

# Numerics for Hydromorphodynamics Processes Relaxation Solvers and Stochastic Aspects

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# Saint-Venant – Exner Model : A CEMRACS Story

## ► CEMRACS 2011 : Numerical Simulation

Sediment transport modelling : Relaxation schemes for Saint-Venant Exner and three layer models.

Emmanuel Audusse, Christophe Berthon, Christophe Chalons, Olivier Delestre, Nicole Goutal, Magali Jodeau, Jacques Sainte-Marie, Jan Giesselmann and Georges Sadaka.

ESAIM Proc., Vol. 38, pp 78-98, 2012.

## ► CEMRACS 2013 : Stochastic Aspects

Numerical simulation of the dynamics of sedimentary river beds with a stochastic Exner equation.

Emmanuel Audusse, Sébastien Boyaval, Nicole Goutal, Magali Jodeau and Philippe Ung.

ESAIM Proc., Vol. 48, pp 312-340, 2015.

# Morphodynamic processes



Coastal erosion



River Morphodynamics



Dunes formation



Soil erosion

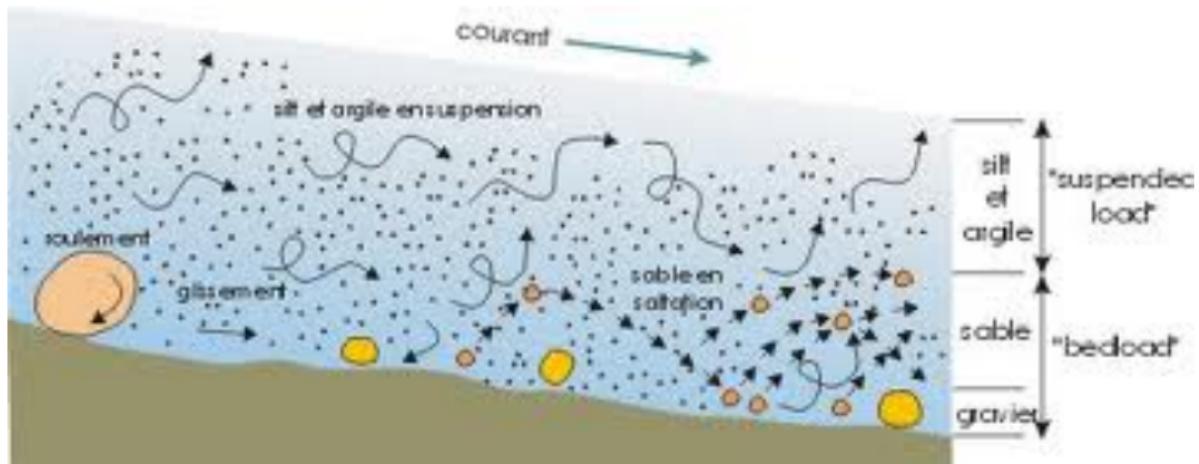


Dam drain



Industrial sites

# Morphodynamics processes



Morphodynamics process  
Suspended- and bedload

# Modelling for bedload transport

- ▶ Saint-Venant – Exner model
  - ▶ Implemented at the industrial level
  - ▶ Empirical derivation, no energy
  - ▶ Reasonable results for a large class of experiences
  - ▶ A lot of parameters to tune...
- ▶ Two-layer (Saint-Venant ?) models
  - ▶ Well-known in the hyperbolic community for bi-fluid modelling
  - ▶ Validity of the extension to bedload transport ?
  - ▶ Definition of the layers ?
  - ▶ Interfaces conditions ?
  - ▶ Rheology law in the solid part ?

# Saint-Venant – Exner model

## ► Equations

$$\partial_t h + \partial_x q_w = 0,$$

$$\partial_t q_w + \partial_x \left( \frac{q_w^2}{h} + \frac{g}{2} h^2 \right) = -gh\partial_x b - \frac{\tau_b}{\rho_w},$$

$$\rho_s(1-p)\partial_t b + \partial_x q_s = 0,$$

(Exner[25], Paola-Voller[05], VanRijn[93,06], Parker[06], Cordier[11],  
Garegnani[13]...)

## ► Comments

- Fluid quantities : Water depth ( $h$ ) and discharge ( $q_w$ )
- Sediment quantity : Position of the interface ( $b$ )
- 2 conservation equations + 1 dynamic equation

# Saint-Venant – Exner model

## ► Equations

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(Exner[25], Paola-Voller[05], VanRijn[93,06], Parker[06], Cordier[11],  
Garegnani[13]...)

