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# Ensemble Data Assimilation of Water Quality Variables

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# Algal bloom outbreaks

- ❖ Cyanobacteria bloom outbreaks in major rivers and lakes have been important environmental issues in Korea



Photo: [www.ohmynews.com](http://www.ohmynews.com)

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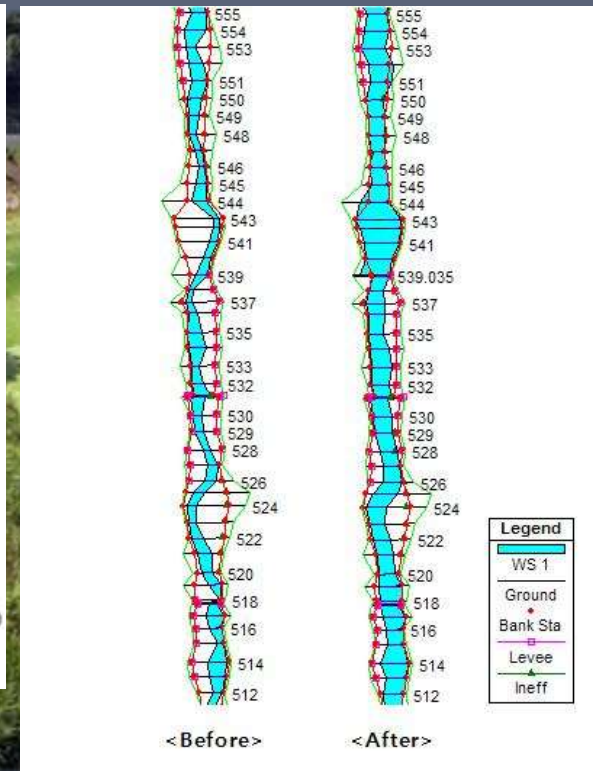
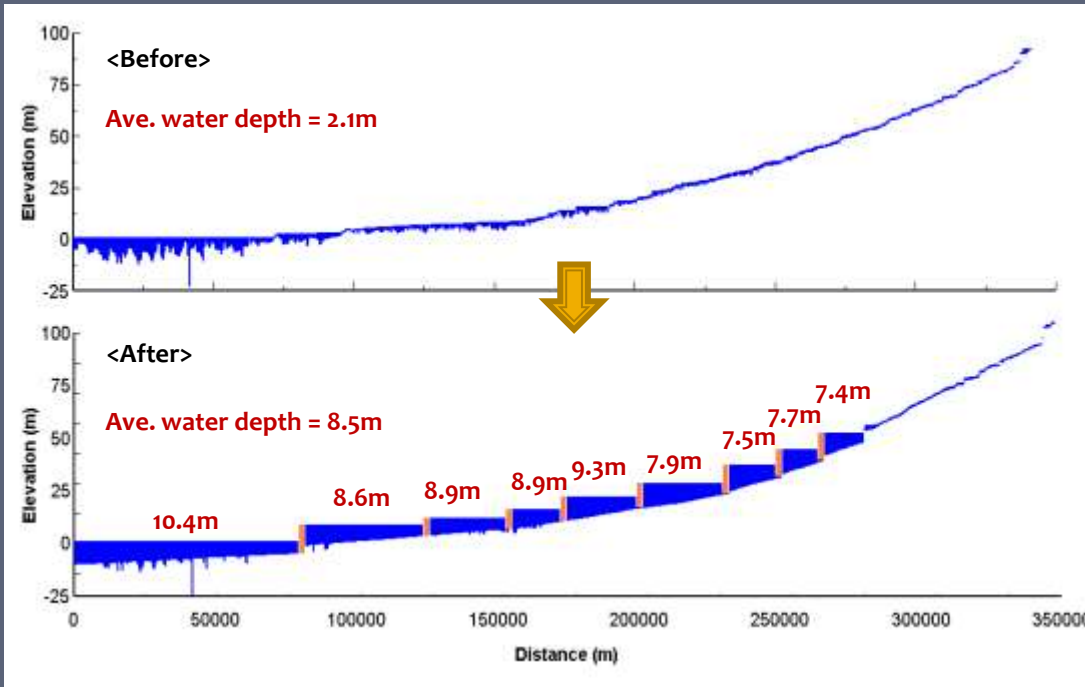
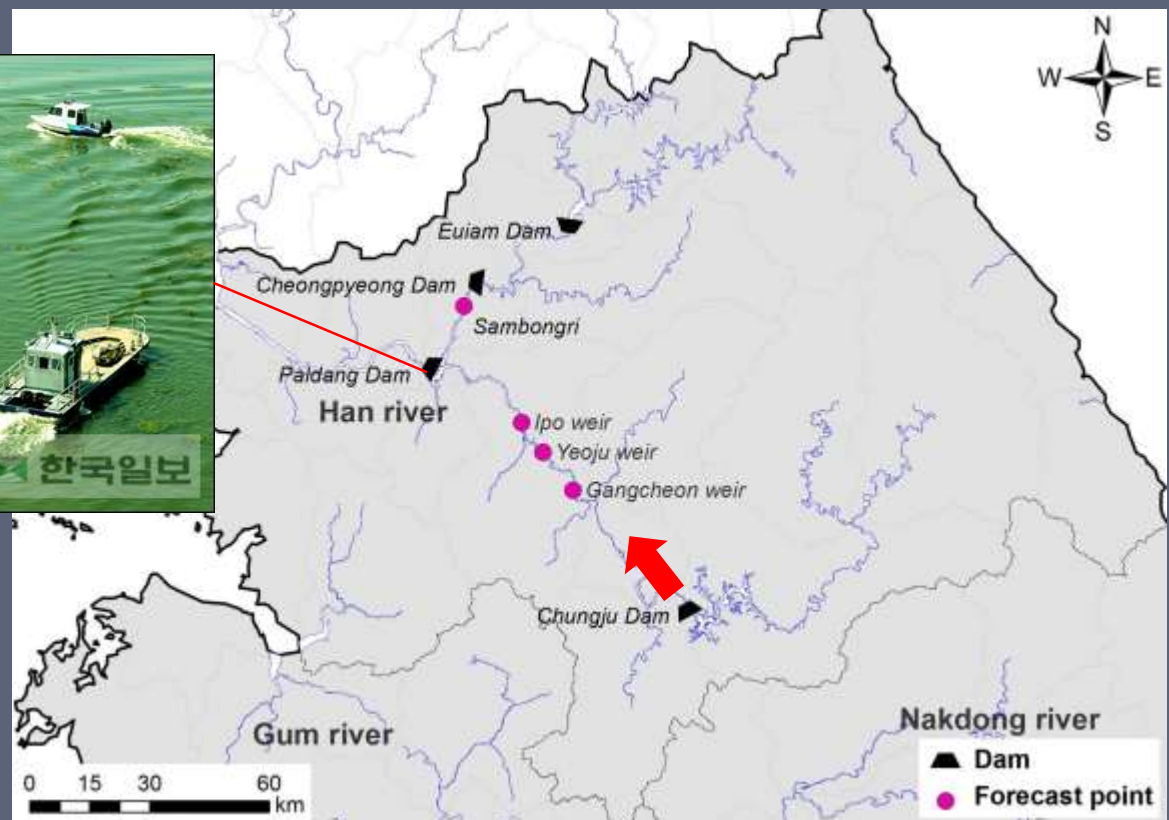


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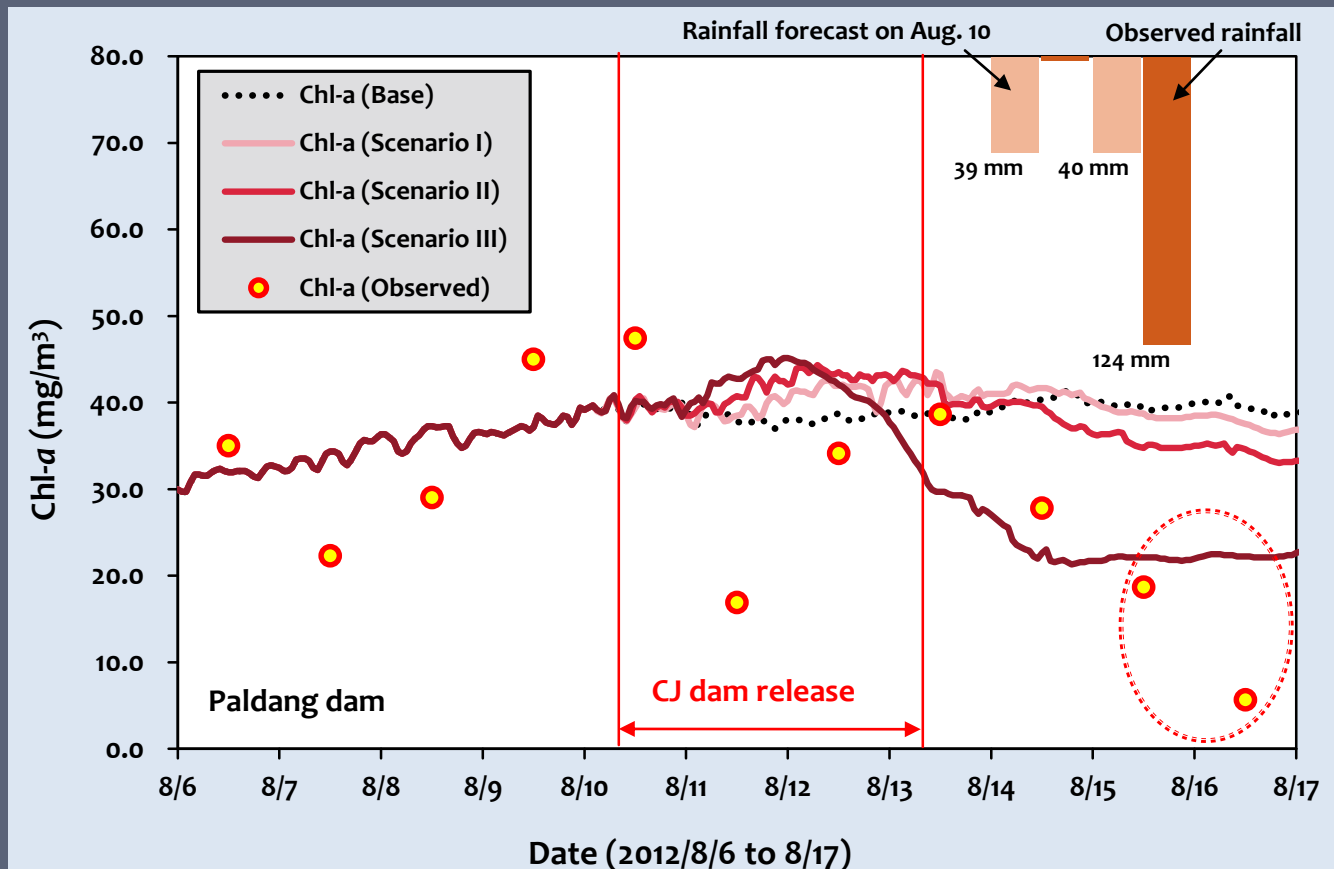
# Effort of WQ degradation prevention

