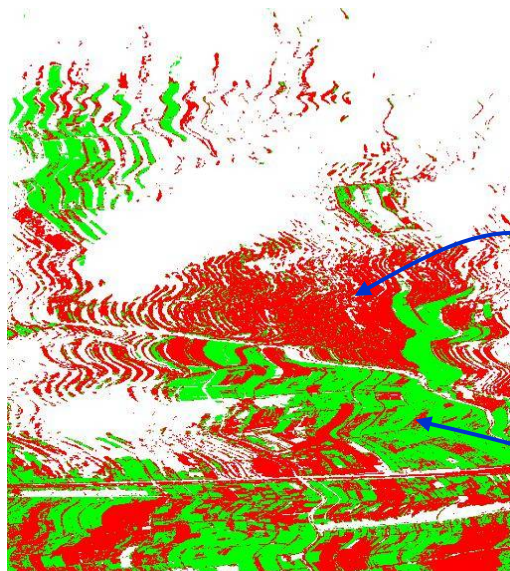


Vegetation BT

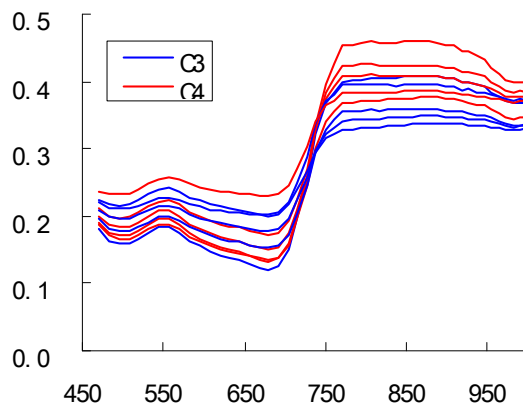
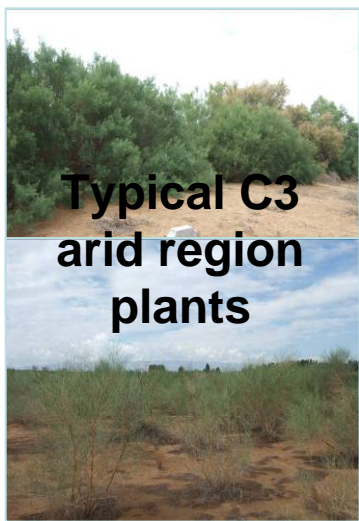


Soil BT

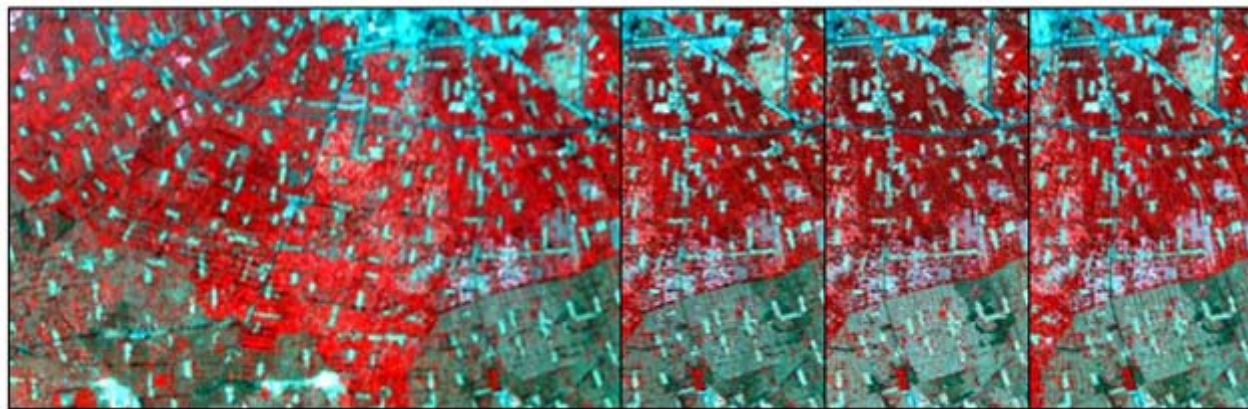
# Mapping C3 and C4 plant functional types using separated solar-induced chlorophyll fluorescence from hyperspectral data



Overall accuracy 92%,  
Kappa 0.84

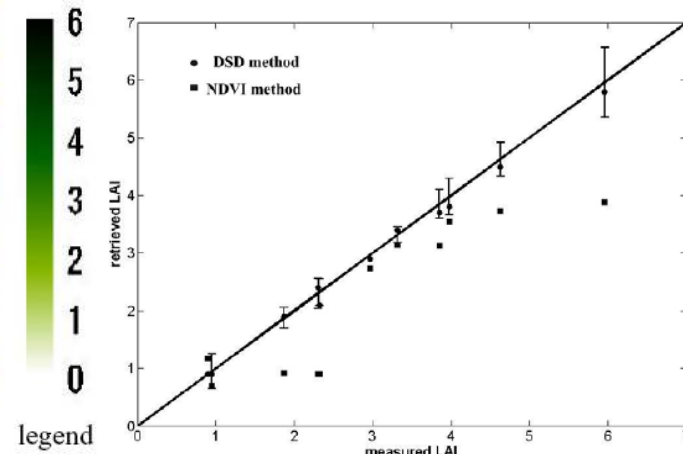
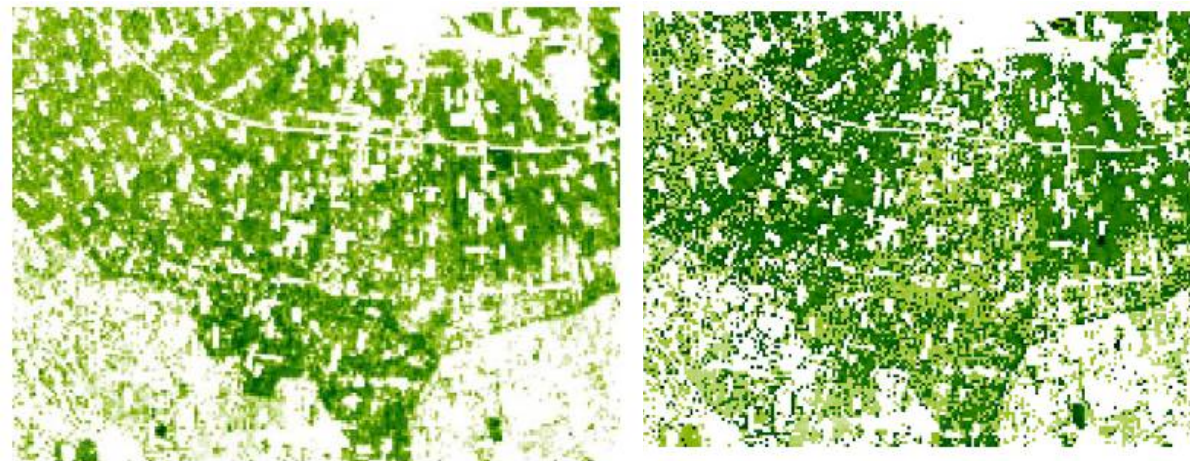


# LAI derived from CHRIS



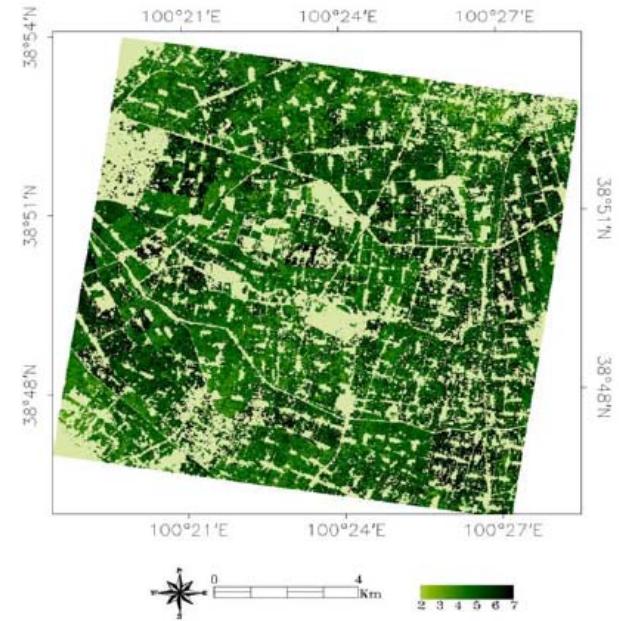
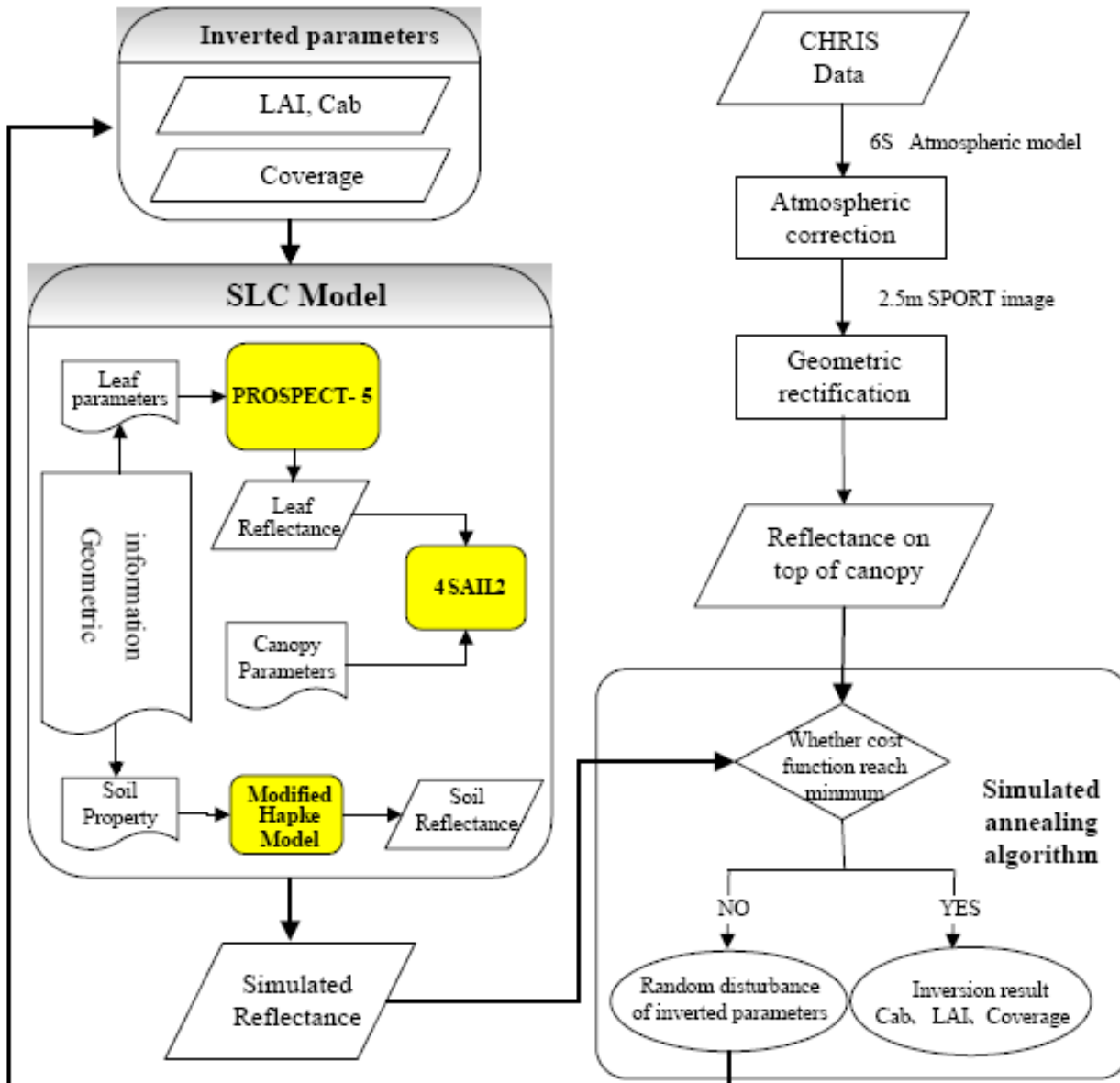
CHRIS data of the study area after geometric correction

A new hybrid canopy reflectance model was developed and applied it to estimate LAI from CHRIS/PROBA.

