

**Heavy metal  
contamination  
modelling**

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This discussion paper is/has been under review for the journal Hydrology and Earth System Sciences (HESS). Please refer to the corresponding final paper in HESS if available.

# A 2-D hydro-morphodynamic modelling approach for predicting suspended sediment propagation and related heavy metal contamination in floodplain: a sensitivity analysis

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Received: 23 December 2013 – Accepted: 5 February 2014 – Published: 10 February 2014

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Published by Copernicus Publications on behalf of the European Geosciences Union.

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## Abstract

Fine sediments represent an important vector of pollutant diffusion in rivers. When deposited in floodplains and riverbeds they can be responsible for soil pollution. In this context, this paper proposes a hydro-morphodynamic modelling exercise aiming at predicting transport and diffusion of fine sediments and dissolved pollutants. The model is based upon the Telemac hydro-informatic system (dynamical coupling Telemac-2D-Sysiphe). As empirical and semi-empirical parameters need to be calibrated for such a modelling exercise, a sensitivity analysis is proposed. In parallel to the modelling exercise, an extensive hydrological/geochemical database has been set up during two flood events. The main sensitive parameters were found to be the hydraulic friction coefficient and the sediment particle settling velocity in water. Using the two monitored hydrological events as calibration and validation, it was found that the model is able to satisfyingly predict suspended sediment and dissolve pollutant transport in the river channel. In addition, a qualitative comparison between simulated sediment deposition in the floodplain and a soil contamination map shows that the preferential zones for deposition identified by the model are realistic.

## 1 Introduction

Recent years have seen a growing awareness of the central role that fine sediment loads play in transport and diffusion of pollutants by rivers and streams (Walling, 2005). Suspended sediment can potentially carry important amounts of nutrients and contaminants, such as trace metals among which some are recognized as Potential Harmful Elements (PHE). These threaten water quality in rivers and wetlands and soil quality in floodplains (Carter et al., 2006; Hissler and Probst, 2006). Contemporary data on sediment loads of rivers provide clear evidence of significant recent changes in sediment fluxes of several rivers in response to human activities (Walling, 2006). Although fine sediment deposition in floodplains is not necessarily responsible for important

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topographical evolution, it can play a central role from a contamination point of view (Stewart et al., 1998; Benjankar and Yager, 2012).

Currently, many studies focusing on sediment transport modelling deal with marine and estuarine areas (e.g., Le Normant, 2000; Nguyen et al., 2009). Some studies evaluate sediment transport at basin scales and often evaluate yearly sediment fluxes using hydrologic and simplified hydraulic models (e.g., van Griensven et al., 2013). Some more theoretical studies develop and improve numerical models on the basis of physical model experiments (e.g., Belleudy, 2000, 2001; Bui and Rutschmann, 2010). As a matter of fact, sediment transport modelling in small rivers at reach/floodplain scale is a rather new research field (Simpson and Castelltort, 2006).

In this paper, we aim at simulating sediment transport at the floodplain scale and the flood event scale in order to predict sediment spreading on alluvial soils. This simulation will help for the estimation of the potential pollution of soil due to the transport of PHEs by suspended sediments. As argued by Benjankar and Yager (2012), only a few studies have focused on fine sediment deposition in floodplains. Moreover, Hardy et al. (2000) explains that, in this context, it is necessary to make use of a model able to consider advection and diffusion processes and to carry out unsteady simulation (physical variable state varying in time).

Numerical models are more and more used by water resource planners, water quality managers, engineers and scientists (Singh and Woolhiser, 2002; Simpson and Castelltort, 2006). Hydrodynamic and morphodynamic models, built up using in situ measurements, arguably represent a useful tool for predicting natural and man-induced environmental impacts on sediment dynamics, especially due to the complexity of physical processes involved in sediment transport (Belleudy, 2000). They are based on an approximate representation of complex natural systems. Therefore, the evaluation of such models with respect to their ability to reproduce multiple processes of a real system is still problematic. In this context, Matgen et al. (2007); Pappenberger et al. (2007); Schumann et al. (2007); Hostache et al. (2009) demonstrated that the calibration of such models is not straightforward and needs particular attention as the datasets used

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in the calibration process determine the optimal parameter set. Hostache et al. (2009) came to the conclusion that data sets other than conventional stream gauge measurements are particularly useful for model calibration because they better constrain model parameters and improve the identifiability of the model parameters. According to Beven (2006), equifinality occurs when various parameter sets yield similar model performance with respect to a given observation due, for example, to compensating effects or unsuitable processes understanding.

In this context, this article describes a modelling exercise using a rather unique field dataset, which includes not only water surface elevation records but also geochemistry data such as temporal variations of contaminants and suspended sediment concentrations. This extensive dataset offers new opportunities for evaluating and analysing in an objective way the performance of a 2-D hydro-morphodynamic model, which is applied to a small river system, with respect to different physical processes. We aim at determining if tracer concentration information can be used to calibrate a hydrodynamic model in a context similar to the study of Fenicia et al. (2010) who used tracer data to calibrate a hydrologic model.

The article is organized in three parts. First we present the hydro-morphodynamic model and the method adopted for the sensitivity analysis. Next, we detail the study area and the available observation dataset. Finally, we show the results of the study and discuss its main outcomes.

## 2 Methods

This section presents the modelling approach that has been adopted. The aim of the modelling exercise is twofold. The first objective is to set up an unsteady 2-D hydro-morphodynamic model capable of accurately predicting flood wave dynamics, dissolved contaminants (tracers) and sediment propagation during flood events. The second objective is to identify the most sensitive parameters of the model using different

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kinds of observations and to evaluate how tracers can help for a better calibration of the model.

As noted above, the calibration of such a model is far from trivial especially because there are, in addition to physical parameters, site specific, empirical and semi-empirical parameters that need to be calibrated (Hardy et al., 2000). In this context, we propose to carry out a sensitivity analysis of the hydro-morphodynamic model.

Following the recommendations proposed by Hardy et al. (2000) and Benjankar and Yager (2012), we propose to make use of a modelling system able to carry out unsteady simulations, to take account of advection and diffusion processes, feedback processes between topography and hydrodynamic variables and to integrate input suspended sediment concentration as boundary conditions. According to these requirements, the model that has been set up is based on the open source Telemac hydro-informatic system (release 6.2) (Hervouet and Bates, 2000). The latter allows for dynamically coupling a 2D-shallow water hydrodynamic model – Telemac-2D – and a sediment transport/morphodynamic model – Sisyphe.