- ❖ Flushing-out is one of active measures to respond major cyanobacteria blooms
  - As an example, abrupt increase of discharge from Choongju dam was made to flush out cyanobacteria bloom in Lake Paldang (summer 2012)



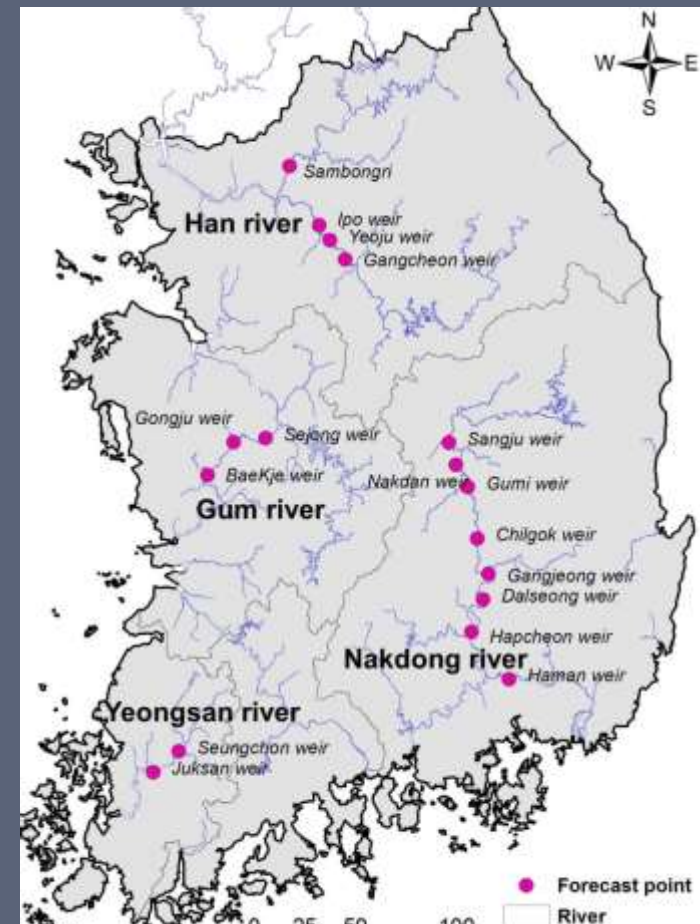
# Efforts of WQ degradation prevention

- ❖ Various scenarios were simulated to determine amount and duration of discharge and actual release was made based on one selected scenario



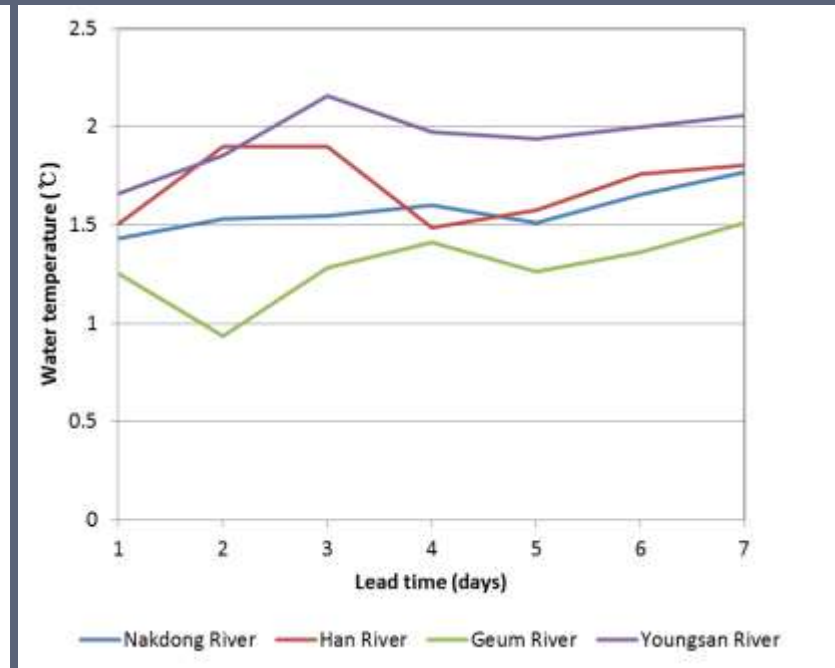
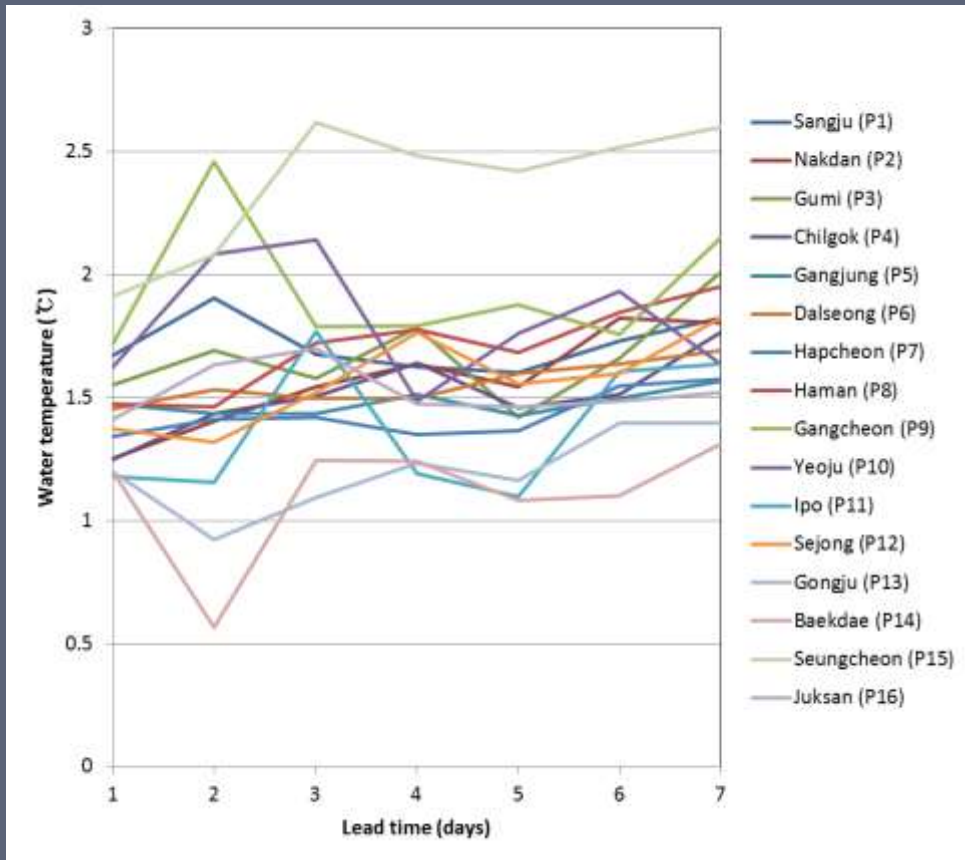
# Algal bloom forecast

- ❖ Since January 2012, NIER has been producing 7-days algal bloom forecast for the 16 weir locations in the major rivers in Korea
  - **Forecasting variables:**  
water temp. and Chlorophyll-*a* level  
- It will be extended to other WQ variables in the future (e.g., TOC & SS)
  - **Forecasting model:**  
a HSPF-EFDC coupled model developed for the four watersheds
  - **Forecasting report:** A 7-days WQ forecast are officially announced on every Monday and Thursday and circulated to water management agencies in the Han River basin via a dedicated website.



