



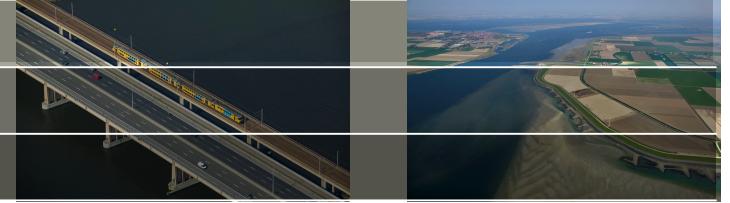
Visualisierung operationeller Daten, Ermittlung und Reduzierung von Vorhersageunsicherheiten, Real Time Control

**Visualisation des données opérationnelles,
détermination et réduction des incertitudes
des prévisions, Real Time Control**

Martin Ebel

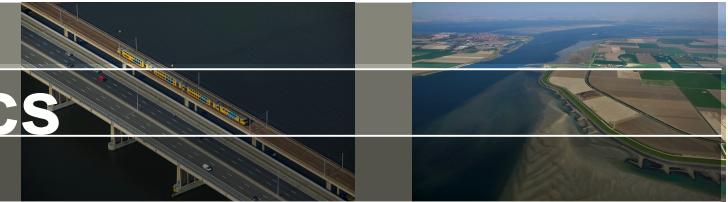
Internationaler LARSIM-Anwenderworkshop Kaiserslautern
22./23. März 2010

Gliederung



- Datenvisualisierung mit Delft-FEWS
- Data Assimilation Tools
zur Hochwasser-Vorhersage
- Real Time Control Tools –
operationelle Steuerung von Retentionsräumen

Deltares - WL | Delft Hydraulics



2008 hervorgegangen aus Fusion von

WL | Delft Hydraulics

- Ende 2007: knapp 360 Mitarbeiter
- Schwerpunktaktivitäten
 - Angewandte Forschung in den Bereichen Integriertes Wassermanagement, Hochwasser, Dürre, etc.
 - Physikalische Modellierung
 - Spezialisierte Software
 - Expertenberatung fuer Ingenieurunternehmen und staatliche Organisationen

GeoDelft (Geotechnisches Forschungsinstitut)

TNO (Grundwasserabteilung)

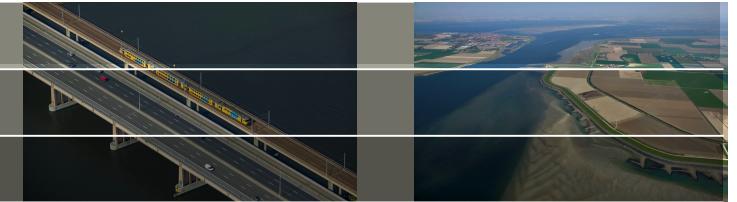
RIZA & RIKZ (Forschungsabteilungen niederländischer Fachbehörden)

- Not-for-Profit Stiftung
- ca. 900 Mitarbeiter

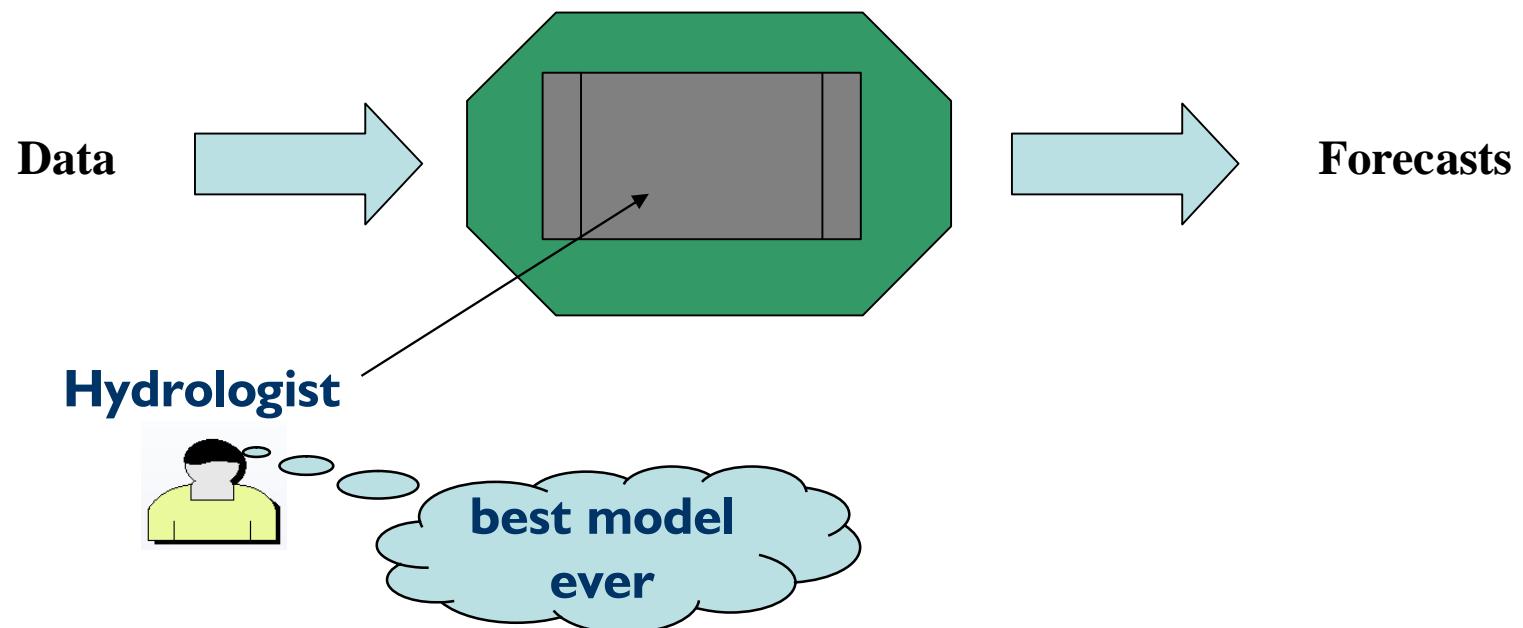
Forschungs- und Experten-Beratungsinstitut mit hoheitlichen Aufgaben

Deltares

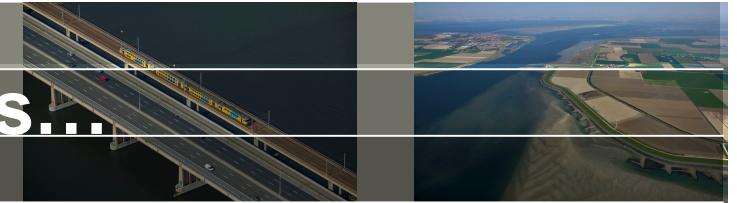
Why Delft-FEWS ?



Traditionally model centric developments around existing models



Current trends and challenges...



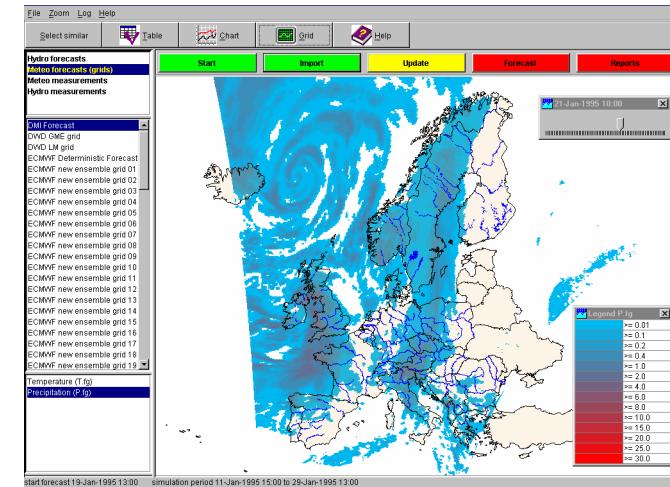
Increasing availability of weather forecast data

- Numerical Weather Prediction
- Radar data

On-line observations (precip., fluvial)

Changing modelling requirements

- *State of the art modelling*
- *model A instead of / plus model B*
- *data assimilation*



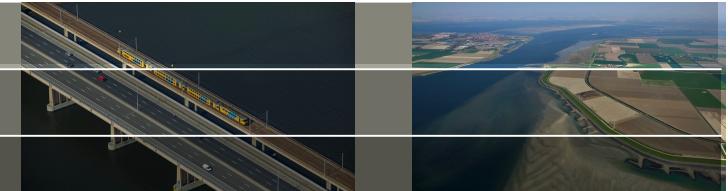
Challenges:

Efficient handling of large datasets

Flexible and open system to enable easy model integration

Working with uncertainties

Data centric approach



NFFS Northwest Region (Eden Pilot Catchment). Pre-Release 05a, June 2004 (Stand alone)

File Zoom Tools Options Help

Table Chart Manual Forecast Log Browser Forecast Manager What-if Scenario Longitudinal Display Flood Map Display ?

Eden

- Hydrological gauges
- Hydrological Forecast Points
- Meteorological gauges
- Catchments

Aisgill Moor
Barras
Brotherswater
Castlethwaite
Coelburn
Cummersdale
Great Corby
Green Close
Greenholme
Harraby Green
Holme Head
Linstock
Mosedale
Scalebeck
Sheepmount
Skelton
Temple Sowerby
Uelford
Ungauged Catchments

Calculated Discharge
Simulated Discharge
Simulated Historical Discharge
Simulated Forecast Discharge
Updated Discharge
Merged discharge
Typical Profile
Observed Water Levels
Simulated Historical Water Levels

1999-01-06 04:00 Eden Floodmap

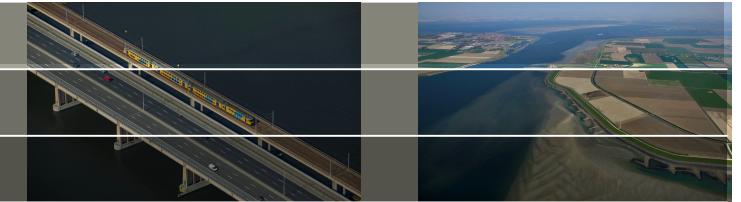
Micha Werner Current system time: 1999-01-06 04:00 07:05:33 09:05:33 Stand alone 340008.00000 , 579574.00000

DELFT FEWS – flood forecasting shell

Philosophy

- Framework for organisation for the flood forecasting process
- Integration of data from several sources – present single source to forecaster
- Provides general functional utilities
- Open interface to models used for forecasting
- Dissemination of results
- Delft FEWS is an open system – joint development approach

Integration of data

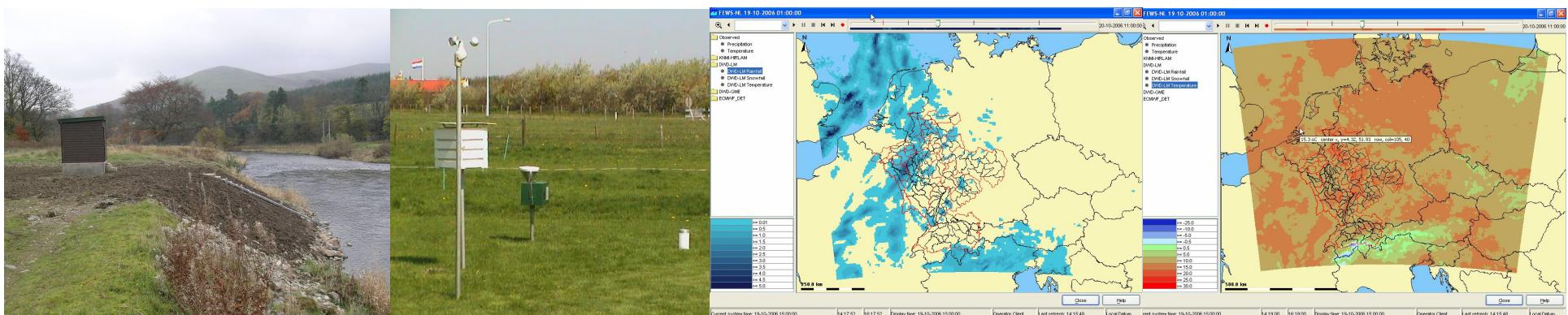


Interfaces to data sources

- Supports many standards in data exchange formats: xml, ascii, GRIB, NetCDF, many custom made imports (e.g. LUBW SYN-Format), etc.
- Data exchange with HIMS (e.g. WISKI)
- Plugin-technology to extend integration of data formats
- Emerging standards: WaterML – OpenGIS standard for exchange of hydrological data (USGS, NWS, CUAHSI)

list of current import formats:

<http://public.deltares.nl/display/FEWSDOC/Available+data+types>

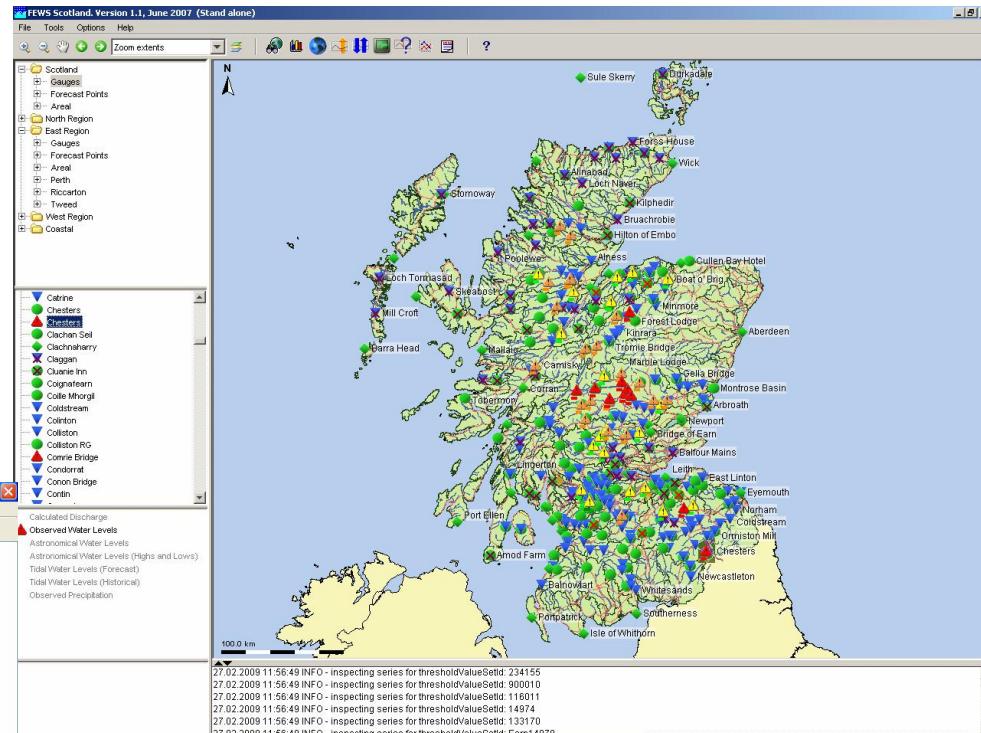
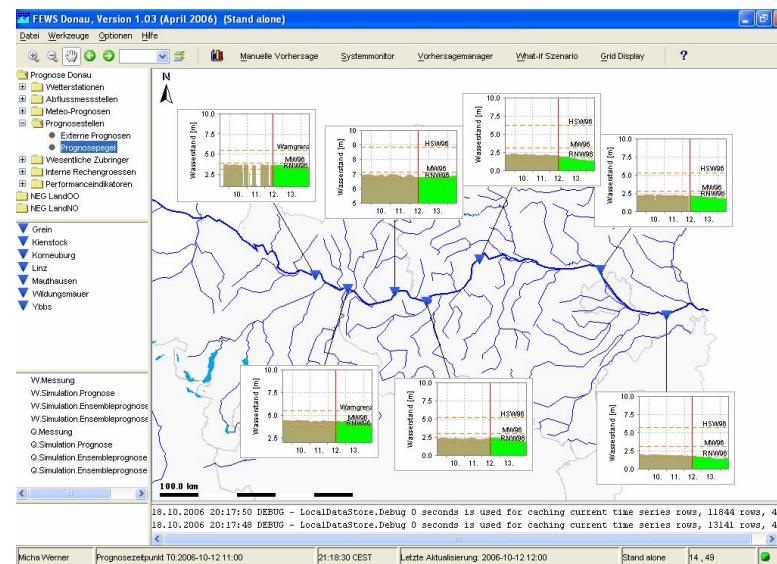


Providing the forecaster an interface to data...