## 2.1 The hydrodynamic model

Telemac-2D is a two dimensional shallow water hydrodynamic model. It solves the de Saint-Venant equations – also called the shallow water equations (conservation of mass and momentum, see Eqs. 1–3) – and predicts, among other hydraulic variables, water depth and fluid velocity at every node of a triangular mesh representing the model domain. The following paragraphs present the main mathematical features of Telemac-2D that are relevant for our study. For more details, readers are referred to the Telemac-2D user manual (Lang, 2010).

$$\frac{\partial h}{\partial t} + \mathbf{w} \cdot \nabla(h) + h \cdot \text{div}(\mathbf{w}) = S_h \quad (1)$$

$$\frac{\partial u}{\partial t} + \mathbf{w} \cdot \nabla(u) = -g \frac{\partial \eta}{\partial x} + F_x + \frac{1}{h} \text{div}(h v_t \nabla u) \quad (2)$$

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$$\frac{\partial v}{\partial t} + \mathbf{w} \cdot \nabla(v) = -g \frac{\partial \eta}{\partial x} + F_y + \frac{1}{h} \text{div}(h\nu_t \nabla v) \quad (3)$$

In Eqs. (1)–(3)  $h$  is the water depth,  $\eta$  the water surface elevation,  $t$  the time,  $\mathbf{w}$  the fluid velocity (vector of component  $u$  and  $v$  along spatial dimensions  $x$  and  $y$ ),  $\nu_t$  the momentum diffusion coefficient,  $F_x$  and  $F_y$  represent momentum source/sink terms (e.g.: friction force on the river bottom, wind force...). Turbulence could play an important role in suspended sediment transport processes. To model the turbulence and take account of its vertical component that is neglected due to averaging over the vertical dimension, we make use of the k-epsilon formulation (Launder and Sharma, 1974).

Telemac-2D can also simulate current entrainment as well as the diffusion of tracers (e.g. dissolved PHE concentrations). For this purpose, the model solves the conservation equation for the tracer  $T$  (see Eq. 4)

$$\frac{\partial T}{\partial t} + \mathbf{w} \cdot \nabla(T) = S_T + \frac{1}{h} \text{div}(h\nu_T \nabla T) \quad (4)$$

In Eq. (4),  $T$  represents the tracer quantity (e.g. concentration in  $\text{g l}^{-1}$ ),  $S_T$  a source/sink term and  $\nu_T$  the tracer diffusivity coefficient. In this equation, the source can be contaminant inputs or outputs. In this context, it has to be noted that in the event of non-conservative tracers, it is possible to program a decay function.

## 2.2 The sediment transport-morphodynamic model

Sediment transport is simulated using Sisyphé, the morphodynamic model of the Telemac hydro-informatic system. Sisyphé does not allow directly for the simulation of contaminant transport in the particulate phase, as the chemical processes related to the adsorption/desorption of contaminants on/from suspended sediment particles is not included. In this first study, we assume that the modelling of suspended sediment

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transport might help estimate contaminant concentrations of the particulate phase in the water column.

Telemac-2D and Sisyphe were dynamically coupled with an identical simulation time step. After each hydrodynamic simulation time step, Telemac-2D sends its hydrodynamic state variables to Sisyphe, which carries out the morphodynamic simulation and outputs the morphodynamic state variables back to Telemac-2D. The dynamical coupling offered by the Telemac hydro-informatic system allows the effect of bed evolution on water propagation to be taken into account.

Sisyphe simulates erosion, deposition, bed load and suspended sediment transport in the water column (Villaret, 2010). It is based on established semi-empirical equations for sediment transport and decomposes the underlying processes into bed load and suspended load. Considering that the estimation of contaminant deposition in the floodplain is of primary interest, the target processes are the suspended sediment transport and deposition. Sisyphe carries out the bed evolution computation using the Exner equation (Exner, 1920, 1925).

The transport of suspended sediment is computed using Eq. (5):

$$\frac{\partial hC}{\partial t} + U_{\text{conv}} \frac{\partial C}{\partial x} + V_{\text{conv}} \frac{\partial C}{\partial y} = \frac{1}{h} \left[ \frac{\partial}{\partial x} \left( h \epsilon_s \frac{\partial C}{\partial x} \right) + \frac{\partial}{\partial y} \left( h \epsilon_s \frac{\partial C}{\partial y} \right) \right] + \frac{E-D}{h} \quad (5)$$

where  $C$  is the depth-averaged suspended sediment concentration,  $E$  and  $D$  the erosion and deposition rates at the bed load/suspended load layer interface,  $\epsilon_s$  the coefficient of dispersion and  $U_{\text{conv}}$  and  $V_{\text{conv}}$  the convection velocity components.

For the computation of erosion/deposition rates (see Eq. 5), numerous empirical equations are implemented in Sisyphe. In particular, equations used for erosion and deposition calculation depend on the cohesive properties of riverbed material. The riverbed material can then be considered as non-cohesive or cohesive. A recent development of Sisyphe offers the capability to simulate cohesive/non cohesive sediment mixtures. The erosion rate computation follows the method proposed by Waeles (2005) (see Eq. 6).

If the bed is composed of less than 30 % of mud (cohesive sediment with grain size lower than 63  $\mu\text{m}$  as defined by Villaret, 2010) the erosion rate computation is conditioned by the suspended sediment equilibrium concentration (see Eq. 6). By default in Sisyphe, the equilibrium concentration is estimated using the formula proposed by Zyserman and Fredsoe (1994) based on the Shield parameter (Eq. 6).

If the bed is composed of more than 50 % of mud, then the erosion/deposition rate computation is based on the Krone and Partheniade formulation (Partheniades, 1965) conditioned by the nominal settling velocity of mud particles in (still) water and on two critical sheer velocities, namely for erosion and deposition (Eq. 6). If the mud ratio is inbetween 30 and 50 %, a linear interpolation is performed between the two above mentioned formulations (Eq. 6).

$$E_{1+2} = \begin{cases} M \left[ \left( \frac{u^*}{u_e^*} \right)^2 - 1 \right] & \text{for } u^* > u_e^* (P_2 \geq 0.5) \\ W_{s1} C_{\text{eq}} & \text{for } u^* > u_e^* (P_2 \leq 0.3) \end{cases} \quad (6)$$

$$\text{with } C_{\text{eq}} = \frac{0.331(\theta' - \theta_c)^{1.75}}{1 + 0.72(\theta' - \theta_c)^{1.75}}$$

$$D_{1+2} = D_1 + D_2$$

$$\text{with : } \begin{cases} D_1 = W_{s1} C_{Z_{\text{ref}}} \\ D_2 = W_{s2} C \left[ 1 - \left( \frac{u^*}{u_d^*} \right)^2 \right] & \text{for } u^* < u_d^* \end{cases} \quad (7)$$

In Eqs. (6) and (7), indices 1 and 2 refer, respectively, to sand and mud,  $M$  is the Partheniade constant,  $W_s$  the settling velocity of particles in water,  $P_2$  the percentage of mud in the riverbed,  $\theta_c$  the Shield parameter,  $C$  the suspended sediment concentration,  $C_{\text{eq}}$  the suspended sediment equilibrium concentration,  $C_{Z_{\text{ref}}}$  the suspended sediment reference concentration (estimated from  $C$  based on Rouse profile),  $u^*$  the

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local shear velocity and  $u_d^*$  and  $u_e^*$  the critical shear velocities respectively for deposition and erosion. The Shield parameter corresponds to the adimensional sheer stress value beyond which erosion starts to occur. Using this formulation, erosion is computed as a global flux of sand and mud together, whereas deposition is computed separately for mud and sand particles. This reflects real behaviour in the sense that the ability of the riverbed material to resist erosion is a global property of riverbed material, whereas the deposition of individual particles depends on individual particle characteristics. Moreover, looking at Eq. (6), it has to be noted that on one hand parameters  $\theta_c$  and  $W_{s_1}$  and on the other hand parameters  $u_d^*$  and  $W_{s_2}$  can potentially have compensating effects on erosion and deposition.