## ► Comments

- No dynamics in the solid phase
- No sediment transport in the fluid phase
- Closure relations for friction term  $\tau_b$  and sediment flux  $q_s$

# Friction coefficient formulae

- ▶ Laminar flow

$$\tau_b = \kappa(h)u$$

Gerbeau[01]

- ▶ Engineers formulae

$$\tau_b = \kappa(h)u^2$$

- ▶ Chezy formula

$$\kappa(h) = \kappa$$

Formule pour trouver la vitesse uniforme que l'eau aura dans un fossé ou dans un canal dont la pente est connue.  
Applications pour la Seine et l'Yvette [Chezy, 1776]

- ▶ Manning formula

$$\kappa(h) = \frac{\kappa}{h^{1/3}}$$

Manning[1891]

# Sediment flux formulae

- ▶ Power laws (Exner[25], Grass[81])

$$q_s = A_g |\bar{u}|^m \bar{u}$$

- ▶ Shields parameter

$$\theta = \frac{|\tau_b|/\rho_w}{g(s-1)d_m}, \quad s = \rho_s/\rho_w, \quad \tau_b = \frac{u^2}{Kh^\alpha}$$

- ▶ Threshold sediment flux formulae

$$q_s = \Phi \sqrt{g(s-1)d_m^3}$$

- ▶ Meyer-Peter & Müller [48] :  $\Phi = 8(\theta - \theta_c)_+^{3/2}$
- ▶ Engelund & Fredsoe [76]:  $\Phi = 18.74(\theta - \theta_c)_+ (\theta^{1/2} - 0.7\theta_c^{1/2})$
- ▶ Nielsen [92] :  $\Phi = 12\theta^{1/2}(\theta - \theta_c)_+ \dots$

