



**Uncertainty Analysis Methodologies  
Workshop**  
**September 19, 2015,  
Québec City, Canada**

# Uncertainties in water system models : Breaking down the water discipline silos

An overview of the discussions and outcomes of the 2015  
Watermatex Uncertainty workshop

**Evangelia Belia**



**Peter Vanrolleghem**



**Tony Jakeman**



# Motivation for DOUT

Why? Facilitate full advantage of simulators and uncertainty analysis – for more (social) cost-effective solutions

How? Communicate state-of-art (academia to practice), show advantages, identify uncertainty sources

- How are uncertainty and risk currently dealt with?
- Terms and definitions
- List sources of uncertainty for typical project phases and contract delivery mechanisms
- Existing uncertainty-related methods
- What about other application fields?
- Present examples

# Uncertainty in Wastewater Treatment Design and Operation: Addressing Current Practices and Future Directions

Scientific and Technical Report No. 21

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**Uncertainty in Wastewater Treatment Design and Operation**  
*Addressing Current Practices and Future Directions*  
Editor(s): Evangelina Belia, Marc B. Neumann, Lorenzo Benedetti, Bruce Johnson, Sudhir Murthy, Stefan Weijers and Peter A. Vanrolleghem (IWA Task Group on Design and Operations Uncertainty - DOUTGroup)  
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Scientific and Technical Report No. 21

Uncertainty in Wastewater Treatment Design and Operation aims to facilitate

## Related books

>> Physical-Chemical Treatment of Water and Wastewater

>> Visual Hydrology

>> Aquifer Test Modeling

>> Phosphorus in Environmental Technology

>> Microbial Ecology of Activated Sludge

## Related reports

>> Field Validation of Biokinetic Coefficients for Degradation of Organic Compounds: Research Digest

ISSUE PAPER

## UNCERTAINTY EVALUATIONS IN MODEL-BASED WWTP DESIGN FOR HIGH LEVEL NUTRIENT REMOVAL

### LITERATURE REVIEW AND RESEARCH NEEDS

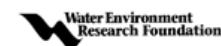
Evangelina Belia  
Primodal Inc.

Bruce Johnson  
CH2M HILL

Lorenzo Benedetti, Waterways Srl.  
Charles B. Bott, HRSD  
Cristina Martin, Université Laval  
Sudhir Murthy, DCWATER

Marc B. Neumann, Université Laval  
Leiv Rieger, EnviroSim Ass. Ltd & inCTRL Inc.  
Stefan Weijers, Waterschap De Dommel  
Peter A. Vanrolleghem, Université Laval

2013



DOUT

# Workshop

## Uncertainties in water system models : Breaking down the water discipline silos



# Accounting for Uncertainties in Models for Water Infrastructure Systems: A Cross-Sectoral Review

Peter Vanrolleghem, Université Laval, Canada



Not the first  
one...



- Workshop on Uncertainty in Water System Models



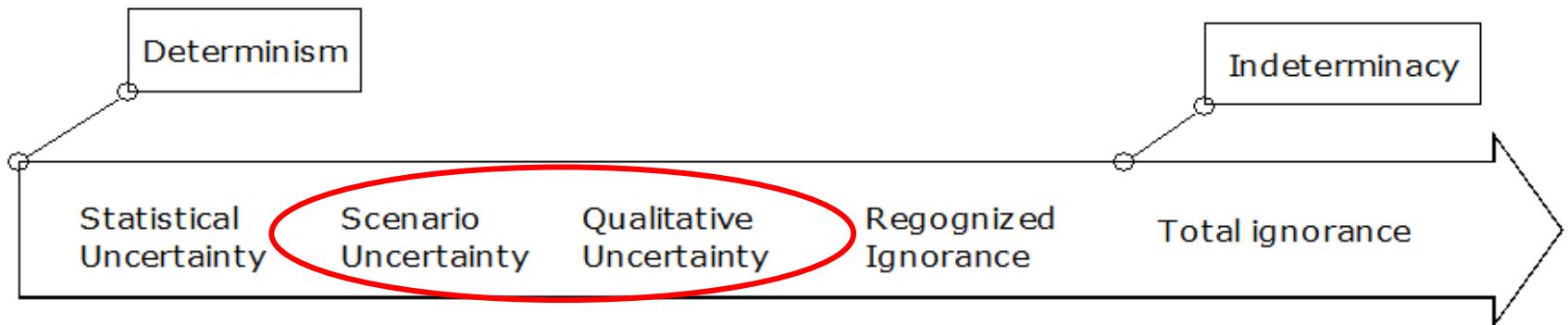
6th International Conference on  
Sewer Processes and Networks

