

## Dealing with various sources of uncertainty in the operational control of water systems using ensemble based MPC with convex optimization

### Acknowledgements:

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HS3.3 is scheduled for a live chat on  
Thursday, 07 May 2020, 08:30-10:15.

HS4.4

## **Ensemble and probabilistic hydro-meteorological forecasts: predictive uncertainty, verification and decision making**

Convener: Albrecht Weerts | Co-conveners: Shaun Harrigan<sup>ECS</sup>, Schalk Jan van Andel, Fredrik Wetterhall, Jan Verkade, Kolbjorn Engeland

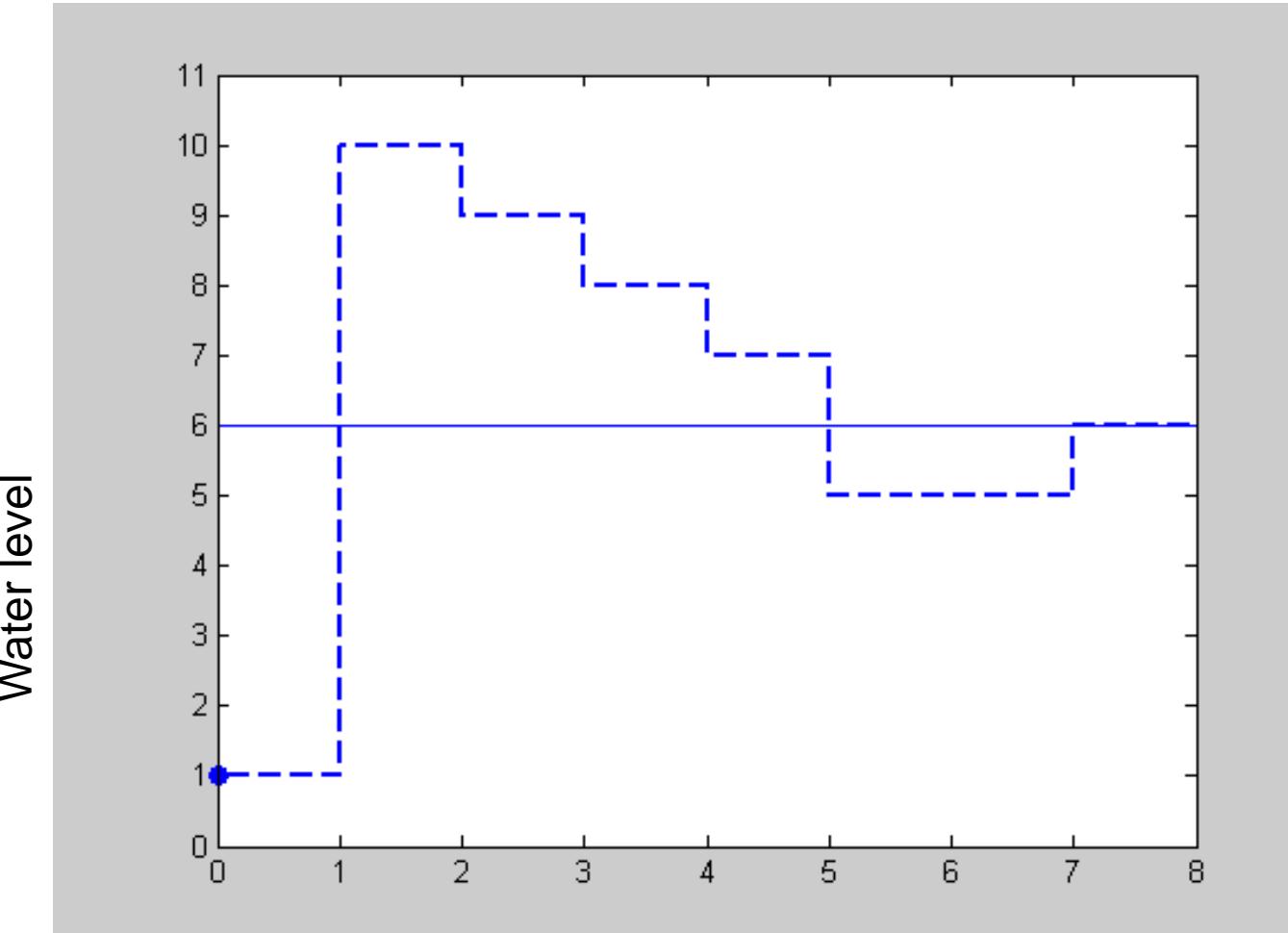
[Displays](#)