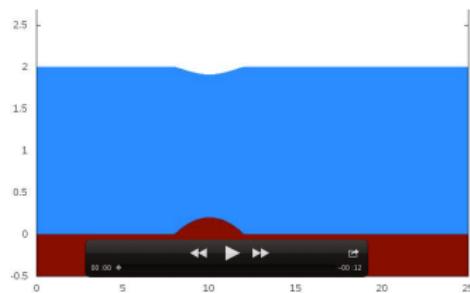
# "Steady" flow over a movable bump



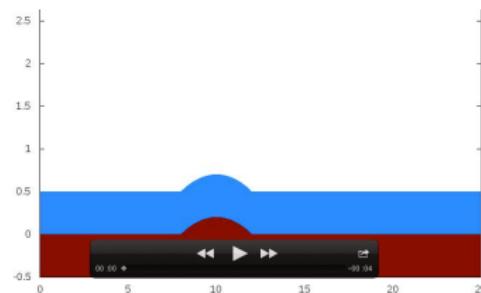
Dunes



Antidunes

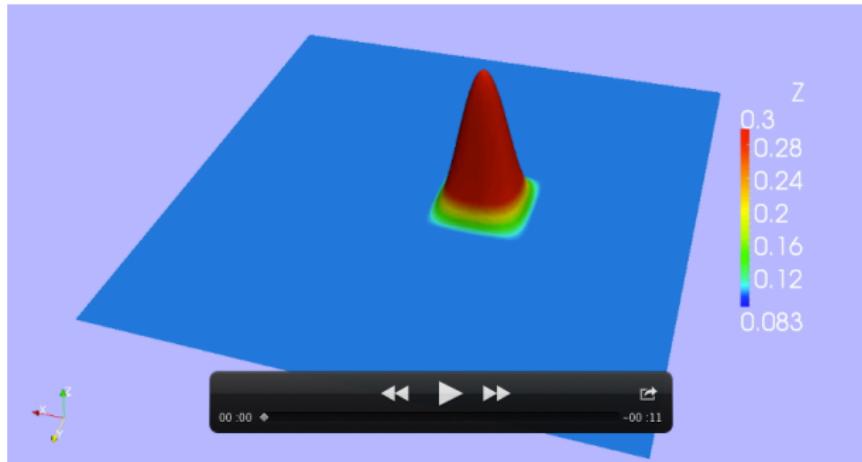


Fluvial flow



Torrential flow

# "Steady" flow over a movable bump in 2d



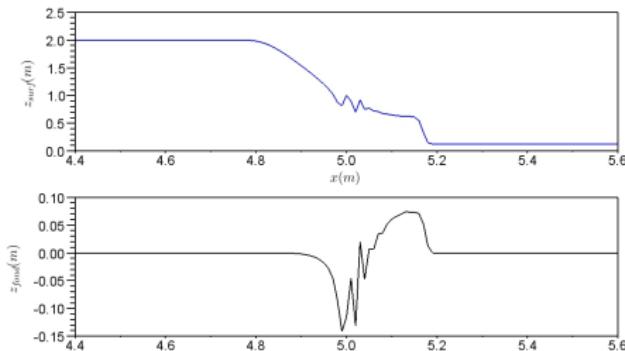
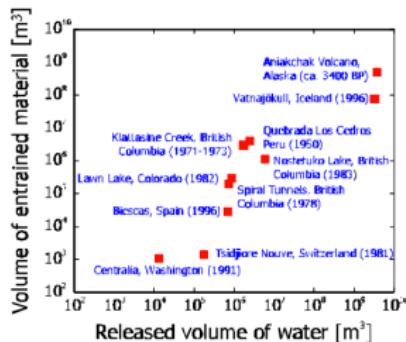
(O. Delestre, CEMRACS 2012)

# Numerical strategies for bedload transport

- ▶ Steady state strategy
  - ▶ Hydrodynamic computation on fixed topography  
~~ Steady state
  - ▶ Evolution of topography forced by hydrodynamic steady state
  - ▶ Efficient for phenomena involving very different time scales
- ▶ External coupling (time splitting)
  - ▶ Use of two different softwares for hydro- and morphodynamics
  - ▶ Allow to use existing solvers and different numerical strategies
  - ▶ Actual strategy in industrial softwares
  - ▶ Efficient for low coupling (?)
- ▶ Internal coupling
  - ▶ Solution of the whole system at once
  - ▶ Need for a new solver
  - ▶ Efficient for general coupling

(Hudson[05], Castro[08], Delis[08], Benkhaldoun[09], Murillo[10]...)

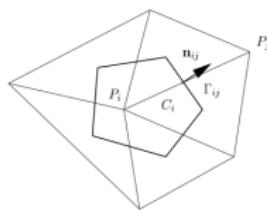
# Dam break : Failure for time splitting



External coupling (M. Jodeau, EDF)

# Finite Volume Method

$$\partial_t u + \nabla \cdot f(u) = 0, \quad u \in \mathbb{R}^p, \quad f : \mathbb{R}^p \rightarrow \mathbb{R}^{2 \times p}$$

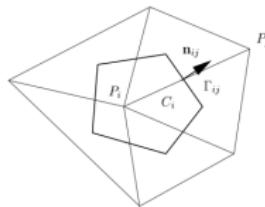


- ▶ Integration on the prism  $C_i \times [t^n, t^{n+1}]$

$$\int_{C_i} u(t^{n+1}, x) dx = \int_{C_i} u(t^n, x) dx - \sum_{j \in V(i)} \int_{\Gamma_{ij}} \int_{t^n}^{t^{n+1}} f(u(t, s)).n_{ij} dt ds$$

## Finite Volume Method

$$\partial_t u + \nabla \cdot f(u) = 0, \quad u \in \mathbb{R}^p, \quad f : \mathbb{R}^p \rightarrow \mathbb{R}^{2 \times p}$$



- ▶ Integration on the prism  $C_i \times [t^n, t^{n+1}]$

$$U_i^{n+1} = U_i^n - \sum_{j \in V(i)} \sigma_{ij}^n F(U_i^n, U_j^n, n_{ij}), \quad \sigma_{ij}^n = \frac{\Delta t^n |\Gamma_{ij}|}{|C_i|}$$

with

$$F(U_i^n, U_j^n, n_{ij}) \approx \frac{1}{\Delta t^n |\Gamma_{ij}|} \int_{\Gamma_{ij}} \int_{t^n}^{t^{n+1}} f(u(t, s)).n_{ij} dt ds$$

# Godunov scheme

## ► Riemann problem

$$\partial_t u + \partial_x f(u) = 0, \quad u(0, x) = \begin{cases} u_l & \text{if } x \leq 0 \\ u_r & \text{if } x > 0 \end{cases}$$

~~> Much more easy to solve than the general IBVP

## ► Godunov scheme

- Start from piecewise constant initial data
- Solve the Riemann pb at each interface  $x_{i+1/2}$ :  $u_{i+1/2}^r(t, x)$
- Fix the time step so that the Riemann problems do not interact
- Construct a global solution by merging the solutions of all the local Riemann problems

$$u^g(t, x) = u_{i+1/2}^r(t, x) \quad \text{if } x \in [x_i, x_{i+1}]$$

- Take the meanvalue of this solution at time  $\Delta t^n$

$$U_i^{n+1} = \frac{1}{\Delta x_i} \int_{x_{i-1/2}}^{x_{i+1/2}} u^g(\Delta t^n, x) dx$$

