



**Hydrological Modelling
for Assessing Climate Change Impacts
at different Scales
(09-063180-DSF)**

**FINAL REPORT
March 2014**

1. Scientific Achievements

Project components and publications

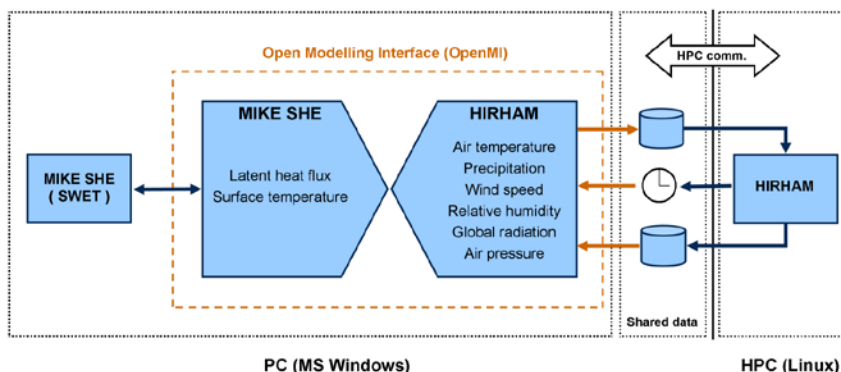
HYACINTS has developed new methodologies and tools for assessing climate change impacts on water resources at different spatial scales. The main project components were:

- Coupling of DMI’s regional climate model HIRHAM and DHI hydrological modelling system MIKE SHE and conversion of GEUS’ national water resources model to run in the coupled system aiming at reducing simulation uncertainty ([1], [4], [5], [6], [10], [11], [14]).
- Development of methodologies for using a spatially refined model grid in parts of a model domain where more detailed descriptions of hydrogeological conditions are required ([21], [22]). An SME project on digital geological modelling was associated to this component ([2]).
- Development of methodologies for estimating precipitation and evapotranspiration from satellite data, particularly aimed at application in data poor regions in the world ([7], [12], [13]).
- Assessment of uncertainty propagation in the calculation chain (emission scenarios → global climate models → regional climate models → downscaling/bias correction methods → hydrological models → hydrological change) and identification dominating sources of uncertainty in projections of climate change impacts on water resources ([3], [8], [9], [15], [16], [17], [18], [19], [20]).

Coupled HIRHAM – MIKE SHE coupling and application to Denmark

The most challenging and risky HYACINTS research task was to establish a coupling between the HIRHAM regional climate model and the MIKE SHE hydrological modelling system. This coupling was successfully developed. HIRHAM is executed at DMI’s linux based supercomputer, while MIKE SHE is run on a MS Windows PC (Figure 1). The two different software platforms make the coupling technically complicated, but the coupling approach allows the two codes to be otherwise almost unchanged. The coupling was tested with HIRHAM being run on an 8,000 km x 5,000 km domain while the MIKE SHE replaces HIRHAM’s land surface scheme over the 2,500 km² Skjern Å catchment.

Previous studies have either been confined to surface water hydrological models (Goodall et al., 2013; Zabel and Mauser, 2013) or, in case of inclusion of groundwater, been limited to relatively small domains (up to a few hundred km²) and short periods (a few days) both for the climate and the hydrological models (Maxwell et al., 2007; Kollet and Maxwell, 2008; Rihani et al., 2010; Maxwell et al., 2011). In this respect our results are novel by including an integrated groundwater-surface water hydrological model in the coupled climate-hydrology model simulation over several years and a large



area. Based on model tests for one year periods, it is too early to conclude to which extent a coupled climate-hydrology model like HIRHAM-MIKE SHE will be able to reduce biases and uncertainties in climate model simulations. But we now have a powerful tool that is very suitable for such analyses.

Figure 1. Schematic of the HIRHAM-MIKE SHE coupling. Both model codes have been extended with OpenMI Linkable Components, exposing selected variables to each other within the OpenMI platform. The MIKE SHE code runs on the same PC (MS Windows) as the OpenMI software, whereas the HIRHAM code runs on a massively parallelized Cray XT5 high performance computer system (HPC).