Simple graphical user interface
Self explanatory

Key features

- GIS Based
- Overview of data & status



FEWS Scotland – flood status in several catchments, January 2008

FEWS Donau (Austria) – Graphs at key stations

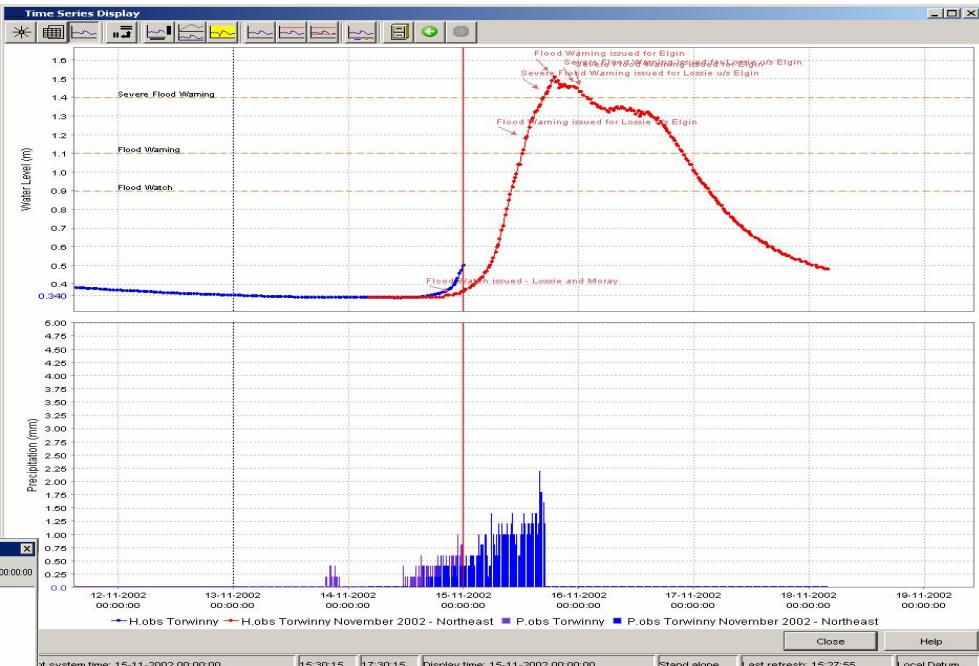
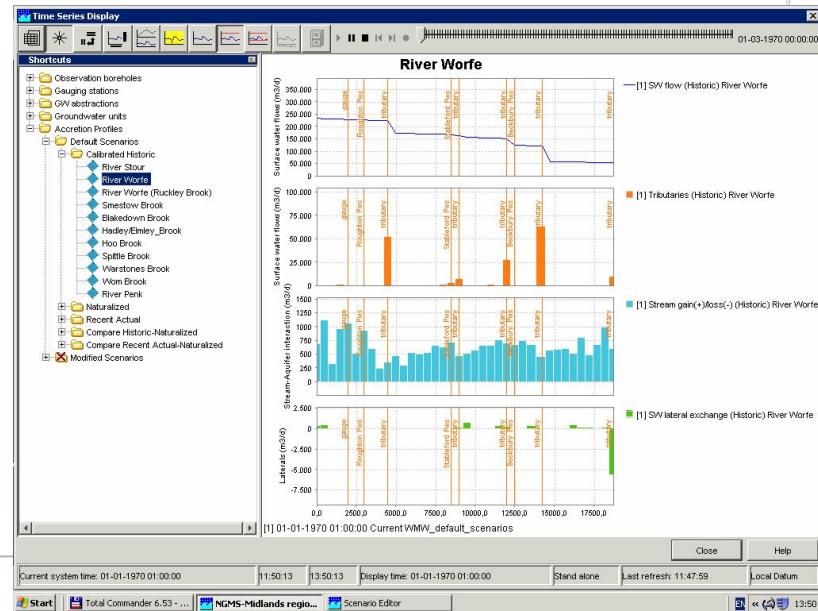
Deltares

Data visualisation and editing – Graphical data

Powerful graphical tools for viewing time series data

Point time series
Longitudinal profiles (animated)

Editing capabilities –
copy to-from e.g. Excel



Historical event at Torwinny, Scotland

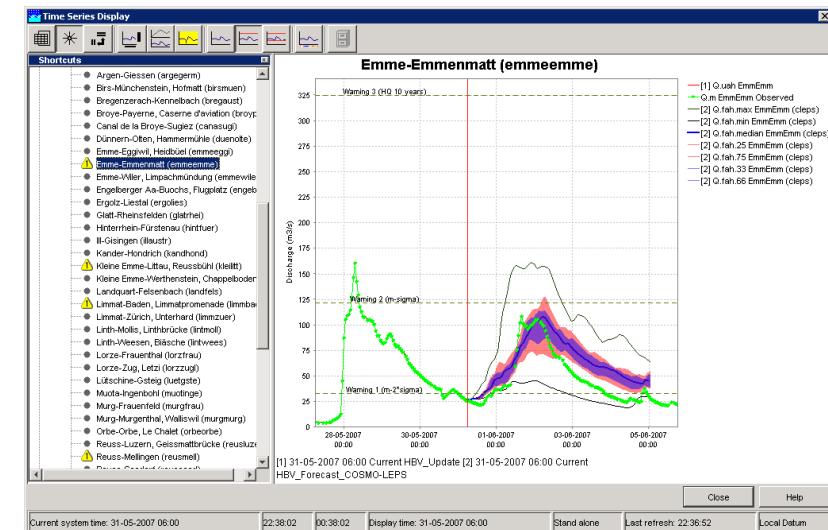
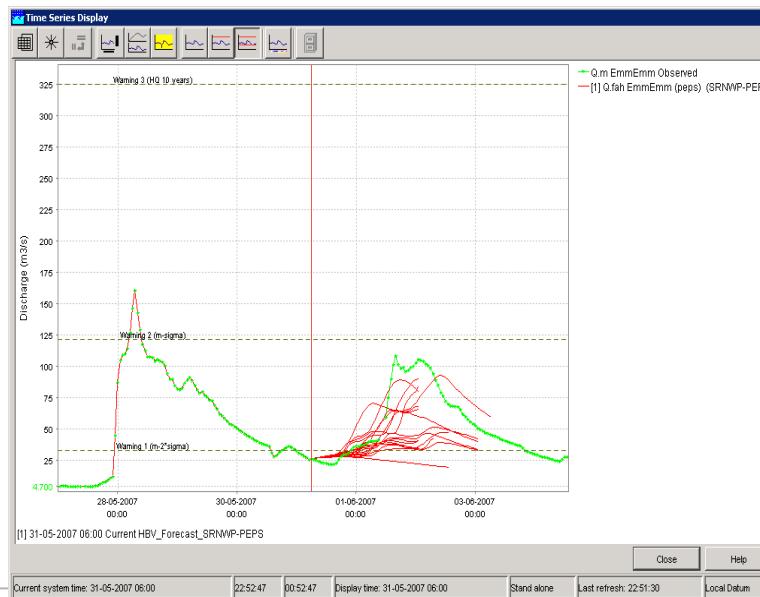
Longitudinal Display

Deltares

Using and displaying probabilistic data

Delft FEWS database model is inherently ensemble aware

- Import ensemble data (e.g. ECMWF, COSMO-LEPS)
- Run models for ensemble members
- results
 - statistical summary
 - verification

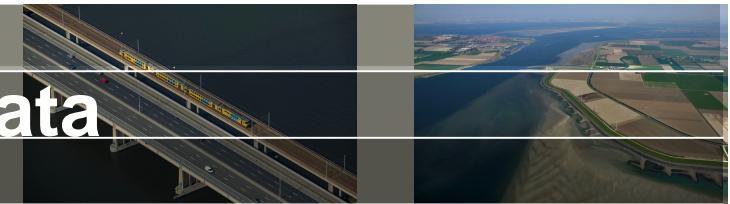


FEWS-CH:
COSMO-LEPS Forecast for 31-05-2007 00:00 UTC

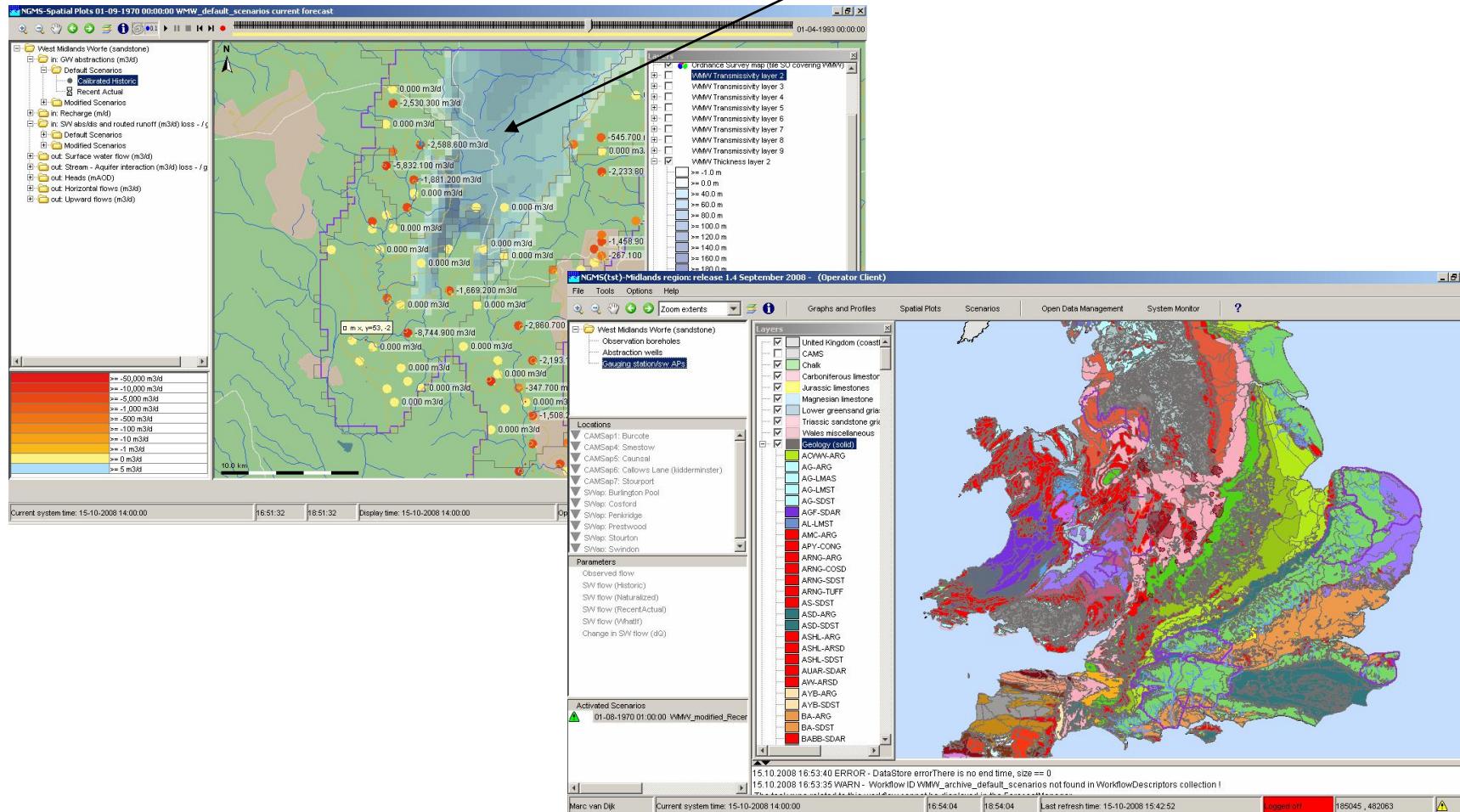
FEWS-CH:
SRNWP-PEPS Forecast for 31-05-2007 00:00 UTC

Deltares

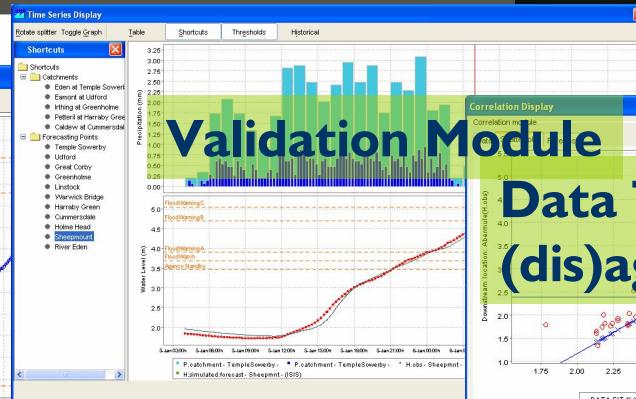
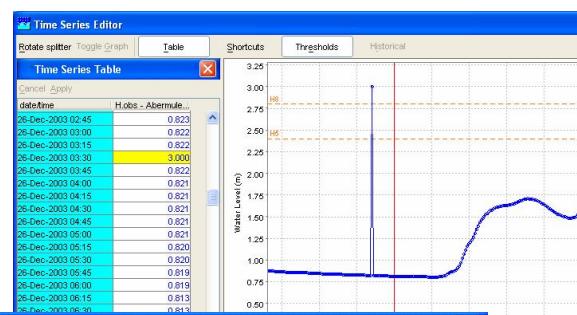
Data visualisation – Spatial Data



Animate Flood Inundation Map

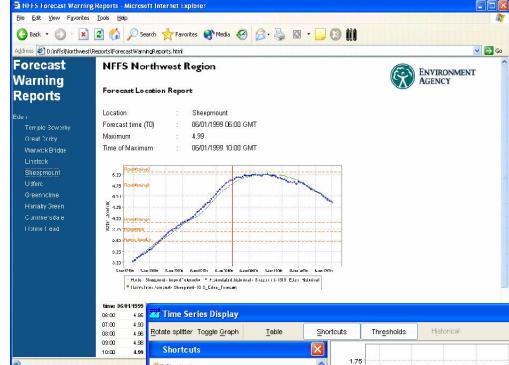


Data Management



Data Transformation and (dis)aggregation Module

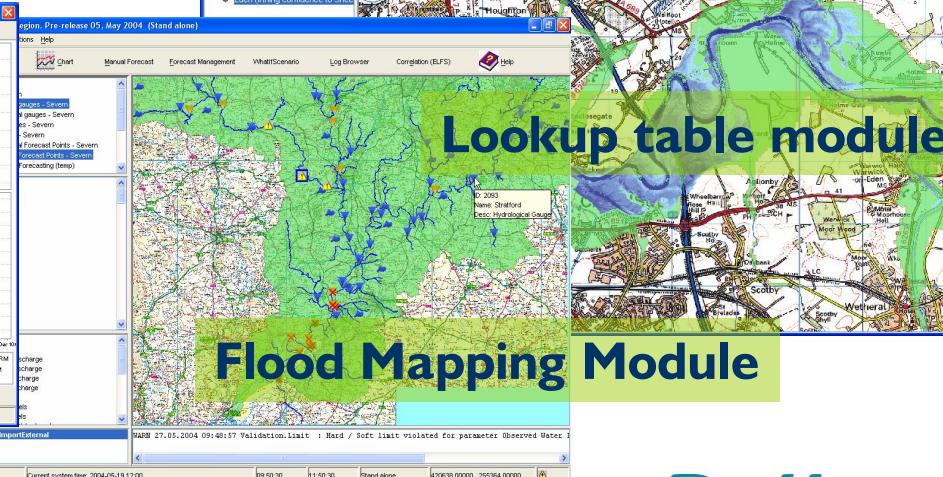
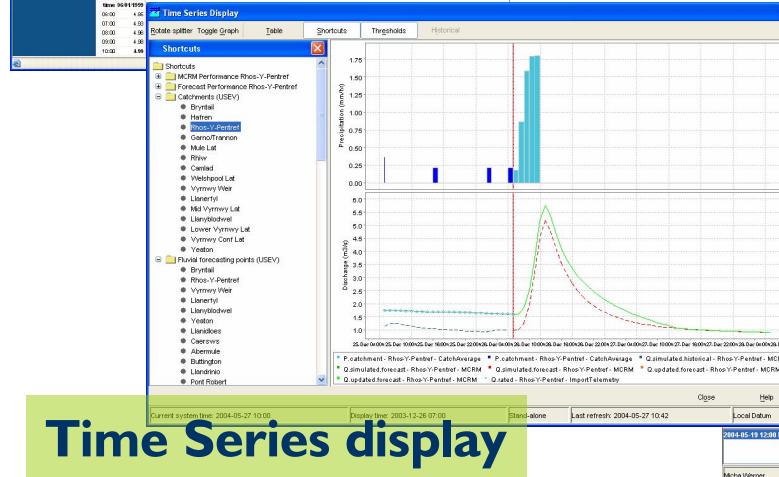
Coastal Status Report for North Kent Forecasting - Microsoft Internet Explorer