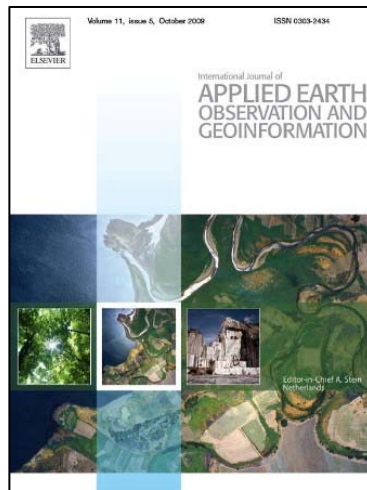
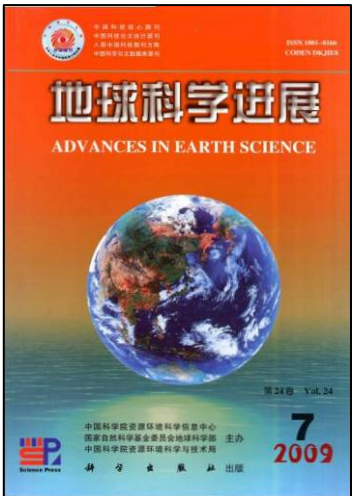
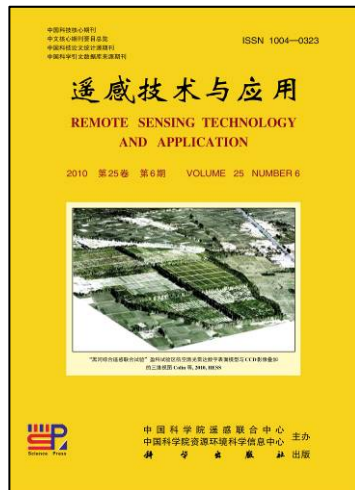
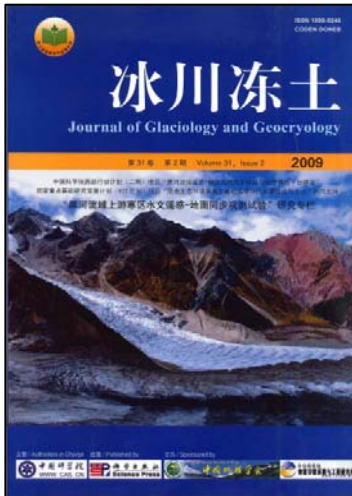


LAI map retrieval based on the empirical relationship between LAI and NDVI (left) and using DSD (directional second derivative) method (right)





A forward model, Soil-Leaf-Canopy (SLC) model, was used to estimate LAI and Cab in this paper. Simulated annealing method was adopted as inversion algorithm.

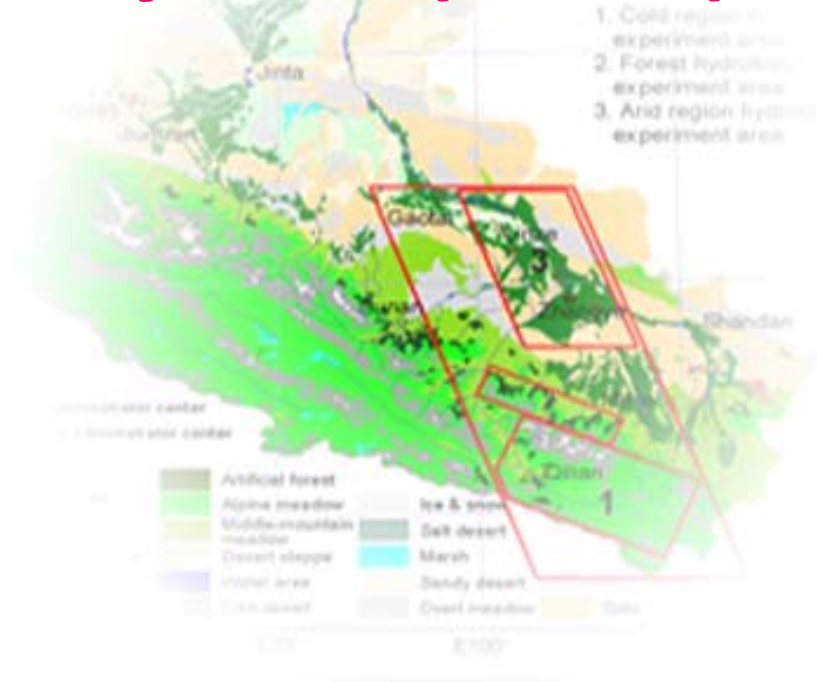


## HESS - Special Issue

**Observing and modeling the catchment-scale water cycle**  
 Editor(s): Xin Li, Xiaowen Li, K. Roth, M. Menenti, and W. Wagner

- |  |             |
|--|-------------|
| <b>Parameterization of a coupled CO<sub>2</sub> and H<sub>2</sub>O gas exchange model at the leaf scale of <i>Populus euphratica</i></b><br>G. F. Zhu, X. Li, Y. H. Su, and C. L. Huang<br>Hydrol. Earth Syst. Sci., 14, 419-431, 2010<br>▢ <a href="#">Abstract</a> ▢ <a href="#">Final Revised Paper</a> (PDF, 1679 KB) ▢ <a href="#">Discussion Paper</a> (HESSD)                     | 05 Mar 2010 |
| <b>The Two-layer Surface Energy Balance Parameterization Scheme (TSEBPS) for estimation of land surface heat fluxes</b><br>X. Xin and Q. Liu<br>Hydrol. Earth Syst. Sci., 14, 491-504, 2010<br>▢ <a href="#">Abstract</a> ▢ <a href="#">Final Revised Paper</a> (PDF, 515 KB) ▢ <a href="#">Discussion Paper</a> (HESSD)   | 12 Mar 2010 |
| <b>Frozen soil parameterization in a distributed biosphere hydrological model</b><br>L. Wang, T. Koike, K. Yang, R. Jin, and H. Li<br>Hydrol. Earth Syst. Sci., 14, 557-571, 2010<br>▢ <a href="#">Abstract</a> ▢ <a href="#">Final Revised Paper</a> (PDF, 1269 KB) ▢ <a href="#">Discussion Paper</a> (HESSD)  | 23 Mar 2010 |
| <b>Estimation of evapotranspiration in the Mu Us Sandland of China</b><br>S. Liu, J. Bai, Z. Jia, L. Jia, H. Zhou, and L. Lu<br>Hydrol. Earth Syst. Sci., 14, 573-584, 2010<br>▢ <a href="#">Abstract</a> ▢ <a href="#">Final Revised Paper</a> (PDF, 1897 KB) ▢ <a href="#">Discussion Paper</a> (HESSD)  | 24 Mar 2010 |
| <b>Groundwater response to leakage of surface water through a thick vadose zone in the middle reaches area of Heihe River Basin, in China</b><br>X.-S. Wang, M.-G. Ma, X. Li, J. Zhao, P. Dong, and J. Zhou<br>Hydrol. Earth Syst. Sci., 14, 639-650, 2010<br>▢ <a href="#">Abstract</a> ▢ <a href="#">Final Revised Paper</a> (PDF, 1116 KB) ▢ <a href="#">Discussion Paper</a> (HESSD) | 07 Apr 2010 |
| <b>Evaluation of Penman-Monteith model applied to a maize field in the arid area of northwest China</b><br>W.-Z. Zhao, X.-B. Ji, E.-S. Kang, Z.-H. Zhang, and B.-W. Jin<br>Hydrol. Earth Syst. Sci., 14, 1353-1364, 2010<br>▢ <a href="#">Abstract</a> ▢ <a href="#">Final Revised Paper</a> (PDF, 505 KB) ▢ <a href="#">Discussion Paper</a> (HESSD)                                    | 29 Jul 2010 |
| <b>Accurate LAI retrieval method based on PROBA/CHRIS data</b><br>W. J. Fan, X. R. Xu, X. C. Liu, B. Y. Yan, and Y. K. Cui<br>Hydrol. Earth Syst. Sci., 14, 1499-1507, 2010<br>▢ <a href="#">Abstract</a> ▢ <a href="#">Final Revised Paper</a> (PDF, 2935 KB) ▢ <a href="#">Discussion Paper</a> (HESSD)  | 10 Aug 2010 |
| <b>The benefits of gravimeter observations for modelling water storage changes at the field scale</b><br>B. Creutzfeldt, A. Guntner, S. Vorogushyn, and B. Merz<br>Hydrol. Earth Syst. Sci., 14, 1715-1730, 2010<br>▢ <a href="#">Abstract</a> ▢ <a href="#">Final Revised Paper</a> (PDF, 2184 KB) ▢ <a href="#">Discussion Paper</a> (HESSD)   | 01 Sep 2010 |
| <b>Responses of snowmelt runoff to climatic change in an inland river basin, Northwestern China, over the past 50 years</b>  | 19 Oct 2010 |