| Chat Fri, 08 May, 08:30-12:30

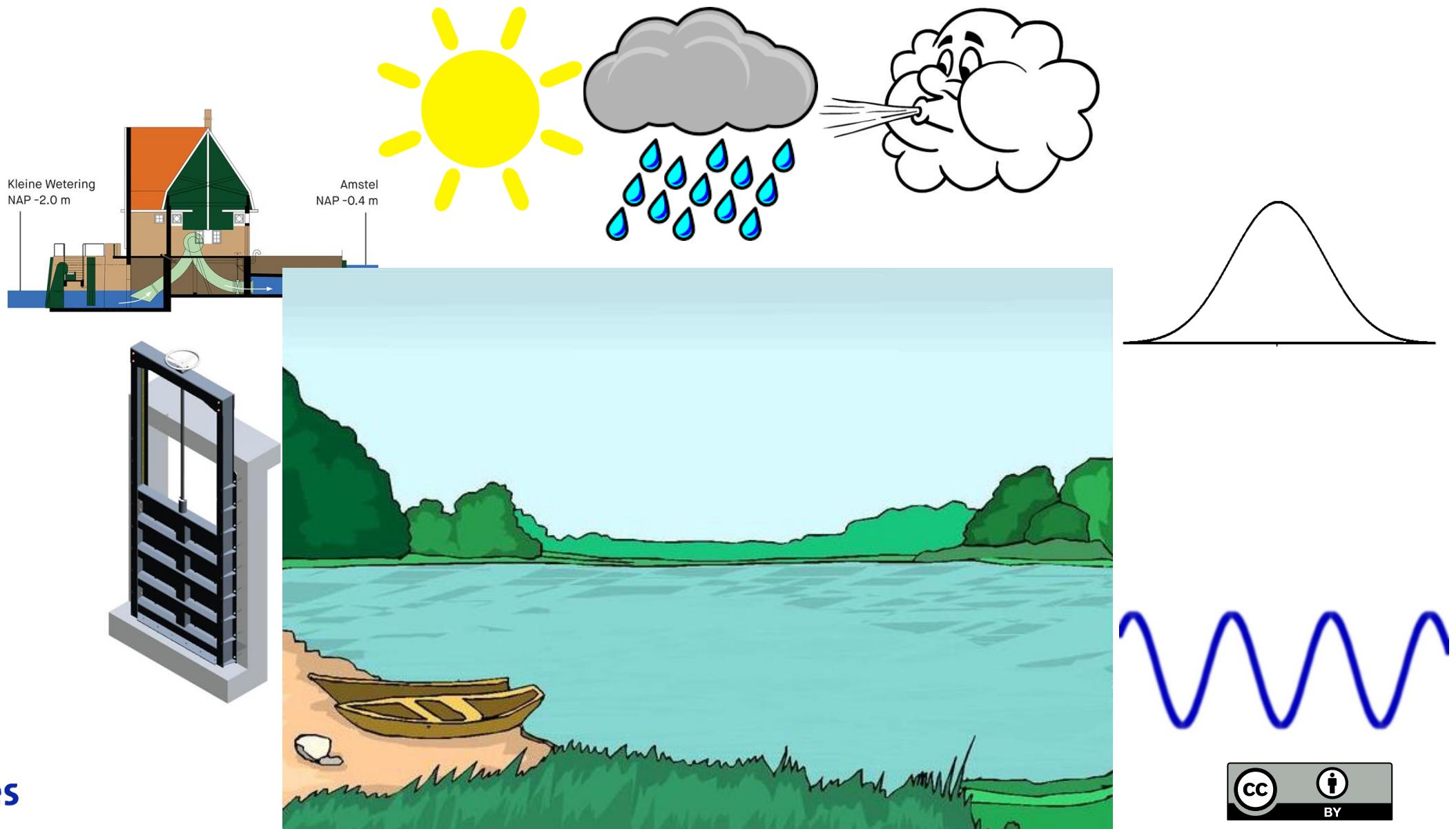
EGU2020-19132

Comparison of model predictive control methods that can account for uncertainties in forecasts of flood discharge and storm surge; case study Volkerak-Zoommeer, the Netherlands by Maarten Smoorenburg et al.