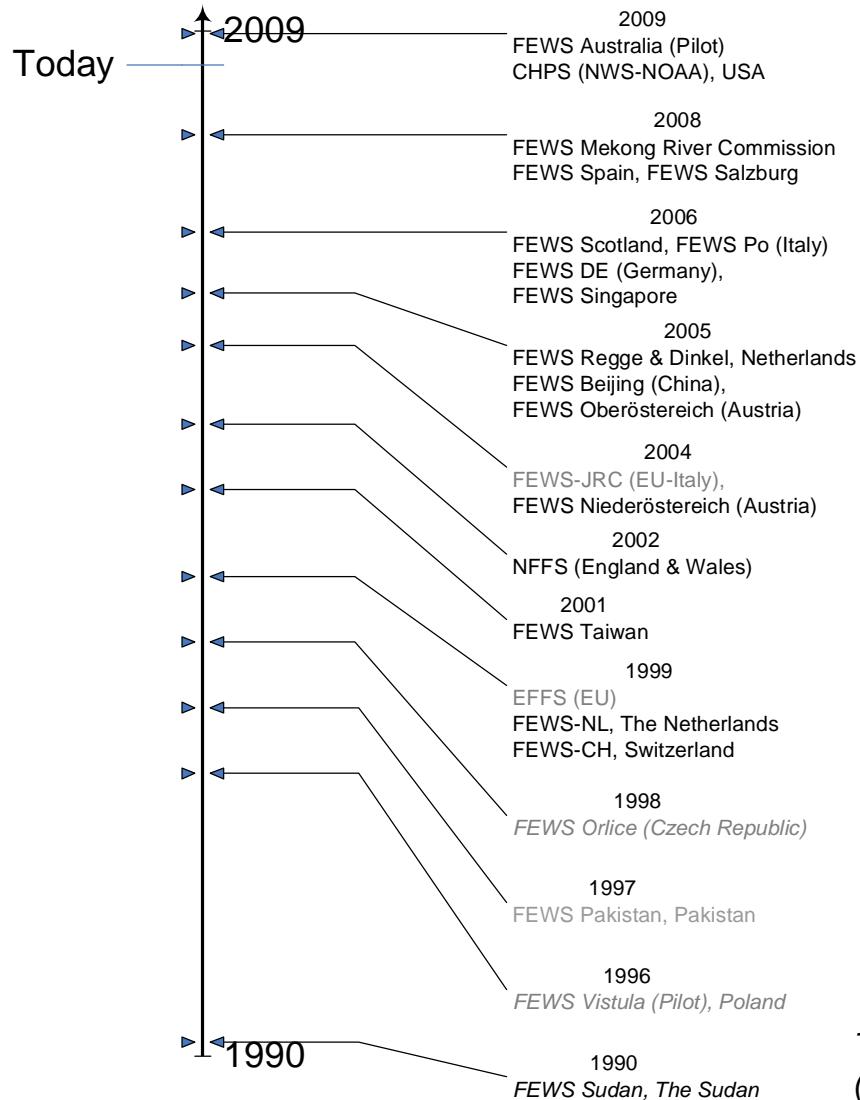
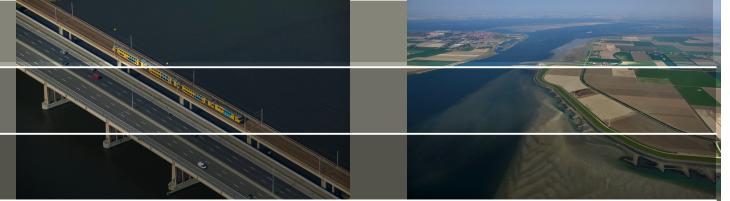
Current system time: 2004-09-09 08:15
Display time: 1999-01-06 04:00
Stand-alone just refresh

Correlation Module

HTML Report Module



Track record



Timeline of FEWS Implementations
(Grey indicates these are not operational)

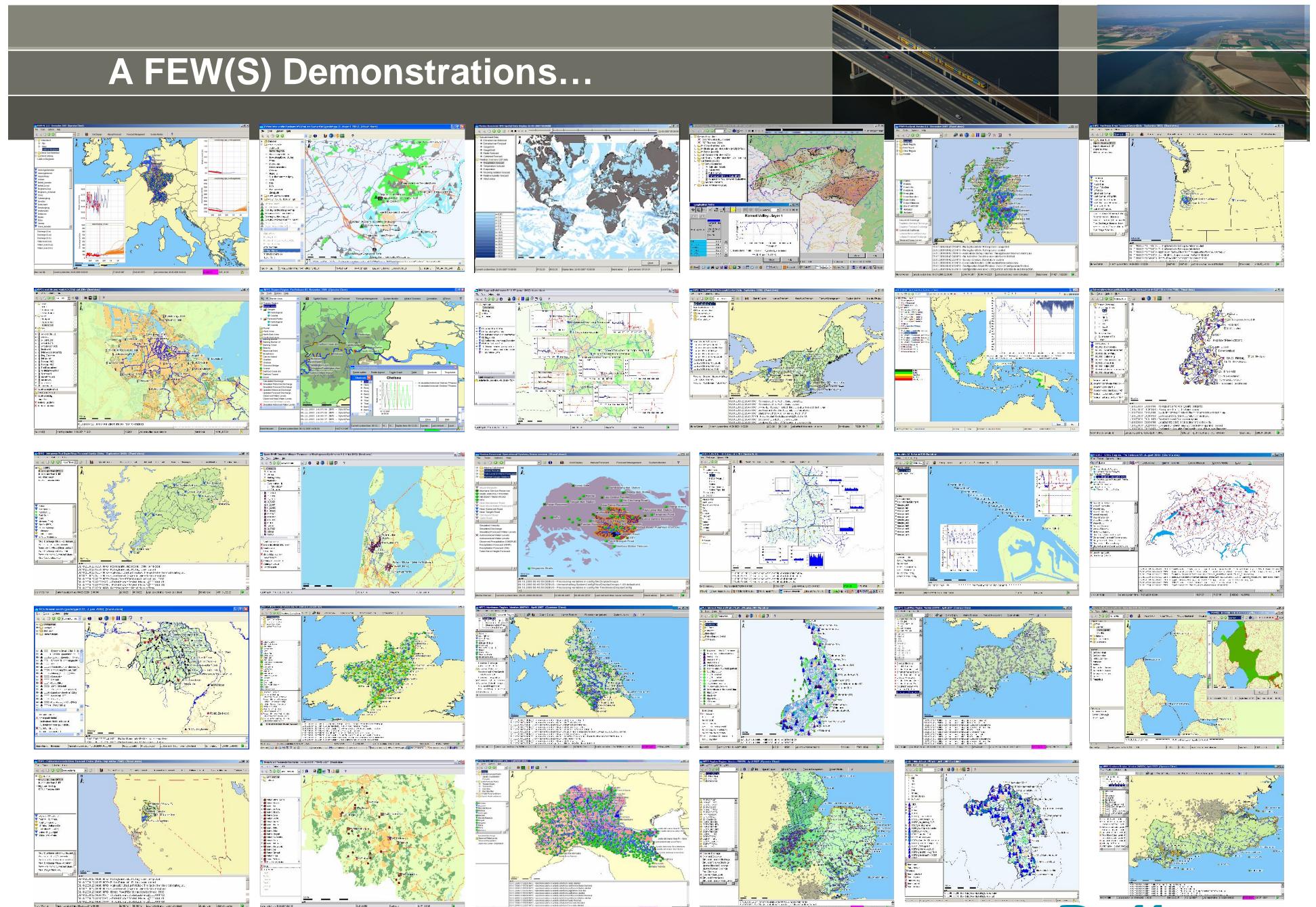
Deltires – Delft Hydraulics has extensive track record in operational forecasting

Key Milestones

- FEWS Sudan – 1992
- FEWS Pakistan – 1998
- EFFS – 1999 to 2003
- National Flood Forecasting System (England & Wales) – 2002
- FEWS-Rhine & Meuse (NL, CH, DE) 2003
- FEWS Donau (NOE, OOE), Salzburg
- Community Hydrological Prediction System (CHPS) – NWS-NOAA, USA 2009 – *in development*
- FEWS Australia (Pilot) 2009

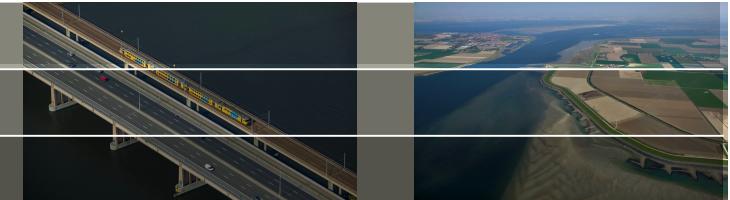
Deltires

A FEW(S) Demonstrations...



Deltares

Uncertainty Estimation



UK Environment Agency Science Report 2009, SR SC080030

Risk-based Probabilistic Fluvial Flood Forecasting for Integrated Catchment Models (Phase 2)

Aim: Develop and test practical probabilistic methods to quantify and reduce uncertainties in fluvial flood forecasts

Tested uncertainty estimation techniques during case studies:

- Forward Uncertainty Propagation methods
 - > for rainfall inputs, rainfall-runoff model parameters, rating curves
- Data Assimilation
 - > adaptive gain, ensemble Kalman Filter
- Forecast Calibration (Conditioning)
 - > quantile regression, Bayesian Model Averaging

Uncertainty Estimation

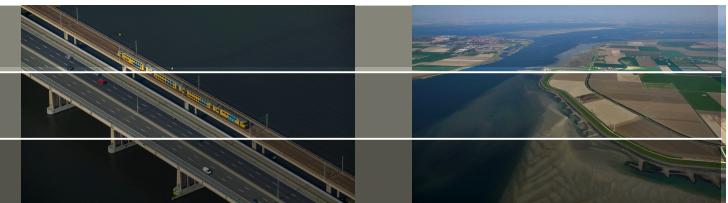


Table 5.2 Summary of Factsheets and NFFS Configurations

Case Study	Configuration	Factsheet	Type of Method	Method
Upper Calder	C1	C1	FUP	STEPS rainfall forecasts – 2 events in 2008
	C2	C2	FUP	Rainfall inputs
	C3	C3	FUP	Model parameters
	C4	C4	C	Quantile Regression
	C5	C5	C	Bayesian Model Averaging
Lower Eden	E1	E1	FUP	Rating curve uncertainty
	E2	E2	FUP	Rating curve uncertainty
	E3	E3	R	Existing operational model
	E4	E4	DA	Adaptive gain
	E5	E5	DA	Ensemble Kalman Filter
	E6	E6	R	Emulation of ISIS outputs
	E7	E7	Statistical+DA	Data Based Mechanistic
Ravensbourne	R1	R1	FUP	Rainfall inputs
	R2	R2	FUP	Model parameters
	R3	R3	FUP	Combined inputs
	R4	R4	C	Quantile Regression
Upper Severn	S1	S1	FUP	Rainfall inputs
	S2	S2	FUP	Model parameters
	S3	S3	FUP	Rating curve uncertainty
	S4	S4	DA	Adaptive gain
	S5	S5	DA	To be completed
	S6	S6	C	Quantile Regression
	S7	S7	R	Emulation of ISIS outputs
	S8	S8	Statistical+DA	Data Based Mechanistic
Other	-	G1	R	Fast Infosets and Binary XML
	-	G2	FUP	Forward Uncertainty Propagation
	-	G3	Statistical+DA	DBM modelling

Development generic data assimilation tools



DATools-openDA

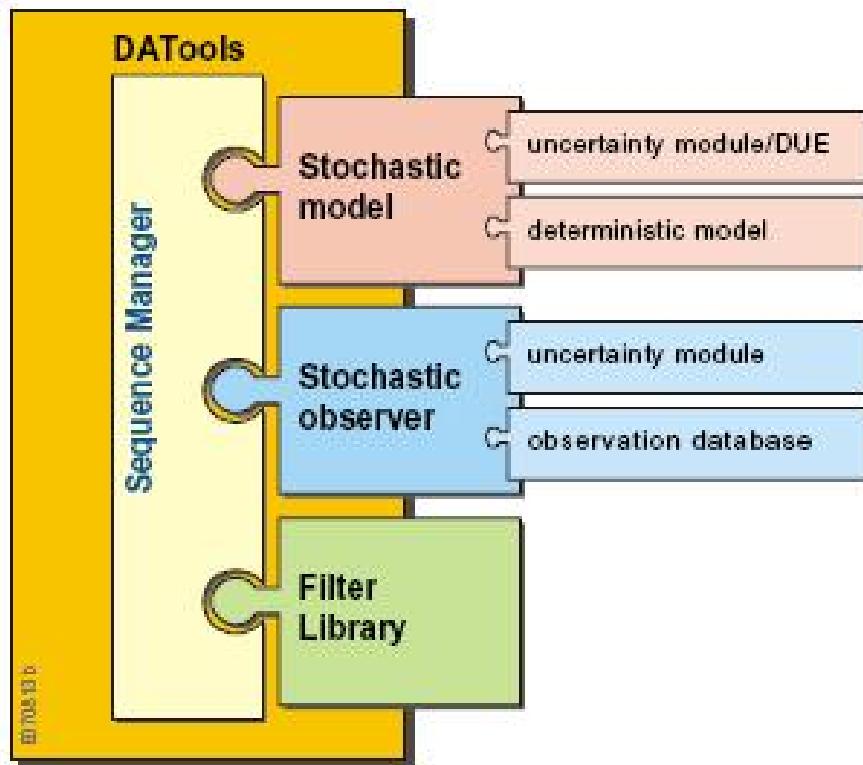
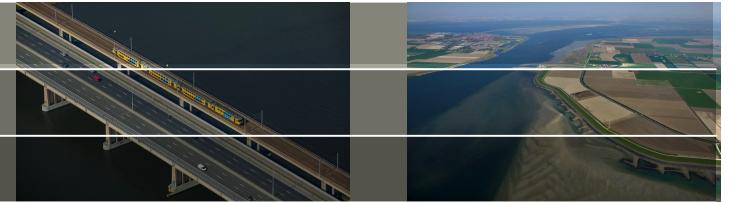
generic (open source)

Basic Idea behind:

- costs: the development and implementation of DA methods is very time consuming and therefore expensive;
- incompatible: it is hard to reuse these data assimilation methods and tools for other models than for which they have originally been developed for.