The concept of suspended sediment equilibrium concentration is used in this equation in order to characterise a tendency to erode or deposit sediment. Indeed, a simulated suspended sediment concentration larger than the equilibrium concentration implies a tendency to deposit, whereas a simulated suspended sediment concentration smaller than the equilibrium concentration implies a tendency to erode the riverbed. It has to be noted that the equilibrium concentration in Eq. (6) is a global value computed for all sediment classes. The equilibrium concentration is distributed in each sediment class proportionally to the sand grading in the riverbed. Therefore, the sand grading curve can have a non negligible effect on erosion and deposition processes.

In our study, suspended sediment measurements only considered particles with diameters lower than  $63\ \mu\text{m}$ . Particle of such diameters are defined as cohesive in Sisyphé according to Villaret (2010). This was supported by observation as the riverbed material appeared cohesive during field campaigns. Consequently, we took advantage of the recent development of Sisyphé that allows for modelling graded cohesive/non cohesive sediment mixtures. Using this approach two classes of sediment can be defined; the first one corresponding to non-cohesive (sand) and the second to cohesive (mud) sediment.

### 2.3 The sensitivity analysis and the evaluation of the model results

First tests of an all-at-once evaluation of model parameters governing the hydrodynamic and the morphodynamic processes show that it is quite difficult to interpret the results due to parameters having compensating effects on each other. It has to be noted that this problem has already been observed and discussed in many modelling exercises and is often referred to as the equifinality of model parameters (Beven, 2000).

As a consequence, we decided to carry out a two-step sensitivity analysis considering that the dataset used for the calibration of the hydrodynamic model (discharge, water surface elevation and tracer concentrations) and for the calibration of the morphodynamic model (sediment concentrations) are independent. First, we focused on hydrodynamic parameters and only afterwards we considered the morphodynamic parameters. In this context, a first analysis is performed using only Telemac-2D with tracer transport simulation. Next, simulations of sediment transport are carried out and analysed considering that the hydrodynamic parameters have already been calibrated during the first analysis. The sensitivity analysis is based on a random sampling of model parameter sets from an a priori defined range of physically plausible parameter values. Subsequent model simulations are carried out for each generated parameter set. Finally each model result is compared to a set of observations and subsequently, model skill scores are computed for each parameter set.

The selected hydrodynamic parameters are the Strickler friction coefficient and tracer diffusivity coefficient. The tracer diffusivity coefficient is assumed to be spatially uniform. In a previous study, Werner et al. (2005) and more recently Hostache et al. (2010) argued that it is quite difficult, even with advanced assimilation techniques (Lai and Monnier, 2009) and spatially distributed water surface data, to calibrate distributed friction coefficients in a river channel. As a consequence we decided to consider two different values of the friction coefficients; one for the river streams, and one for the floodplain.

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The parameters that we considered in the sensitivity analysis of the morphodynamic model are the critical shield parameter for sand and the settling velocities of sand and mud (see Eq. 6).

### 3 Study area and available data

#### 3.1 Study area

Due to important urban and industrial developments since 1900, the southern part of the Grand Duchy of Luxembourg suffers from substantial PHE contamination from various origins (Hissler et al., 2008). The upper Alzette River, which drains this historical steel basin in Luxembourg presents all the characteristics of a good test site for evaluating small river system and alluvial plain contamination. The study area of about 2.2 km<sup>2</sup> is located at the outlet of a 290 km<sup>2</sup> river basin (see Fig. 1). In this part of the basin, the Alzette riverbed has a mean slope of around 0.1 %, a mean depth of around 4 m and a mean top width of around 12 m. It has two main tributaries (see Fig. 1), namely the Bibeschbach on its left side and the Crauthembach on its right side.

As a test case, we propose to focus on two flood events that occurred in January and December 2011. Whereas the January flood event was responsible for a rather large floodplain inundation, during the December one flows mostly remained in-channel with only sparse overbank flow.

#### 3.2 Topography/bathymetry data

The set up of the hydro-morphodynamic model requires accurate information about the topography (ground elevation) and the bathymetry (shape and elevation of the riverbed). The topographic data are derived from a Lidar digital elevation model (DEM) representing the ground surface elevation with a pixel size of 2 m and a theoretical accuracy on the elevation of ±15 cm. The bathymetry data for Alzette River are available

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as ground surveyed cross sections (26 in the study area, see Fig. 1) with a theoretical elevation accuracy of a few centimetres. Between these cross sections, the Alzette riverbed elevation has been linearly interpolated in order to draw a continuous riverbed across the study area. The bathymetry of the two tributaries have been interpolated between two ground surveyed cross sections (one at the upstream end and one at the downstream end of each tributary). This interpolation has been performed along digitized riverbed lines. The banks, the roads and the other hydraulic singularities present in the study area have also been digitized. The triangular mesh representing the model domain was drawn from the river lines and the bank, road and hydraulic singularity lines and the elevation of each node was derived from the DEM in the floodplain and interpolated between observed cross sections in the riverbeds. The triangular mesh that was thereby produced contains 25 086 nodes.

### 3.3 Hydrometric data

The study area is equipped with four stream gauges (see Fig. 1) recording the water surface elevation every 15 min. During the January 2011 flood event, the stream gauge in the upstream part of the Crauthembach tributary was not operational. Considering that this event is really interesting due to substantial floodplain inundation, the discharge hydrograph at this section was estimated from observations of other flood events. In addition to the water surface elevation records, discharge measurements during flood events have been carried out at the following stream gauges: upstream Alzette (BCAI1), upstream Crauthembach (BCCr), upstream Bibeschbach (BCBi) and downstream Alzette (BCAI2) (Fig. 1). These measurements allowed us to estimate rating curves for each gauge (i.e.: the discharge/water surface elevation relationship – at BCAI1, BCCr, BCBi and BCAI2. Figure 2a and b present the discharge hydrographs recorded during the January and December 2011 flood events respectively.

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depth) were collected on a regular grid of 100 m spacing for all the study area. The Zn concentration was determined by ICP-MS after digestion of the soil samples using a HCl/HNO<sub>3</sub> mixture.