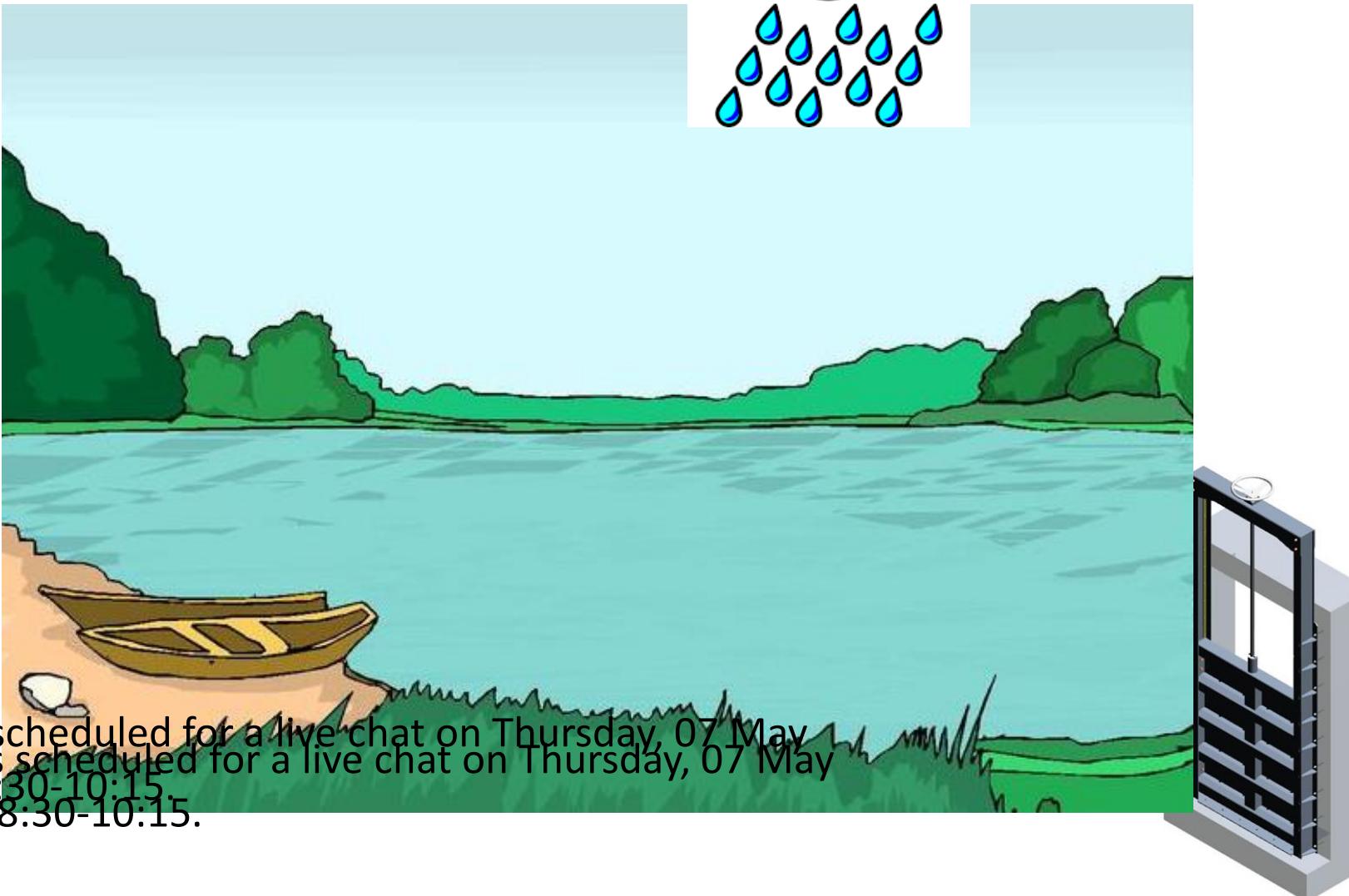
# Predictive Control



# Water system



# Water system



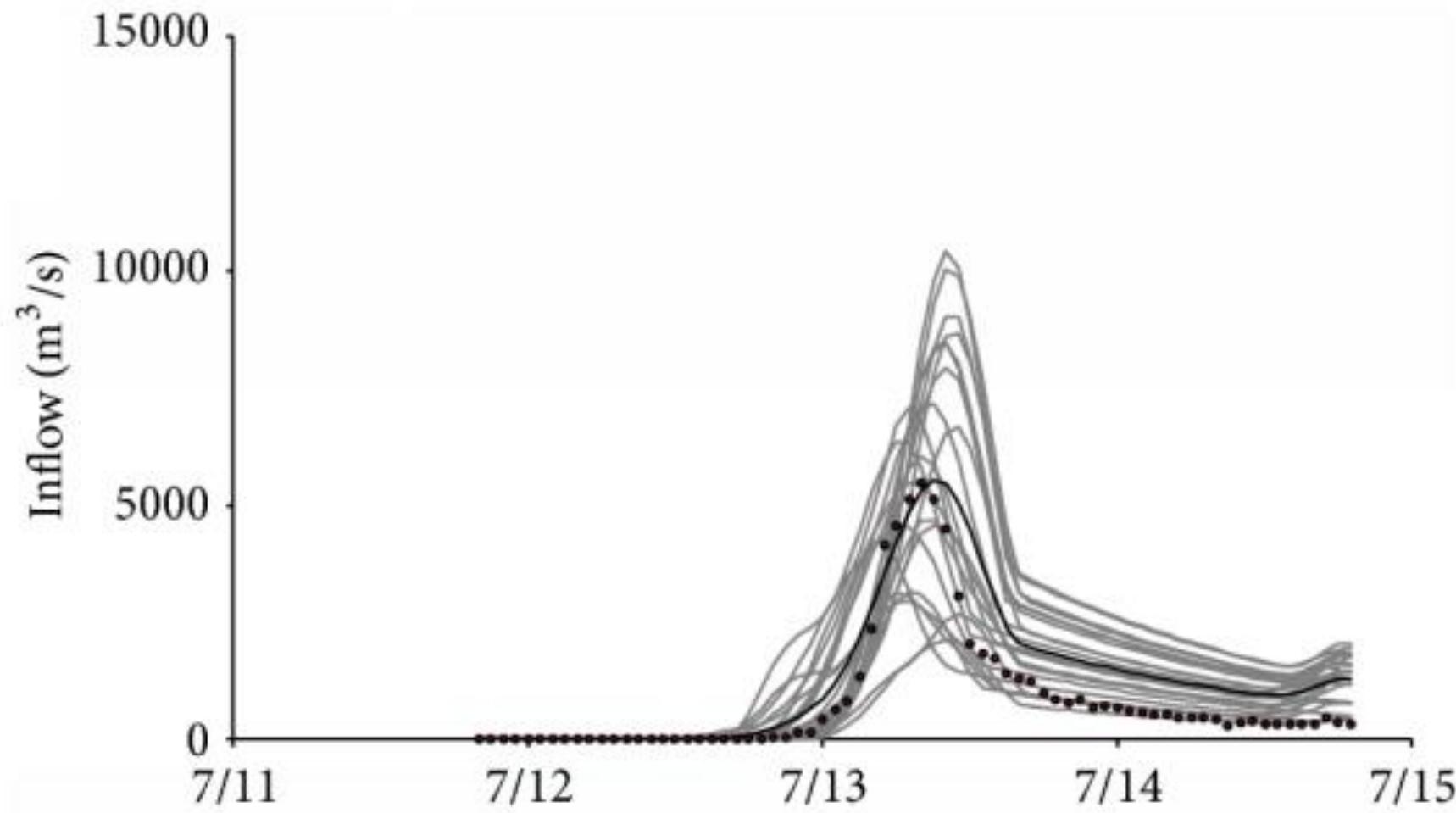
Deltas

$$\frac{V(k+1) - V(k)}{\Delta t} = Q_{in}(k+1) - Q_{out}(k+1) \quad k=0, \dots, \lambda \quad V(0) \text{ initial condition}$$