# A summary of the first two years forecast

- ❖ The RMSE of **water temperature forecast** for each location tends to increase with lead time but not significantly

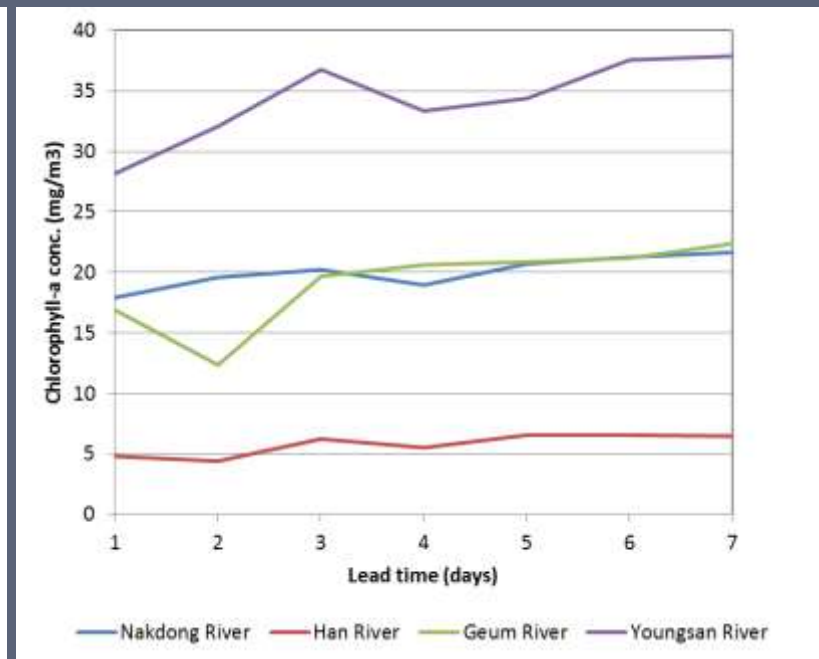
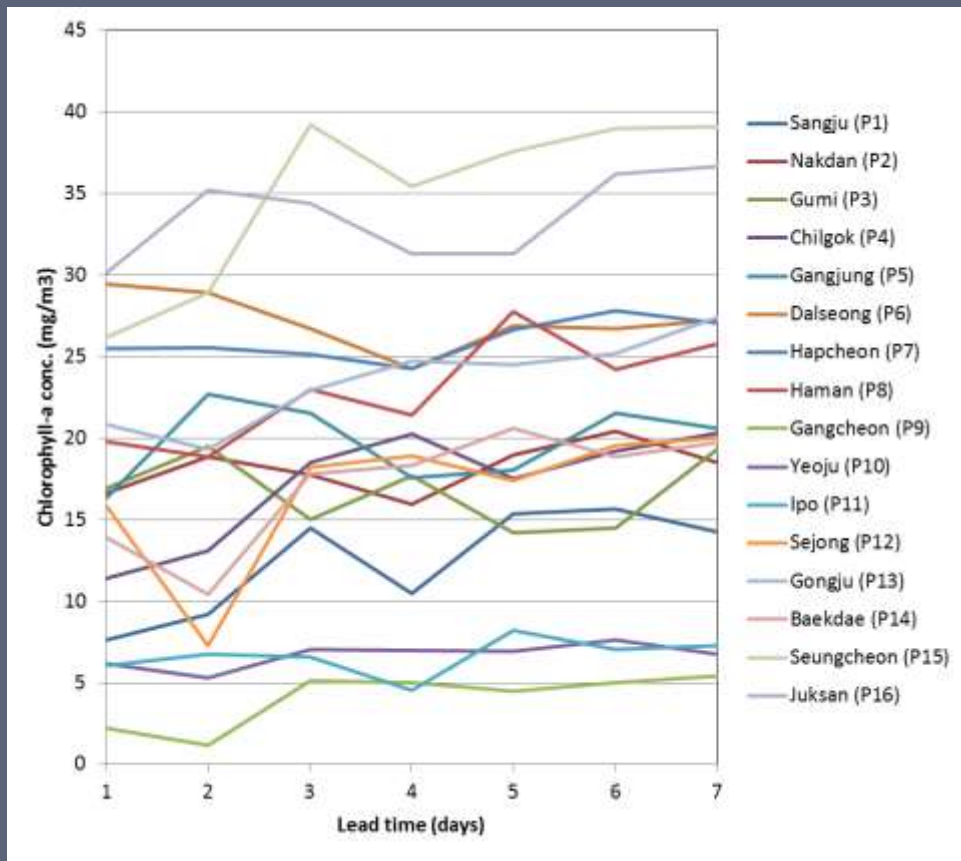


▲ Variation of the mean RMSE for each river with lead time

◀ Variation of RMSE for each location with lead time

# A summary of the first two years forecast

- ❖ The RMSE of **chlorophyll-a forecast** for each location tends to increase with lead time but not significantly



▲ Variation of the mean RMSE for each river with lead time

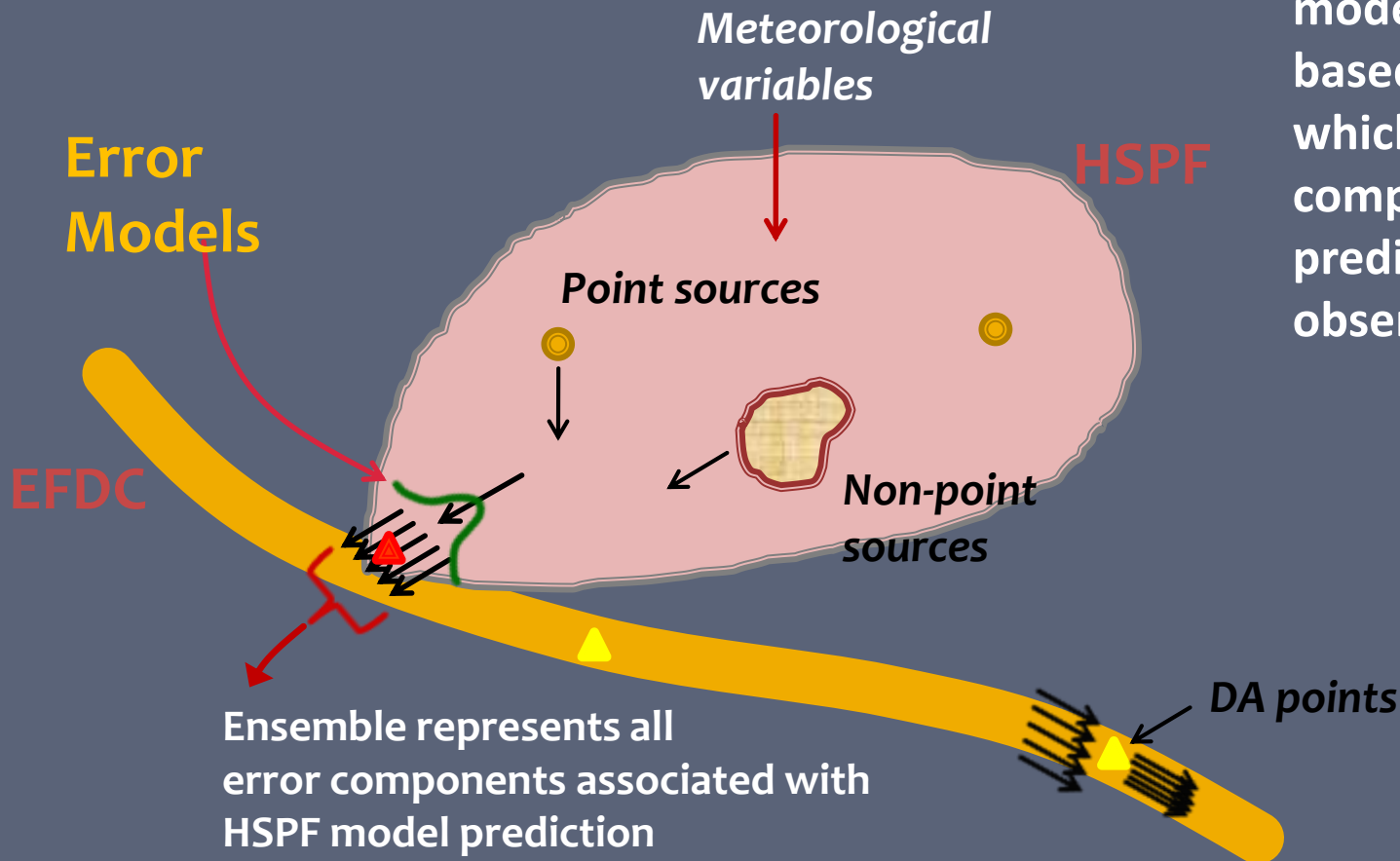
◀ Variation of RMSE for each location with lead time