developed for: state updating, calibration, uncertainty analysis

Overview DATOOLS - 1



Basic idea:

adjust the prior estimate of the model states

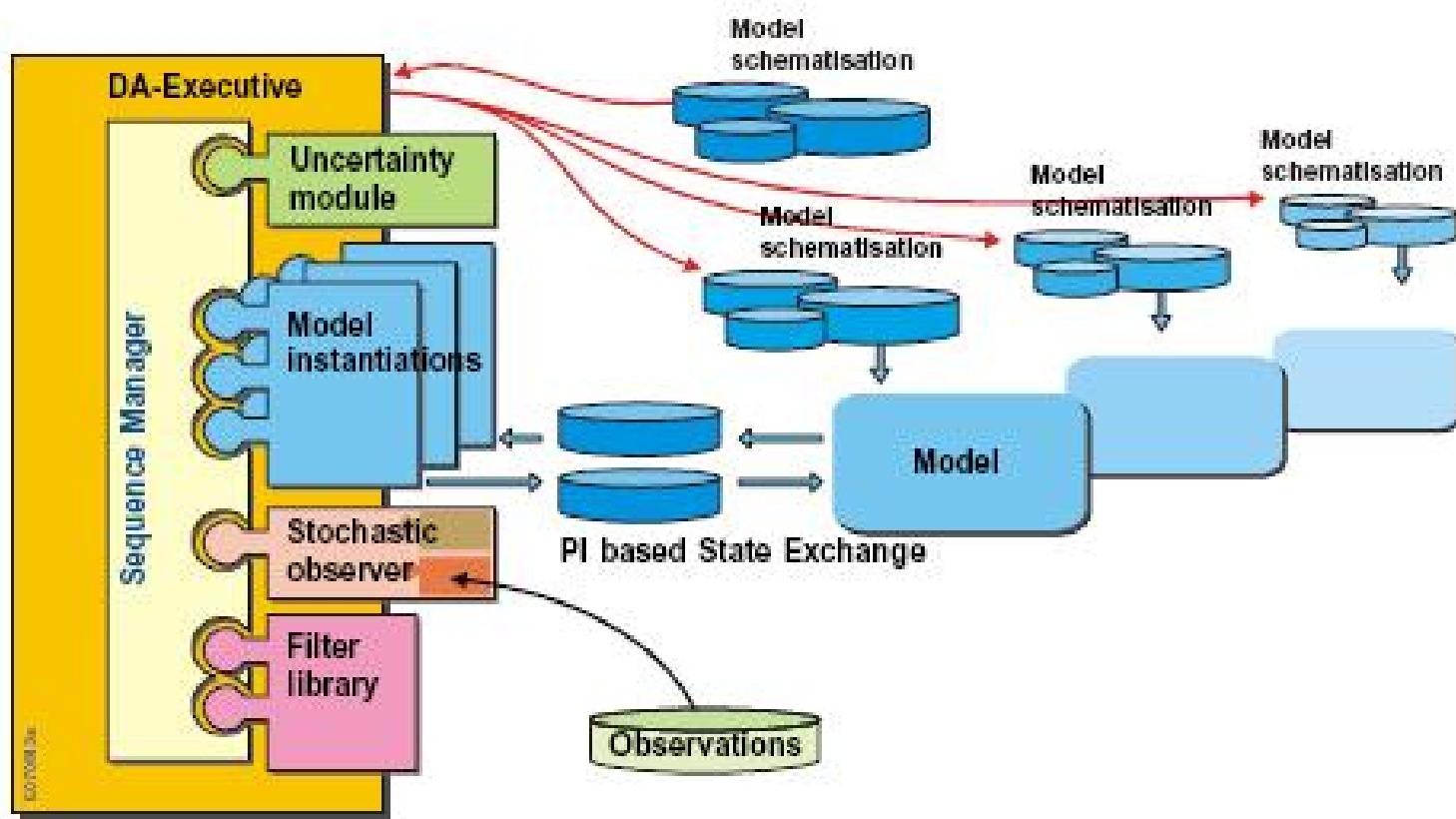
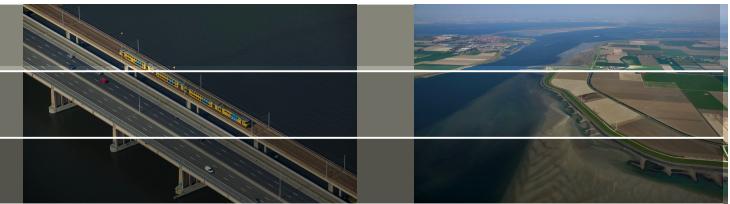
obtain prior estimates:
stochastic model with specification of input
and model uncertainty

adjust prior estimates:
include measurement uncertainty

Filter to choose from:
Ensemble Kalman Filter, Particle Filter

Deltas

Overview DATOOLS - 2



Deltas



Computers & Geosciences 36 (2010) 453–463



Contents lists available at ScienceDirect

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journal homepage: www.elsevier.com/locate/cageo

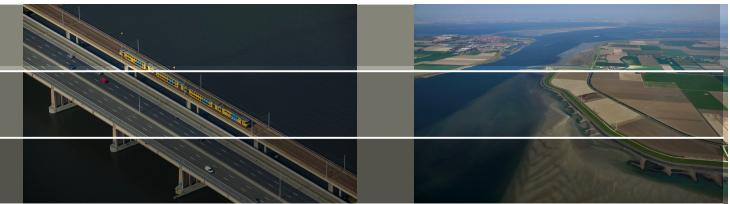
Application of generic data assimilation tools (DATools) for flood forecasting purposes

Albrecht H. Weerts *, Ghada Y. El Serafy, Stef Hummel, Juzer Dhondia, Herman Gerritsen

Deltares, P.O. Box 177, 2600 MH, Delft, The Netherlands

Deltares

GUI developments - 1



DA Tools

File

Open Project New Project Load Uncertain Items Load Results Run

Application Method Settings Uncertainty Specification (PDF) Results

Application Type:
Uncertainty Analysis

Uncertainty Analysis Method:
Monte Carlo (PDF Definition)

Uncertainty Application

Uncertainty Specification File:
C:\smhi\ihms\dat\stochmodel\uncertaintiesHBVMAAS.xml Load

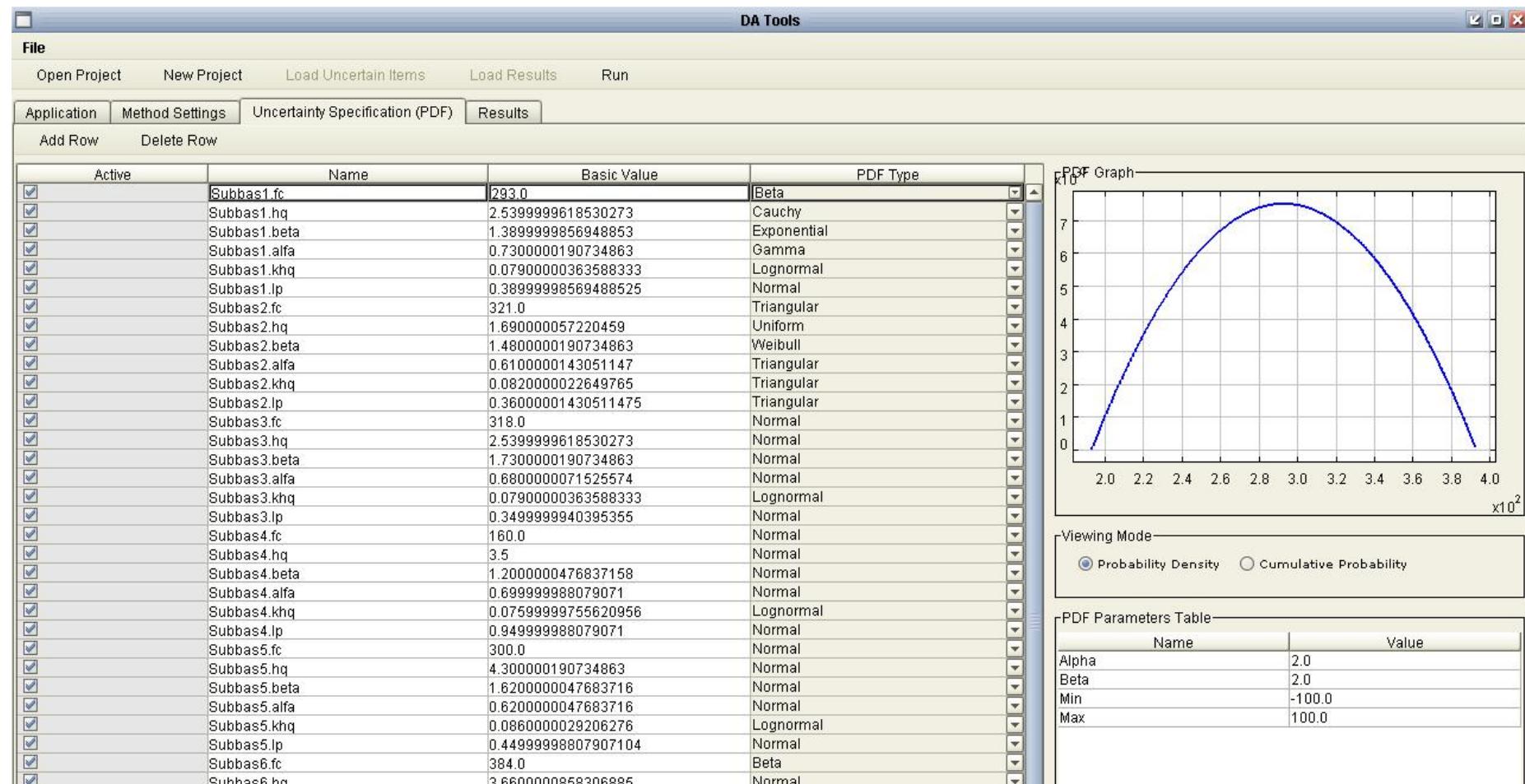
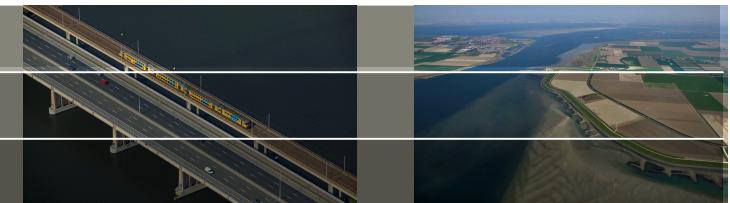
Result Selection File:
C:\smhi\ihms\dat\stochmodel\resultsSelectionHBVMAAS.xml Load

Model Schematization

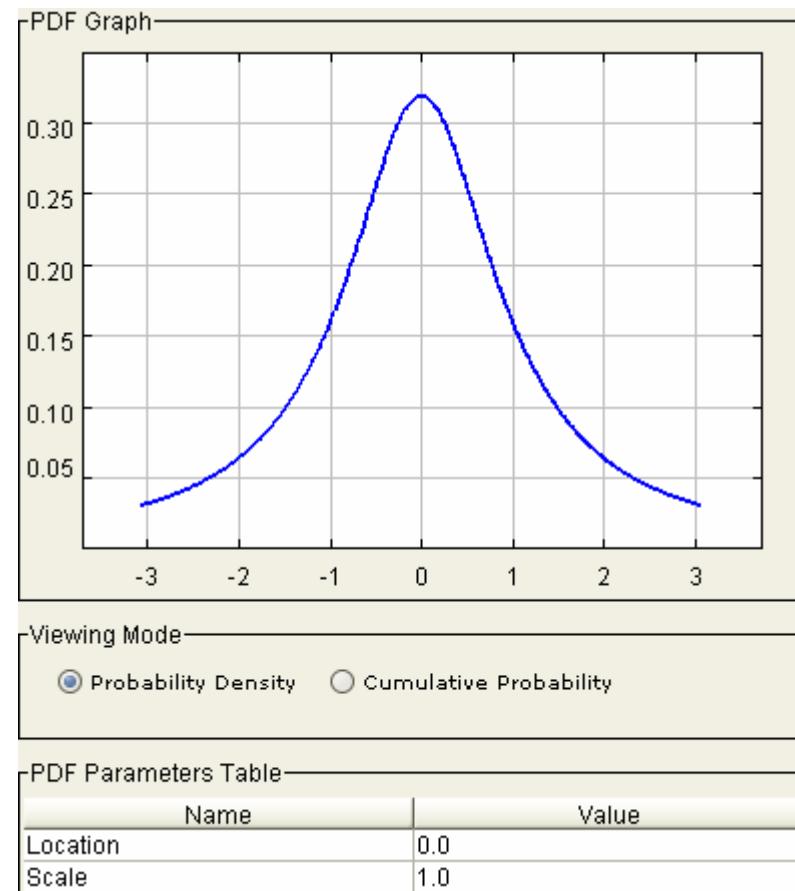
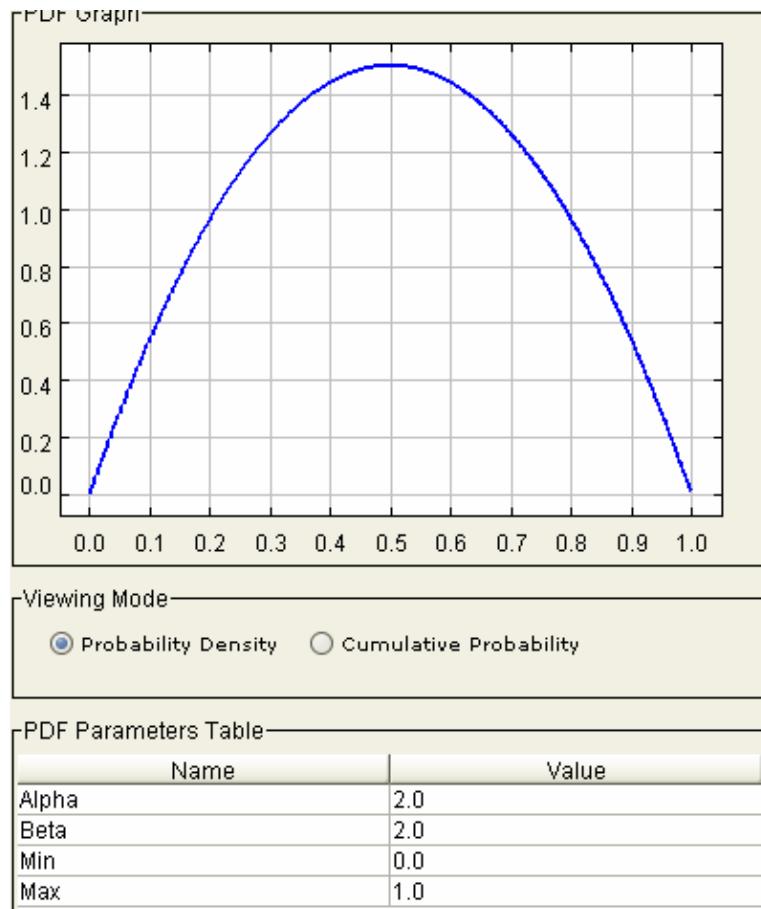
Uncertain Items:
C:\smhi\ihms\dat\stochmodel\uncertaintyMappingsHBVMAAS.xml