## 4 Results and discussion

In the following sections, the two-step sensitivity analysis proposed in Sect. 2.3 is carried out and discussed using as a test case the January 2011 flood event. The January 2011 flood event has been chosen for the sensitivity analysis because the flood level and the observed suspended sediment concentrations were higher than during the December 2011 flood event. In addition, we propose to further evaluate the calibrated model on the basis of a simulation of the December 2011 flood event.

### 4.1 Hydrodynamic model sensitivity analysis

The aim of the first step of the sensitivity analysis is twofold. On the one hand we want to analyse the identifiability of model parameters. On the other hand we want to evaluate which dataset is the most powerful for the calibration. In particular, we want to see if the concentration of selected chemical tracers can be used as an alternative to more traditional hydrometric data for the calibration of a hydrodynamic model.

For the friction parameters, we assumed homogeneous values in the river channels and in the floodplain. 150 plausible parameter sets have been randomly generated within uniform distributions ranging from 25 to 45 for the channel Strickler coefficient and from 15 to 35 for the floodplain Strickler coefficient, and from 10<sup>-7</sup> to 10<sup>-4</sup> m<sup>2</sup> s<sup>-1</sup> for tracer diffusivity coefficients. One could argue that the number of generated parameter sets is rather limited but considering the duration of one simulation (approximately one day) it seems not easily feasible to increase this number. Moreover, we believe that albeit limited, the number of parameter set might be sufficient for capturing parameter sensitivity. For each generated parameter set, the results were compared against

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observations using a slightly modified version of the Nash-Sutcliffe Efficiency (NSE) (Nash and Sutcliffe, 1970). The NSE is a model skill score expressing the percentage of variance of the observations explained by the model results. A NSE value of 1 means a perfect fit between model results and observations. In the modified version of the NSE we used, called NSE\* hereafter, we took account of observation uncertainty, meaning that the fit between observations and model results is considered as perfect if model results are included in intervals representing the observation uncertainty (see Eq. 8).

$$\text{NSE}^* = 1 - \frac{\sum_t (\Delta_{S-O})^2}{\sum_t (O - \bar{O})^2} \quad (8)$$

$$\text{with } \Delta_{S-O} = \begin{cases} S - (O + u_O) & \text{if } S > (O + u_O) \\ S - (O - u_O) & \text{if } S < (O - u_O) \\ 0 & \text{otherwise} \end{cases}$$

In Eq. (8),  $S$  is the simulated variable,  $O$  the observed variable,  $\bar{O}$  the time average of the observed variable and  $u_O$  the uncertainty of the observation. The uncertainty is set to  $\pm 2$  cm for water surface elevation, and to  $\pm 10\%$  of the observed values for discharge and tracer concentrations. This uncertainty bounds have been estimated from past experiments where the same measurement was repeated many times subsequently or at slightly different locations. NSE\* has the main advantage of exhibiting comparable values for different kinds of observations. Moreover, model results falling within the uncertainty bounds of the observation are considered equal as further distinction is not possible with the observations.

In this study, we used as tracers the dissolved gadolinium (Gd), dissolved lead (Pb) and dissolved zinc (Zn) concentrations.

As upstream boundary conditions discharge hydrographs and tracer concentration temporal evolutions are imposed at BCAI1, BCBi and BCCr (Fig. 1). As a downstream boundary condition (see point BCAI2, Fig. 1), a water surface elevation hydrograph is imposed and a free exit of tracer concentrations is used.

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As an initial condition we used the steady state (water surface elevation, velocity and tracer spatial distribution) reached after a 6 h-simulation using as boundary condition the same as those at the start of the dynamic run.

The NSE\* has been computed for all available observations and all model simulations. Figure 3 shows the results of the evaluation. In these dot plots, each dot corresponds to one model simulation (one parameter set). The values in X are the parameter values (channel or floodplain Strickler coefficients). The values in Y correspond to the NSE\* values calculated by comparing simulated and observed data (water surface elevation, discharge and Gd, Pb and Zn concentrations). Each colour reflects a different observation location (stream gauge location). A clear trend in the dot plot shape indicates a high sensitivity of the model result with respect to the considered parameter and a good identifiability of the parameter. On the contrary, a rather flat dot plot indicates that the model is less sensitive to the considered parameter and that this parameter most likely suffers from the equifinality issue. The range of the dot plot provides additional information, showing the overall sensitivity of the model results to the considered parameter with respect to the observed variable. A large range shows that variations of the considered parameters are responsible for significant differences in model results whereas a small range indicates that the model results are similar for every tested parameter values.

The dot plots obtained with respect to the tracer diffusivity coefficient exhibited no significant sensitivity and are not presented in this paper. This is rather surprising since we expected this parameter to have a significant effect on simulated tracer concentrations. This shows that the tracer concentrations are mainly governed by current entertainment instead of diffusion phenomena. The relatively sharp peak exhibited in Fig. 3a shows that the water surface elevations simulated by the model are mainly sensitive to Kc, the channel friction coefficient, whereas Fig. 3b indicates a limited sensitivity to Kf, the floodplain friction coefficient, when comparing simulated and observed water surface elevation. In Fig. 3c and d, when comparing observed and simulated discharge at BCA12 stream gauge location it appears that the model is rather sensitive to

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Kc and to a lesser extent to Kf. When comparing Fig. 3b and d, the sensitivity of the model to Kf is more visible for the evaluation on the discharge at BCAI2 (Downstream Alzette) than on water surface elevation at BCAI1 (Upstream Alzette). This is most likely due to the fact that BCAI2 is the downstream boundary condition. As a consequence, the downstream hydrograph is a more integrative dataset with respect to both Kc and Kf. Moreover, in Fig. 3a and c the best model performances are obtained for similar values of Kc, indicating a good agreement of the model results with the two kinds of data.

Figure 3e to j indicates, at first view, significant sensitivities of the model to Kc when comparing simulated and observed Gd, Pb and Zn tracer concentrations at the BCAI2 stream gauge. However, one can notice that these three plots are in contradiction since the best model performances are obtained for markedly different Kc values. From this point many questions with respect to the model results arise. To better address this issue, Fig. 3 shows simulated water surface elevations and concentrations of Gd, Pb and Zn. In this figure, each black line corresponds to the results provided by Telemac-2D using one parameter set and the red stars correspond to the observations. By comparing Fig. 3a with Fig. 3b to d, one can see that the behaviour of the model ensemble is markedly different for water surface elevation than for the chemical tracer concentrations. Indeed, whereas the spread of simulated water surface elevation is rather large and encompass the observed one, the range of the simulated tracer concentrations are limited and the observations frequently lie outside the ensemble of simulated concentrations. This shows the limited sensitivity of the tracer concentrations to targeted model parameters. The different values of NSE\* obtained in Fig. 3e to i are then dominated by a few time steps for which some parameter sets provide better results, but no parameter set clearly outperforms any other for the whole simulation period. This hampers a straightforward interpretation of the trends observed in Fig. 3e to i. In Fig. 3b to d, it is reasonable to say that the temporal dynamics of tracer concentration are globally well captured by the ensemble of model results. This shows that the model, if calibrated using only water surface elevation and/or discharge, is able to predict tracer concentration

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with an acceptable accuracy. However, the calibration of the hydraulic model using only observations of chemical tracer concentrations is not a suitable option.