Qin(k): boundary condition

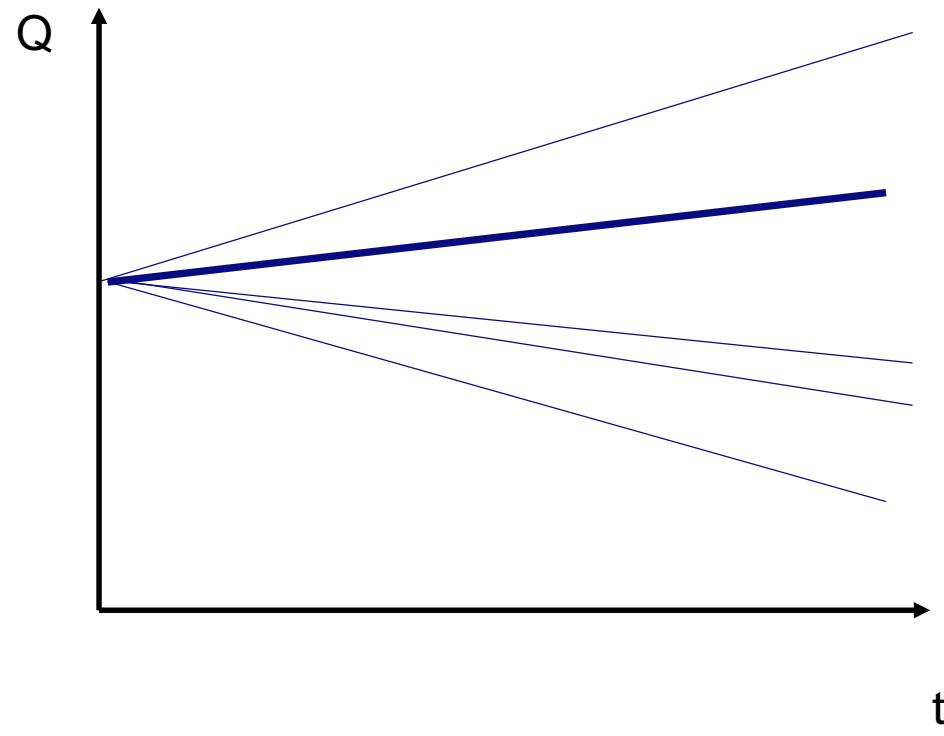
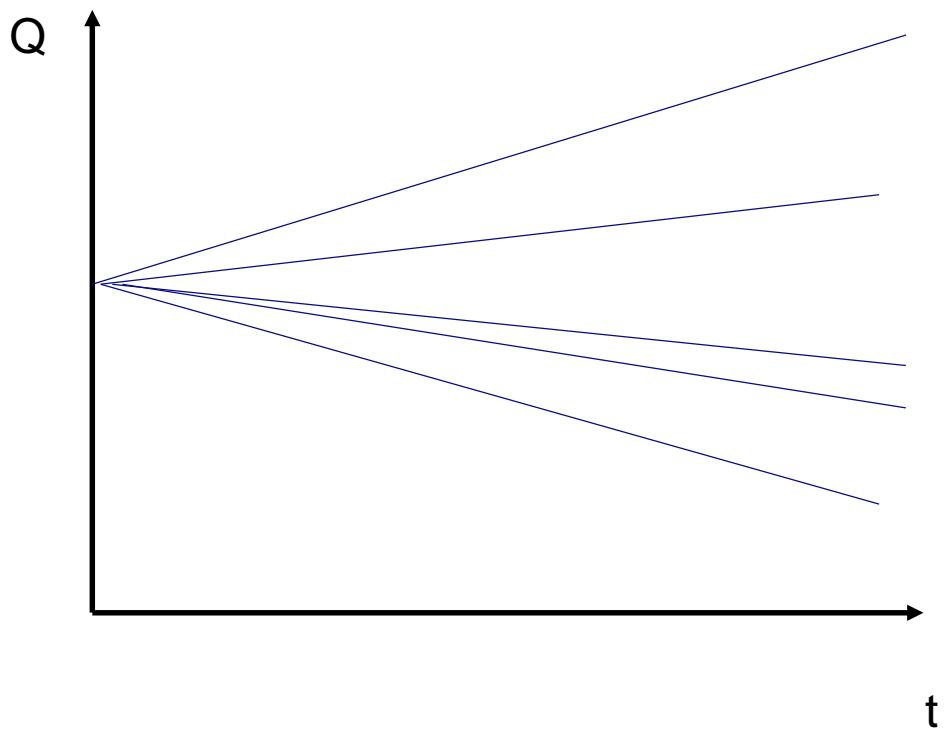
Qout(k): ?

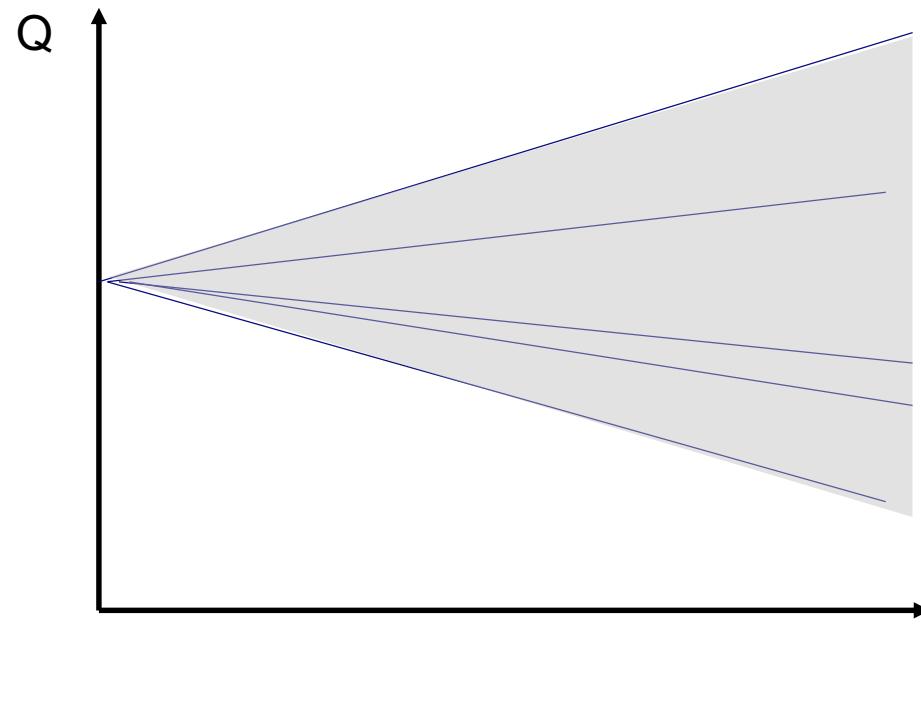
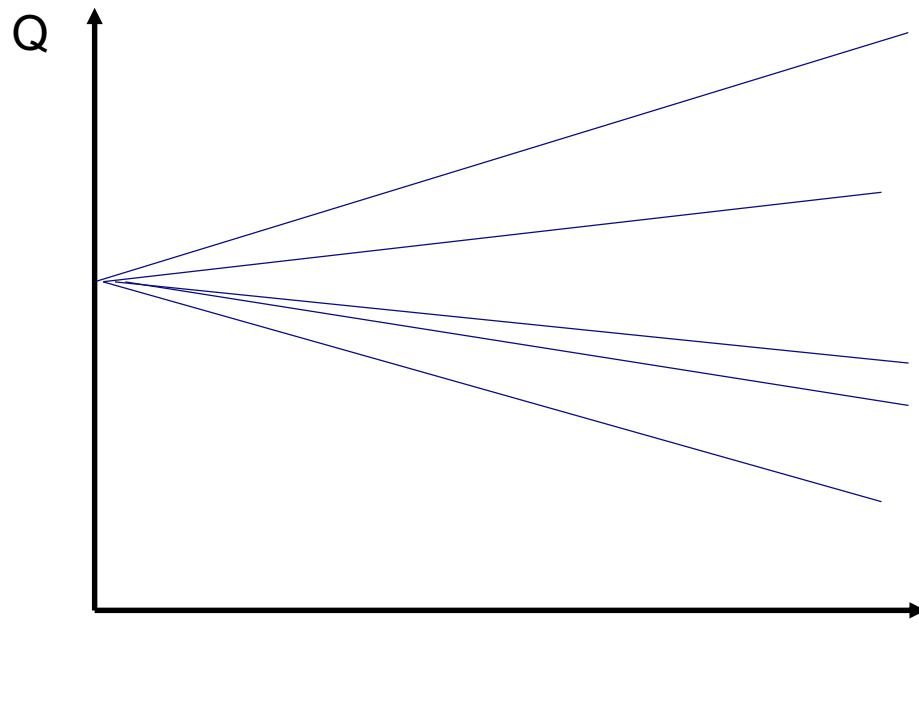
$V_{\min} < V(k) < V_{\max}$