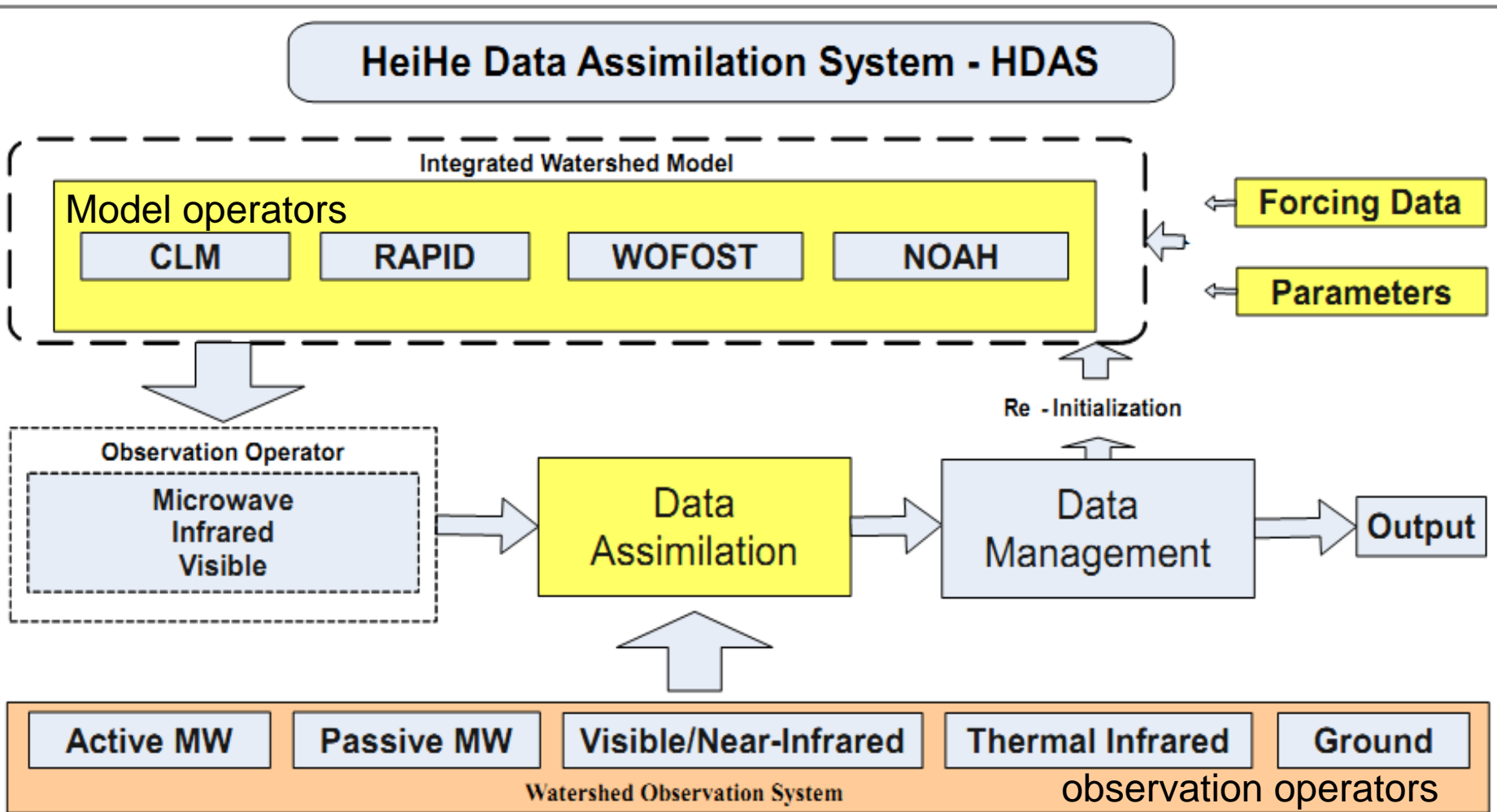
# 3. Progress on Heihe data assimilation system (HDAS)



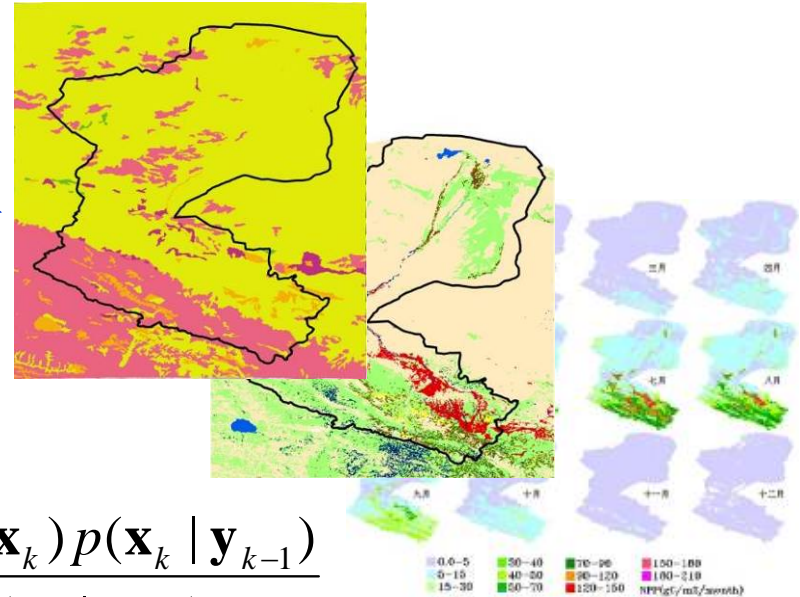
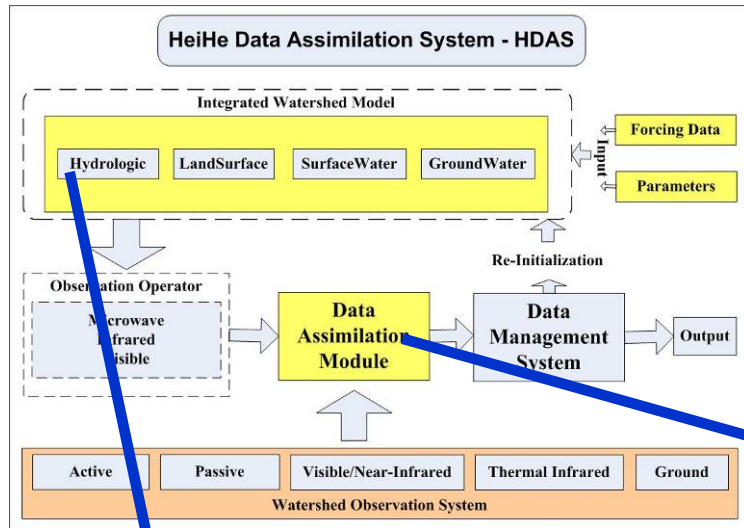
## 3.1 Objective

- To implement the **real-time monitoring** system of the watershed
- To improve the **predictability** of water cycle at catchment scale
- To integrate the multi-source watershed observation systems within a data assimilation framework to produce **improved water and energy fluxes**

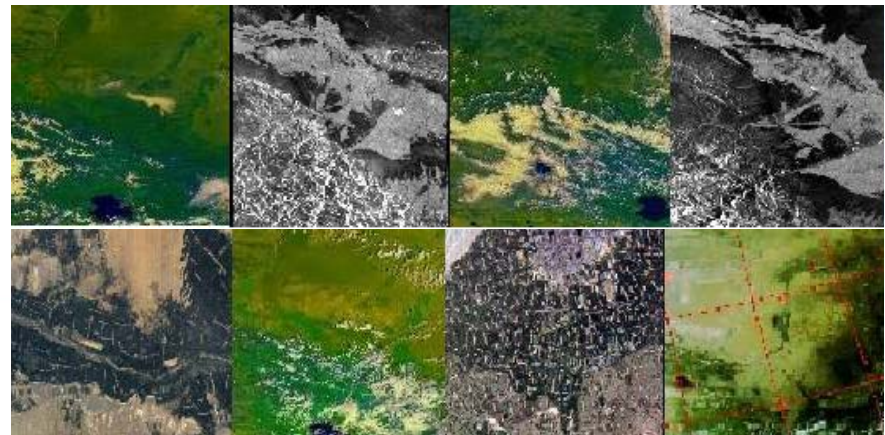
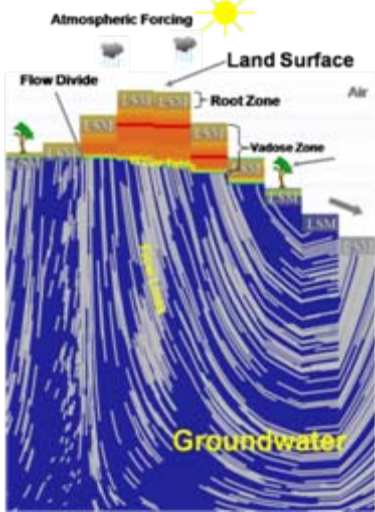
## 3.2 Implemented system structure



# 3.3 General framework



$$p(\mathbf{x}_k | \mathbf{y}_k) = \frac{p(\mathbf{y}_k | \mathbf{x}_k) p(\mathbf{x}_k | \mathbf{y}_{k-1})}{p(\mathbf{y}_k | \mathbf{y}_{k-1})}$$



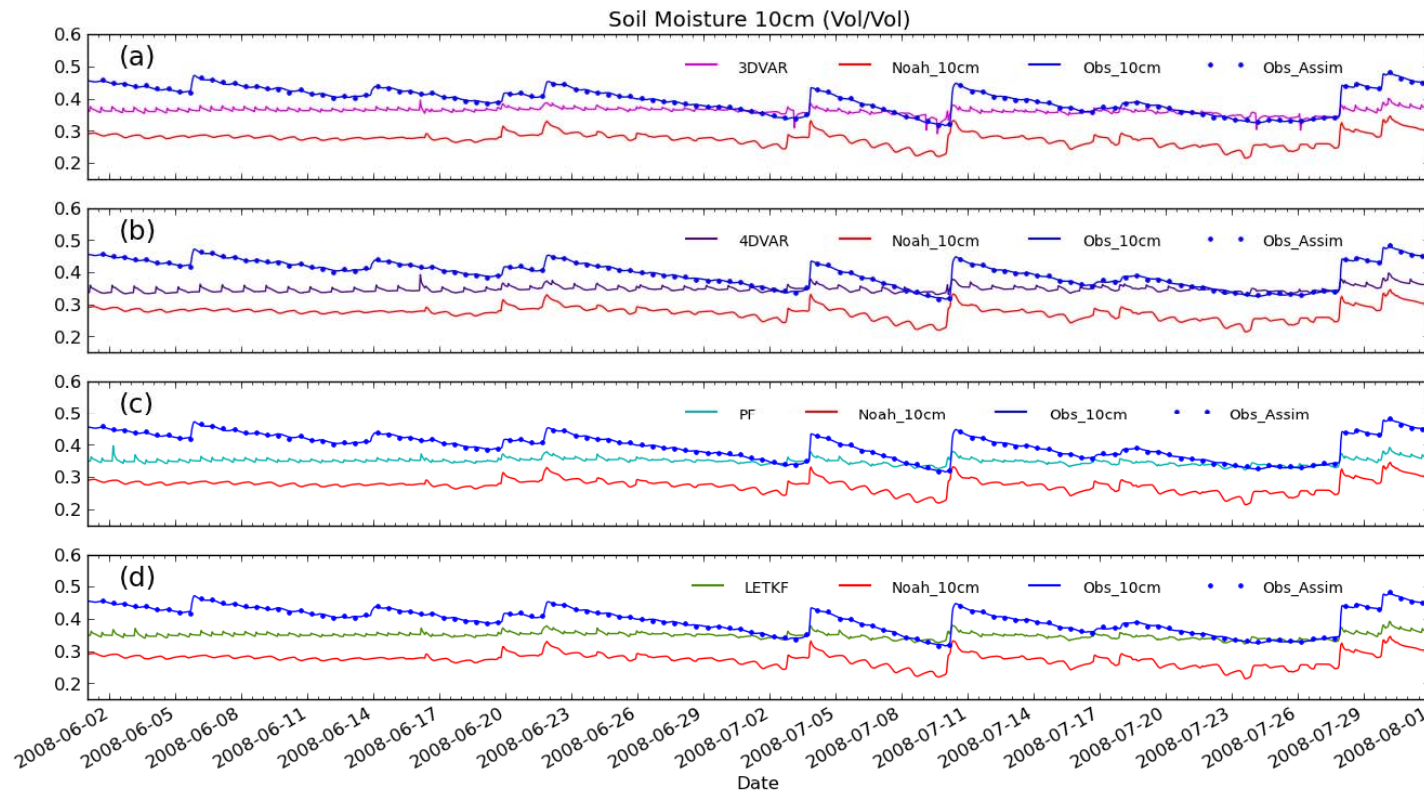
# 3.4 Comparison of assimilation algorithms