As a matter of fact, one of the main outcomes of the sensitivity analysis of the hydrodynamic model is that these three trace metal concentrations cannot substitute traditional calibration datasets (water surface elevation and discharge). This implies moreover that the model calibrated using water surface elevation and discharge hydrographs is able to predict tracer concentrations satisfactorily, whereas a hydrodynamic model calibrated using only observations of tracer concentrations would not necessarily be able to predict water surface elevation and discharge accurately.

To define the best parameter set that will be used for the morphodynamic modelling, we decided to use the parameter set providing the best performance over the hydro-metric calibration dataset (water surface elevation and discharge). To do so, we first rescaled the NSE\* obtained for each observed dataset between 0 and 1. Next, we computed an overall performance score as the average of the previously computed rescaled values of NSE\* and the parameter set providing the best overall performance score was considered as optimal. This method for computing the overall performance score has been chosen since it gives the same weight to each observation. The parameter set identified as optimal is the following:  $K_c = 32$  (unitless),  $K_f = 23$  (unitless) and  $\nu_T = 10^{-6} \text{ m}^2 \text{ s}^{-1}$ .

## 4.2 Morphodynamic model sensitivity analysis

The aim of the second step of the sensitivity analysis is to analyze the identifiability of the morphodynamic model parameters using observed suspended sediment concentration. In addition, it proposes to qualitatively evaluate model results by comparing the simulated sediment deposition map with point samples of floodplain soil contamination.

As proposed in section 2.3, the targeted parameters for the sensitivity analysis of the morphodynamic model are the critical Shield parameter ( $\theta_c$ ) and the settling velocities for sand ( $W_{s_1}$ ) and mud ( $W_{s_2}$ ) particles. In addition to these three parameters, as it is difficult to estimate an average sand grading curve for the whole river reach and as

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we saw previously that the sand grading curve could play a role in the sediment erosion/deposition processes, we decided to consider the percentage of mud in the Alzette (pma) and Crauthembach (pmc) riverbeds as two additional model parameters. To carry out the sensitivity analysis, we adopted the approach previously presented for the hydrodynamic model. We first randomly generated 180 parameter sets within the following ranges: pma in  $[.01 \ .10]$ , pmc in  $[.10 \ .30]$ ,  $W_{s_1}$  in  $[10^{-6} \ 10^{-3}] \text{ m s}^{-1}$ ,  $W_{s_2}$  in  $[10^{-7} \ 10^{-4}] \text{ m s}^{-1}$  and  $\theta_c$  in  $[.01 \ .45]$ . Again, one could argue that the number of generated parameter sets is rather limited but considering the duration of one simulation (more than one day) it seems not easily feasible to increase this number. Moreover, we believe that albeit limited, the number of parameter set might be sufficient for capturing parameter sensitivity. Next, for each generated parameter set, we carried out dynamically coupled Telemac-2D-Sisyphé simulations. For each simulation, we compared simulated and observed suspended sediment concentrations at BCAI2. For this evaluation, we made use of NSE\* defined in Eq. (8). The uncertainty on the suspended sediment concentration has been assumed to be equal to  $\pm 10\%$  of the observed values. This uncertainty value was estimated from measurements performed at the same time for various river discharge conditions, on close locations (various depth in the water column and various points on a river cross section). It is worth mentioning here that the suspended sediment concentration measurements considered mud particles.

The dotty plots resulting from the model evaluation are presented in Fig. 4. The critical shield parameter (Fig. 4e), the mud and sand ratio in the Alzette (Fig. 4a) and Crauthembach (Fig. 4b) riverbeds are of rather limited importance since similar model performance values have been obtained using markedly different values of these parameters (rather flat dotty plots). As a consequence, it is worth noting in this figure that the most sensitive parameter of the model is the settling velocity of mud particles (Fig. 4d). This result is in agreement with the remark by Villaret (2010) arguing that, in Sisyphé, due to the cohesive component of the second class of riverbed material, the settling velocity of mud rather than the particle diameter might be the governing parameter for sediment transport. Figure 4c exhibit some sensitivity of the model to the

settling velocity of sand particles as the model evaluation clearly penalizes very small values for the sand particle settling velocity. This result is sensible as sand particles have larger diameter than mud particles and must therefore have lower settling velocity in water.

To select the optimal parameter set we consider the parameter set yielding the best performance (NSE\*). The parameter set identified as optimal is the following:  $pma = 5\%$ ,  $pmc = 19\%$ ,  $W_{s_1} = 6.81 \times 10^{-5} \text{ m s}^{-1}$ ,  $W_{s_2} = 1.99 \times 10^{-5} \text{ m s}^{-1}$ , and  $\theta_c = 0.02$ . Table 1 summarizes the performances reached by the calibrated hydro-morphodynamic model. Figure 5 Shows the simulated (calibrated model) and observed suspended sediment concentrations at BCAI2. In this figure, the simulated suspended sediment concentration captures correctly the temporal evolution of the observed suspended sediment concentration. The first peak is slightly overestimated while the second one is inversely underestimated. This is likely due to a too important simulated erosion during the beginning of the flood event and, on the contrary, a too important simulated deposition during the following time steps. However, the overall fit between observed and simulated sediment concentration is rather good, which indicates that the calibrated hydro-morphodynamic model is capable of predicting the downstream suspended sediment concentration satisfactorily.

In order to further evaluate model results we qualitatively compared the deposition map obtained from the model with soil contamination maps derived on the basis of Fig. 6. The latter presents the map of fine sediment deposition simulated by the calibrated model during the January 2011 flood event. The black circles represent the Zn concentration in the surficial layer (0–5 cm depth) of the soils. The larger this circle the greater the soil contamination. As this contamination is mainly due to sediment deposition in the floodplain during the successive flood events, the soil contamination sampling can be considered as a proxy for contaminated sediment deposition. As a matter of fact, there should be some similarities between the sediment deposition map simulated by the model and the soil contamination. In Fig. 6, most of the areas with high deposition (in red and yellow) are overlapped by circles of rather large

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diameters, especially in the downstream areas (North-Western part). On the contrary, circles of rather limited diameter (locations less impacted by river sediment deposition) are located in areas where the model predicts limited deposition (blue) to no deposition (white). In addition, in the upstream part of the domain (western part), one can remark that some large circles are located where the model does not simulate any deposition. This can be easily explained by the fact that the soil contamination dataset integrates information from many flood events, with some of higher magnitude than the January 2011 flood event. These are therefore responsible for larger flood extents and larger zones of deposition. Moreover, the temporal evolution of the floodplain topography causes changes in the preferential flowpaths followed by the water in the alluvial area during the flooding. This comparison also highlights the similarity of the dispersion between the geochemical information and the model simulation.