Results:
C:\smhi\ihms\dat\stochmodel\resultMappingsHBVMAAS.xml

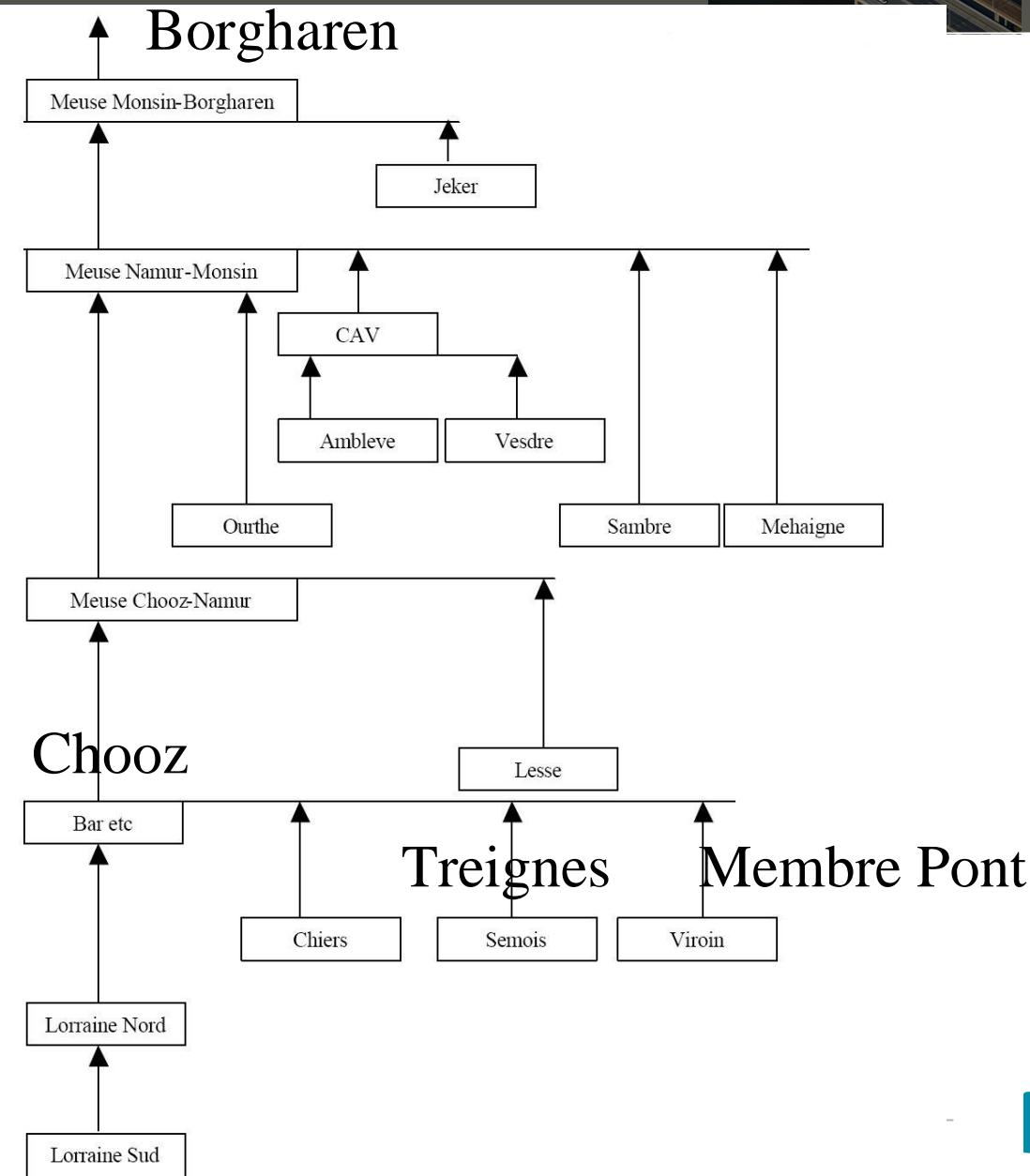
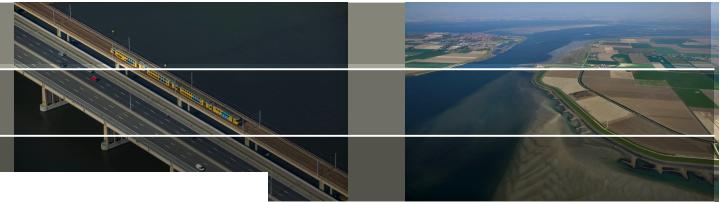
GUI developments - 2



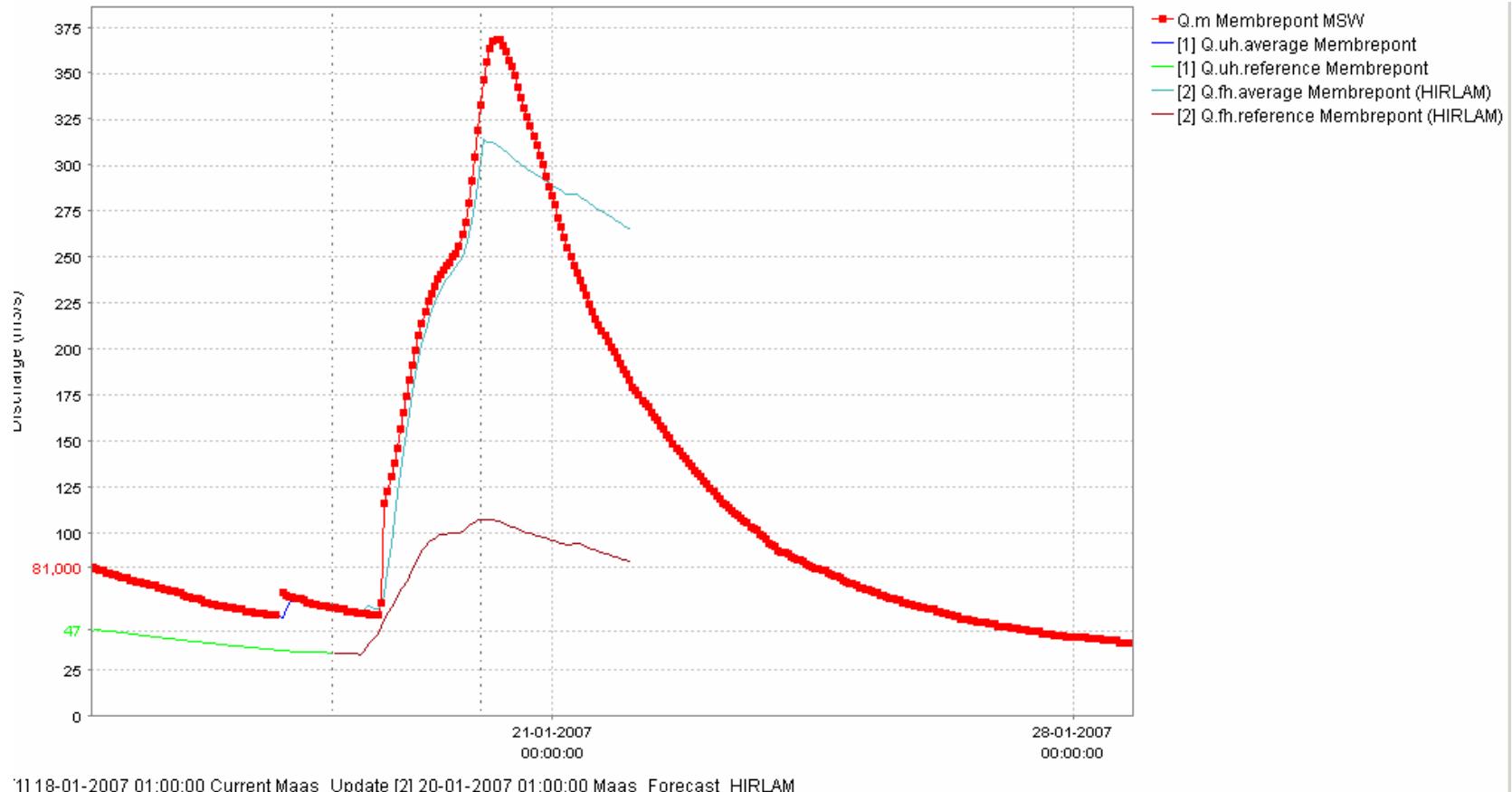
examples of distribution to choose from



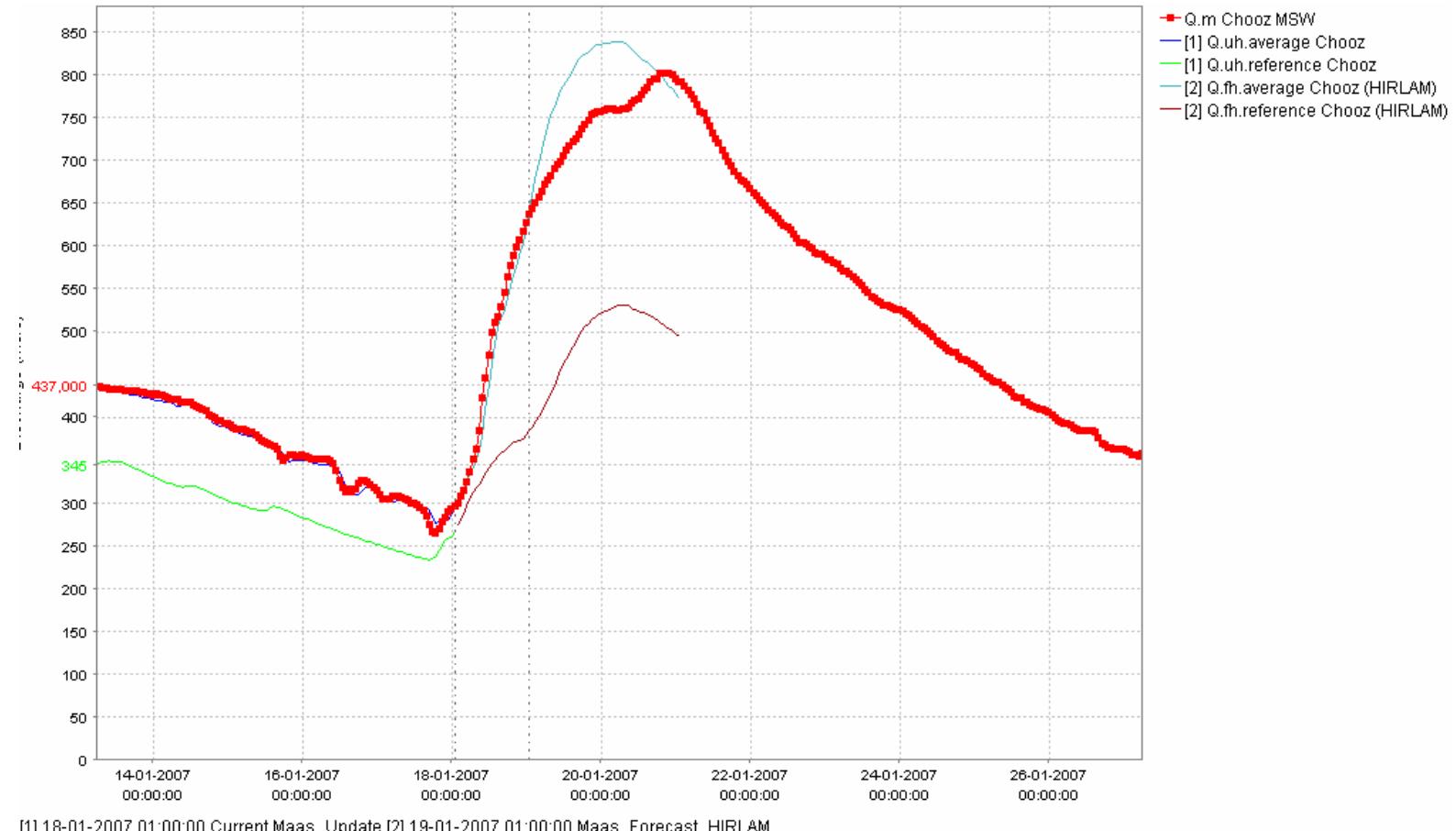
HBV Meuse example



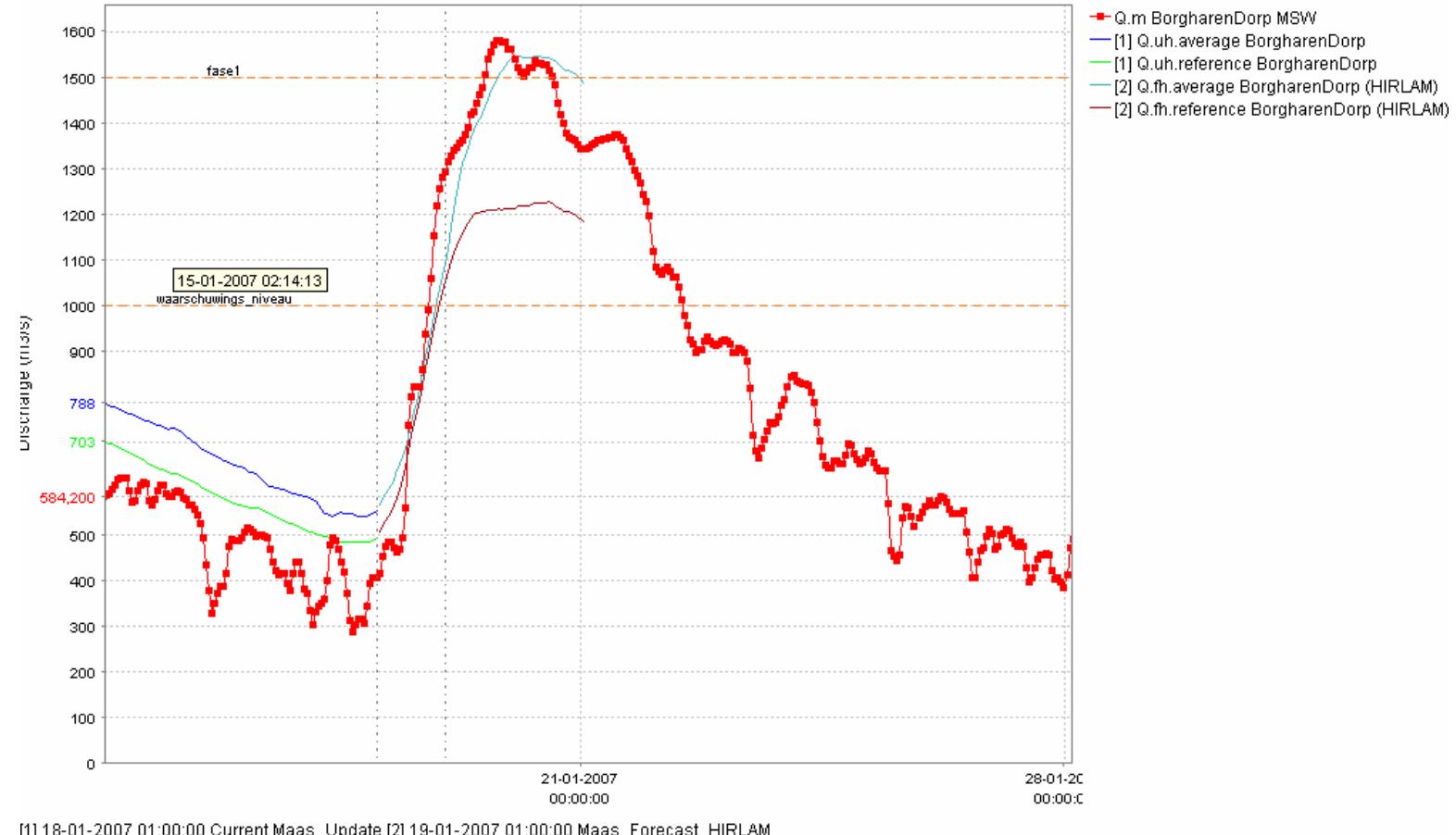
Result of EnKF filtering at Semois (Membre pont) during the forecast 20-01-2007 01:00.



Result of EnKF filtering at Bar etc (Chooz) during the forecast at 19-01-2007 01:00.