3DVAR (three-dimensional variational)

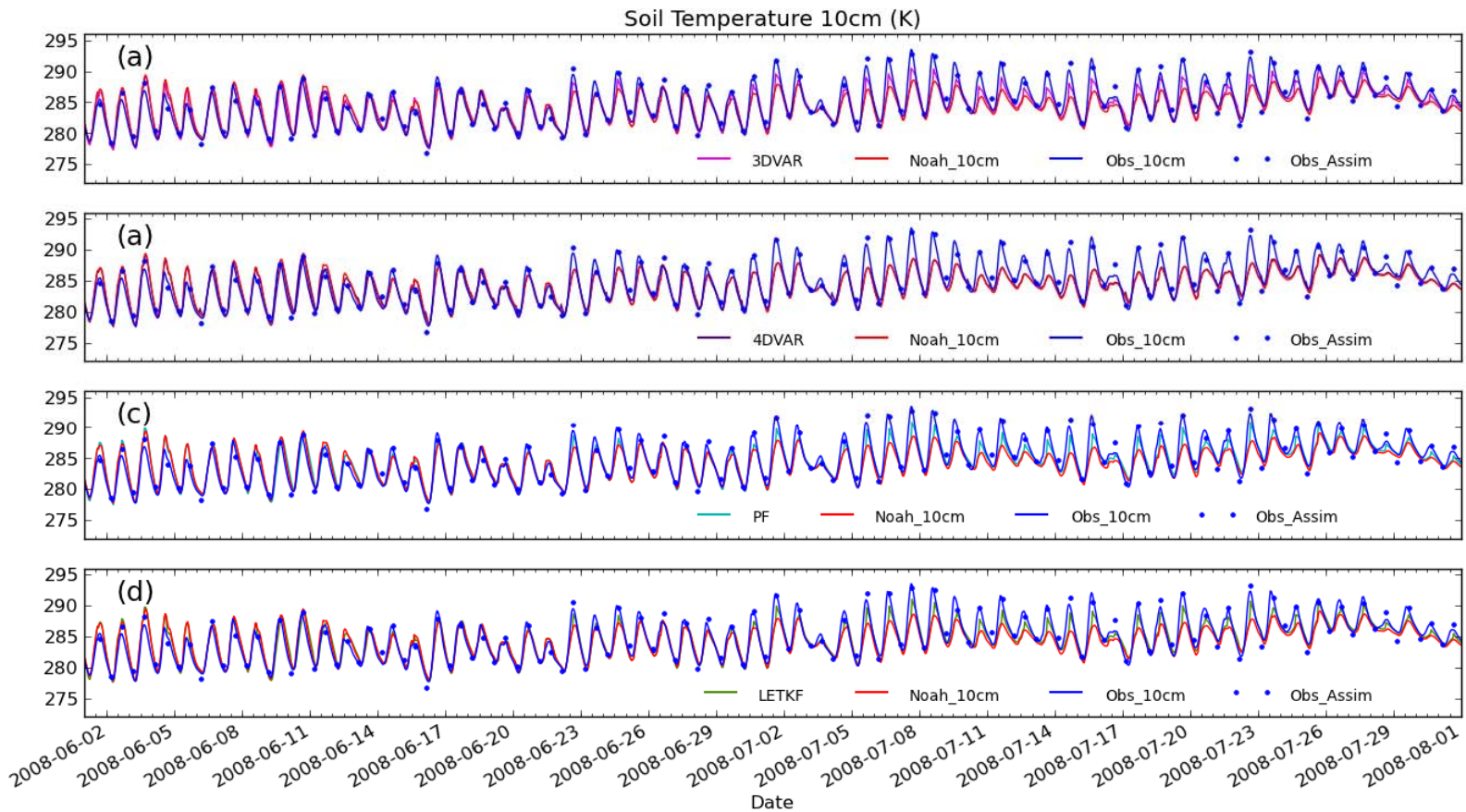
4DVAR (four-dimensional variational)

PF (Particle Filter)

LETKF (Local Ensemble Transform Kalman Filter)



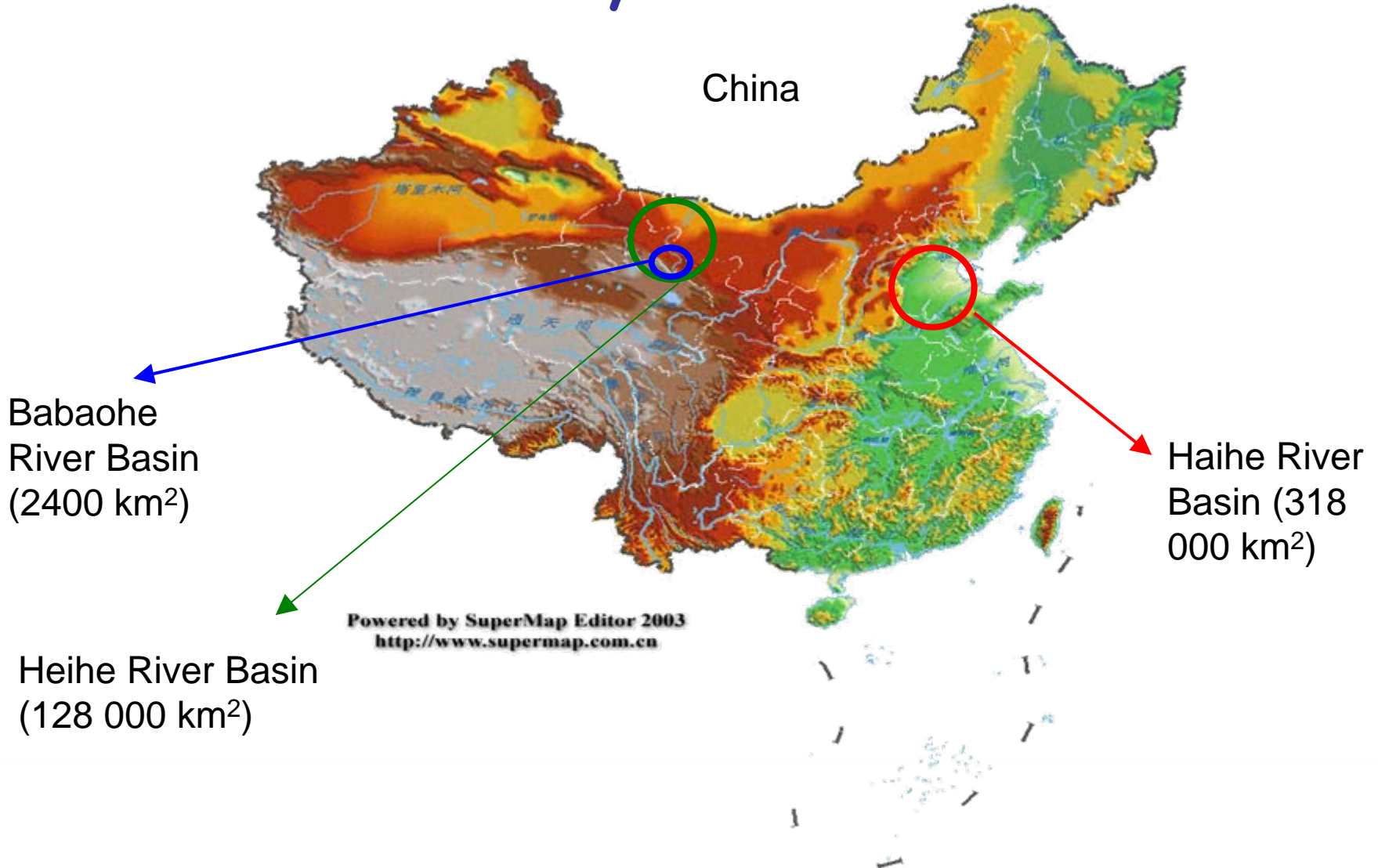
# 3.4 Comparison of assimilation algorithms



LETKF > PF > 3DVAR > 4DVAR



## 3.5 Study area of HDAS



## 3.6 Sensors and data sets

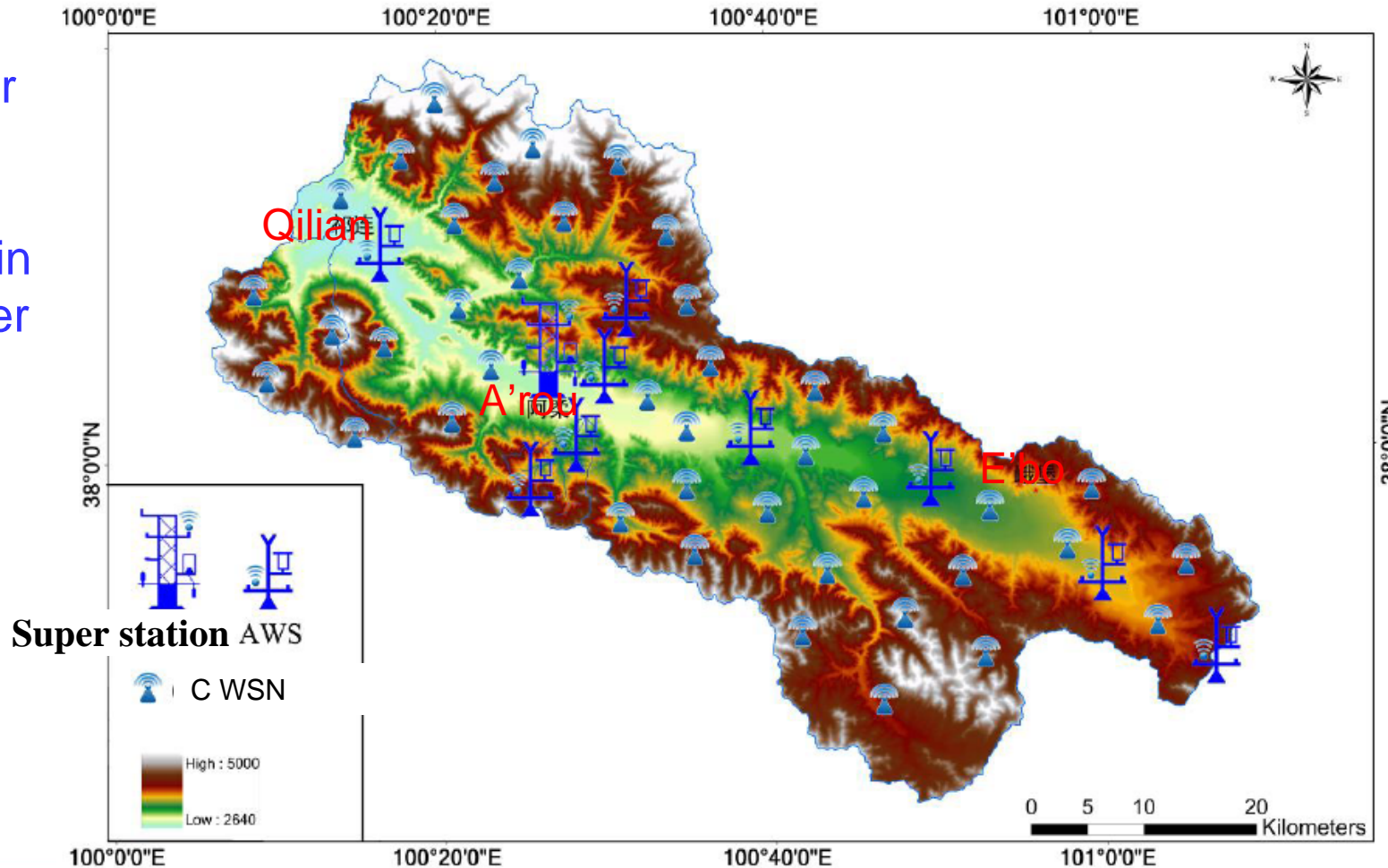
- **Remote Sensing**

- **MODIS**: LAI, Land Surface Temperature, Snow Cover
- **AMSR-E, SMOS**: Brightness Temperature or Soil Moisture
- **ASAR, PALSAR**: Backscattering Coefficients
- **GRACE**: Groundwater Variations