7-10 November 2010

Surfers Paradise, Gold Coast, Australia



# Agreement



# Need for sharing developments

- Major methodological developments take place in hydrology
- Transferable/desired in other water fields
- Many uncertainty-related methods around!
- Too many?
- Meta-guidance by van der Keur et al. (2010) (a guidance on available guidances!) to navigate through the wealth of tools

# IWA Design and Operational Uncertainty Task Group (DOUT)

**Stefan Weijers, Waterschap De Dommel, The Netherlands**



## Different angles/perspectives

- Systems analysis framework - **statisticians**
  - sampling error, measurement error, parameter uncertainty, model structure, numerical
- Modelling project phases - **modellers**
  - Project definition – data collection – model building – calibration/validation – simulation
- Infrastructure project phases - **engineers**
  - Plan – Preliminary design – Detailed design – Construction-Commissioning – Operation
- Contracting/delivery mechanisms - **stakeholders**
  - design-bid-build vs. design-build-own-operate-transfer

# Contract delivery mechanisms

P: Private Company

U: Utility

M: Municipality

R: Regulator

indices 0,1&2 in P:  
different companies

in bold:  
the phases covered by  
the actual contract

Project Phase	Delivery mechanism	Design-Bid-Build (DBB)	Design-Build-Operate (DBO)
Regulatory	R	R	
Planning	P0, U, M, R	P0, M, R	
Preliminary Design	P1, U	<b>P1</b>	
Detailed Design	P1, U	<b>P1</b>	
Construction	<b>P2</b>	<b>P1</b>	
Commissioning	P1/P2	<b>P1</b>	
Operation	U		<b>P1</b>

Stakeholders responsible for taking decisions within the project phases  
for two contract delivery mechanisms

**Who takes which risk? Increasing need to make more explicit !**

# Identifiability methods as a first step in uncertainty analysis

**Tony Jakeman, The Australian National University, Canberra**



## Tony's Sound Bytes

- The underwhelming modelling practice
- Modellers stubbornly prefer their familiar paradigm,  
The model ‘landscape’ investigated too infrequently
- Scant discussion of model assumptions, strengths  
and weaknesses; very little frank reporting of  
uncertainties
- Underutilised tools at our disposal
- Insufficient stress-testing of the models (validation)

# Identifiability

- Extent to which parameter values can be captured from the observational data and prior knowledge (*practical identifiability*)
- Often a model structure is over-parameterised, sometimes unnecessarily so, regardless of noise in data (*structural identifiability*)
- Lack of information content in the data may impede identification; lack of persistent excitation by inputs