Scaling of hydrological models – refined grid modelling

The novelty and main achievement of the HYACINTS research in this field has been investigations with two different methodologies for using refined grid (telescopic mesh) around model sub-areas of particular interest and tests of the models in highly complex geologies. The two different methodologies were based on i) a new MODFLOW Local Grid Refinement module (MODFLOW-LGR) developed by Mehl and Hill (2007); and ii) a coupling of the MIKE SHE surface water processes (Butts and Graham, 2008) to a finite element groundwater code FEFLOW (Diersch, 2002).

The MODFLOW-LGR method was tested against a hypothetical setup with complex geology and on Aarhus Water's well field in Ristrup, which is an area with buried valleys and complex geology. The HYACINTS results suggest that the LGR routine can have so long execution times for models with complex geologies that the benefit of using it often may disappear. Furthermore, results show that decisions on how to design the grid refinement may have substantial implications on results when applied for projecting climate change impacts on groundwater.

The MIKE SHE-FEFLOW coupling was developed and has been successfully tested against a sequence of hypothetical cases of surface water-groundwater interactions for which there are known analytical/numerical solutions. (Yamagata et al., 2012a,b). The current testing this technology for catchment-scale set-ups indicate that care is needed to match the surface water and groundwater grid sizes to properly capture the interactions between surface water processes and the time steps when there is strong dynamical interaction such as during surface water flooding. The strength of this approach is that we extend the capabilities of both models to address new problems such as the effect of climate change on saltwater intrusion or radioactive waste disposal.

The digital geological software tools being developed in the associated SME project includes new and improved functionalities to handle complex geologies fully three-dimensionally in a manner that makes it easy to use the geological information in groundwater modelling.

Application in data sparse areas

HYACINTS research has produced new knowledge on use of satellite data for estimating precipitation and evapotranspiration and use of these data in hydrological modelling. The methods have been successfully tested on cases from Western Africa and China.

Uncertainty

HYACINTS has in a number of case studies assessed how uncertainties in climate modelling interact with uncertainties in geological and hydrological modelling when projecting climate change impacts on water resources (Figure 2). The analysis of uncertainties on climate models was based on results from the ENSEMBLES project that is available through a database hosted by DMI. Daily climate data from 11 combinations of global General Circulation Models (GCMs) and Regional Climate Models (RCMs) were downloaded for the entire Denmark for the period 1950 – 2100. The data were made ready for use in hydrological models by two different bias correction methods. The 11 different climate model projections were then imposed on six different geological conceptualisations for the Lejre area (HOFOR well fields, water supply to Copenhagen, 465 km²) and on three different refined grids for the Ristrup area (Aarhus Water well field, 18 km²).

From the case studies it was concluded that the inherent natural climate variability together with climate models constitute the dominating sources of uncertainty for precipitation projections, while uncertainty due to bias correction methods typically amounts to 10-20% of the climate model uncertainty. When propagating climate uncertainty through hydrological models the climate uncertainty may, depending on the projection variable and the site specific regime, be amplified or reduced and become larger or smaller than the uncertainty originating from the hydrological model. We found in our two cases that

climate uncertainty dominates over geological uncertainty and model uncertainties related to numerical discretization and geological resolution for projection of groundwater heads and streamflow, while the opposite is the case for projection of well field capture zones.