- **Ground Based**

- **Wireless Network**: Moisture, Temperature
- **COsmic-ray (COSMOS)**: Moisture, Snow

Observation system in the Babaohe River Basin, which belongs to the upper stream in the Heihe River Basin



Constructed before October, 2011

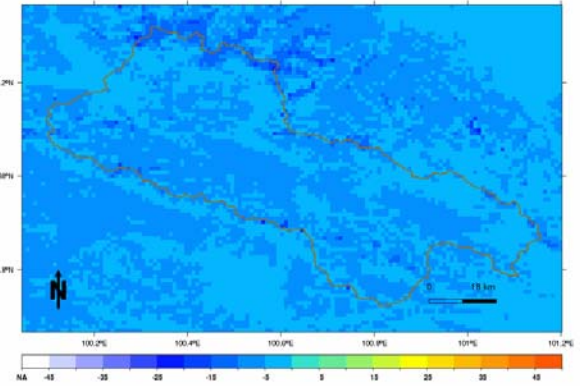
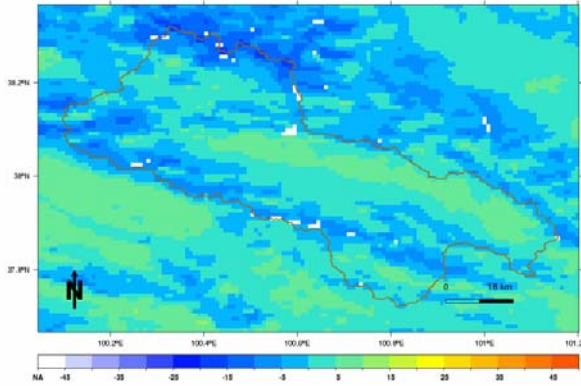
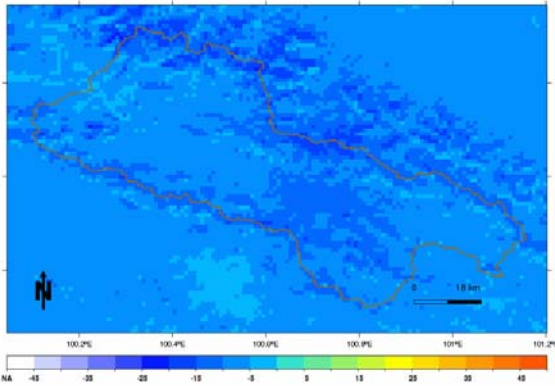
# 3.7 MODIS LST and SCF Assimilation

## MODIS LST

Babaohe River Basin Ground\_Temperature 2008-01-01-05 (Cel Degree)

Babaohe River Basin LST\_Daily 2008-01-01 (Cel Degree)

Babaohe River Basin Ground\_Temperature 2008-01-01-05 (Cel Degree)



**CLM**

**MODIS**

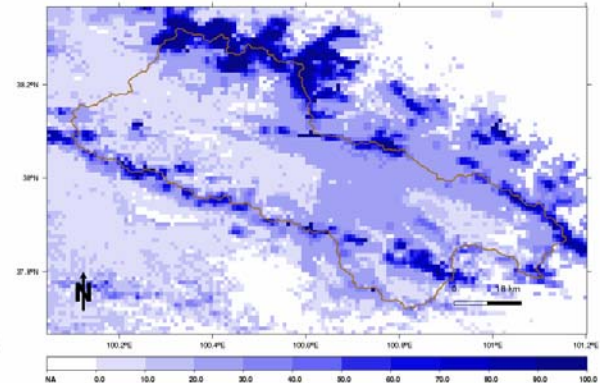
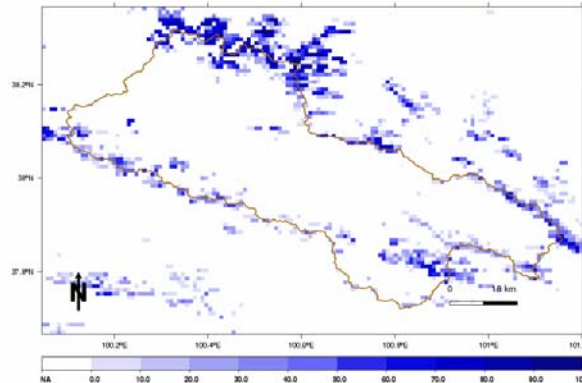
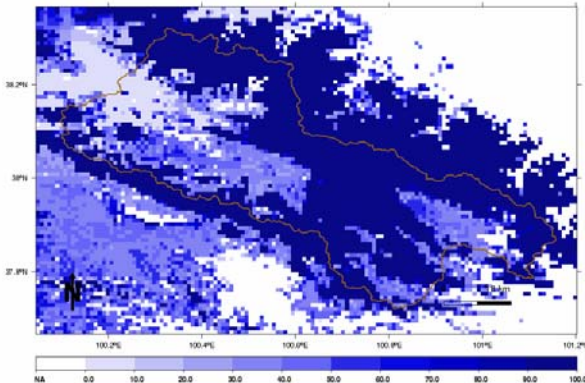
**Assimilation**

## MODIS SCF

Babaohe River Basin SCF 2008-01-01-05 (%)

Babaohe River Basin SCF 2008-01-01 (%)

Babaohe River Basin SCF 2008-01-01-05 (%)



**CLM**

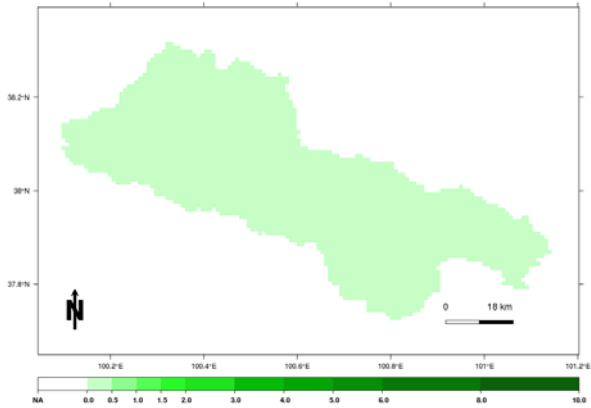
**MODIS**

**Assimilation**

# 3.8 MODIS LAI Assimilation

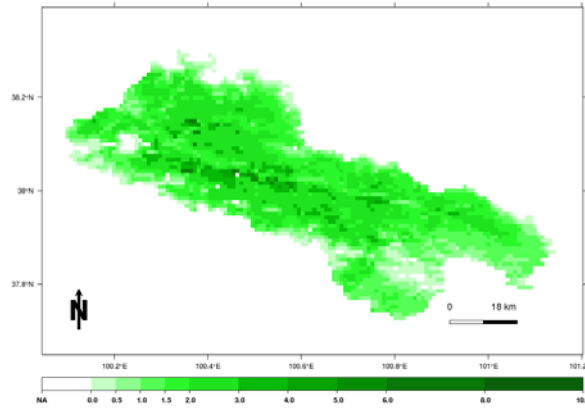
## MODIS LAI 2008-08-04

Babaoh River Basin LAI 2008-08-04-07 (mm/hour)



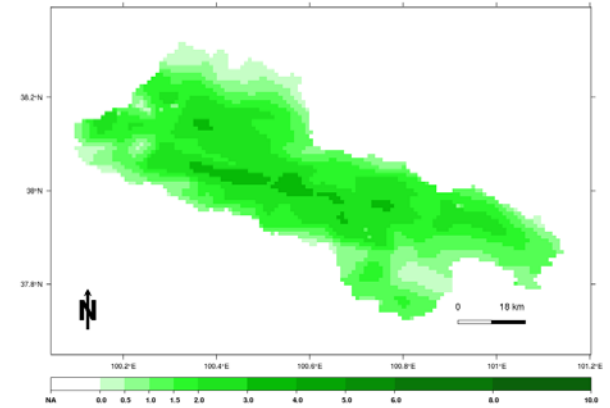
**CLM**

Babaoh River Basin LAI 2008-08-04



**MODIS**

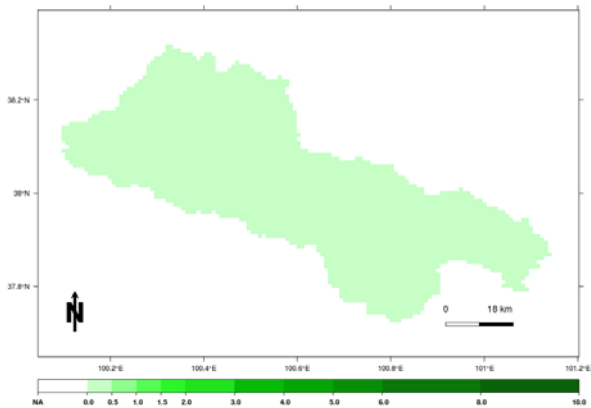
Babaoh River Basin LAI 2008-08-04-07 (mm/hour)



**Assimilation**

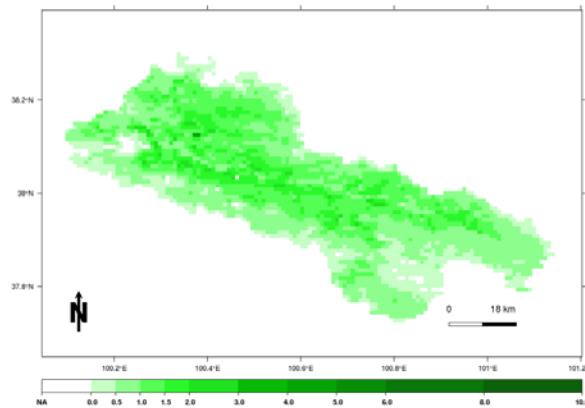
## MODIS LAI 2008-09-05

Babaoh River Basin LAI 2008-09-05-07 (mm/hour)



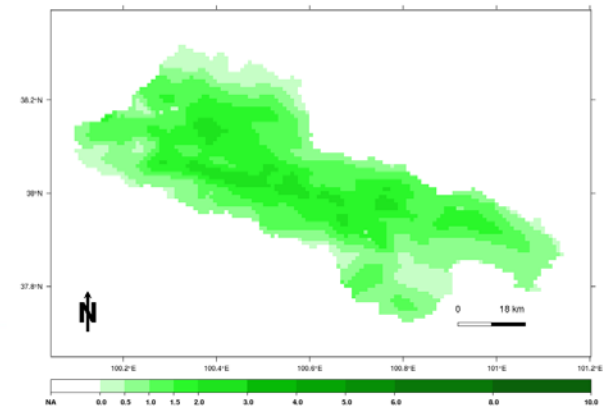
**CLM**

Babaoh River Basin LAI 2008-09-05



**MODIS**

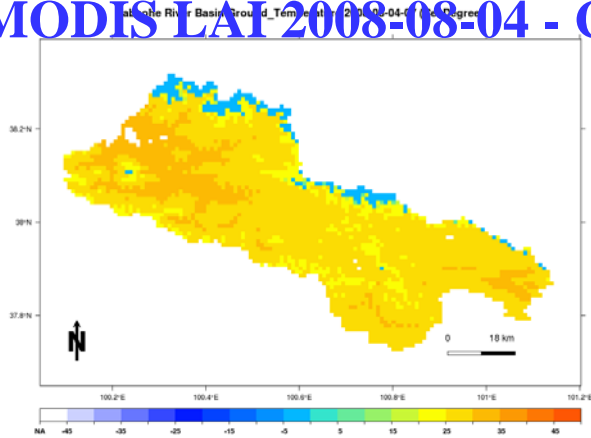
Babaoh River Basin LAI 2008-09-05-07 (mm/hour)