Result of EnKF filtering downstream at Meuse Monsin-Borgharen (Borgharen-Dorp) during the forecast 19-01-



Updating States SOBEK Model with EnKF



Model consist of +/- 1740 gridpoints

- many lateral inflows (+/- 60)
- tributaries are AR-error corrected when measurements are available
- Measurement Maxau-Lobith:

Speyer, Worms, Mannheim, Mainz, Kaub, Andernach, Bonn, Koln,
Dusseldorf, Ruhrort, Wesel, Rees, Lobith

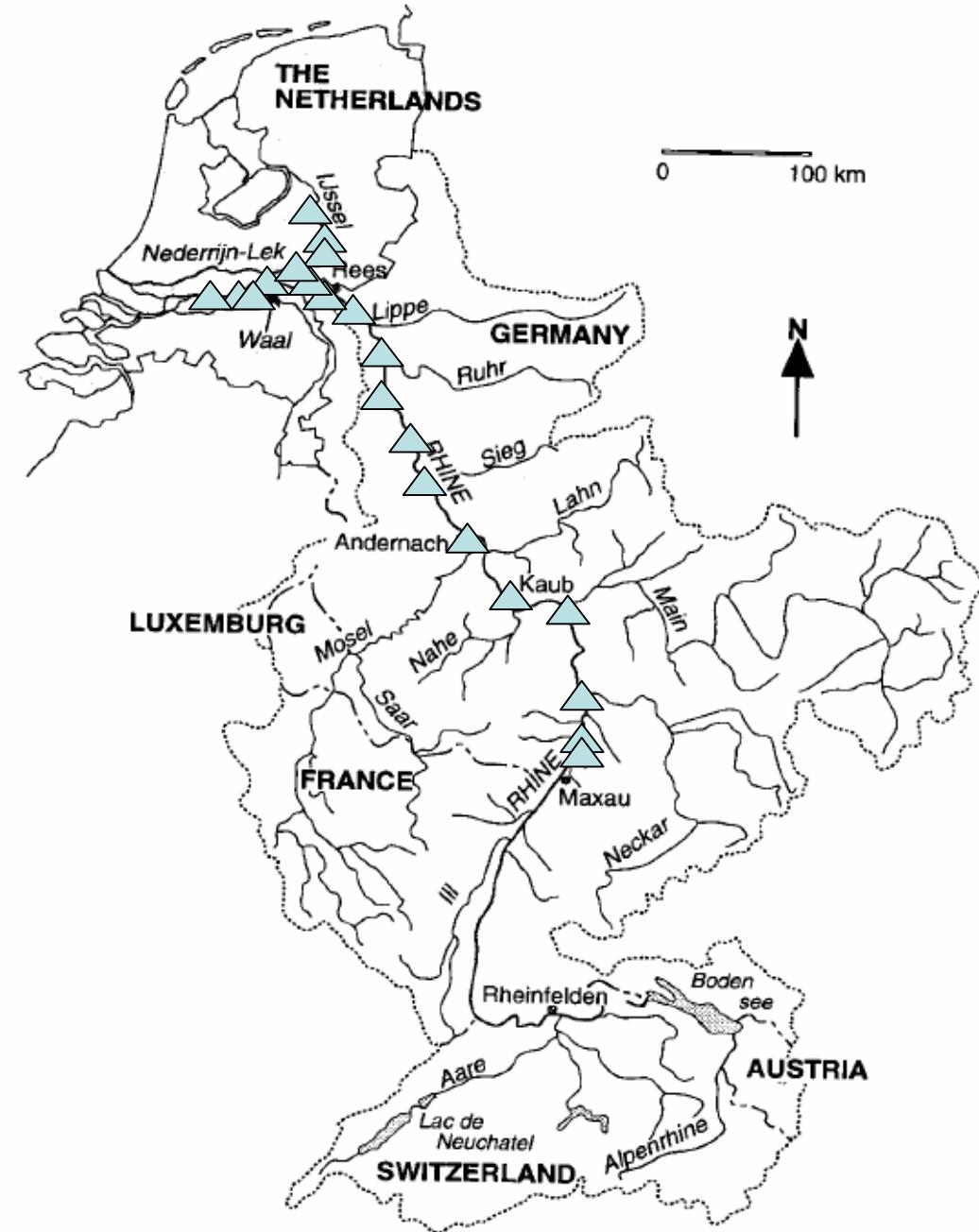
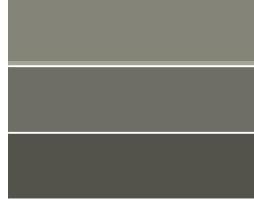
- Measurement Lobith-Rhine branches:

IJssel: Doesburg, Zutphen, Olst, Kateveer

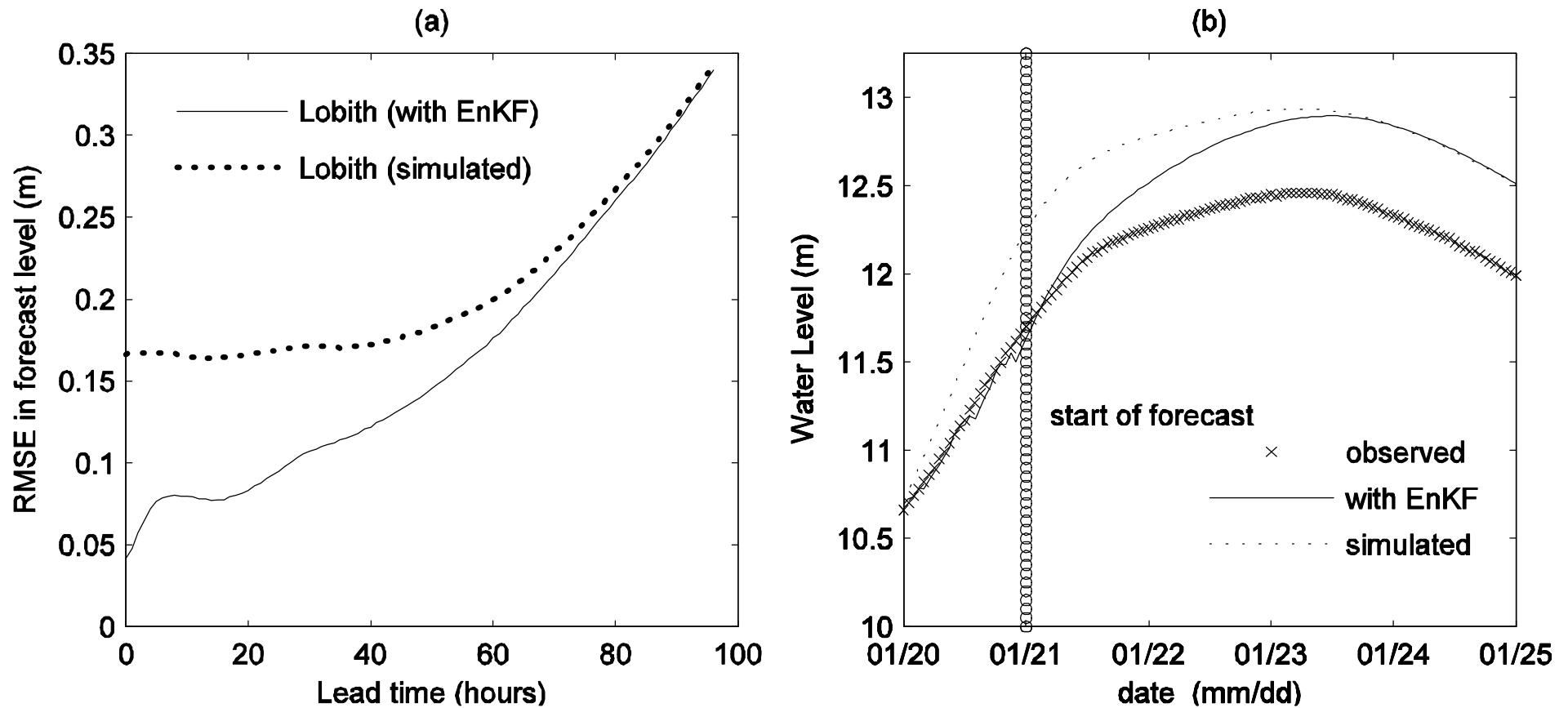
Waal: Nijmegen, Dodewaard, Tiel, Zaltbommel

Pannerdensch Kanaal: IJsselkop

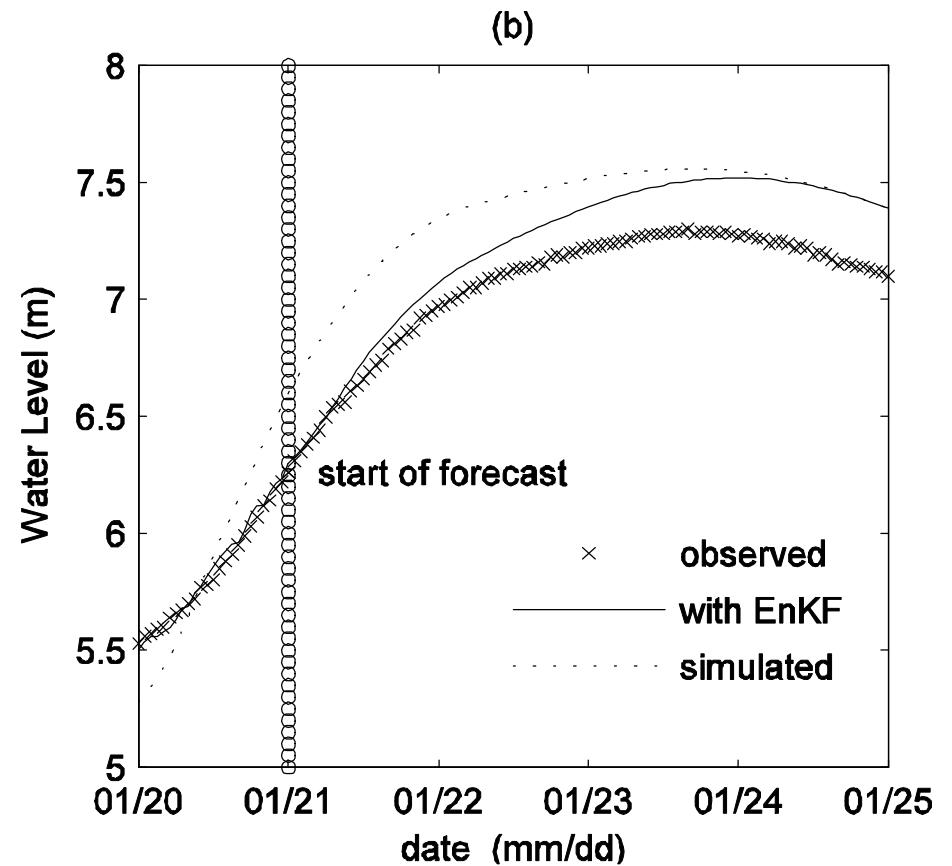
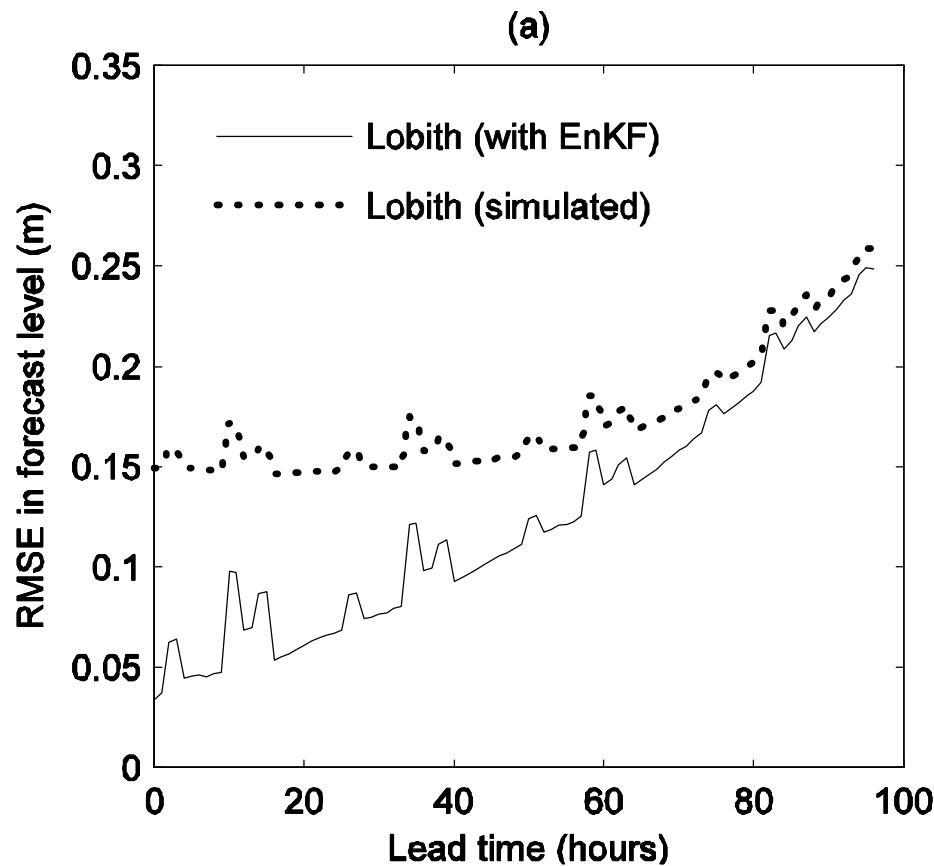
Nederrijn: -



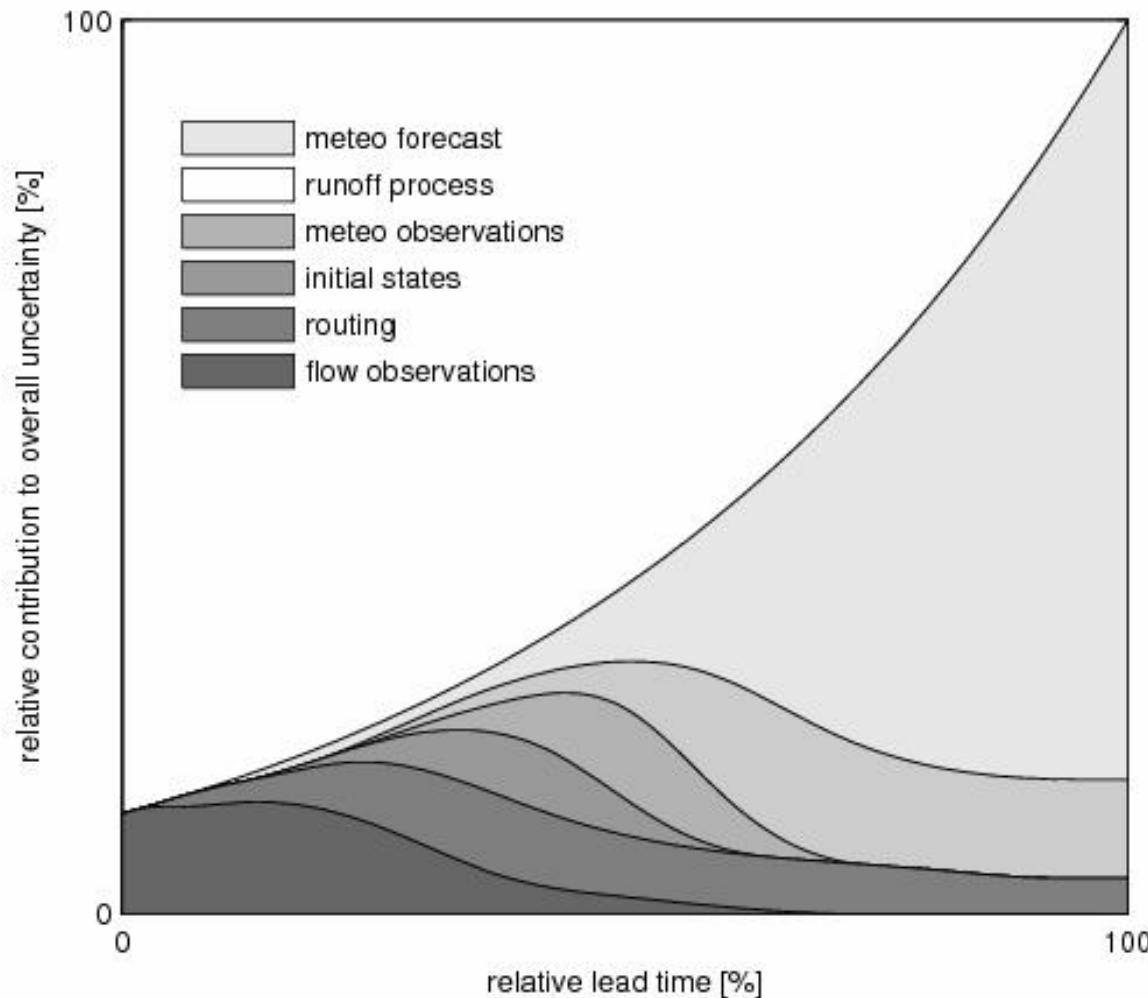
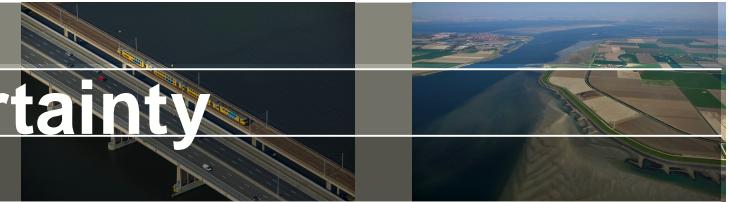
Results at Lobith over 2 year hindcast (2006/2007)



Results at Tiel (Waal) over 2 year hindcast (2006/2007)

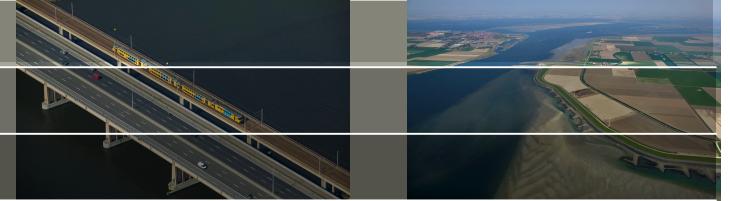


Relative contribution to uncertainty



Dominant source will differ with e.g. lead time

Post Processing Forecasts



Bayesian Processor of Output

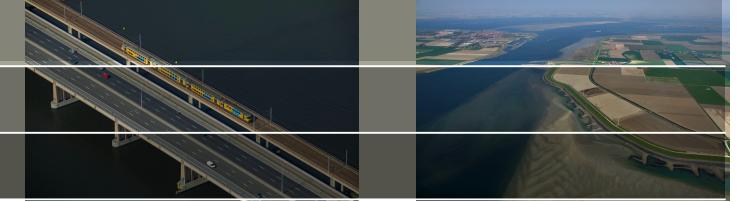
- Condition a single or ensemble forecast using a prior and likelihood (both derived from past performance) to remove of biases etc to derive the predictive uncertainty!!!!