**Generic, robust model -and data-independent uncertainty quantification**

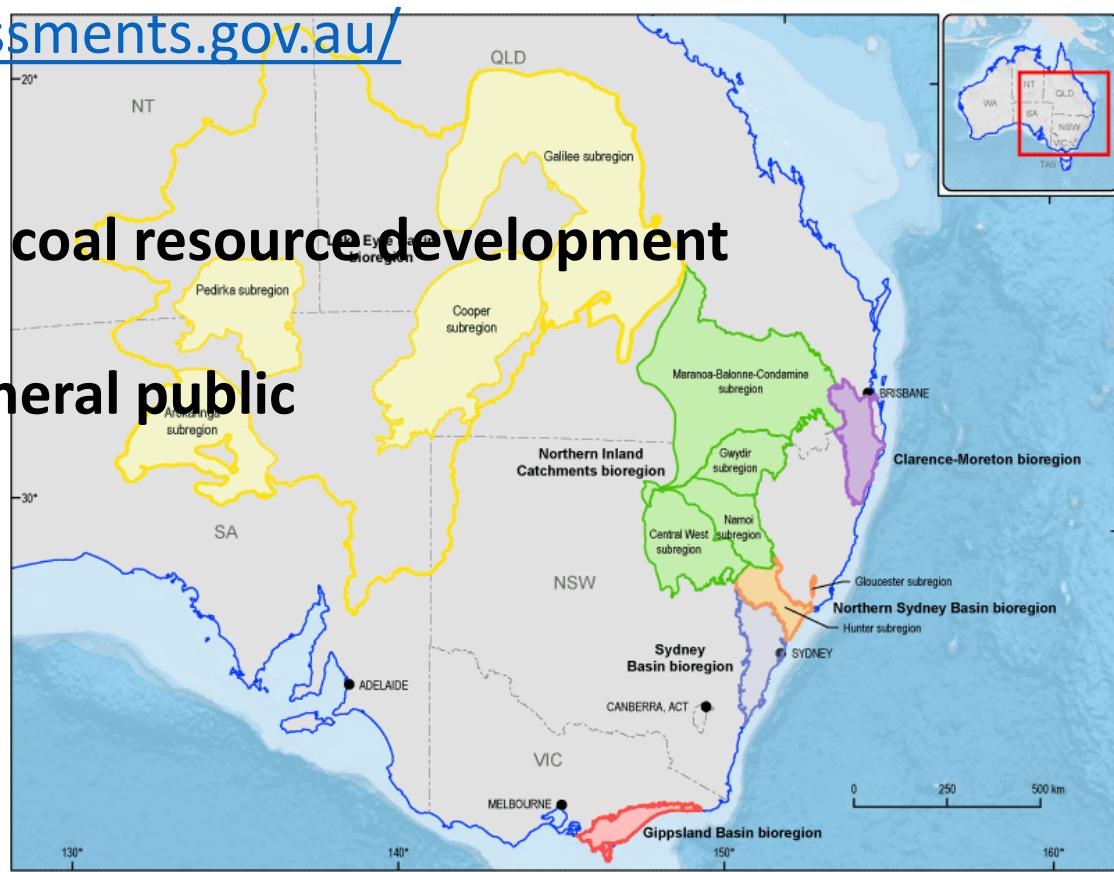
**Luk Peeters, CSIRO Land & Water, Australia**



# Bioregional Assessments

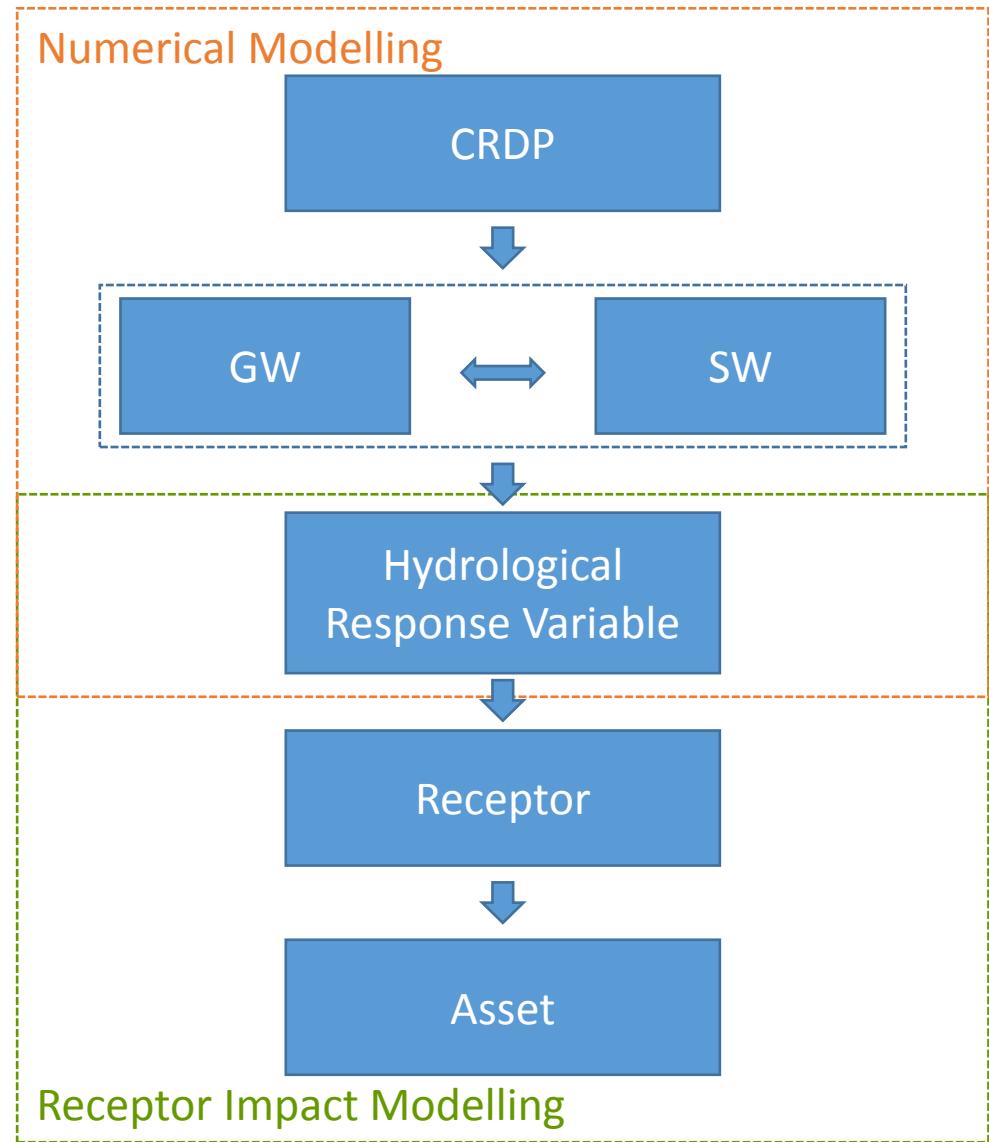
<http://www.bioregionalassessments.gov.au/>