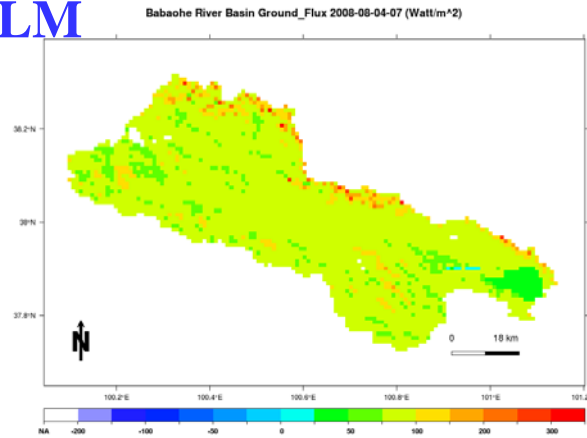
**Assimilation**

# 3.8 MODIS LAI Assimilation

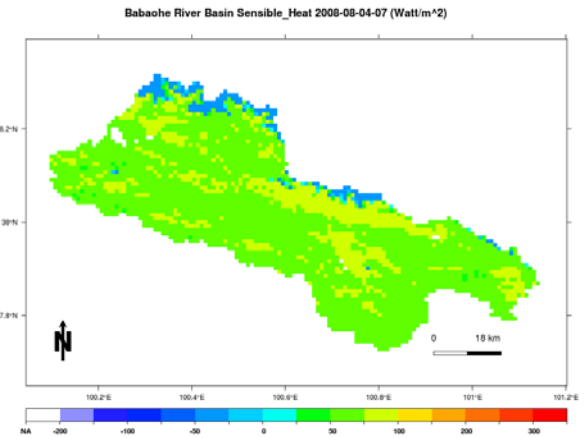
## MODIS LAI 2008-08-04 - CLM



**Ground Temperature**

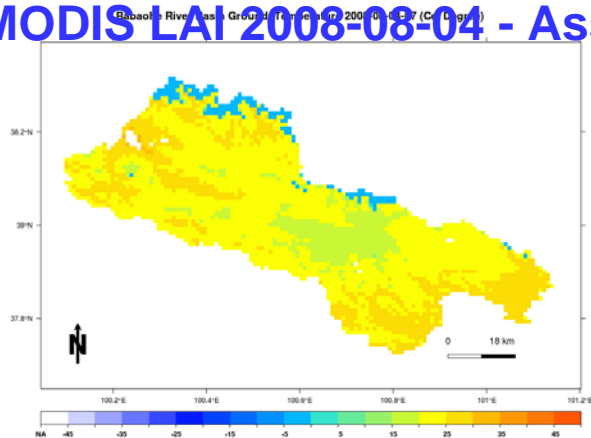


**Ground Flux**

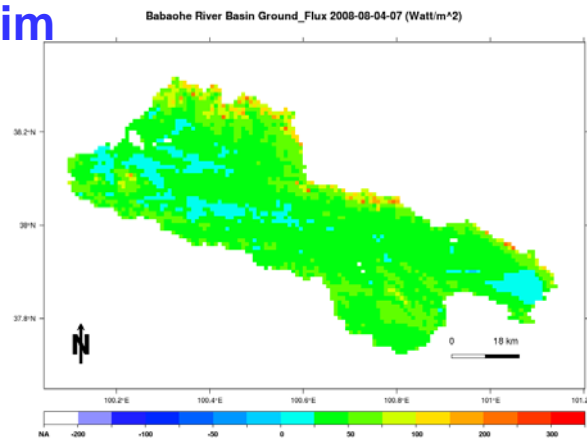


**Sensible Flux**

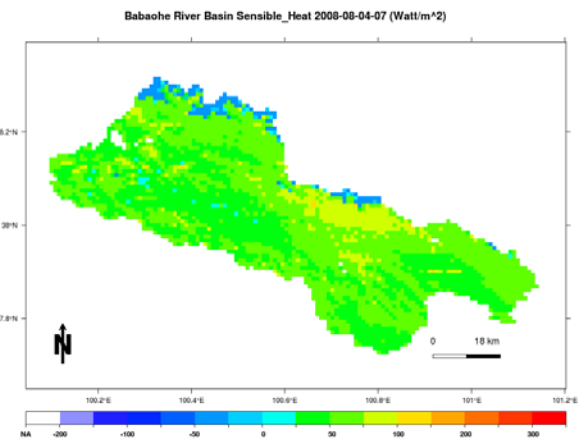
## MODIS LAI 2008-08-04 - Assim



**Ground Temperature**

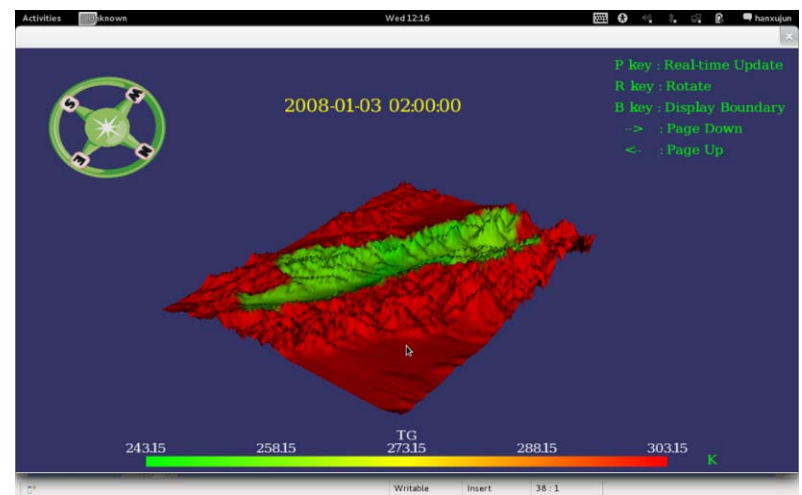
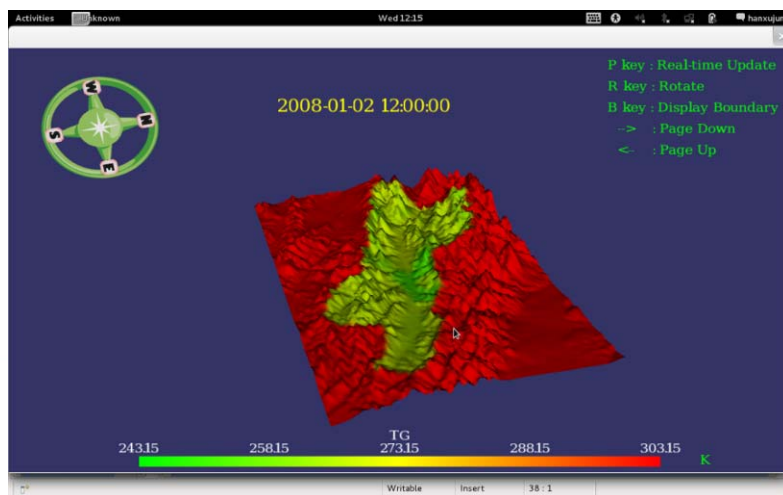
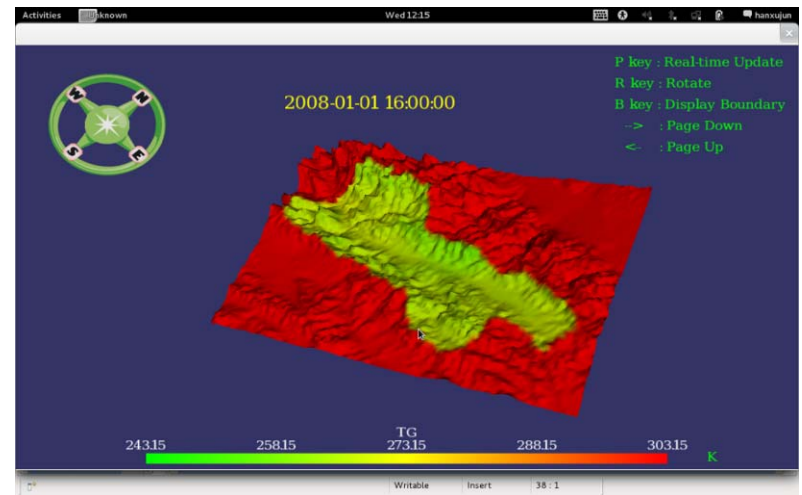
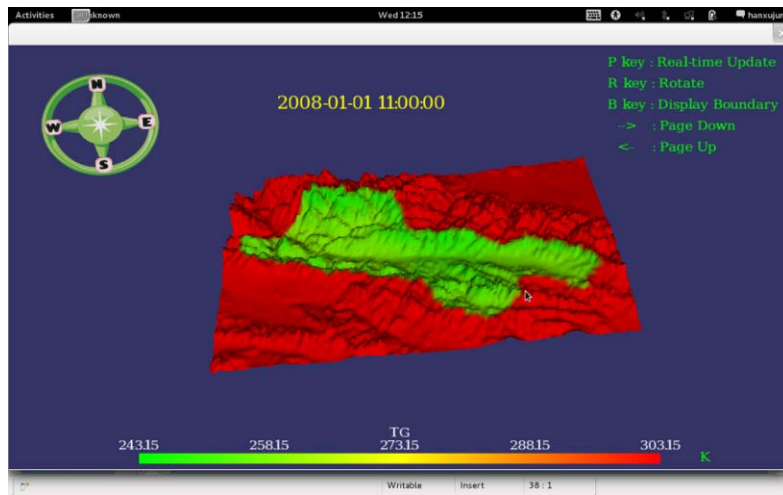