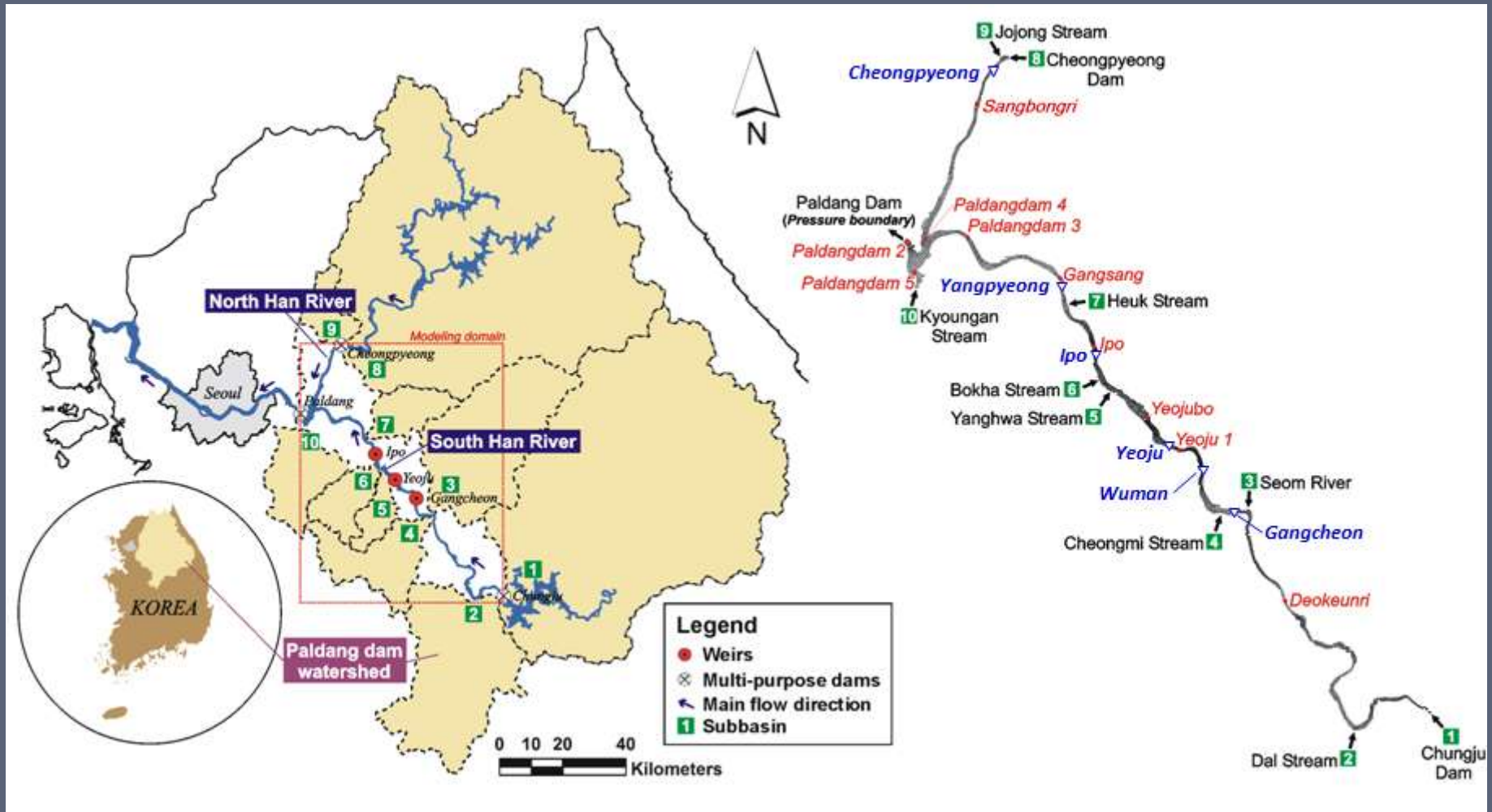
# Reducing Forecast Error : Data assimilation

## *Ensemble Kalman Filter for EFDC model*

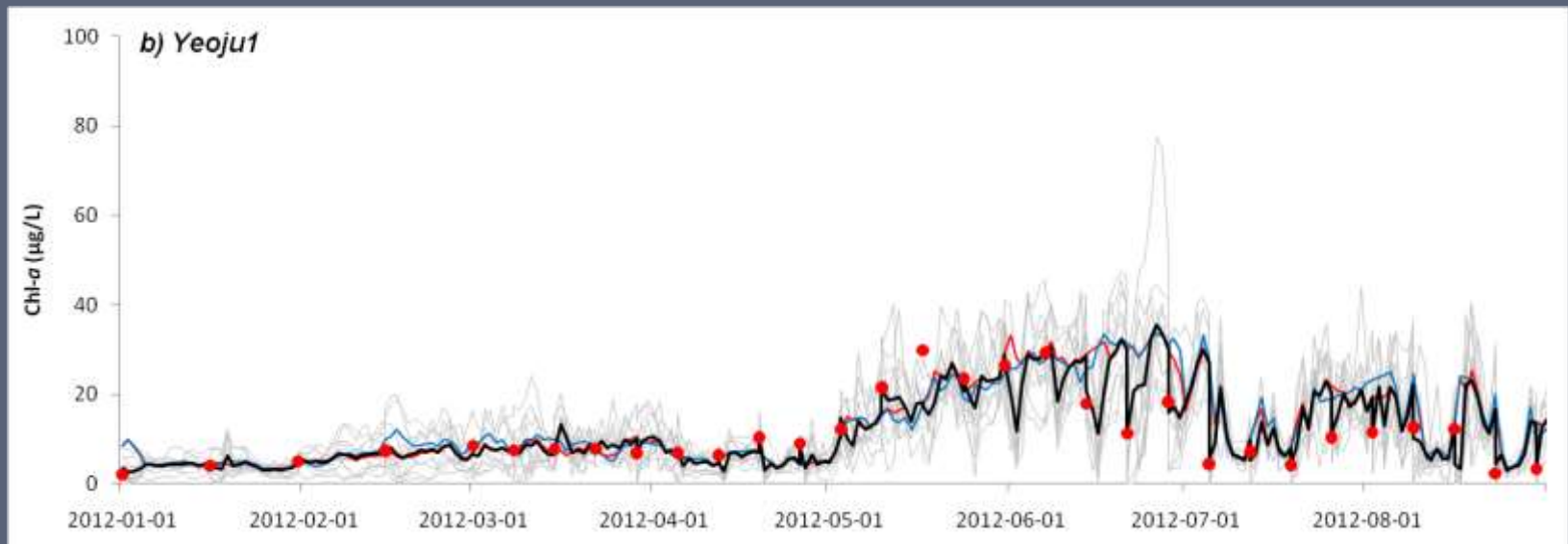
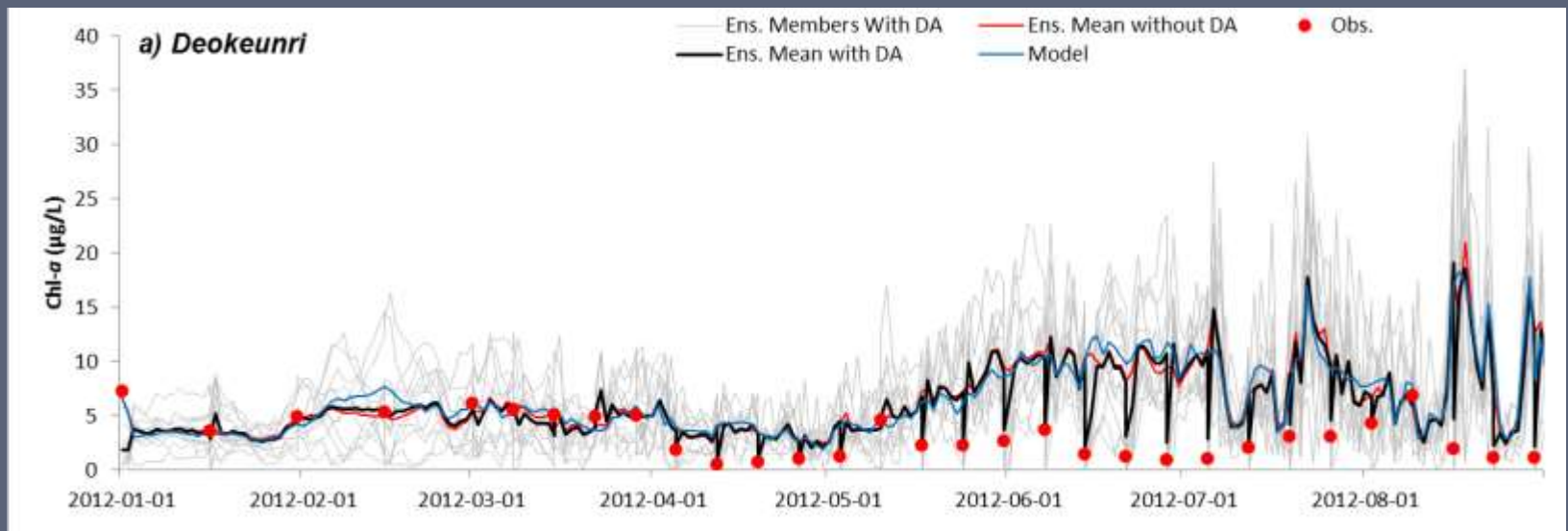
- ❖ Ensemble representation of EFDC model prediction is created by applying perturbation to HSPF model prediction based on error models, which are built by comparing model prediction and observation