Bayesian Model Averaging

- Merge different forecast into a single forecast based on their past performance (weighing) and derived an uncertainty band

**Predictive uncertainty is what we / the forecasters
are really interested in!**

Uncertainty Estimation



Bayesian Model Averaging (BMA)

- applicable to a set of competing forecasts:
 - > different hydrological / hydrodynamical models
 - > different sets of input data (meteorological ensemble forecasts)
- evaluates the uncertainty of an ensemble forecast in a training period prior to the present forecast
- historical model forecasts are compared with observations
- produces a weighted overall probabilistic forecast with confidence limits
- determines a correction for the bias

Example BMA

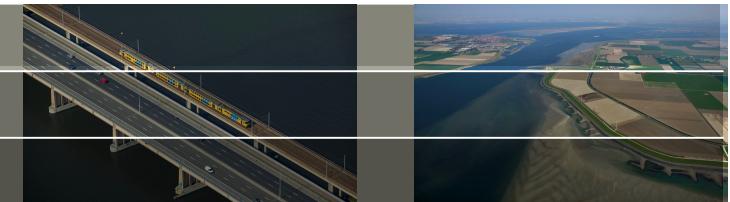
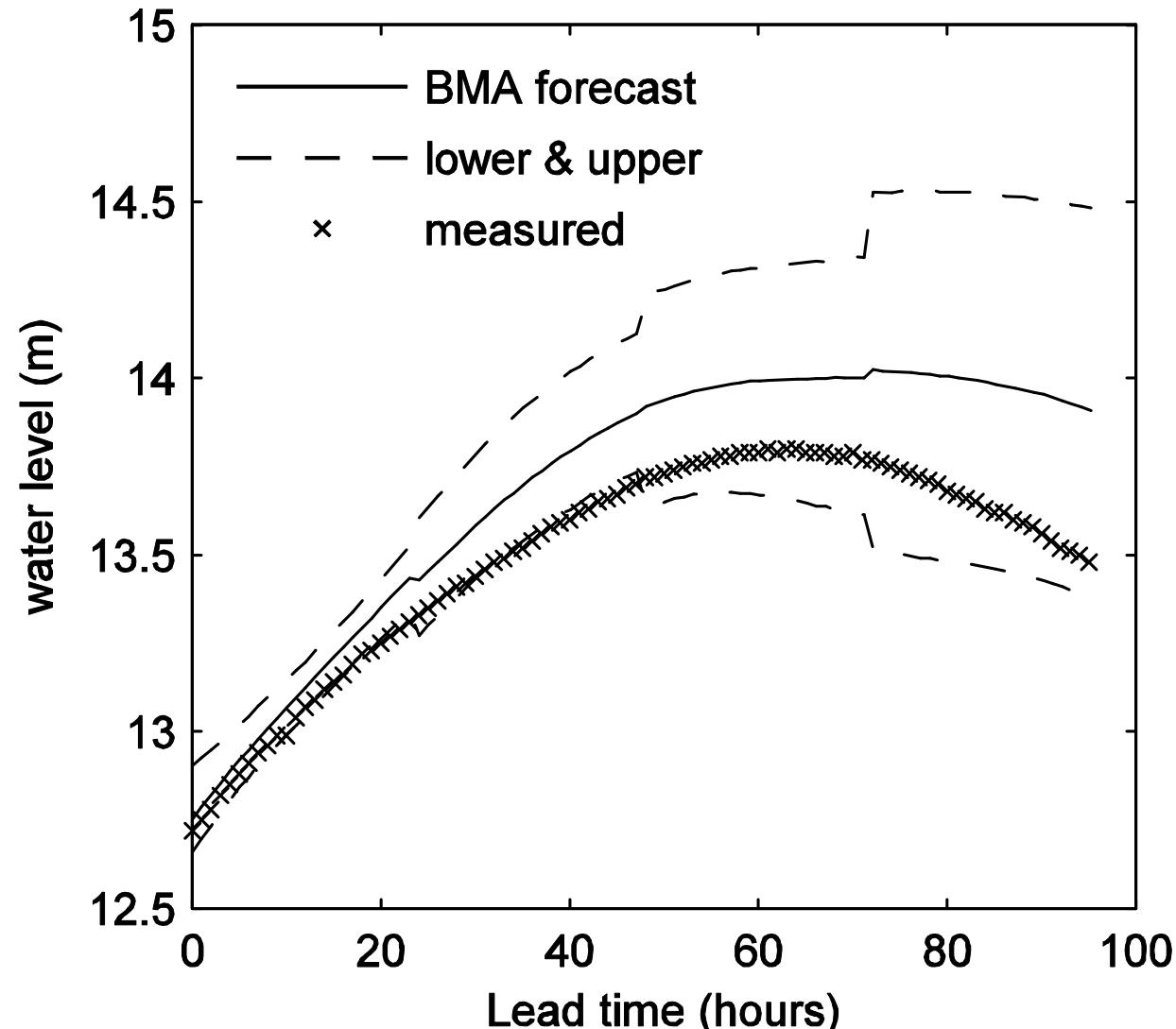
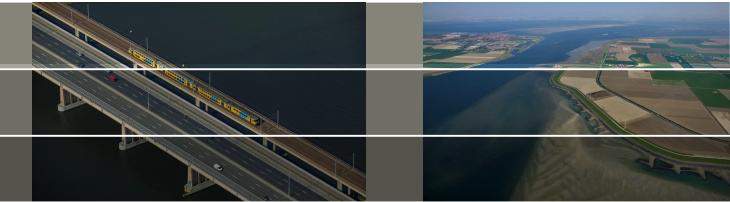


Table 1: RMSE of the individual forecast models and the BMA mean forecast for different lead times, with the lowest RMSE's highlighted in yellow. All calculations used a training period of 28 days.

Forecast	Meteorological input	Hydrological/hydraulic model	RMSE (24-48 hrs)	RMSE (48-72 hrs)	RMSE (72-96 hrs)
1	HIRLAM	HBV	0.252	0.329	0.428
2	ECMWF	HBV	0.249	0.313	0.379
3	DWD-LM	HBV	0.249	0.302	0.347
4	DWD-GME	HBV	0.249	0.306	0.345
5	HIRLAM	HBV/SOBEK	0.196	0.258	0.381
6	ECMWF	HBV/SOBEK	0.196	0.250	0.340
7	DWD-LM	HBV/SOBEK	0.195	0.238	0.314
8	DWD-GME	HBV/SOBEK	0.195	0.239	0.303
9	LobithW (statistical model)		0.176	0.250	0.366
BMA mean forecast			0.179	0.235	0.307

Example BMA



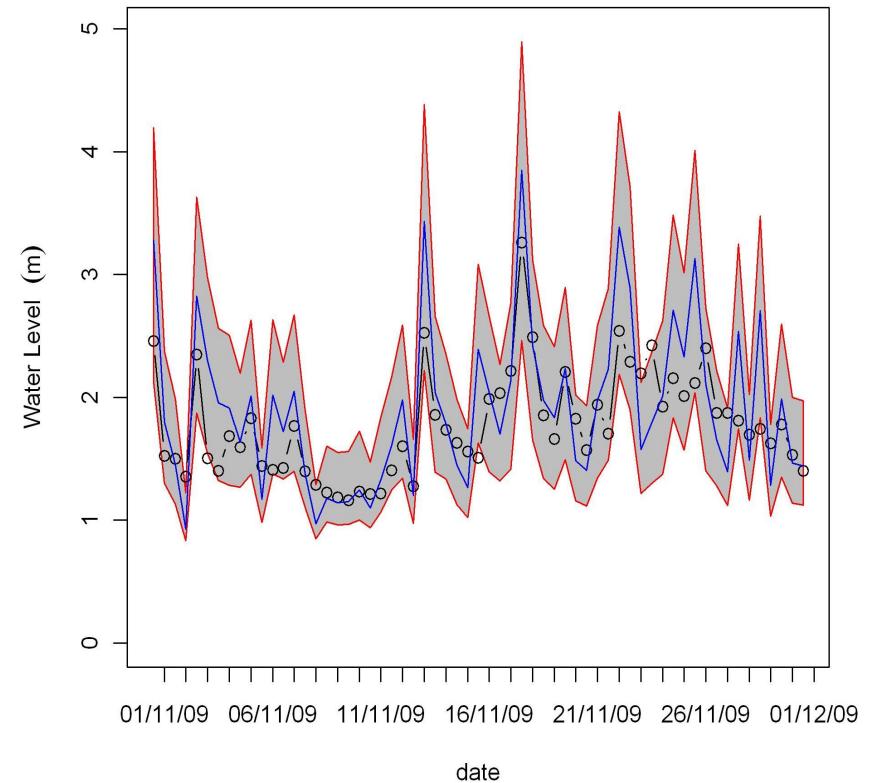
Uncertainty Estimation



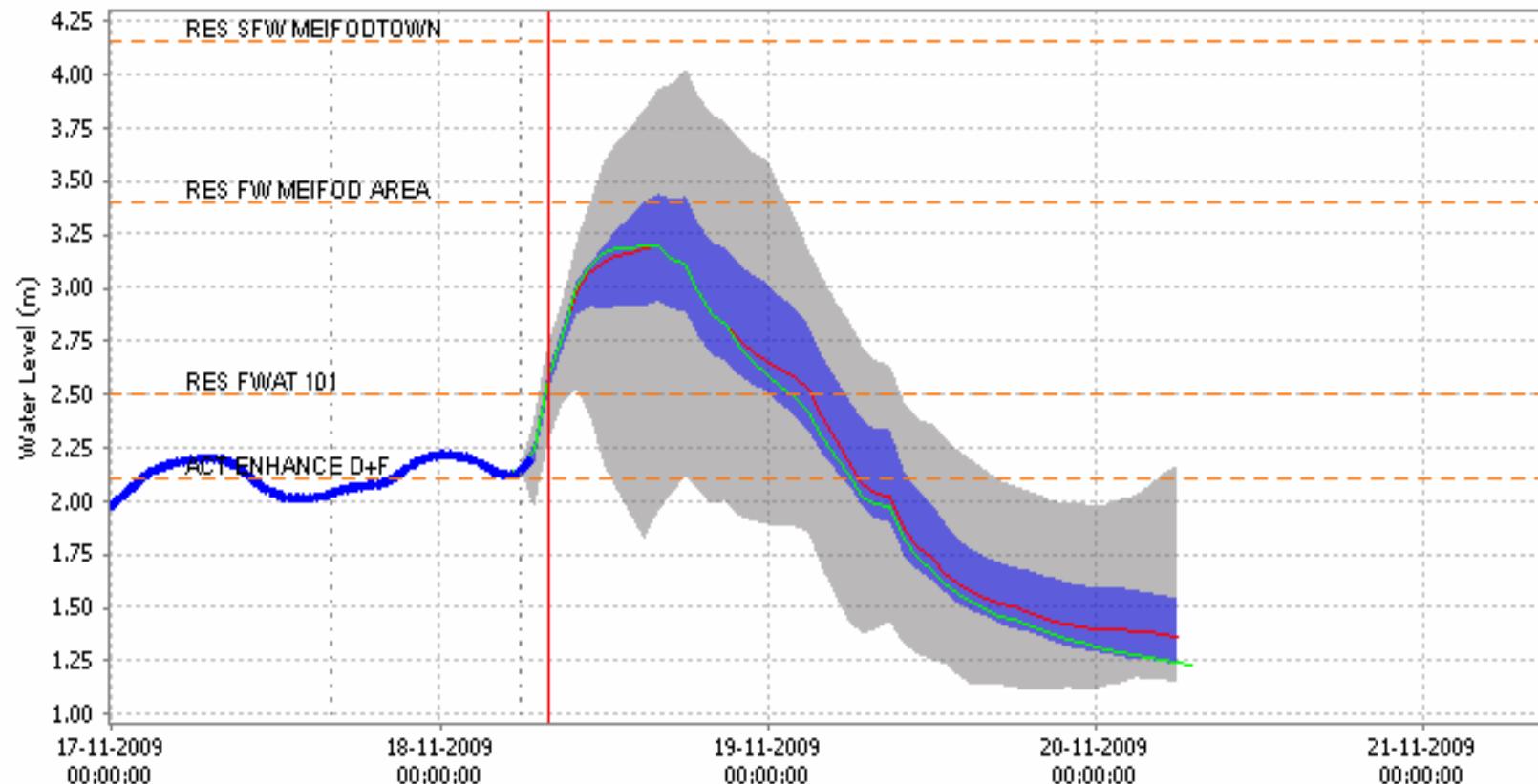
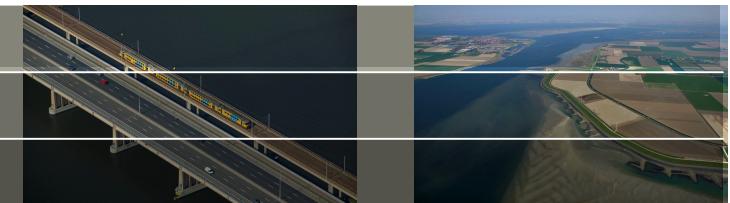
Quantile Regression

- Method for estimating of conditional quantiles
- Estimation of the Cumulative distribution function (CDF) of a forecast error conditioned by the value of the present simulated river levels
- promising results
- easy to implement, developed in R
- stage-discharge uncertainties can be taken directly into account
- needs calibration, long time series necessary for reliable results
- only possible at locations, where observations are available