**Ground Flux**

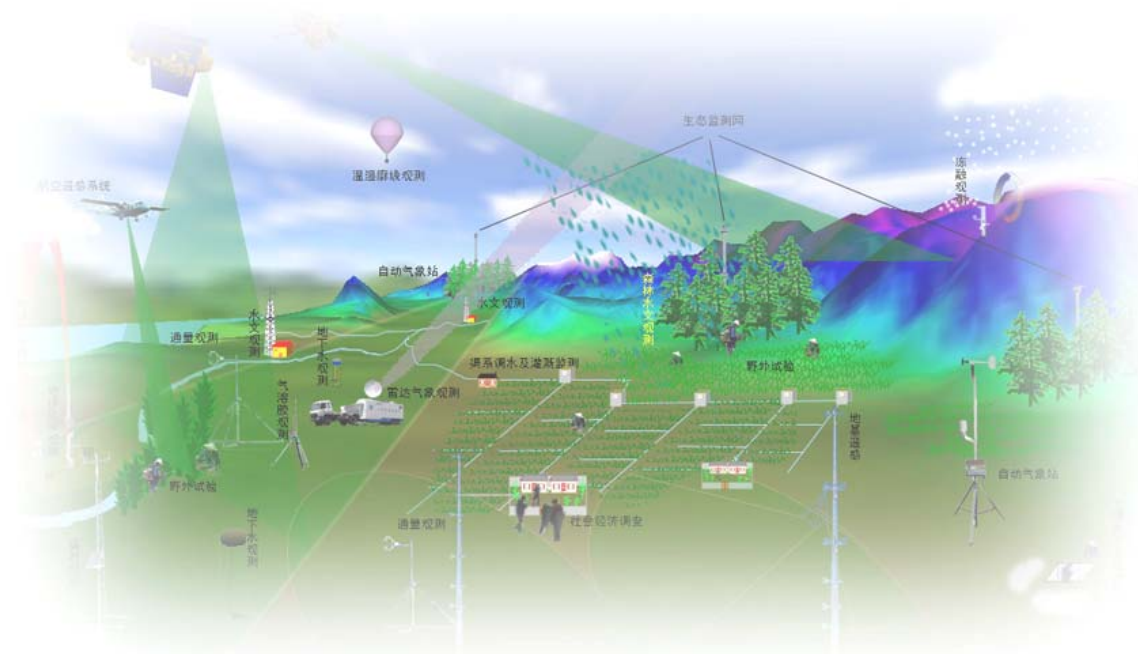


**Sensible Flux**

# 3.9 Visualization



## 4. Prevue of Hi-WATER





# Heihe Watershed Allied Telemetry Experimental Research



- **Comprehensive and multi-disciplinary:** satellite – airborne – ground based, ecology – hydrology – atmosphere
- **Multi-scale:** isotope – sub-meter – meters level.....catchment – sub-basin – basin
- **Collaboration:** other projects in the Heihe plan, international & domestic collaborations.
- **Hi:** Heihe, experimental area; hello, open platform; high, higher and stronger

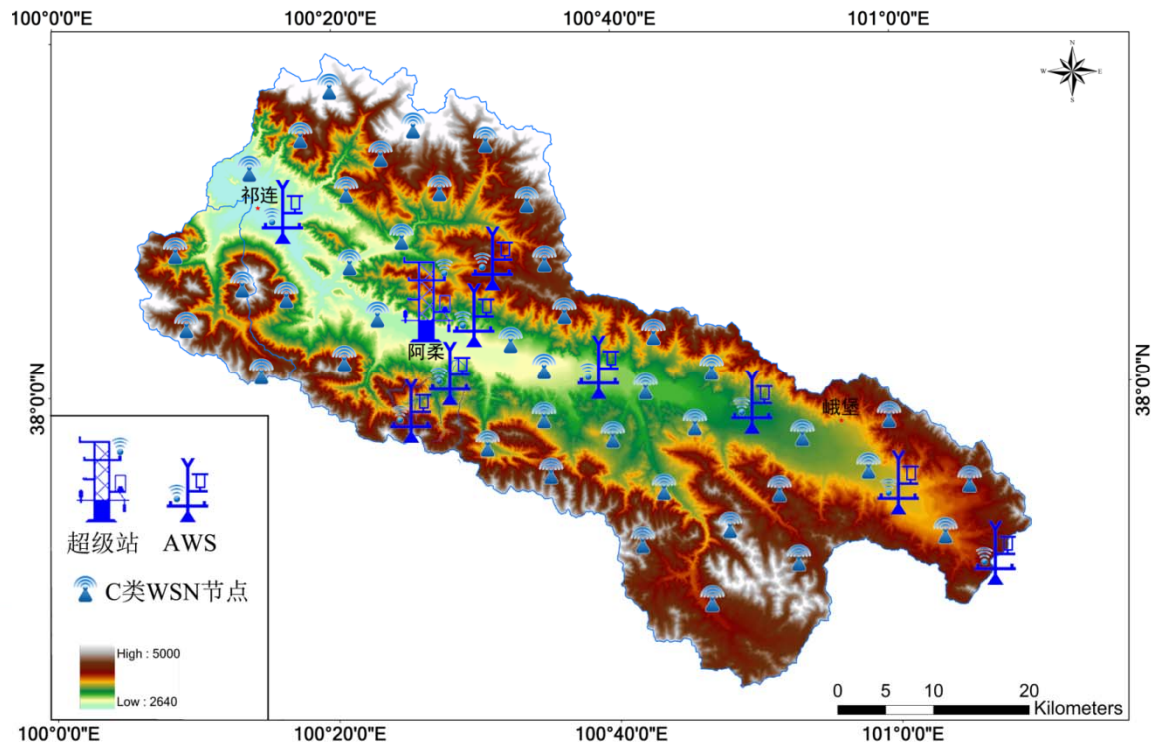
The overall objective of Hi-WATER is to improve the **observability** of hydrological and related ecological processes and build a leading river basin observing system to serve the watershed science (earth system science in a river basin scale).

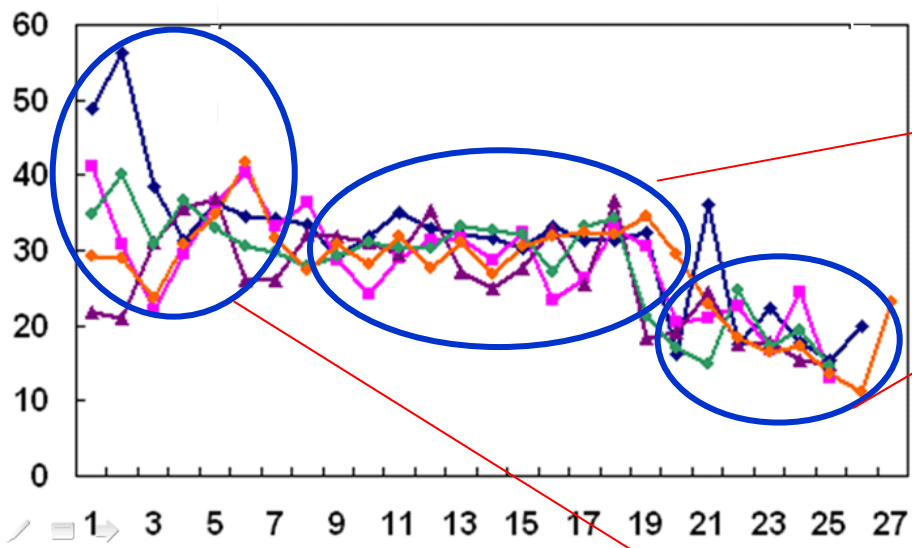
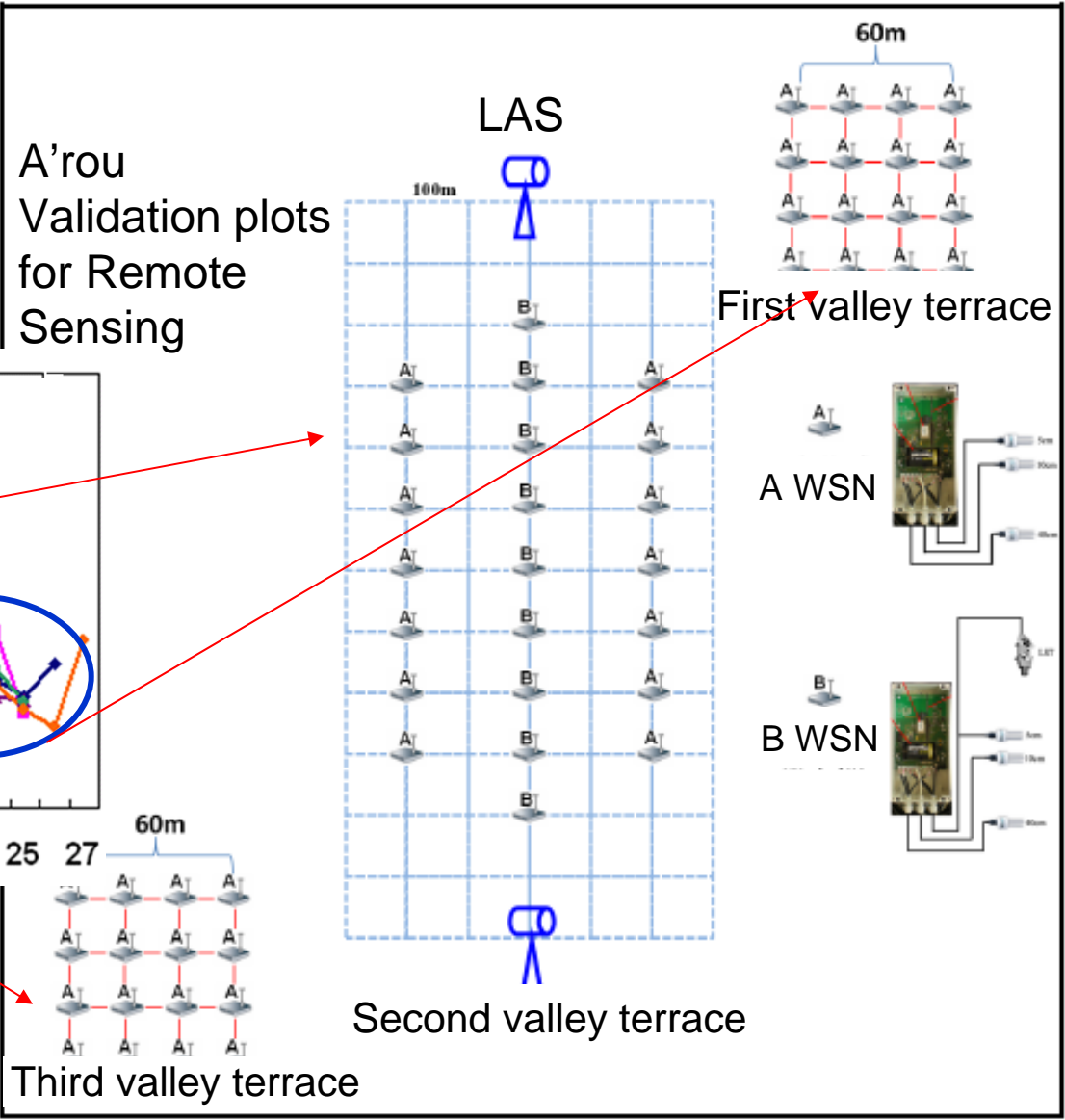
## Challenge 1: Distributed ground observations to capture the heterogeneity

How to observe hydrological and ecological process in a river basin scale, instead of point scale?

### 4 hierarchic subsystems

- (1) The A'rou super station.
- (2) A distributed AMS network.
- (3) Three validation plots.
- (4) A watershed soil moisture/temperature observing network.