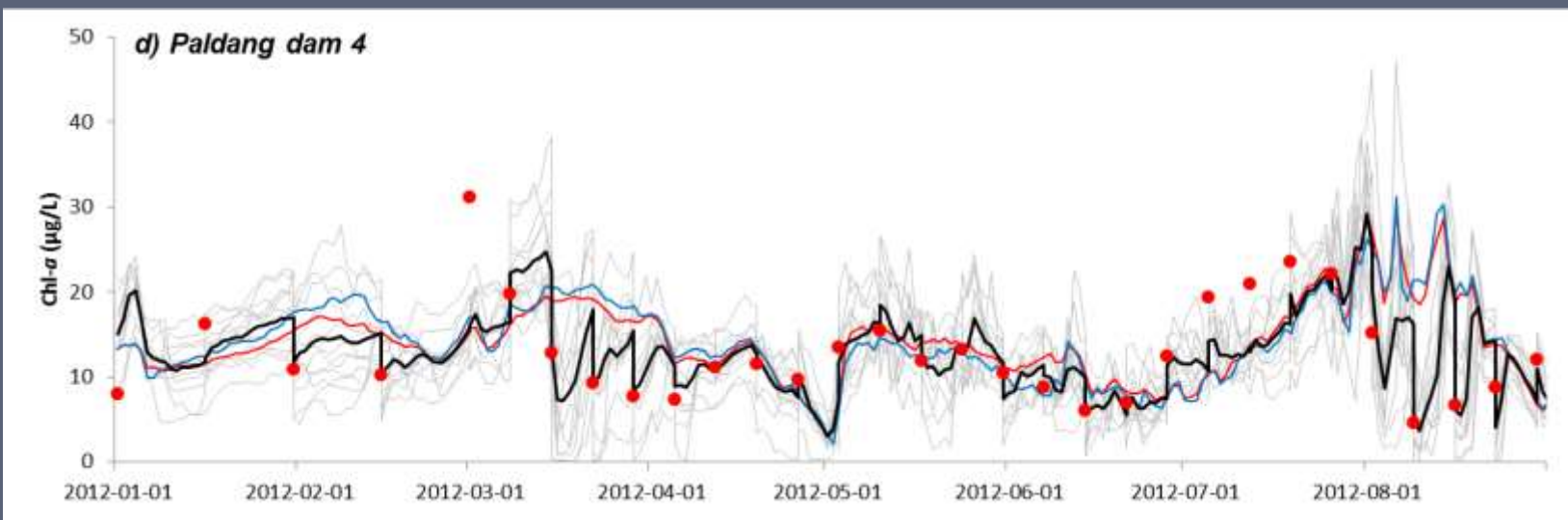
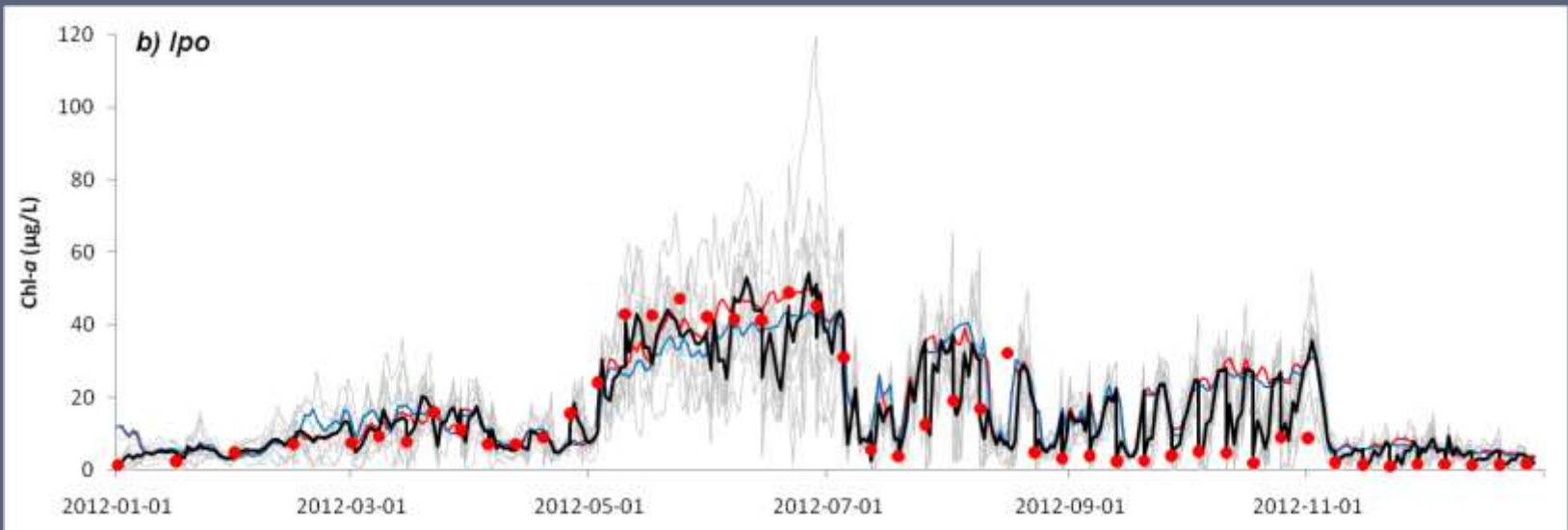
# Study site - Han River watershed



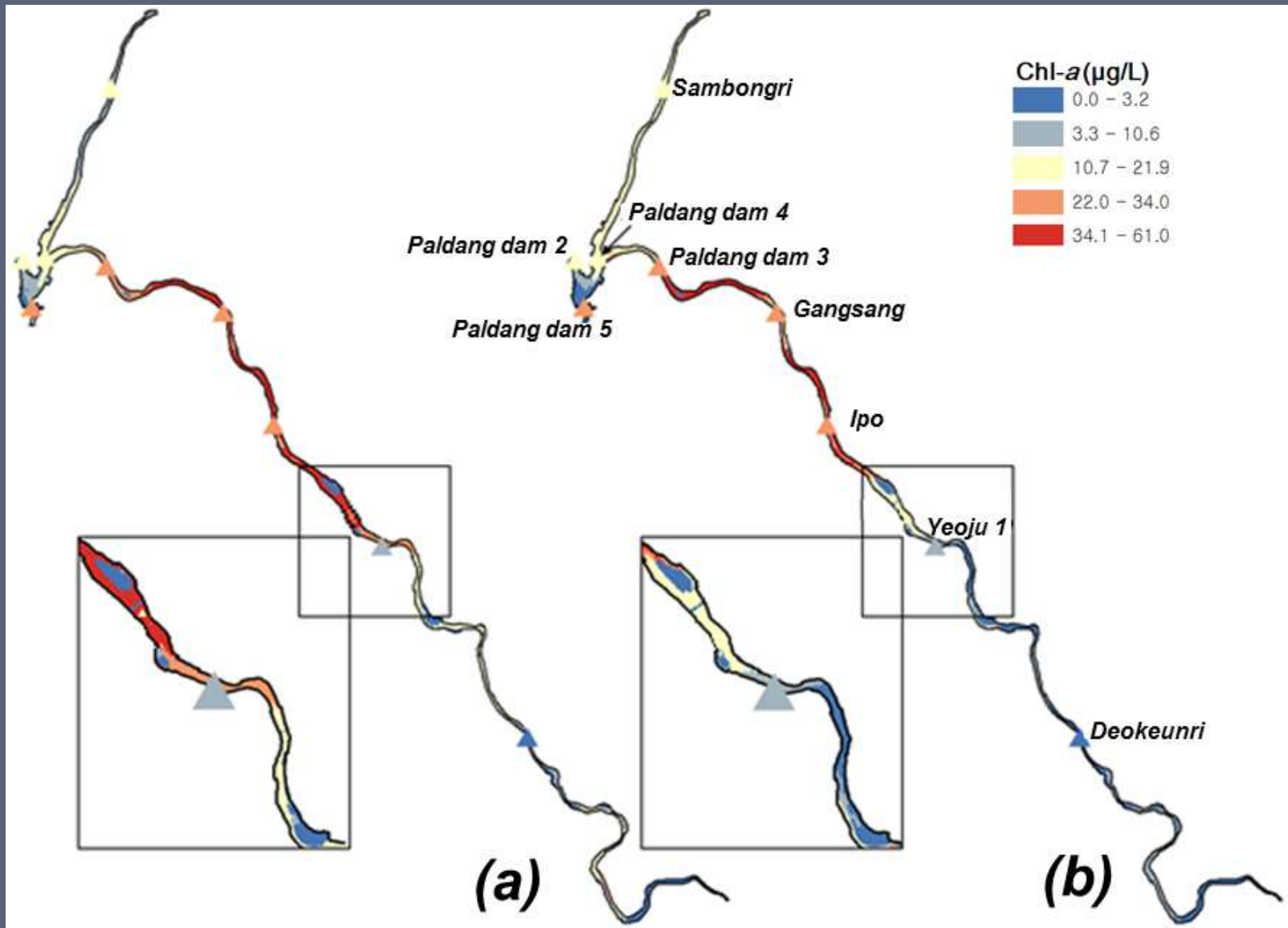
# Results of Chl-a ensemble simulation with DA



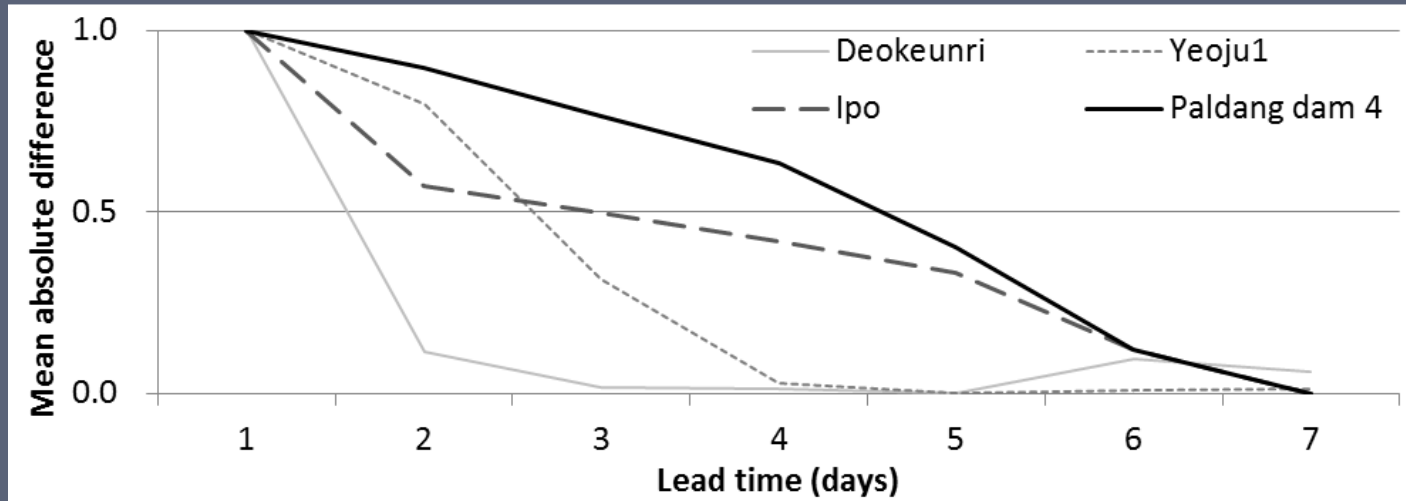
# Results of Chl-a ensemble simulation with DA