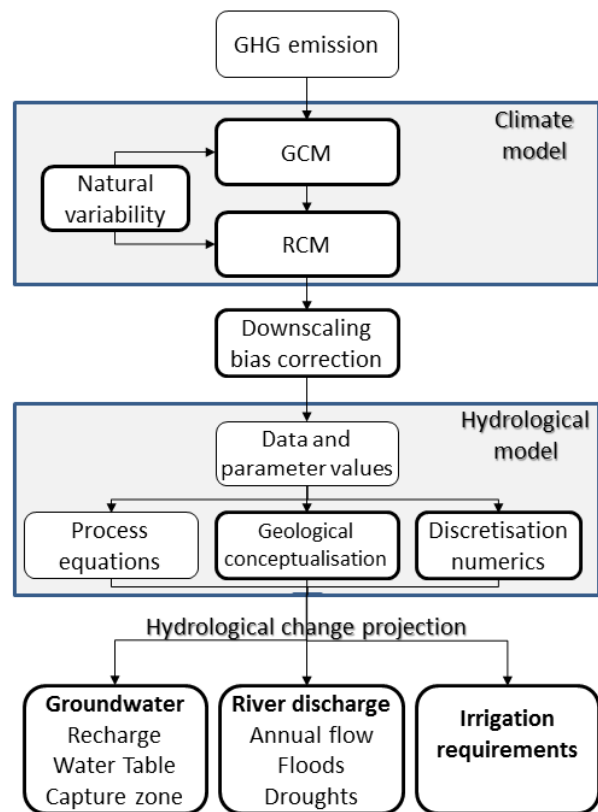


Figure 2. The uncertainty cascade from emission scenarios to hydrological change projections. The elements studied in HYACINTS are marked with bold frames.

2. Commercial and Societal Results

HYACINTS results have already been applied in many societal contexts. This is particularly the case with the downscaled climate projection data and the uncertainty assessments of climate change impacts. Key examples of applications by HYACINTS partners include:

- The assessment of climate change impacts on groundwater conditions carried out for Koordineringsenheden for Klimatilpasning (KFT) and now available at www.klimatilpasning.dk provided by the Nature Agency and aiming at being used by municipalities for screening purposes (Henriksen et al., 2012). A follow-up study included assessment of changes in extreme river discharges under future climate conditions (Henriksen et al., 2013). The assessment tool has supported municipalities to establish climate change adaptation plans, a task that had to be completed by the end of 2013.
- Climate proofing of the design of the Silkeborg motorway (Troldborg et al., 2011).
- IDA’s climate change adaptation strategy for Denmark (Mark et al., 2012).
- The climate basis for the INTERREG projects CLIWAT and BaltCiCa as well as projects for municipalities and regions.
- Advisory functions to the Ministry of Environment.

The new knowledge generated in HYACINTS will strengthen the specialised consultancy services within the water sector both in Denmark and internationally that is offered by the HYACINTS partners ALECTIA and DHI. In addition, the two new coupling technologies developed for DHI’s software will contribute to new functionalities of DHI’s modelling software. The HIRHAM-MIKE SHE coupling is a valuable and innovative research tool being used by Danish researchers but is not, as yet, fully mature as a commercial product. The MIKE SHE – FEFLOW coupling is already being applied commercially as a consultancy tool and potential software product in DHI consultancy projects in Sweden and Singapore.

In addition, the downscaled climate projection data are today being used by consulting companies in a variety of water resources projects.

HYACINTS results have been disseminated via many articles in Danish popular scientific journals such as Vand & Jord as well as public presentations at a large number of professional meetings. A key message promoted throughout the HYACINTS period has been that climate change adaptation requires a paradigm shift compared to traditional water management in order to suitably handle the major uncertainties in climate change projections. Advocacy for such paradigm shift requires many years of continuous oral and written presentations and discussions supplemented by new illustrative examples. HYACINTS results have been crucial and very instrumental in this respect.

3. Research Education

Four PhD students have successfully completed their studies. Three of the candidates are today employed as postdocs at AU, RUC and DTU, while the fourth candidate works in the consulting company Envidan. A fifth PhD student (at GRAS) terminated his study after a year, and the remaining resources were successfully converted to a postdoc position at GRAS.