90% confidence interval 2077_24 hour leadtime

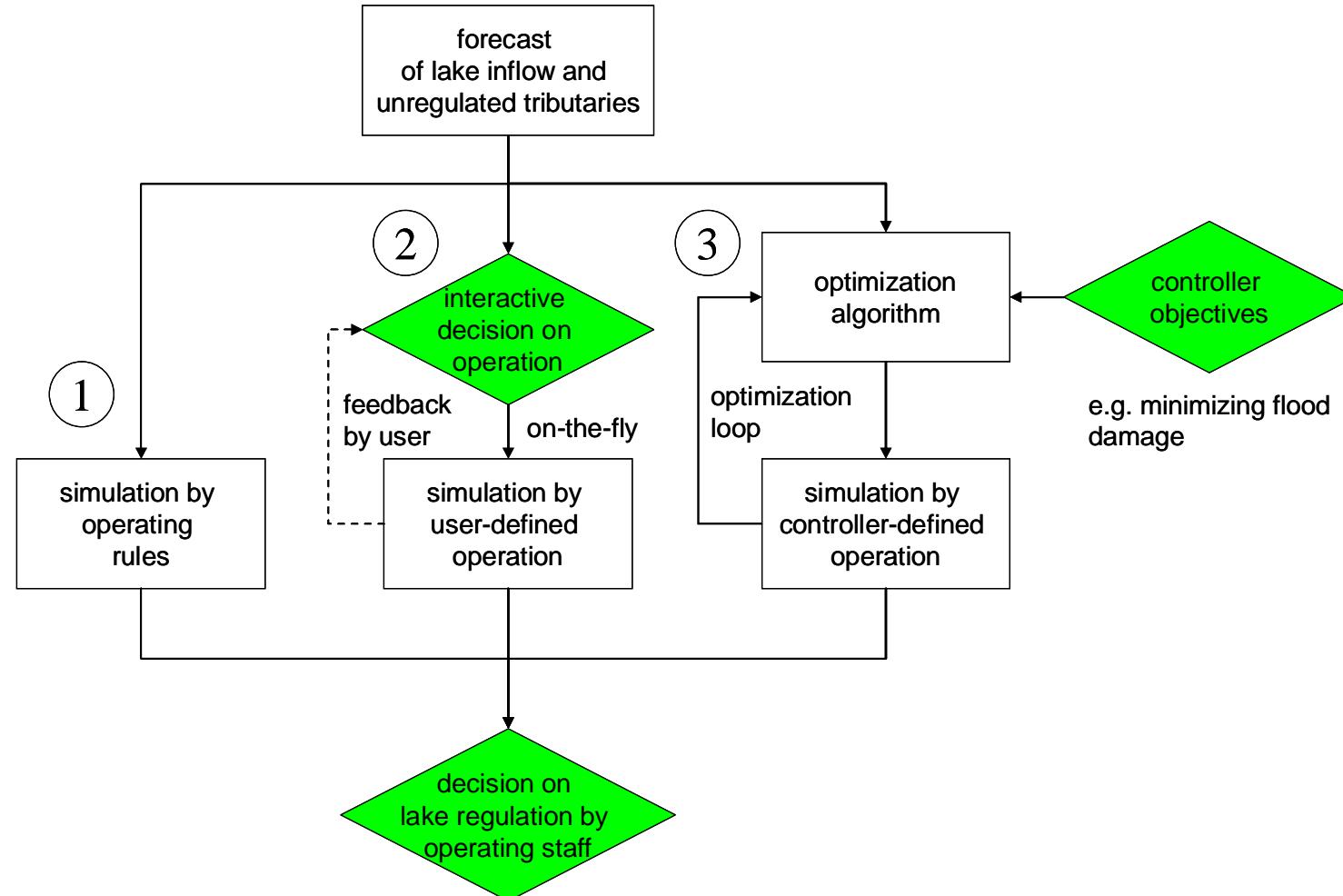
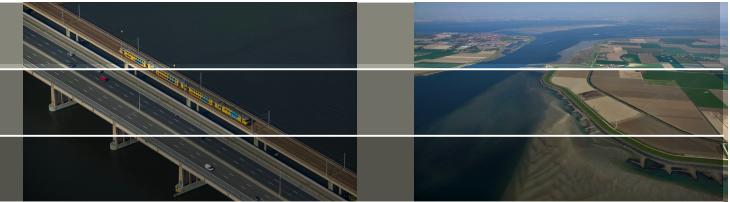


Example Visualisation

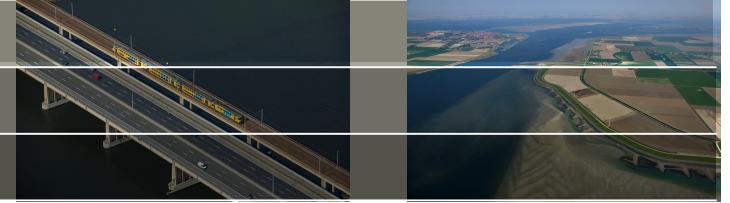


[1] 17-11-2009 16:00:00 Current Fluvial_Historical [2] 18-11-2009 06:00:00 Current Severn_Usev_Forecast

Operational Decision Support



Real Time Control Tools



RTCTools – a novel framework for supporting real-time control

includes:

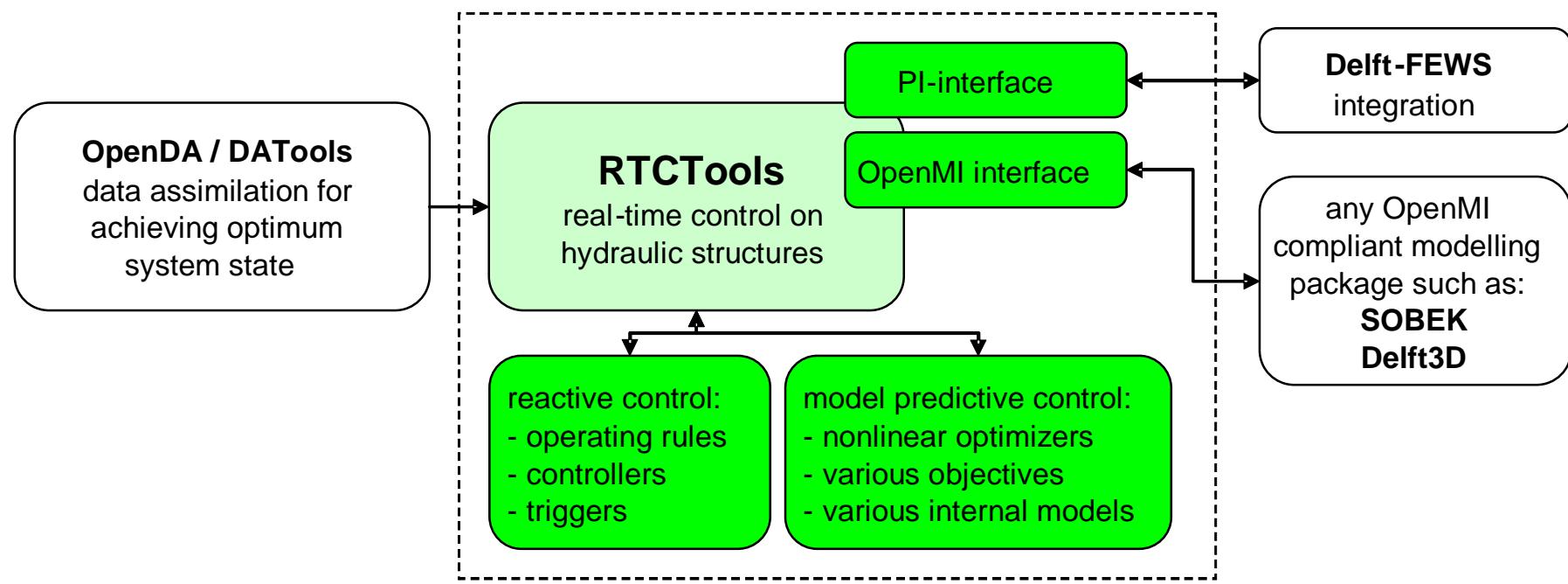
- collection of operating rules for reservoirs
- simple reactive controllers for hydraulic river structures (e.g. PID-controller)
- several sophisticated model predictive controllers, e.g.
 - internal models for pool routing in reservoirs
 - flood routing in rivers and imbedded structures
- logical rules for (de)activating sets of rules / controllers

OpenMI interface

OpenMI: Open Modelling Interface, a standard for the exchange of data between computer software in environmental management

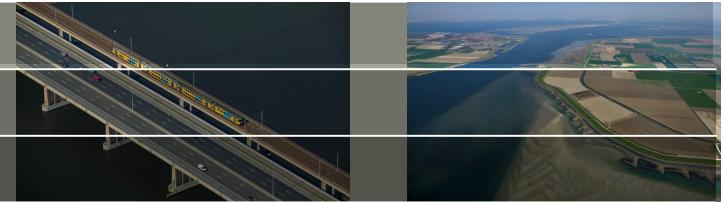
www.openmi.org

Real Time Control Tools - architecture



Delft-FEWS

Ongoing projects in predictive control



- SDWA MOMRO, Singapore
Short-term and medium-term control of reservoir systems (Marina Basin / Singapore, Alqueva / Portugal) related to flood control, irrigation, hydropower and water quality
- Flood Control 2015, NL
Operational decision-making on major hydraulic structures in the Rhine-Meuse-Delta during flood events
- Lake Control, CH
Operational decision-making on the control of Swiss lakes during flood events

Knowledge of Deltires and strategic partners:

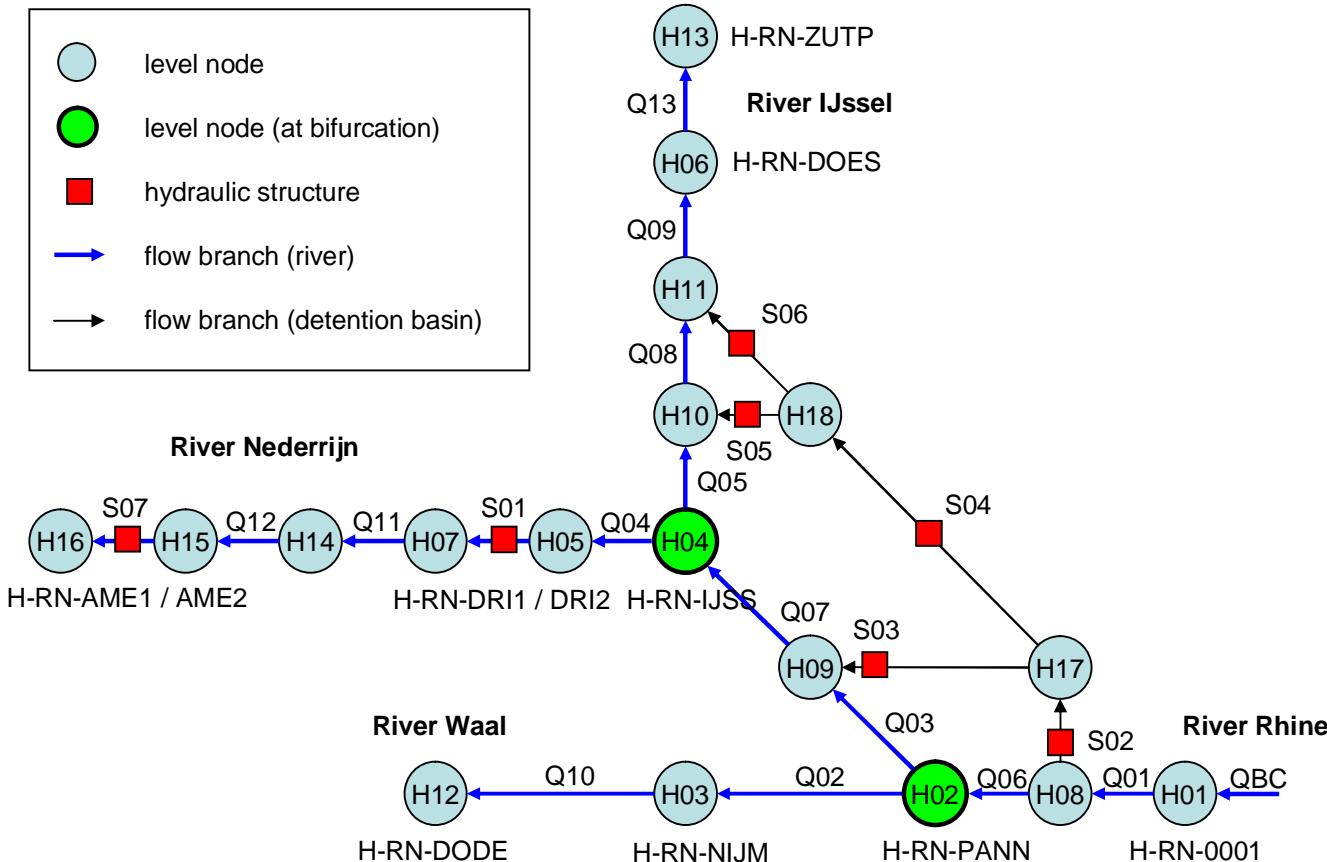
operational optimization of reservoir releases in reservoir systems with up to 50 reservoirs, supervisory control of run-of-river plants, supervisory control of irrigation systems,
all of them in combination with nonlinear objectives, logic constraints, centralized and/or distributed model predictive control

Deltires

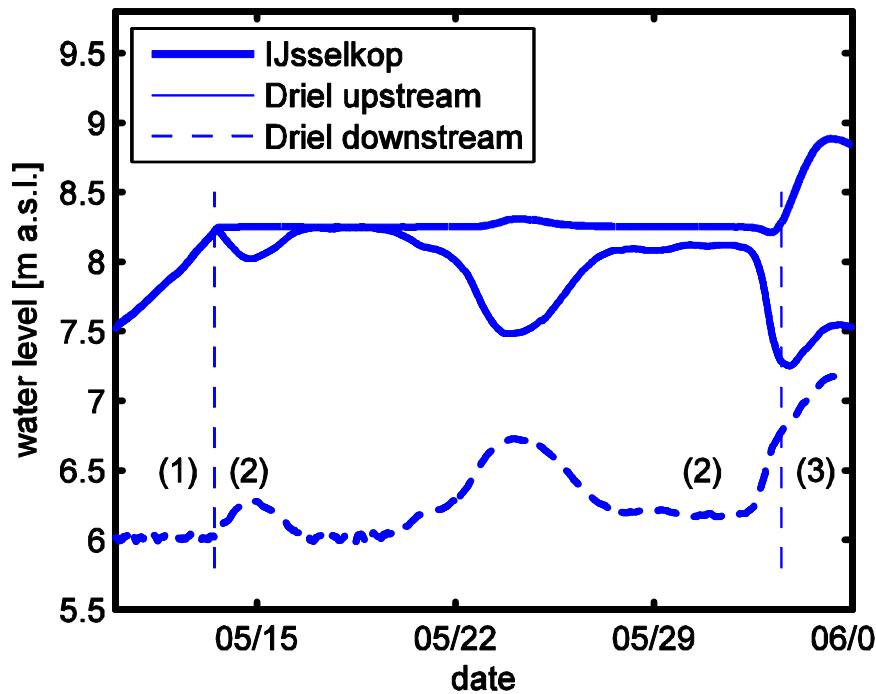
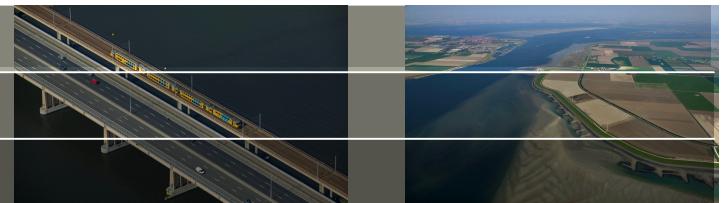
RTC Tools – Example



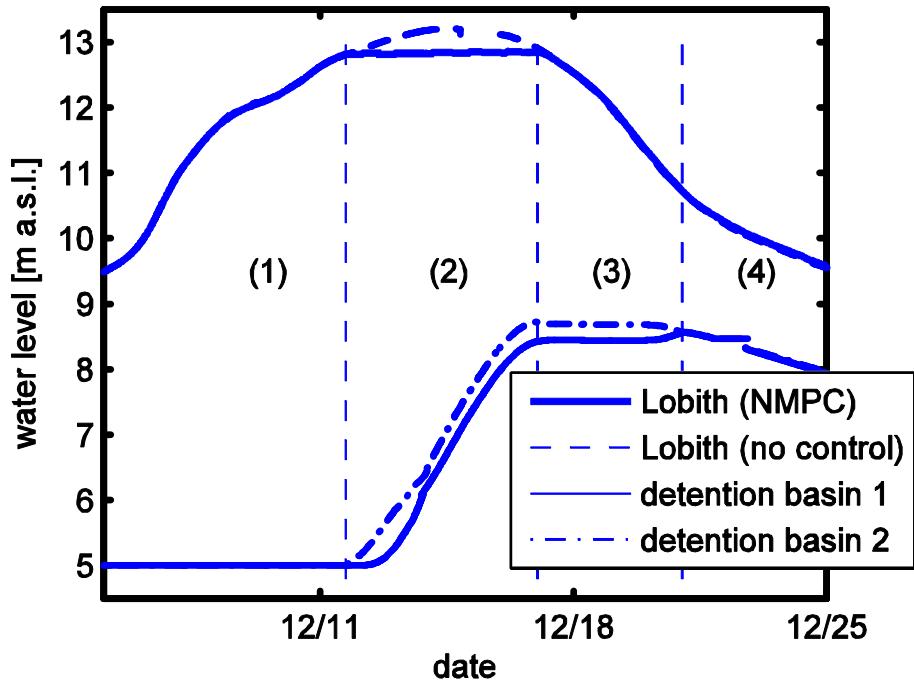
Layout of internal model of predictive controller (kinematic wave model):
schematic overview about nodes and flow branches and hydraulic structure branches



RTC Tools – Example



water level control at Driel during low - medium flow regime in May 2007 with water level set point of 8.25 m a.s.l. at gauge IJsselkop



damping of small flood peak above 12.75 m a.s.l. in December 2007 at gauge Lobith by control of detention basins 1 and 2



more information?

<http://public.deltares.nl/display/FEWSDOC/Home>

Deltares