# Results of Chl-a ensemble simulation with DA



# How fast does the effect of DA disappear?



# Correlation among WQ variables

## Model equations

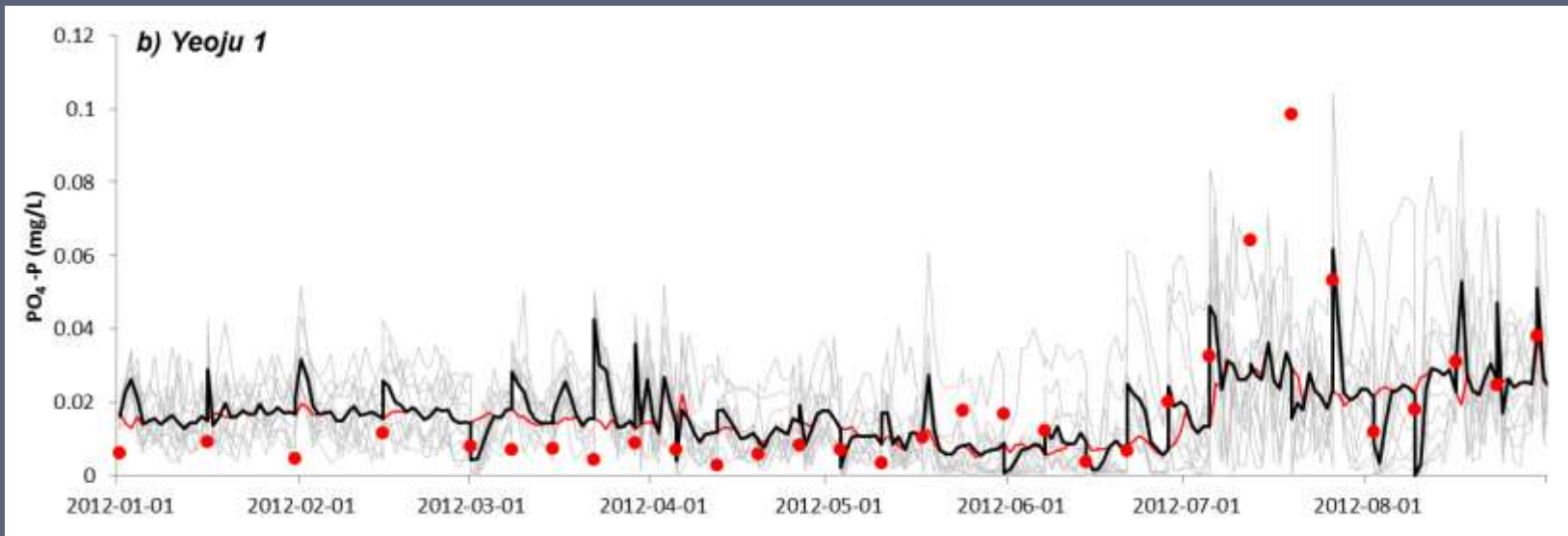
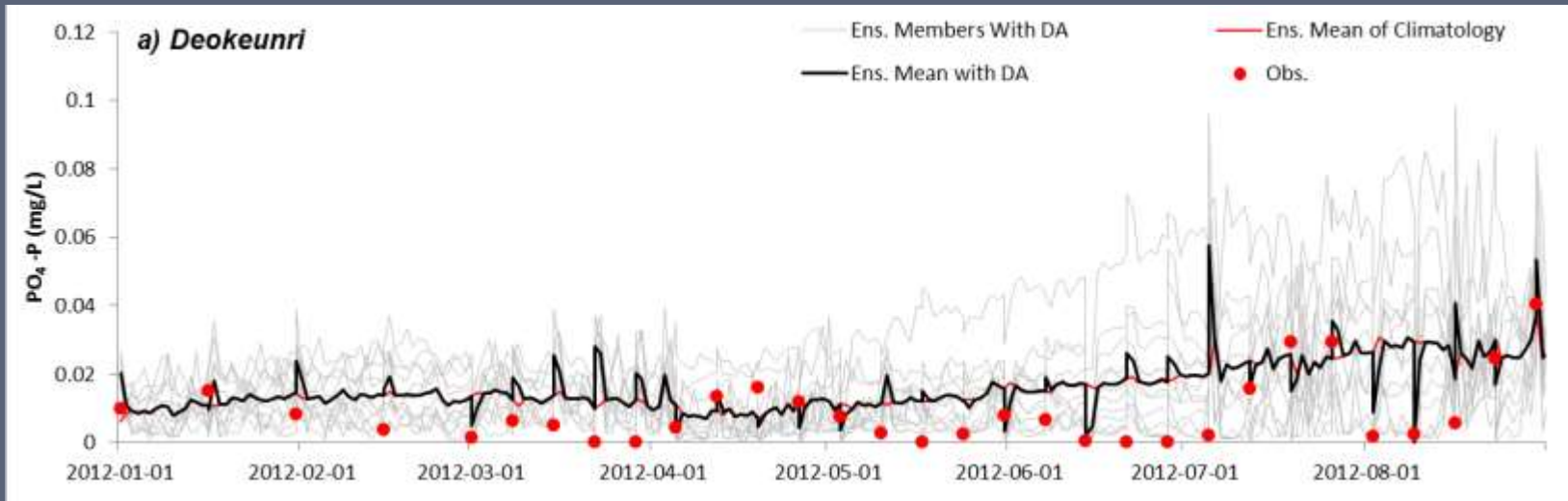
Chl-a

$$\frac{\partial B_x}{\partial t} = \underbrace{(P_x - BM_x - PR_x)B_x}_{\text{Net growth}} + \frac{\partial}{\partial z}(WS_x \cdot B_x) + \frac{WB_x}{V}$$

PO4

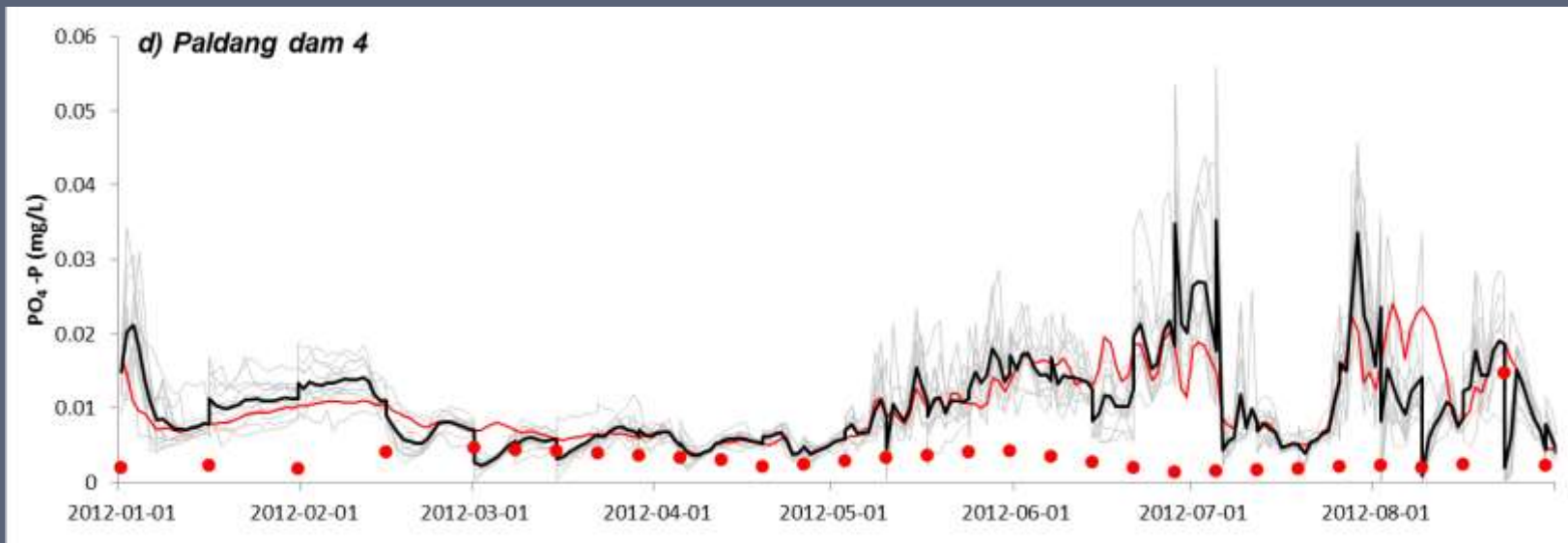
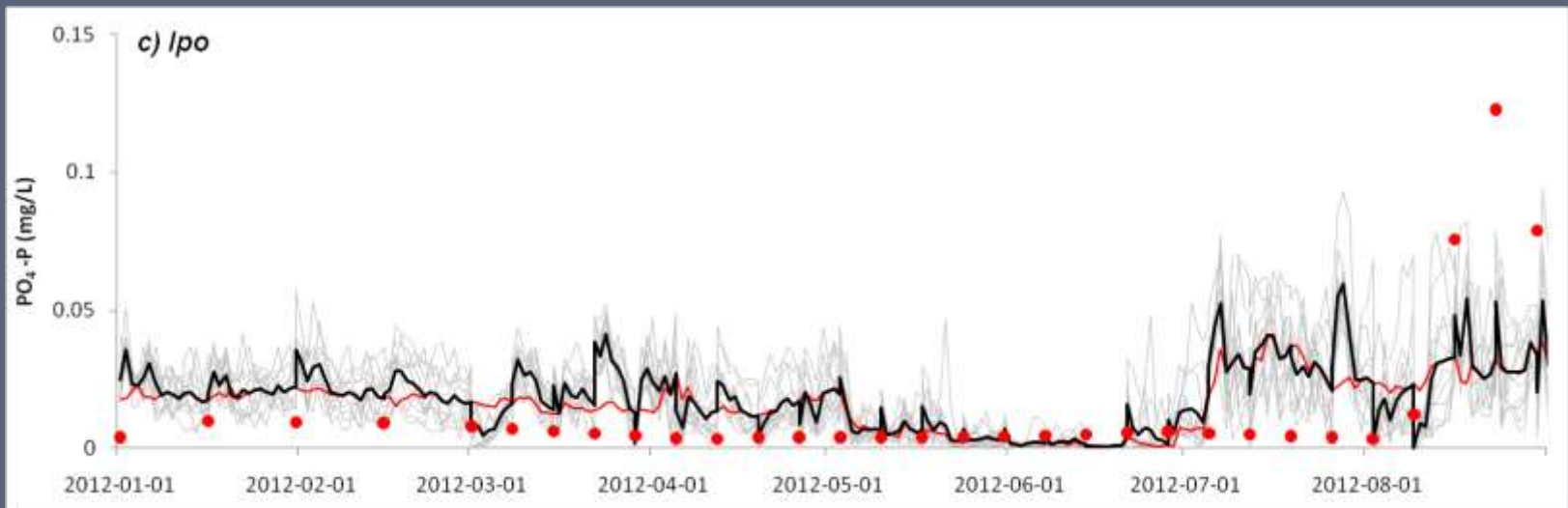
$$\begin{aligned} \frac{\partial PO4t}{\partial t} = & \sum_{x=c,d,g,m} \underbrace{(FPI_x \cdot BM_x + FPIP \cdot PR_x - P_x)APC \cdot B_x}_{\text{Net growth}} + K_{DOP} \cdot DOP \\ & + \frac{\partial}{\partial z}(WS_{TSS} \cdot PO4p) + \frac{BFPO4d}{\Delta z} + \frac{WPO4t}{V} \end{aligned}$$