Four postdocs received research training of varying lengths (between 1 and 2½ years). The two postdocs from private companies (ALECTIA and GRAS) are today still employed at the same company, while the two postdocs at DMI and GEUS today are employed at permanent positions at DTU and the Danish Road Agency. The two postdocs with 2½ and 2 years duration (ALECTIA and GRAS) conducted separate research tasks and each contributed with two first-authored papers plus some co-authored papers, while the two postdocs with shorter durations (GEUS, DMI) primarily had tasks supporting PhD students in the HIRHAM- MIKE SHE coupling and contributed with co-authored papers.

HYACINTS arranged and co-sponsored one PhD course: “Assessment and Propagation of Uncertainty in Spatially Distributed Environmental Modelling” held at GEUS in September 2009 with 25 participants. The external teachers were Dr. Gerard BM Heuvelink, Wageningen University, The Netherlands and Dr. James D Brown, National Weather Service, NOAA, USA. In addition, HYACINTS contributed to the PhD course “Adaptive management in relation to climate change” held at University of Copenhagen in August 2011 with 15 participants.

4. Collaboration

HYACINTS has resulted in strengthened and new collaborations both nationally and internationally. *Nationally*, the collaboration between the partners has been substantially strengthened. This has materialised in new tools and joint publications. The mutual learning between the climate modelling community and the water resources community (both researchers and practitioners) has been very significant during the six years project period. The importance of this intangible knowledge dissemination cannot be overestimated.

Internationally, HYACINTS partners have exploited and strengthened existing collaborations. In addition new collaborations have been established:

- China: Peking University (Prof Chunmiao Zheng) and Institute of Remote Sensing Application, Chinese Academy of Science (Dr. Bingfang Wu) related to testing of remote sensing technologies and integrated hydrological modelling. (GEUS, ALECTIA, GRAS).
- Germany: University of Bonn (Prof Clemens Simmer) and Forschungszentrum Jülich (Prof Stefan Kollet) related to coupled climate hydrology modelling (GEUS, University of Copenhagen, DMI, DHI).
- USA: US Geological Survey (Dr. Steffen W Mehl) related to the refined grid modelling (AU).
- SKB – Swedish Nuclear Fuel and Waste Management Co concerning surface water and groundwater interactions in radioactive waste disposal (DHI).