Consequently, a rather good consistency between the two sets of information is obtained despite some local mismatch. This indicates that the capability of the model to identify the main sediment deposition areas is satisfying. Moreover, this indicates at the same time that the simulated deposition map can be used to infer interesting information about the tracer dispersion in the floodplain area. The main drawback in this respect is that only a qualitative characterisation of the pattern of contamination can be made as it is difficult to estimate the level of contamination the deposited sediment suffers from.

### 4.3 Evaluation of calibrated models on the basis of the December 2011 flood event

In order to further evaluate the calibrated hydro-morphodynamic model, we propose in this section to carry out a simulation for the December 2011 flood event. This second flood event is interesting because it is markedly different from the January 2011 flood event that has previously been used for the sensitivity analysis and the model calibration. First, the December 2011 was a flood event of lower magnitude and one key feature is that limited over-bank flow occurred during this event. Moreover, the

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contribution of the river Crauthemerbach in terms of sediment fluxes was very limited compared to the January flood event. This last point is interesting as it allows for evaluating the Alzette response more specifically. The results of the model have been evaluated against observed data using the NSE\* skill score. The obtained performances are listed in Table 1 in addition to the performances obtained during the January flood event.

The performances obtained are good especially with respect to the downstream discharge and the upstream water surface elevation with NSE\* values higher than 0.9. The temporal evolution of tracer concentrations are predicted satisfactorily by the model, with values higher than the ones obtained during the calibration. In particular, the model performance with respect to concentrations of Gd and Zn is good. The performance in predicting suspended sediment concentrations is slightly lower than during the calibration. Figure 7 presents simulated and observed suspended sediment concentration at BCAI2. In this figure, one can see that the model tends to slightly underestimate the sediment concentration, but the results appear satisfying. This underestimation could be due to the simplified representation of the flow velocity field in two dimensions in Telemac-2D. As a matter of fact the shear velocity could be underestimated especially for lower discharge.

As a consequence, the overall performances of the model for a flood event different from the one used for the calibration are satisfying. This indicates that the model can be used for predicting sediment transport/deposition and the associated dispersion of PHE contamination, for many flood events.

## 5 Conclusions

This study aimed at predicting sediment and contaminant dispersion in a small river system. To do so, a hydro-morphodynamic model was set up and a sensitivity analysis was carried out using multiple observation datasets in order to identify the most important parameters of the model. The model used in this study is the Telemac-2D-Sysiphe

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coupled model provided by the open source Telemac hydro-informatic system (release 6.2). An innovative point in this study is the rather unique measurement database including water surface elevation, discharge, dissolved trace metal concentration and suspended sediment concentration at two point locations. Taking benefit of this dataset one aim of the study was to see if trace metal concentrations can be used to calibrate the model in a way similar to the use of tracers for calibrating hydrologic models.

The sensitivity analysis was carried out on the basis of the January 2011 flood event and was split into two steps. The first step aimed at evaluating the hydrodynamic model and the second one the morphodynamic model.

The most sensitive parameters of the hydrodynamic model were the friction coefficients. The evaluation of the hydrodynamic model was carried out using measurements of water surface elevation and discharge, and in addition using trace metal concentration in the water column. It was found that tracer concentration was not an informative dataset for calibrating the hydrodynamic model as the variability of the simulated tracer concentration with changing parameter values was low. Moreover, considering that tracer concentrations were satisfyingly predicted by the model, we inferred that the model calibrated using usual hydrometric data (water surface elevation and discharge) was able to predict trace metal dispersion satisfactorily, whereas the model calibrated using only tracer concentration was not suitable. The performances reached by the calibrated hydrodynamic model were satisfying.

The most sensitive parameters of the morphodynamic model were found to be the settling velocity of sediment particles, divided into two diameter classes: mud (cohesive) and sand (non cohesive). The mud particle settling velocity was identified as the most sensitive parameter, but this result is mainly due to the fact that the model was evaluated using observed suspended sediment concentrations that were composed of mud particles only. The comparison of the simulated sediment deposition map with floodplain spatially distributed soil contamination information exhibited a rather good agreement between the two sources of data. This result, albeit qualitative, is quite

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encouraging as the zones where the model tends to deposit sediment are located on the most polluted areas.

The evaluation of the coupled model using a second flood event (December 2011) also yielded satisfying performances. This is also encouraging as it provides evidence that the model is robust and can be used to predict various flood events accurately.

One could argue that a 3-D modelling approach would be more accurate for sediment transport modelling as this tool is often utilized for sediment transport in marine and estuarine areas. We do not reject this possibility, and 3-D simulations are foreseen and will be compared to a 2-D approach in the near future. The main drawback of such an approach will be very long computation durations. An additional issue in 3-D modelling is the dynamic wetting and drying of flood flows so as water depths go to zero the vertical grid distorts and can become unstable.

*Acknowledgements.* This study was part of the DISMET project (Advanced Solutions for the Calibration of Heavy Metal Dispersion Contamination Modelling in Floodplains), financed by the National Research Fund (FNR) of the Grand Duchy of Luxembourg in the framework of the CORE research program (Contract no. C09/SR/18). We want to thank Eric David at ARTELIA Eau for his help in setting up the hydrodynamic numerical model and his expert advices. We want to thank Markus Jonas for his appreciated support for the use of the linux cluster that render this work possible and his help for the programming of the Monte-Carlo simulation code. We also want to thank Jean-François Iffly, Cyrille Tailliez, François Barnich, Jérôme Juilleret and Johanna Ziebel for their extensive work in the tasks of installing field equipments and collecting and analysing field observations.