# Results of phosphate ensemble simulation with DA





# Results of Chl-a ensemble simulation with DA



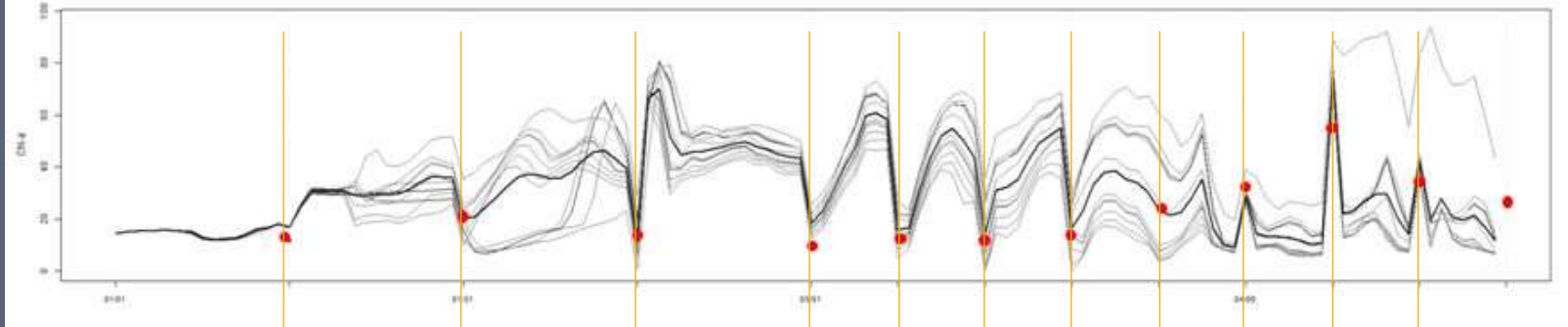
# Synthetic experiment

- ❖ ‘**ill-posed ensemble**’ in terms of correlation among WQ variables due to ignorance of spatial correlation of the boundary forcing to EFDC (perturbed HSPF outputs) and lack of consideration on correlation between observed WQ variables
- ❖ Synthetic experiment for ‘**well-posed ensemble**’
  - Perturbed water temperature only and left other WQ variables as single time series in the boundary forcing