5. References

HYACINTS journal papers

- [1] Butts M, Drews M, Larsen MAD, Lerer SM, Rasmussen SH, Grooss J, Overgaard J, Refsgaard JC, Christensen OB, Christensen JH. Embedding complex hydrology in the regional climate system – dynamic coupling across different modelling domains. Submitted to *Advances in Water Resources*, October 2013.
- [2] Jørgensen F, Møller RR, Nebel L, Jensen NP, Christiansen AV, Sandersen PBE (2013) A method for cognitive 3D geological voxel modelling of AEM data. *Bulletin of Engineering Geology and the Environment*, 72(3-4), 421-432.
- [3] Kidmose J, Refsgaard JC, Troldborg L, Seaby LP, Escrivà MM (2013) Climate change impact on groundwater levels: ensemble modelling of extreme events. *Hydrology and Earth System Sciences* 17(4), 1619-1634.
- [4] Larsen, MAD, Thejll P, Christensen JH, Refsgaard JC, Jensen KH (2013) On the role of domain size and resolution in the simulation with the HIRHAM regional climate model. *Climate Dynamics* 40(11-12), 2903-2918.
- [5] Larsen MAD, Refsgaard JC, Jensen KH, Butts MB, Stisen S, Møllerup M. Calibration of a distributed hydrology and land surface model using uncertain energy flux measurements. Submitted to *Water Resources Research*, August 2013.
- [6] Larsen MAD, Butts MB, Christensen JH, Christensen OB, Drews M, Jensen KH, Refsgaard JC. Results from a full coupling of the HIRHAM regional climate model and the MIKE SHE hydrological model for a Danish catchment. Submitted to *Hydrology and Earth System Sciences*, December 2013.
- [7] Qin H, Cao G, Kristensen M, Refsgaard JC, Rasmussen MO, He X, Liu J, Zheng C (2013) Integrated Hydrological Modelling of the North China Plain and Implications for Sustainable Water Management. *Hydrology and Earth System Sciences*, 17, 3759-3778.
- [8] Randall MT, Troldborg L, Refsgaard JC, Kidmose JB (2013) Assessing urban groundwater table response to climate change and increased stormwater infiltration. *Geological Survey of Denmark and Greenland Bulletin*, 28, 33-36.
- [9] Rasmussen J, Sonnenborg TO, Stisen S, Seaby LP, Christensen BSB, Hinsby K (2012) Climate change effects on irrigation demands and minimum stream discharge: impacts of bias-correction method. *Hydrology and Earth System Sciences* 16(12), 4675-4691.
- [10] Rasmussen SH, Butts MB, Lerer SM, Refsgaard JC (2012) Parameterisation and scaling of the land surface model for use in coupled climate-hydrological model. *Journal of Hydrology* 426-427, 63-78.
- [11] Rasmussen SH, Christensen JH, Drews M, Gochis DJ, Refsgaard JC (2012) Spatial-Scale Characteristics of Precipitation Simulated by Regional Climate Models and the Implications for Hydrological Modelling. *Journal of Hydrometeorology* 13(6), 1817-1835.
- [12] Rasmussen MO, Sørensen MK, Wu B, Yan N, Qin H, Sandholt I. Regional-scale Estimation of Evapotranspiration for the North China Plain using MODIS data and the Triangle-approach. Submitted to *International Journal of Applied Earth Observation and Geoinformation*, December 2013.
- [13] Rasmussen MO, Sørensen MK, Pipunic R, Sandholt I. Towards operational estimation of Evapotranspiration from Remote Sensing - a simple approach for semi-arid regions. Submitted to *Agricultural and Forest Meteorology*, January 2014.
- [14] Rasmussen, SH, Drews M, Butts MB, Christensen JH, Refsgaard JC. Towards fully coupled climate-hydrological model: necessary considerations of land surface-atmosphere feedbacks. Submitted to *Climate Dynamics*, April 2012.
- [15] Refsgaard JC, Christensen S, Sonnenborg TO, Seifert D, Højberg AL, Troldborg L (2012) Review of strategies for handling geological uncertainty in groundwater flow and transport modelling. *Special Issue on Uncertainty Quantification and Risk Assessment. Advances in Water Resources* 36, 36-50.
- [16] Refsgaard JC, Sonnenborg TO, Andersen JA, Andreasen JO, Bjerre TK, Butts MB, Christensen JH, Christensen S, Drews M, Jensen KH, Jørgensen F, Jørgensen LF, Larsen MAD, Müller-Wohlfeil DI, Rasmussen MO, Rasmussen SH, Seaby LP, Seifert D, Vilhelmsen TN, Kappel MN. From climate change to hydrological change – where are the main uncertainties? Submitted to *Hydrological Sciences Journal*, January 2014.
- [17] Seaby LP, Refsgaard JC, Sonnenborg TO, Stisen S, Christensen JH, Jensen KH (2013) Assessment of robustness and significance of climate change signals for an ensemble of distribution-based scaled climate projections. *Journal of Hydrology* 486, 479-493.
- [18] Seaby LP, Refsgaard JC, Sonnenborg TO, Højberg AL. Spatial uncertainty in bias corrected climate change projections and hydrogeological impacts. Submitted to *Hydrological Processes*, September 2013.
- [19] Seifert D, Sonnenborg TO, Refsgaard JC, Højberg AL, Troldborg L (2012) Assessment of hydrological model predictive ability given multiple conceptual geological models. *Water Resources Research* 48, W06503.

- [20] Seifert D, Sonnenborg TO, Refsgaard JC. Assessment of climate model uncertainty in hydrological modelling using multiple conceptual geological models. Submitted to Journal of Hydrology, March 2014.
- [21] Vilhelmsen TN, Christensen S, Mehl SW (2012) Evaluation of MODFLOW-LGR in Connection with a Synthetic Regional-Scale Model. Ground Water 50 (1), 118-132.
- [22] Vilhelmsen TN, Behroozmand AA, Christensen S, Nielsen TH. Joint inversion of aquifer test, MRS and TEM data. Submitted to Water Resources Research, August 2013.