- risk analysis of impact of coal resource development on water related assets
- advise government & general public



# Bioregional Assessments

1. Define
  - a) stress
  - b) prediction
2. Establish model
3. Figure out what matters
  - a) qualitative
  - b) quantitative
4. Priors
  - a) experts
  - b) soft/hard data
  - c) constrain by state obs
5. PDF of prediction



# Conclusions

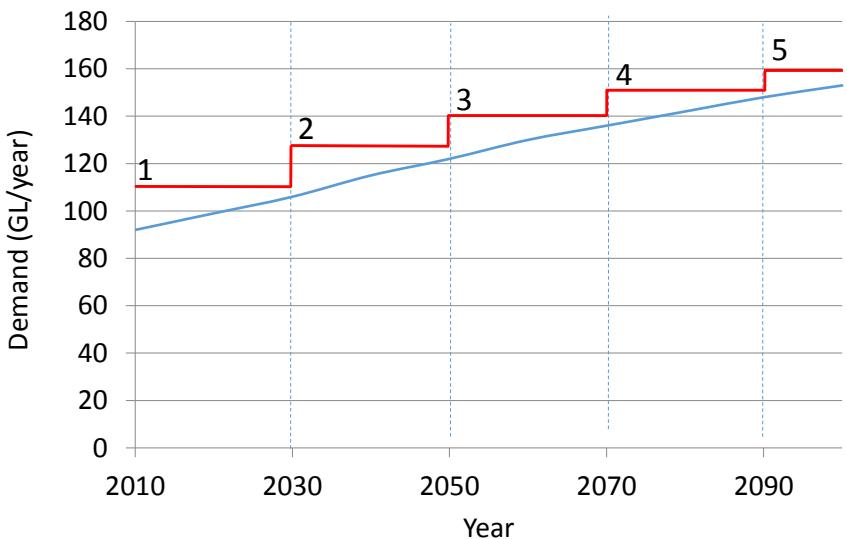
- Focus on stress & prediction rather than model & data
- Sensitivity analysis - qualitative
  - Set of scenarios
  - Explicitise hypotheses underlying the scenarios
- Qualitative analysis discussion starter for public review
- Starting point for receptor impact modelling