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Variable	NSE* (calibration)	NSE* (validation)
WSE(BCAI1)	0.98	0.9
Q(BCAI2)	0.99	0.99
Gd(BCAI2)	-1.76	0.94
Pb(BCAI2)	0.42	0.58
Zn(BCAI2)	.6	0.93
SS(BCAI2)	0.83	0.67

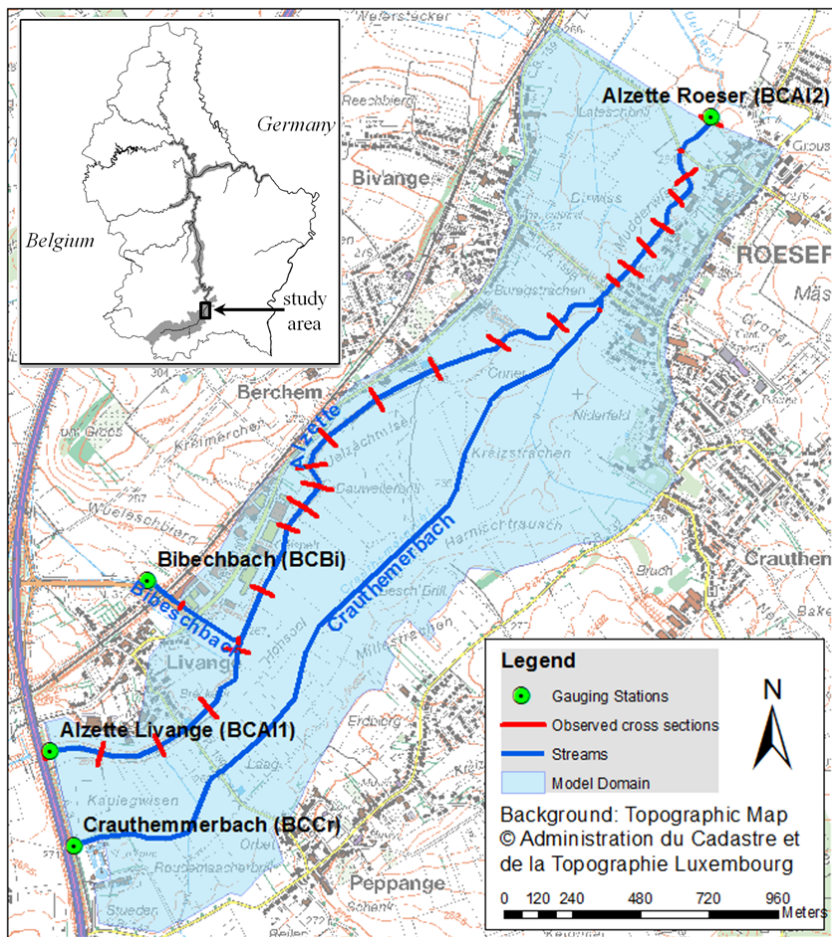


Fig. 1. Presentation of the study area and extension of the model domain.

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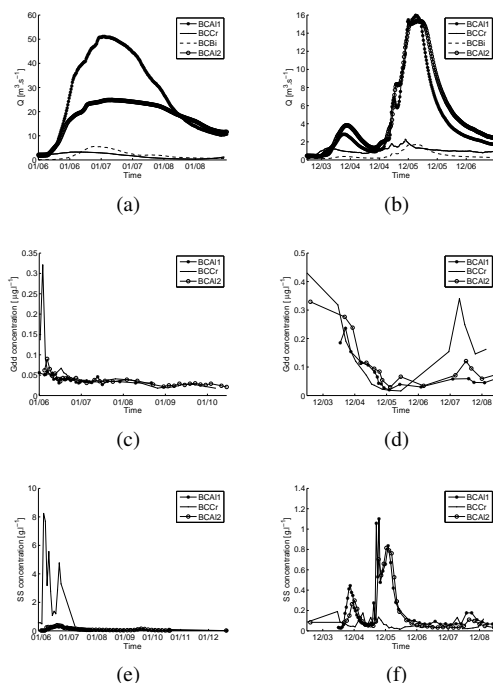
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**Fig. 2.** Observations made during January 2011 (left column) and December 2011 (right column) flood events: **(a)** and **(b)** discharge hydrographs, **(c)** and **(d)** dissolved gadolinium concentration, **(e)** and **(f)** suspended sediment concentration.

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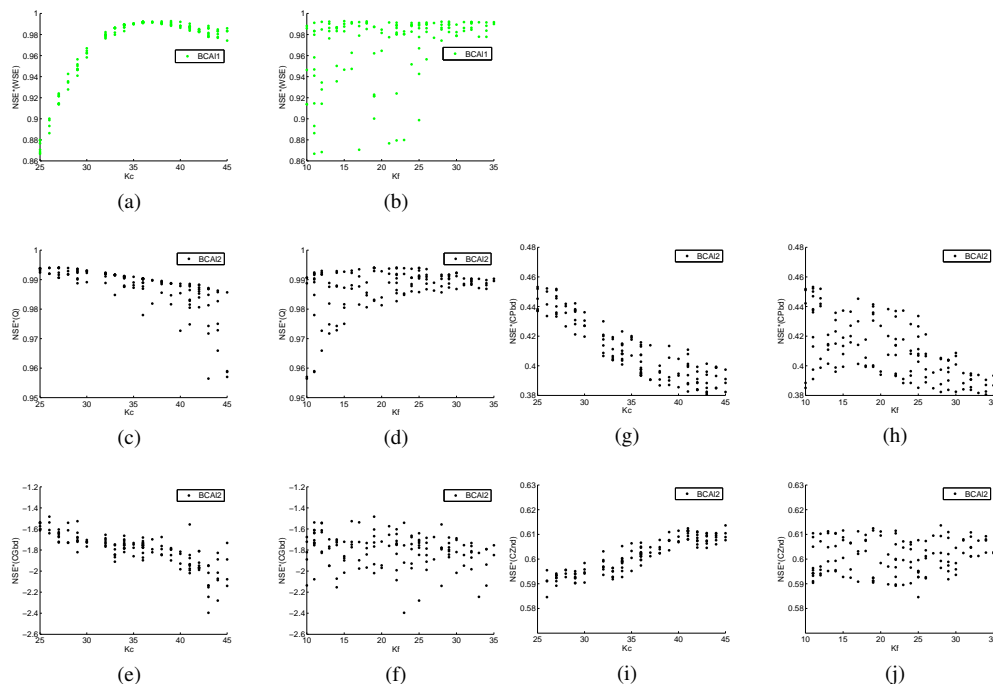
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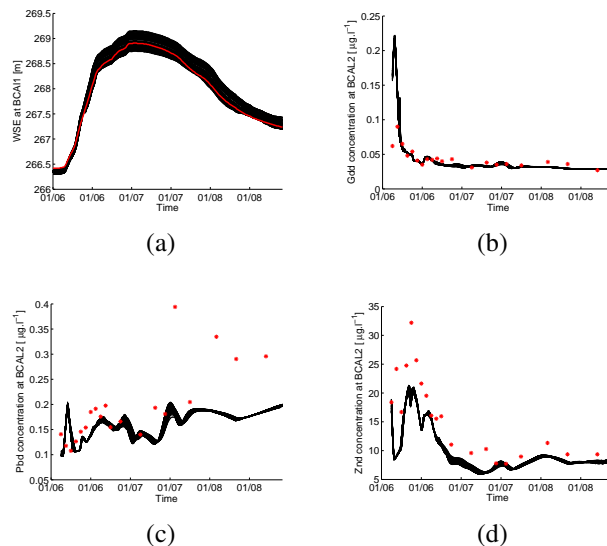


**Fig. 3.** Dotty plots of the hydrodynamic model sensitivity analysis: evaluation of simulated **(a)** water surface elevation (WSE) depending on channel Strickler coefficient ( $K_c$ ), **(b)** water surface elevation depending on floodplain Strickler coefficient ( $K_f$ ), **(c)** discharge ( $Q$ ) depending on  $K_c$ , **(d)** discharge depending on  $K_f$ , **(e)** dissolved gadolinium depending on  $K_c$ , **(f)** dissolved gadolinium depending on  $K_f$ , **(g)** dissolved lead depending on  $K_c$ , **(h)** dissolved lead depending on  $K_f$ , **(i)** dissolved zinc depending on  $K_c$ , **(j)** dissolved zinc depending on  $K_f$ .