— Individual member  
— Ensemble-mean

• Observation





$$\frac{V(k+1) - V(k)}{\Delta t} = Q_{in}(k+1) - Q_{out}(k+1)$$

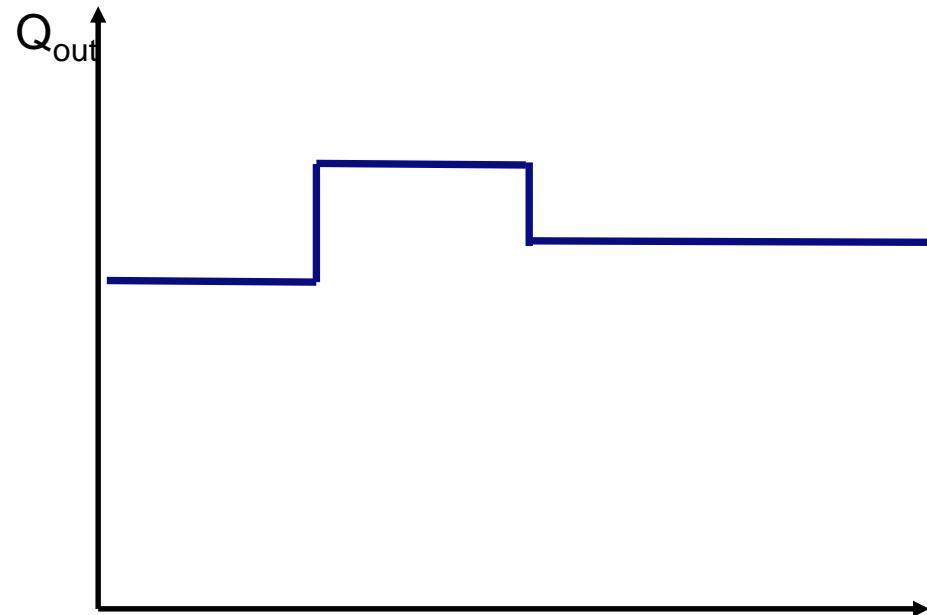
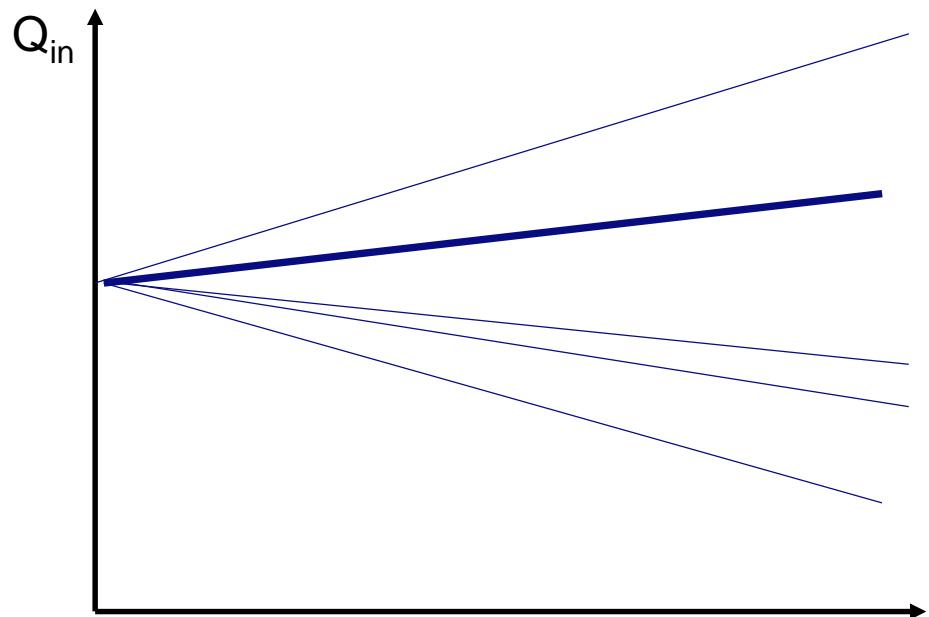
$k=0, \dots, \lambda$

$V(0)$  initial condition

$Q_{in}(k)$ : boundary condition

$Q_{out}(k)$ : ?