# Optimal Water Infrastructure Planning Under Deep Uncertainty: Balancing Robustness, Flexibility and Adaptability

Holger Maier, University of Adelaide, Australia



## The Planning Problem



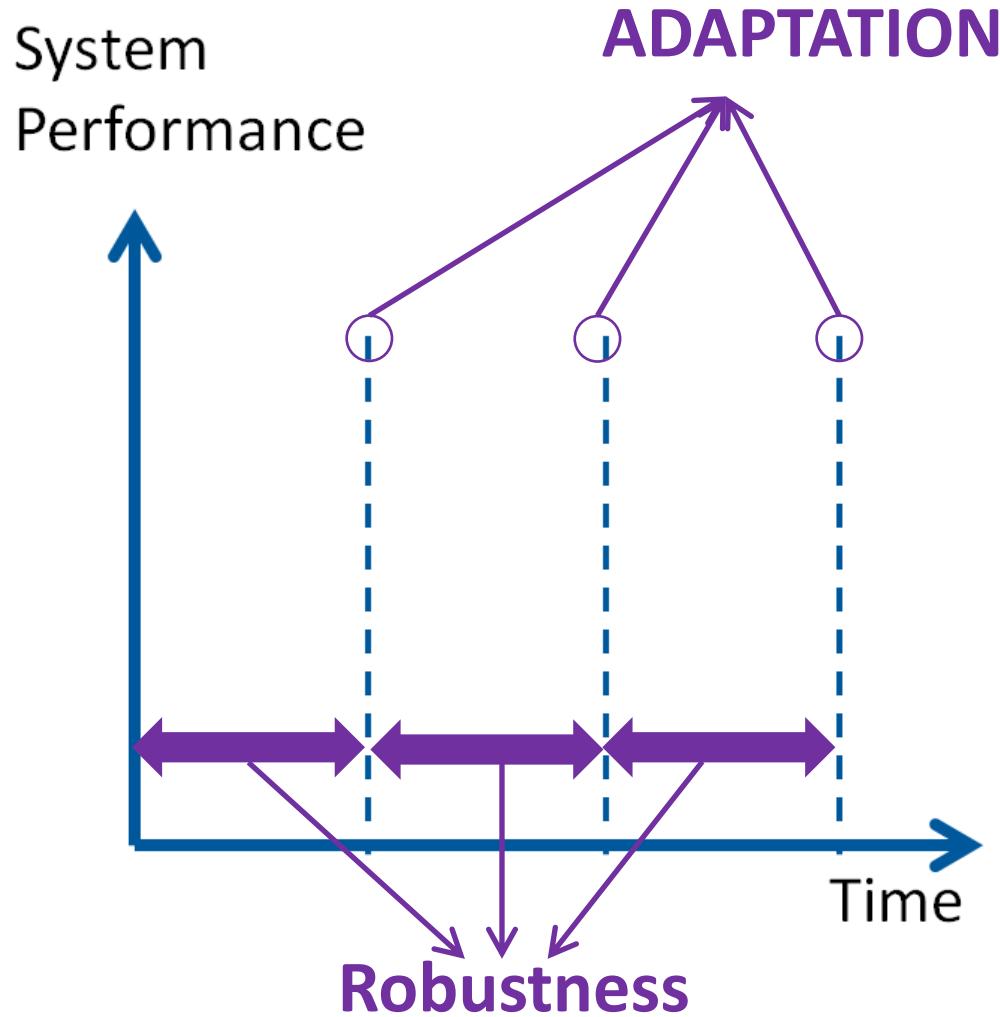
Long-term water infrastructure planning is complicated by:

- Global (deep) uncertainty
- Longevity of infrastructure
- Long project lead times