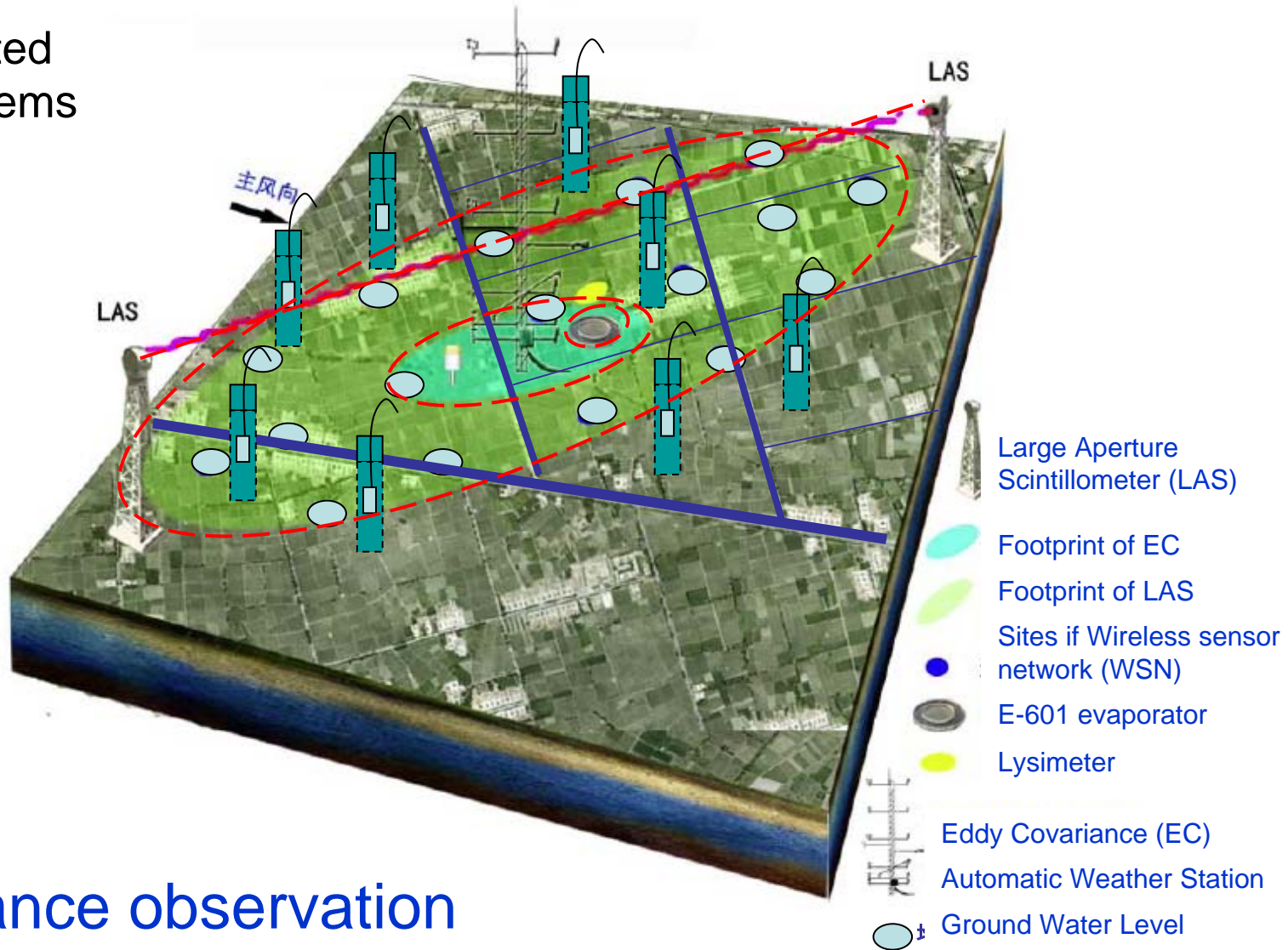




## Challenge 2: Spatial representativeness of ground observations

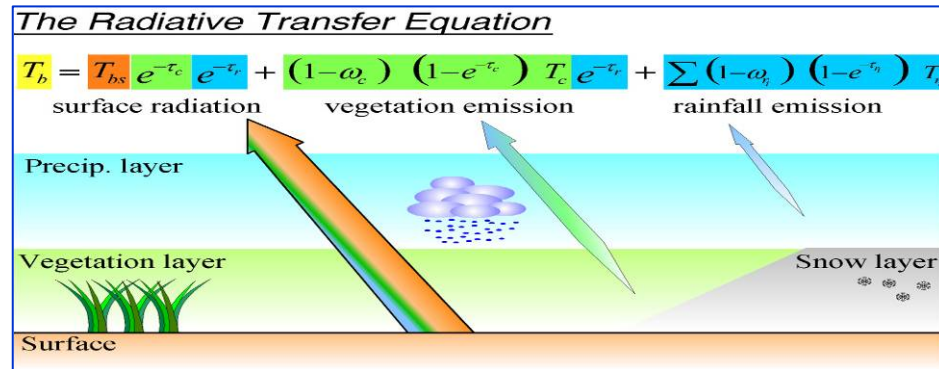
- Spatial representativeness of ground observations, i.e., their temporal and spatial variation characteristics (**Probability Density Function, footprint**) should be analyzed.
- Relationship between different scales (observation operator) should be obtained.
- Uncertainties related with spatial representativeness and scaling should be quantified.

# Multi-scale nested observation systems



# Water Balance observation in irrigation region scale

# Challenge 3: Development of radiative transfer models for heterogeneous pixel/land surface to improve the observability (mathematical viewpoint) of remote sensing



A quasi-homogeneous pixel

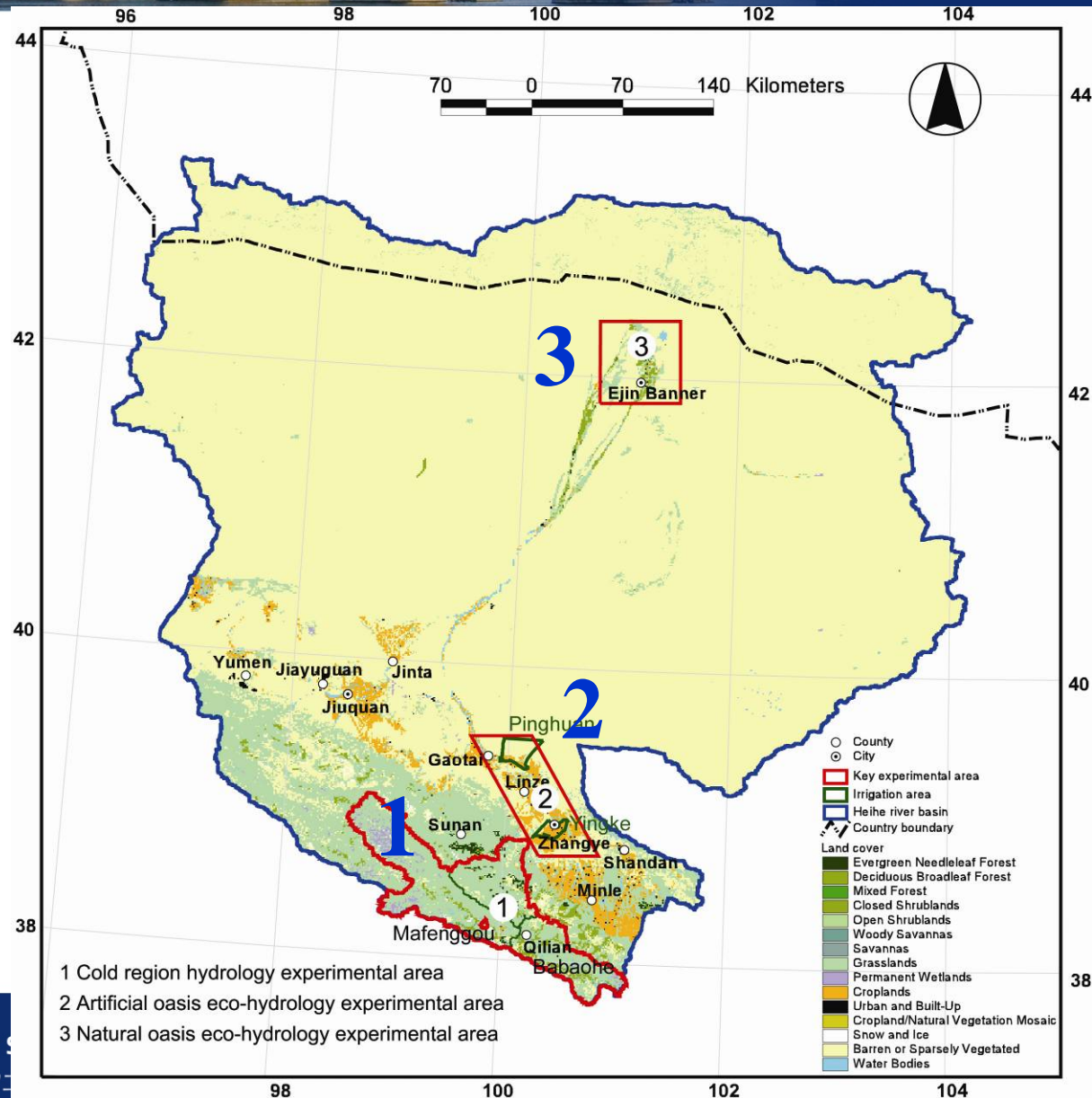


A heterogeneous pixel

- The relationship between remote sensing observations and surface ecological or hydrological variables is implied, so observations are indirect. In general, the forward model is a complex nonlinear model. This leads to very difficult or even illposed inversion.
- RTM for heterogeneous pixel needs to be developed.
- Inversion strategies for heterogeneous pixel.
- Related uncertainties with the above operators.
- How to design the ground sampling scheme which is more appropriate for remote sensing validation?



Three key experimental areas (KEAs) are identified to conduct intensive and long-term observations. Within each KEA, nested experimental areas, i.e., the foci experimental area (FEA), the experiment site (ES) and the elementary sampling plot (ESP) will be established to carry out multi-scale observations based on different objectives.



# To provide and validate the remote sensing products

<b>Remote sensing product</b>	<b>Spatial resolution</b>	<b>Internal satellite/sensors</b>	<b>International satellite/sensors</b>
<b>LAI</b>	<b>30-1000 m</b>	<b>HJ-1 , FY-3</b>	<b>MODIS, MISR, VEGETATION, POLDER, MERIS, MSG</b>
<b>Chlorophyll content</b>	<b>30-1000 m</b>	<b>HJ-1</b>	<b>MERIS</b>
<b>Precipitation</b>	<b>5-25 km</b>	<b>FY-3</b>	<b>TRMM, AMSR-E, GMS</b>
<b>Soil moisture</b>	<b>1-25 km</b>	<b>FY-3</b>	<b>SMOS, EnviSat, SMAP, AMSR-E</b>
<b>Snow Water Equipment</b>	<b>1-25 km</b>	<b>FY-3</b>	<b>CoReH2O, SLCP, AMSR-E</b>
<b>...</b>	<b>...</b>	<b>...</b>	<b>...</b>

- Intensive observation period (IOP): 2012-2014, a one year intensive observation will be conducted in each KEA.

Please pay attention on the detailed and latest information at our website.

<http://water.westgis.ac.cn>

- We introduce a few case studies of using airborne and satellite-borne remote sensing data (most from Dragon II project) obtained during WATER for retrieval of hydrological and ecological variables/parameters.
- Ground truth collected in WATER field campaigns are tested to be useful in validation of the models/algorithms for retrieval of hydrological and ecological parameters.
- Multi-source remote sensing data assimilation system is established and obtained preliminary results, further efforts need to be made in the next step.

- Catchment scale hydrological experiments should therefore be encouraged (e.g., **Hi-WATER**). In designing this kind of an experiment capturing multi-scale heterogeneity must be taken into account so that the knowledge obtained can eventually be scaled up to sub-basin and basin scales.
- Hi-Water has insistent demands on the Satellite data.

# Thank you !

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