$V_{min} < V(k) < V_{max}$



$$\frac{V(k+1) - V(k)}{\Delta t} = Q_{in}(k+1) - Q_{out}(k+1)$$

$k=0, \dots, \lambda$

$V(0)$  initial condition

$Q_{in}(k)$ : boundary condition

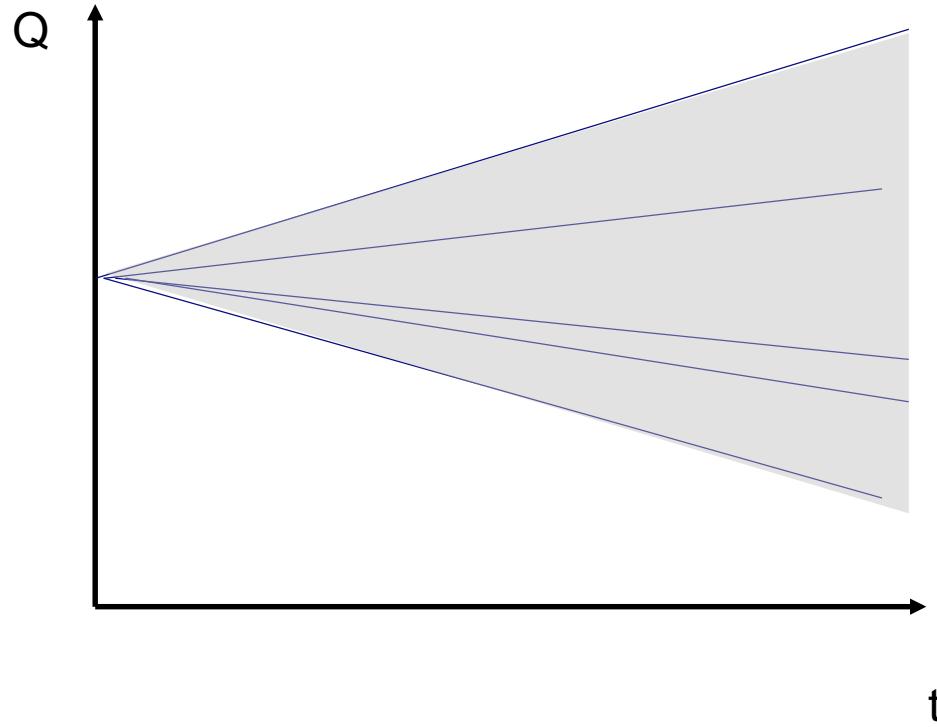
$Q_{out}(k)$ : ?

$V_{\min} < V(k) < V_{\max}$

$$\frac{V^{e1}(k+1) - V^{e1}(k)}{\Delta t} = Q_{in}^{e1}(k+1) - Q_{out}(k+1)$$

$V_{\min} < V^{e1}(k) < V_{\max}$

Number of equations:  $e \times \lambda \times 3$



Ensemble: e1, e2, ..., ee

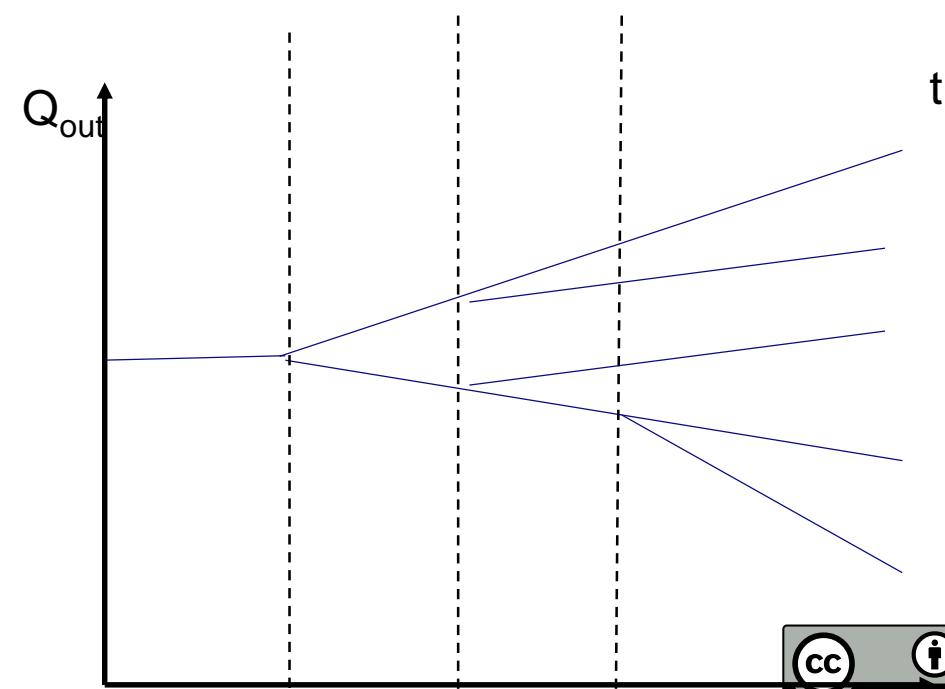
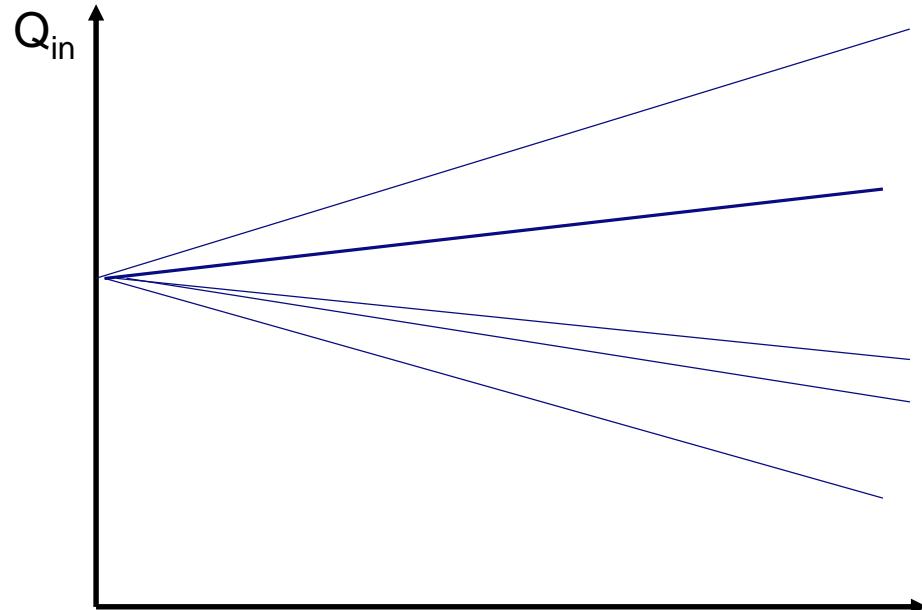
**Deltares**