# The planning dilemma



# Solution: Robust adaptation

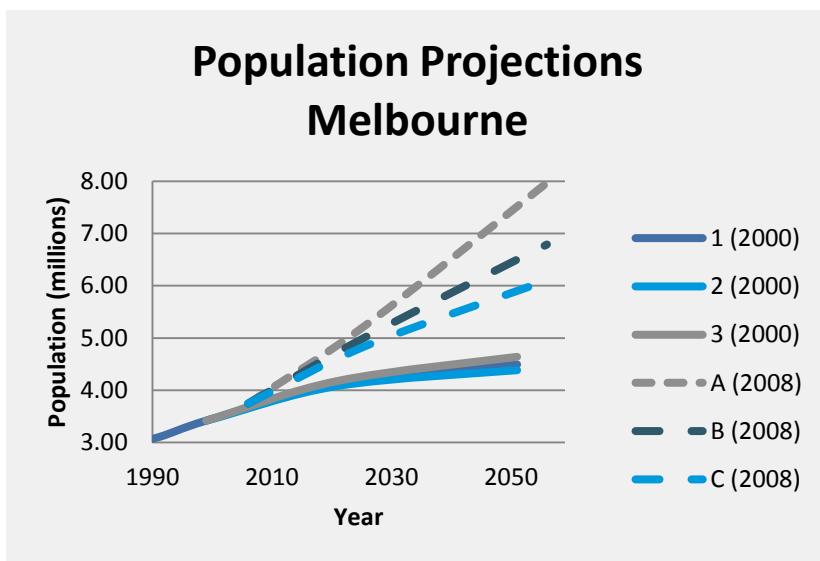


# Socio-technical modelling tools to examine urban water management strategies under deeply uncertain future scenarios

**Christian Urich, Monash University, Australia**



## Deep uncertainty - Using scenarios to support strategic planning



Predictive

Probable: What will happen?

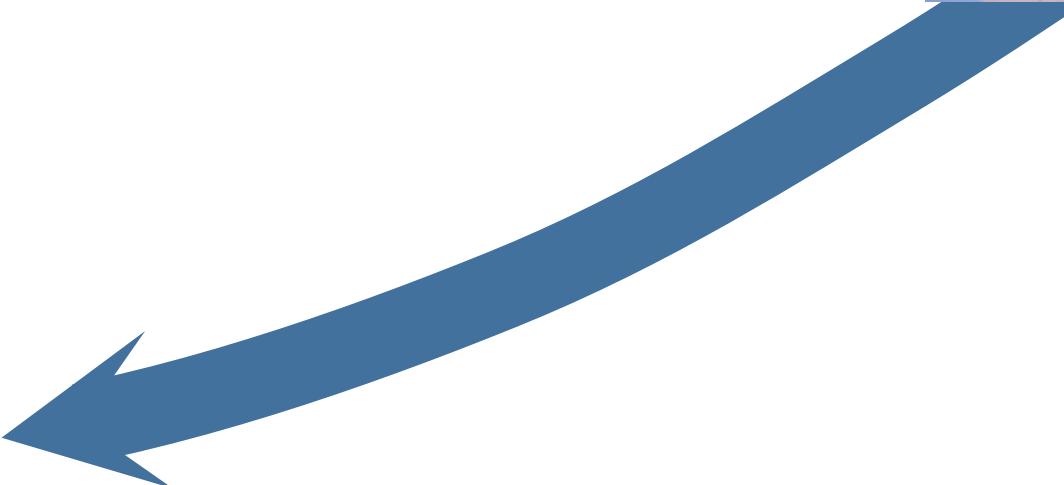
Explorative

Possible: What might happen?