Other references

- Diersch H-JG, Kolditz O (2002) Variable-density flow and transport in porous media: approaches and challenges. *Advances in Water Resources* 25 (2002) 899–944.
- Goodall JL, Saint KD, Ercan MB, Briley LJ, Murphy S, You H, DeLuca C, Rood RB (2013) Coupling climate and hydrological models: Interoperability through Web Services. *Environmental Modelling & Software*, 46, 250-259.
- Kollet SJ, Maxwell RM (2008) Capturing the influence of groundwater dynamics on land surface processes using an integrated, distributed watershed model, *Water Resources Research*, 44, W02402.
- Henriksen HJ, Højberg AL, Olsen M, Seaby LP, van der Keur P, Stisen S, Troldborg L, Sonnenborg TO, Refsgaard JC (2012) Klimaeffekter på hydrologi og grundvand (Klimagrundvandskort). Koordineringsenhed for forskning i klimatilpasning. GEUS Rapport 2012/116.
- Henriksen HJ, Olsen M, Troldborg (2013) Klimaekestremvandføring. Klimaeffekter på hydrologi og afstrømning. GEUS Rapport 2013/29.
- Mark O, Refsgaard JC, Henriksen HJ, Ferdinandsen I, Arnbjerg-Nielsen K, Quist MK, Rugbjerg M, Jensen NA, Mangor K (2012) Klimatilpasning af Danmark – IDAs Klimatilpasningsstrategi. Ingeniørforeningen in Danmark, IDA, 83pp
- Maxwell RM, Chow FK, Kollet SJ (2007) The groundwater-land-surface-atmosphere connection: Soil moisture effects on atmospheric boundary layer in fully-coupled simulations. *Advances in Water Resources*, 30, 2447-2466.
- Maxwell RM, Lundquist JK, Mirocha JD, Smith SG, Woodward CS, Tompson AFB (2011) Development of a coupled Groundwater-Atmosphere Model. *Monthly Weather Review*, 39, 96-116.
- Mehl S, Hill MC (2007) MODFLOW-2005, the U.S. Geological Survey modular ground-water model -- documentation of the multiple-refined-areas capability of local grid refinement (LGR) and the Boundary Flow and Head (BFH) Package: U.S. Geological Survey Techniques and Methods 6-A21. 13p.
- Rihani J, Maxwell RM, Chow FK (2010) Coupling groundwater and land surface processes: Idealized simulations to identify effects of terrain and subsurface heterogeneity on land surface energy fluxes. *Water Resources Research*, 46, W12523.
- Troldborg L, Refsgaard JC, Kidmose J, Escrivà MM, Nyegaard P (2011) Grundvandsmodel for motorvejsstrækning gennem Silkeborg. Statusrapport fase 1.1 og 1.2.
- Yamagata K, Butts MB, Grooss J, Clausen TH, Graham DN, Clausnitzer V, Gründler R, Monninkhoff B (2012a) Investigating an OpenMI coupling of FEFLOW and MIKE SHE, 3rd International FEFLOW® User Conference, September 3-7, 2012, Berlin, Germany. http://www.feflow.com/fileadmin/FEFLOW/content_tagung/feflow2012/papers/papers/15.pdf
- Yamagata K, Butts MB, Grooss J, Clausen TH, Graham DN, Clausnitzer V, Gründler R, Monninkhoff B (2012b) OpenMI coupling of FEFLOW and MIKE SHE. Hydrology & Water Resources 2012 Symposium, Sydney, NSW, Australia, 19 - 22 November 2012.
- Zabel F, Mauser W (2013) 2-way coupling the hydrological land surface model PROMET with the regional climate model MM5. *Hydrology and Earth System Sciences*, 17, 1705-1714.