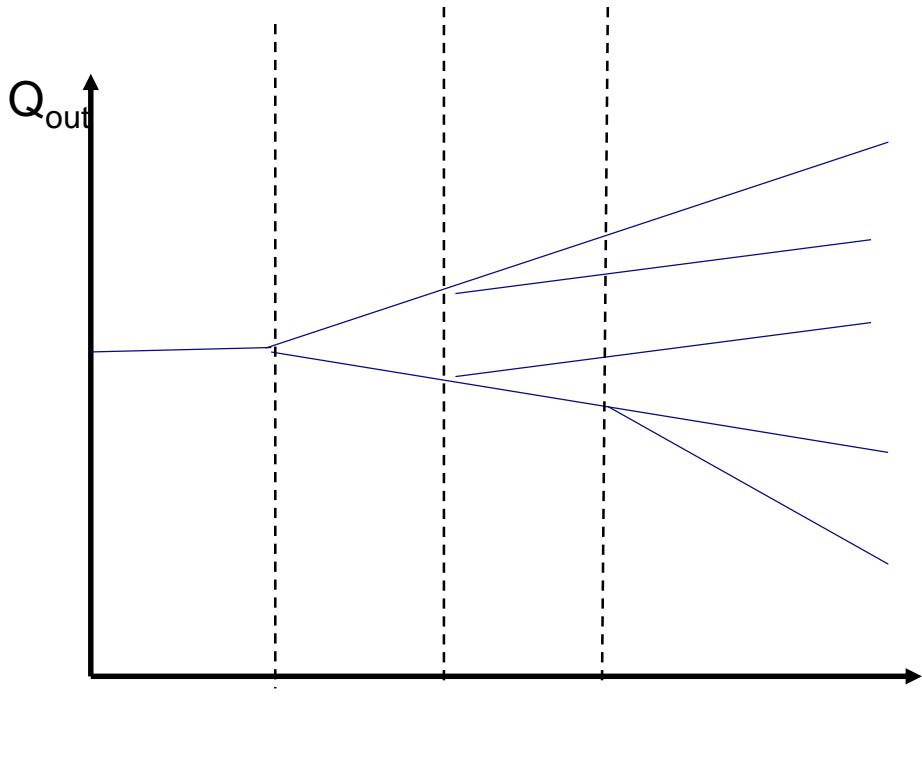




Raso, Luciano, et al. "Tree-scenario based model predictive control." *EGU General Assembly Conference Abstracts*. Vol. 12. 2010.

Raso, Luciano. "Optimal control of water systems under forecast uncertainty: robust, proactive, and integrated." (2013) **Deltares**





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$$\frac{V^{e1}(k+1) - V^{e1}(k)}{\Delta t} = Q_{in}^{e1}(k+1) - Q_{out}^{e1}(k+1)$$

$$V_{\min} < V^{e1}(k) < V_{\max}$$

$$Q_{out}^{e1}(1) = Q_{out}^{e2}(1)$$

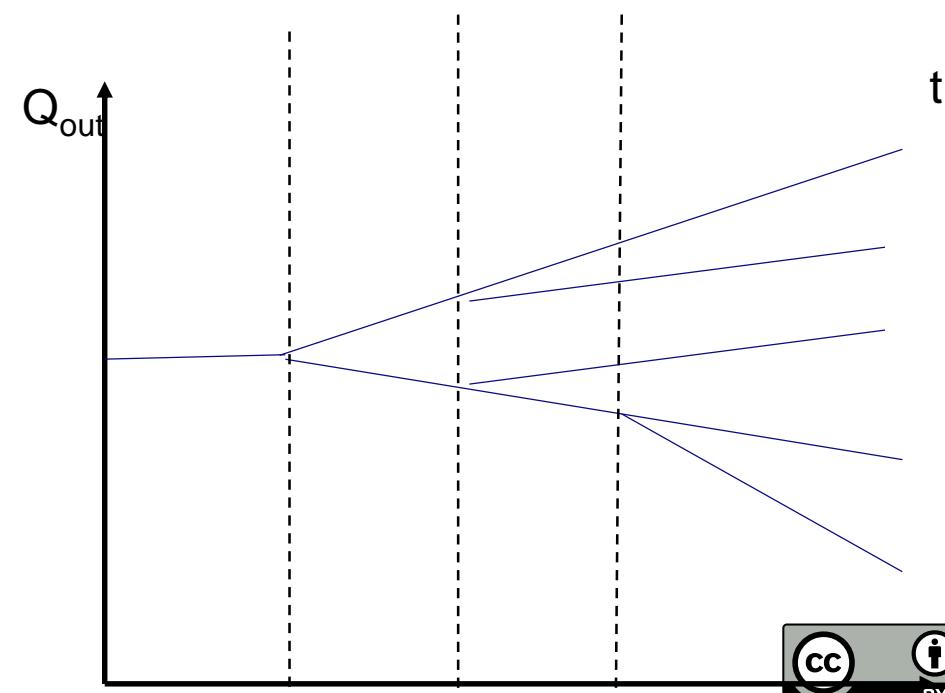
$k=0, \dots, \lambda$

$V(0)$  initial condition

$Q_{in}(k)$ : boundary condition

$Q_{out}(k)$ : ?