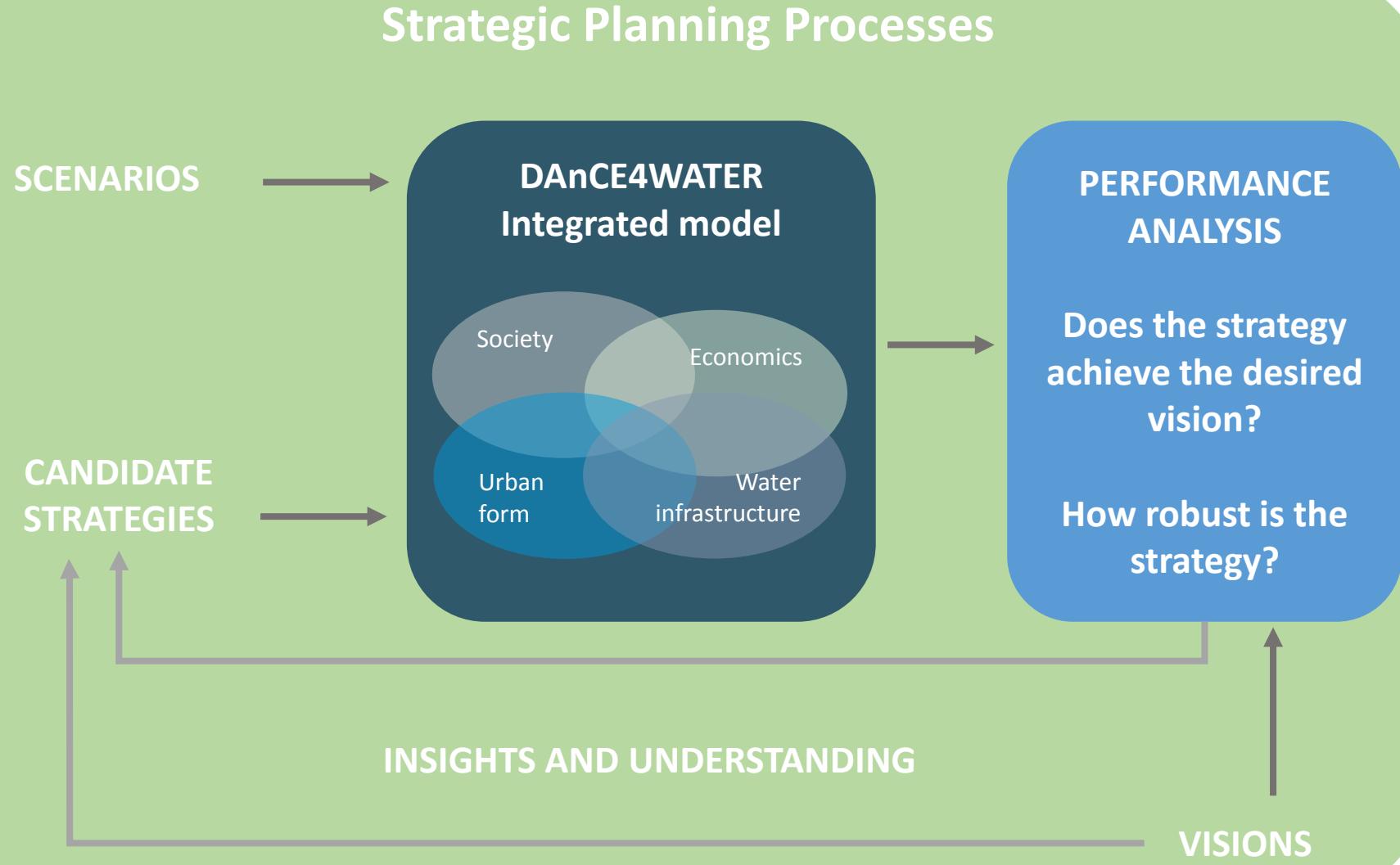
Normative

Preferred: How to reach a vision?

# Backcasting from a future vision



# DAnCE4Water as exploratory modelling tool



# Overall discussion

- Uncertainty is always implicitly considered
- Uncertainty is now talked about explicitly, so
  - People need/want to communicate about it
  - People need/want to be educated about it
  - People want transparency about it
- Trust in model-based decisions relies on success on the above

# Overall discussion (cont'd)

- Within consulting companies,  
uncertainty is typically dealt with by the risk analysts
- Engineers are typically not in contact with risk people  
(closed because of corporate risk)

# Overall discussion (cont'd)

- Early involvement of stakeholders in model-based decision making is essential, to
  - Make the model-based approach acceptable
  - Make the model choice transparent
  - Help define the expected uncertainties
- Multicriteria analysis leads to subjective weighting
- The decision-making must thus involve the stakeholders to make that weighting transparent
- This must be prepared at the project definition phase and must involve uncertainty aspects

# Steps to accelerated adoption

## Method development

PDF selection  
Incorporate expert knowledge  
Correlation  
Incorporating human error & equipment failures  
**Accounting for temporal and spatial variability (3-D space vs. simulation space)**  
Meaningful composition of heterogeneous components (different sources, large variety of interaction mechanisms, different levels of abstraction)  
Generating additional key process indicators such as process stability

## Concept communication

Variability vs. uncertainty  
Moving from single parameter values to distributions  
**Communicating key concepts - PONC**  
Scenario development  
Visualization  
Psychology and preferential engineering

## Method adoption

Incorporating existing design concepts e.g. "max month"  
Linking SF in guidelines to sources of uncertainty  
**Developing MOP for methods**  
Case studies  
Post project audits  
Collaboration: engineer-modeler-statistician  
**Software tools**

# Workshop

## Uncertainties in water system models : Breaking down the water discipline silos