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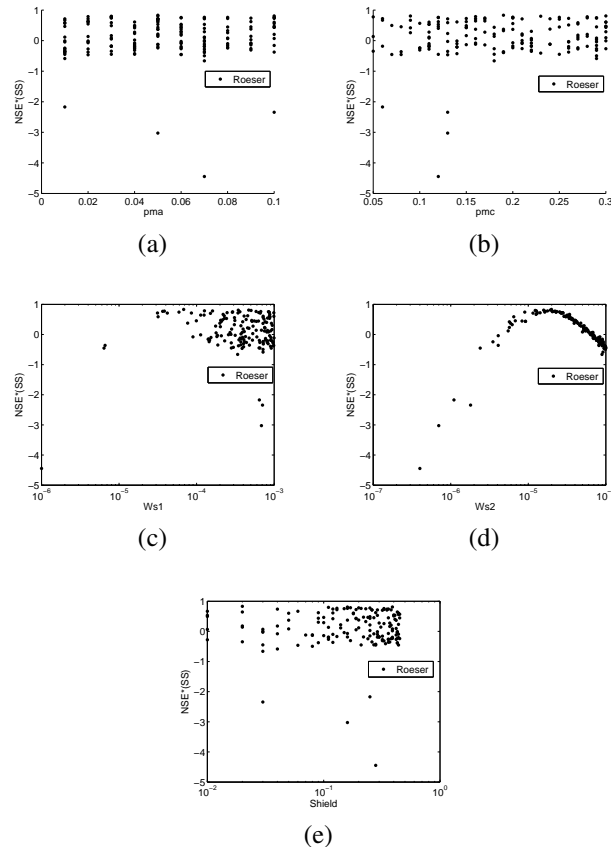
**Fig. 4.** Simulation results for every parameter sets (black lines) and observations (red stars): **(a)** water surface elevation (WSE), **(b)** dissolved gadolinium concentration, **(c)** dissolved lead concentration and **(d)** dissolved zinc concentration.

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**Fig. 5.** Dotty plots of morphodynamic model sensitivity analysis: evaluation of the simulated suspended sediment concentration according to **(a)** mud percentage in the Alzette riverbed (pma), **(b)** mud percentage in the Crauthemerbach riverbed (pmc), **(c)** settling velocity of sand particles ( $W_{s1}$ ), **(d)** settling velocity of mud particles ( $W_{s2}$ ) and **(e)** critical shield parameter ( $\theta_c$ ).

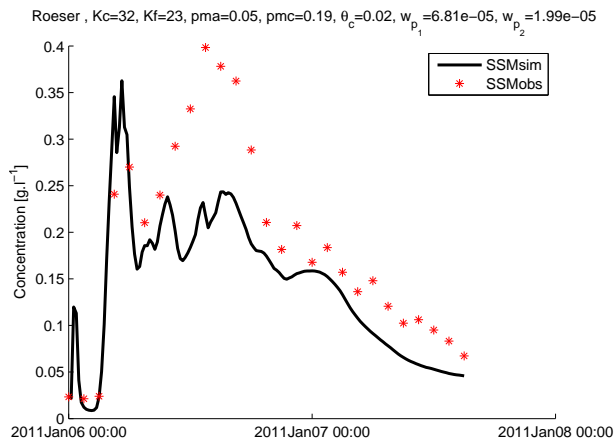
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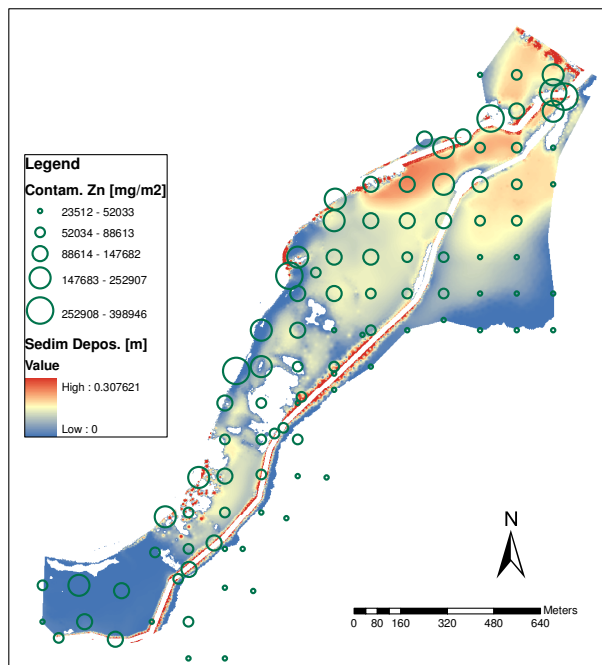
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**Fig. 6.** Observed and simulated temporal evolution of suspended sediment concentrations at BCAI2 during the January 2011 flood event using the best parameter set.

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**Fig. 7.** Comparison between the simulated fine sediment deposition map and the spatial distribution of the Zn contamination in the alluvial soils of the study area.

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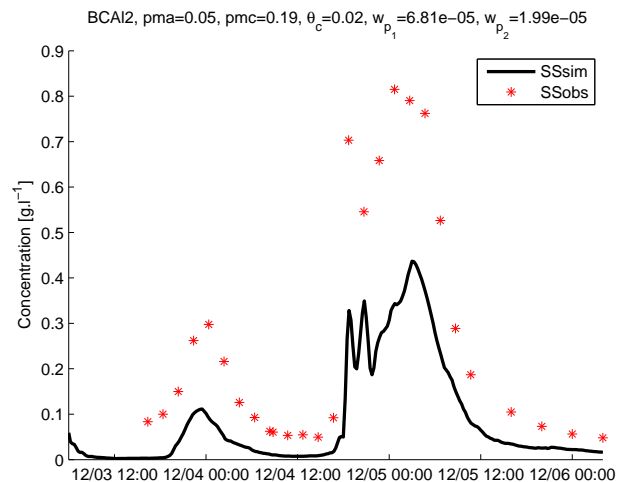
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**Fig. 8.** Observed and simulated temporal evolution of suspended sediment concentrations at BCAI2 during the December 2011 flood event using the calibrated model.

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