$V_{\min} < V(k) < V_{\max}$



12 time steps

10 ensemble members

Mixed integer problem: open or close the gates

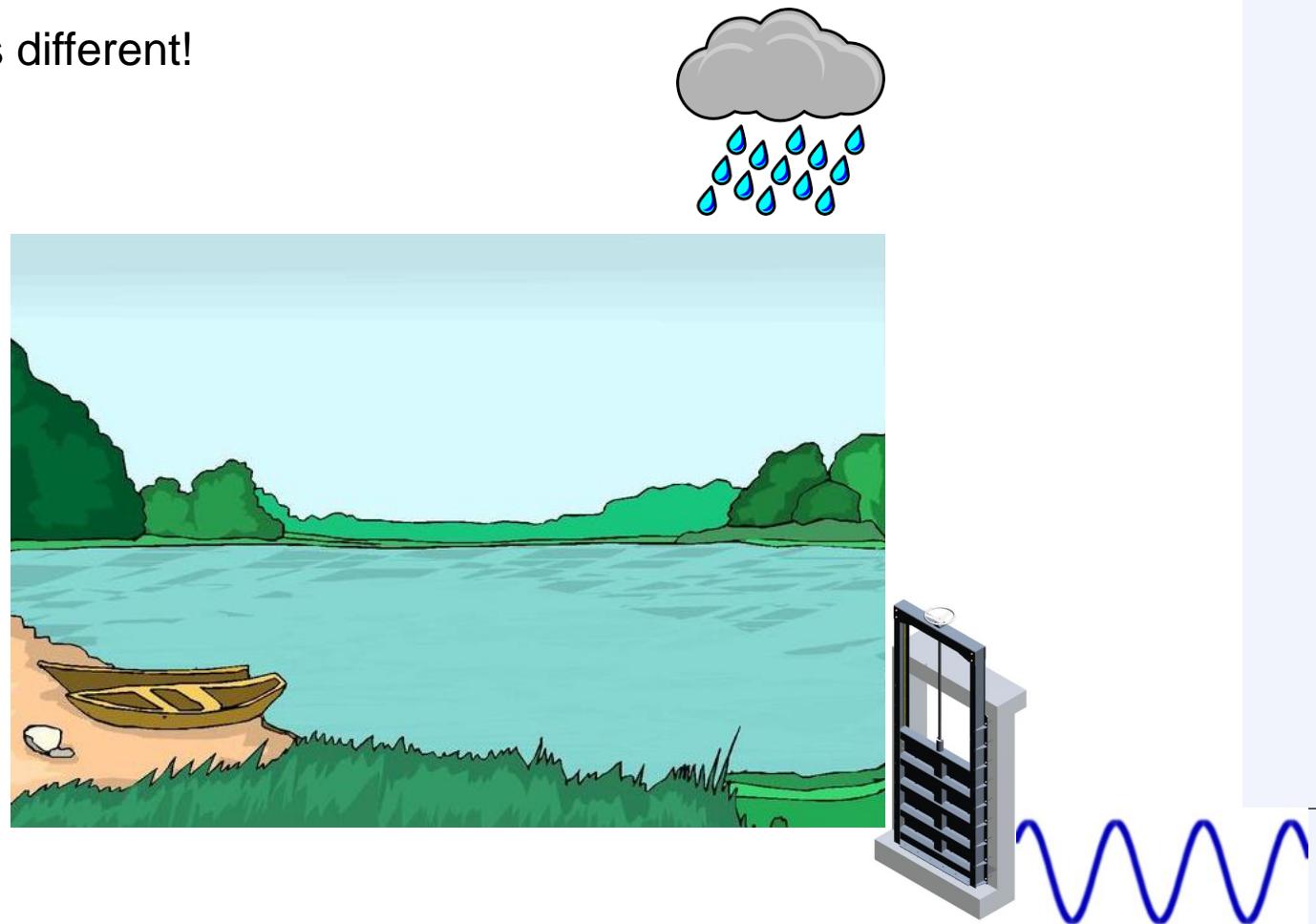
Closed-loop test: control model and test model is different!

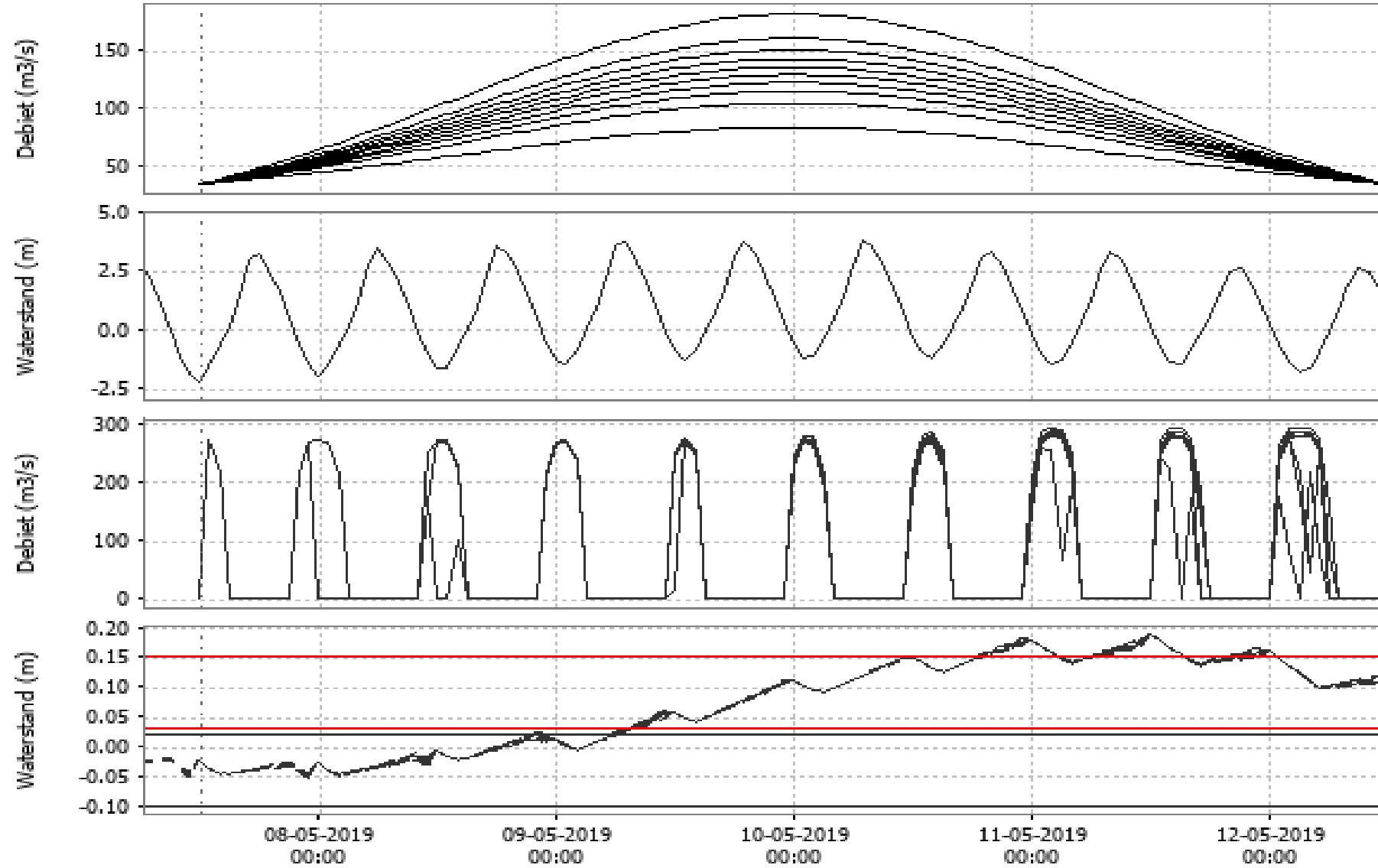
Two inputs as ensembles



# Deltares RTC-Tools

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# MPC using ensembles

**Deltares**    RTC-Tools

[www.deltares.nl](http://www.deltares.nl)

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