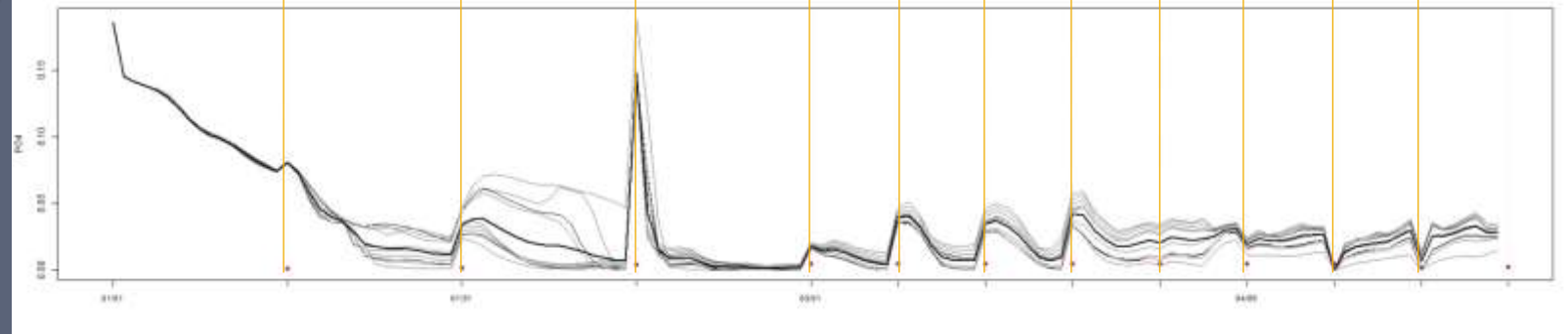


# Synthetic experiment

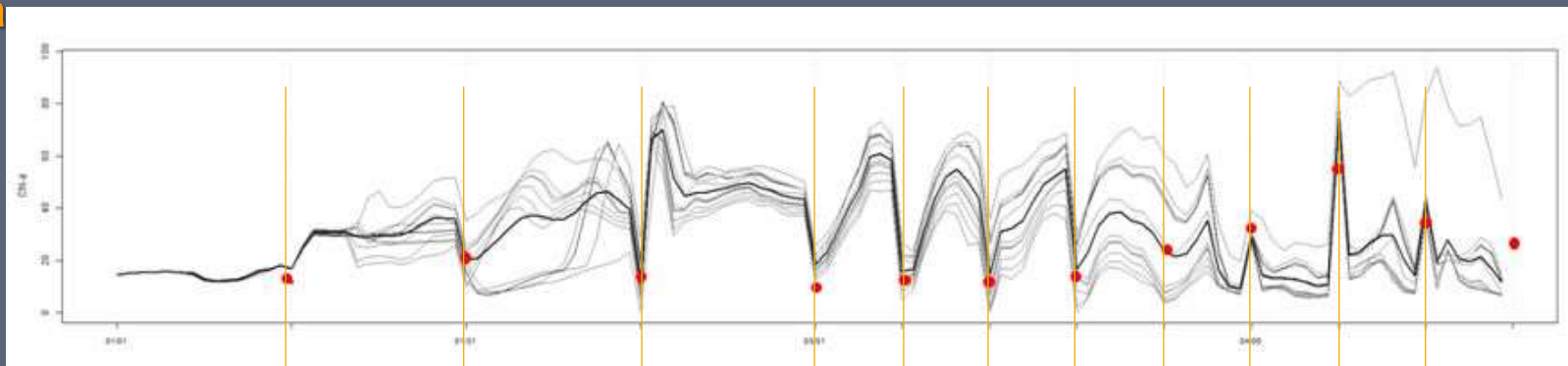
Chl-a



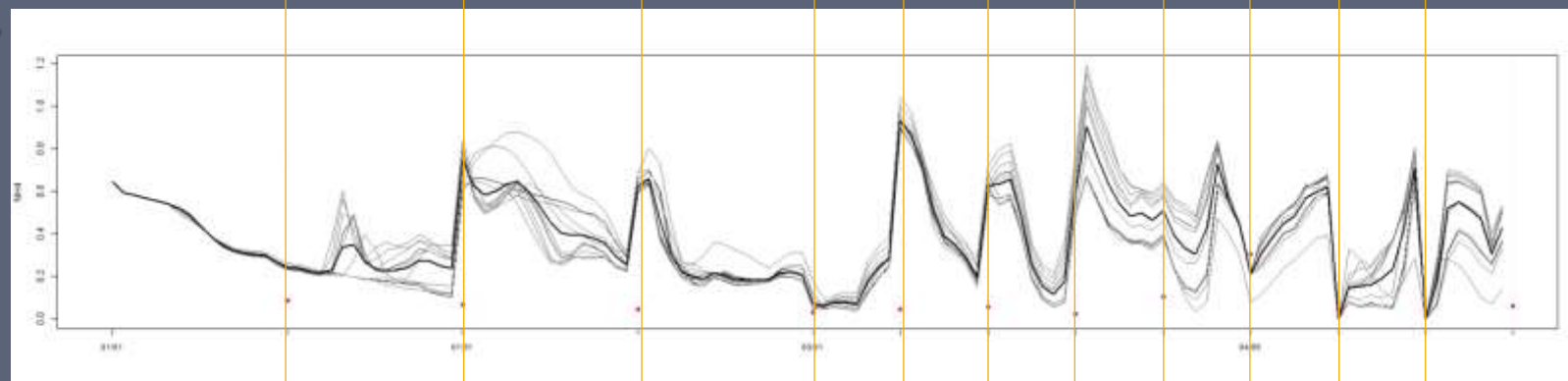
PO<sub>4</sub>



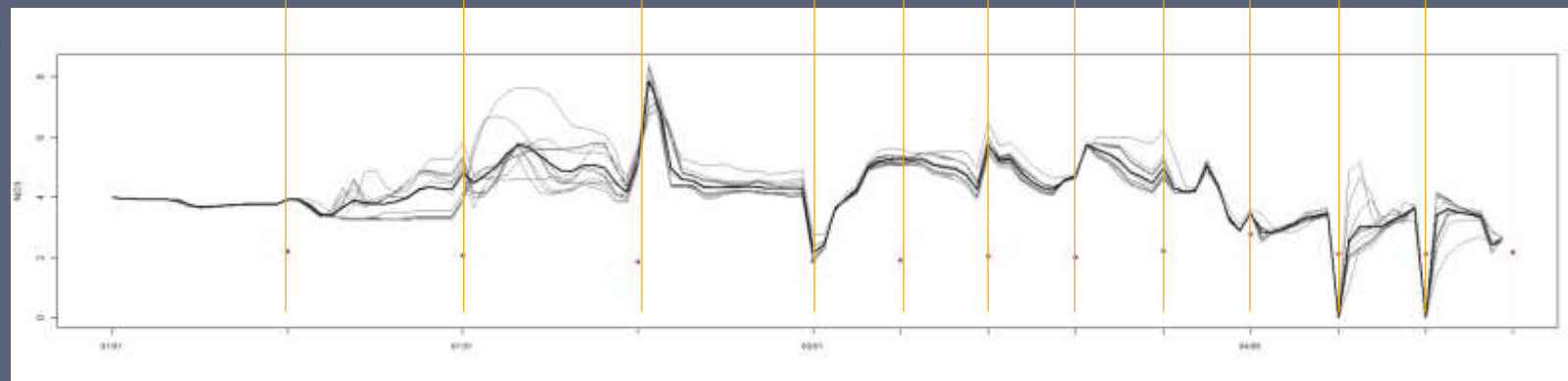
Chl-a



NH4

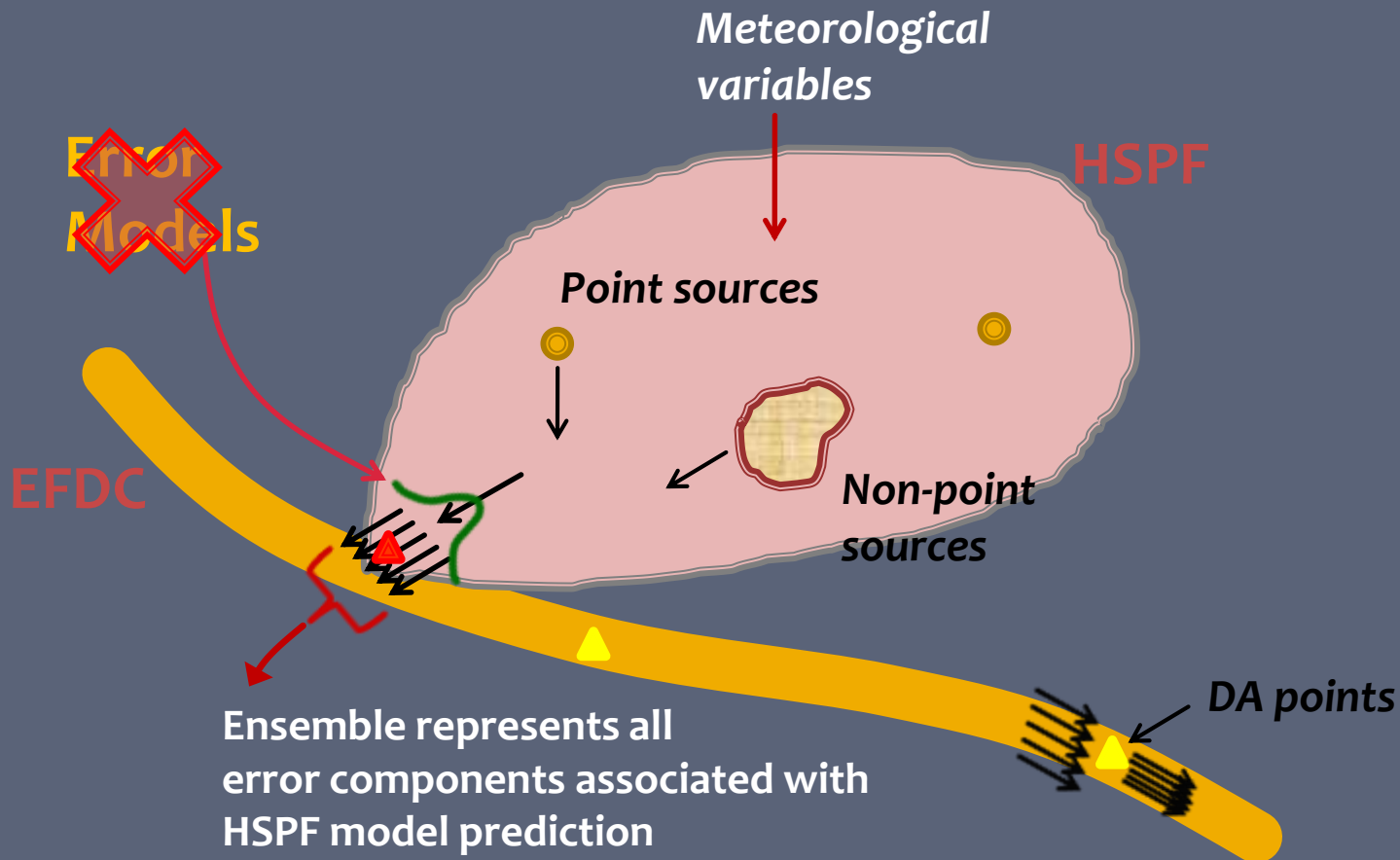


NO3



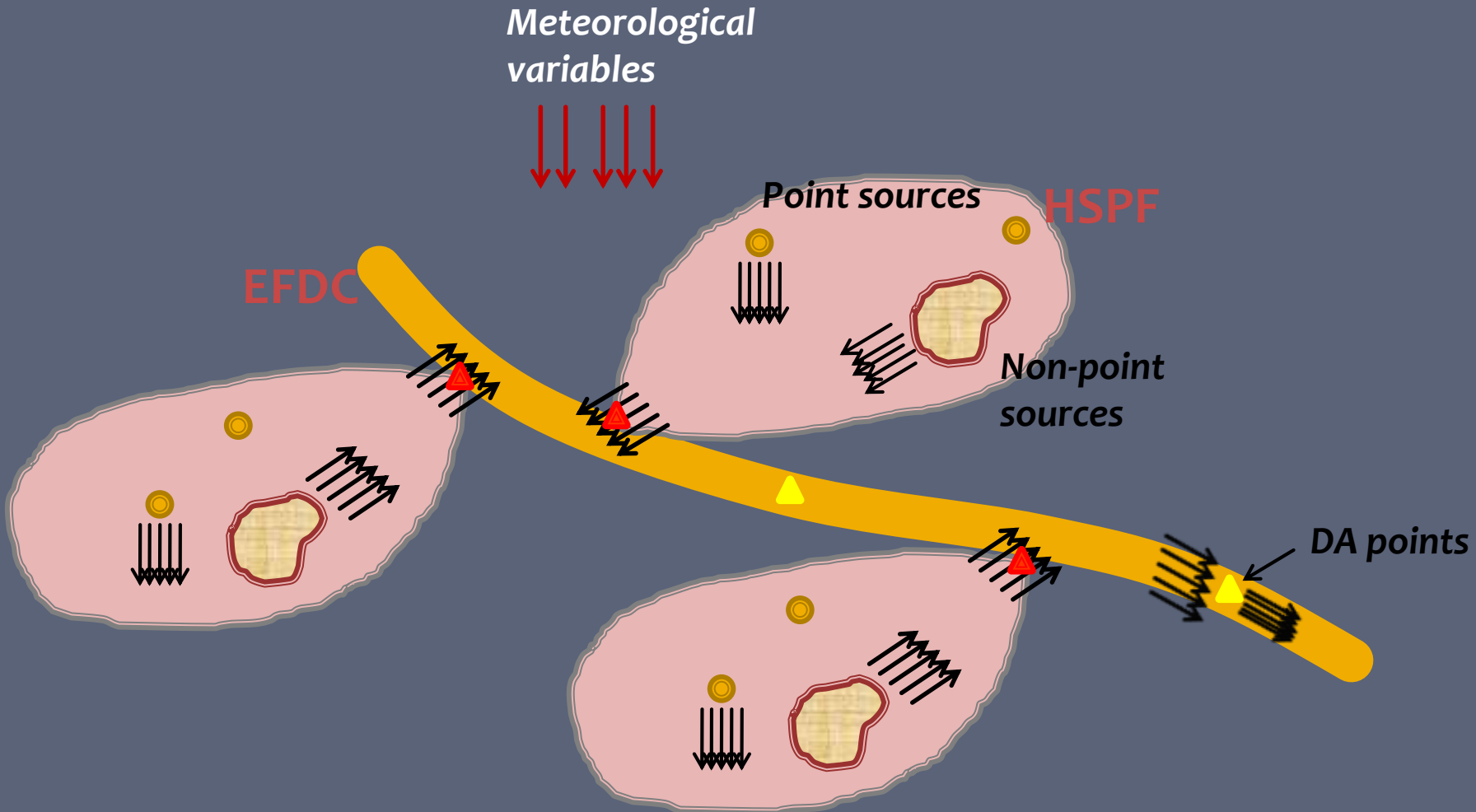
# So what is a proper approach?

- ❖ Our approach using error models is wrong. It is very difficult to consider spatial and inter variable correlations in this framework



# So what is a proper approach?

- ❖ In stead, **ensemble simulation of the entire watershed is necessary**



# Thank you

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