# Godunov scheme

## ► Riemann problem

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$$u^g(t, x) = u_{i+1/2}^r(t, x) \quad \text{if } x \in [x_i, x_{i+1}]$$

- For conservative equations, equivalent with FV approach

$$F_{i+1/2} = \frac{1}{\Delta t^n} \int_0^{t^n} u_{i+1/2}^r(t, x_{i+1/2}) dt$$

# Relaxation solver: General idea

- ▶ Godunov scheme
  - ▶ Consistency, Stability
  - ▶ Complexity : Solution of the Riemann problem  
(rarefaction waves, shocks, contact discontinuities...)
- ▶ Relaxation models : Introduction of a larger system
  - ▶ that is hyperbolic (with LD fields)
  - ▶ that formally converges to the physical one
  - ▶ that ensures some stability properties
  - ▶ for which the (homogeneous) Riemann problem is easy to solve
- ▶ Numerical algorithm
  - ▶ Definition of auxiliary variables from physical ones
  - ▶ Solution of the (homogeneous) Riemann problem
  - ▶ Computation of the physical variables at the next time step

(Suliciu [92], Chen et al. [94], Jin-Xin [95],

Nonlinear Stability of FVM for Hyperbolic Conservation Laws [Bouchut, 04]...)

# Relaxation solver : Scalar conservation law

- ▶ SCL to solve

$$\partial_t u + \partial_x f(u) = 0$$

- ▶ Relaxation model

$$\begin{aligned}\partial_t u + \partial_x v &= 0 \\ \partial_t v + c^2 \partial_x u &= \frac{1}{\epsilon} (f(u) - v)\end{aligned}$$

- ▶ Homogeneous part : Linear wave equation

$$\partial_{tt} u - c^2 \partial_{xx} u = 0$$

- ▶ Rusanov (or HLL) scheme

# Relaxation solver : Stability criterion (Wave celerities)

- ▶ Wave celerities

$$f'(u) \quad \text{vs.} \quad c, -c$$

- ▶ Information goes faster in the relaxation model

$$c \geq |f'(u)|$$

- ▶ Same argument as for explicit numerical schemes  
(cone of dependence)

# Relaxation solver : Stability criterion (Diffusive correction)

- ▶ "Chapman-Enskog" expansion

$$v = f(u) + \epsilon v_1 + O(\epsilon^2)$$

- ▶ Auxiliary equation

$$v_1 = \partial_t f(u) + c^2 \partial_x u + O(\epsilon)$$

- ▶ Estimation of the time derivative

$$\begin{aligned} \partial_t f(u) &= f'(u) \partial_t u = -f'(u) \partial_x v &= -f'(u) \partial_x f(u) + O(\epsilon) \\ &= -f'(u)^2 \partial_x u + O(\epsilon) \end{aligned}$$

- ▶ Modified equation with viscous correction

$$\partial_t u + \partial_x f(u) = \epsilon \partial_x ((-f'(u)^2 + c^2) \partial_x u) + O(\epsilon^2)$$

# Relaxation solver : Numerical strategy

- ▶ Entries

$$(u_i^n)_i$$

- ▶ Initialization of auxiliary unknowns

~~ Solution of EDO system with " $\epsilon = 0$ "

$$v_i^n = f(u_i^n)$$

- ▶ Advance in time

~~ Solution of the homogeneous Riemann problems at each interface

$$w_{[W_l, W_r]}^R(t, x), \quad W_=(u, v)^T$$

~~ Computation of physical unknowns : Averaging of the solution on each cell

$$(u_i^{n+1}) = \frac{1}{\Delta x} \int_{C_i} u^R(\Delta t, x) dx$$

# Homogeneous SW system

## ► Equations

$$\begin{aligned}\partial_t h + \partial_x(h\bar{u}) &= 0 \\ \partial_t(h\bar{u}) + \partial_x\left(h\bar{u}^2 + \frac{gh^2}{2}\right) &= 0\end{aligned}$$

## ► Energy

$$\partial_t(hE) + \partial_x(\bar{u}(HE + p)) \leq 0, \quad hE = \frac{h\bar{u}^2}{2} + \frac{gh^2}{2}$$

## ► Eigenvalues

$$\lambda_{\pm} = \bar{u} \pm \sqrt{gh}$$

## ► Riemann problem

Multiple waves and complex structure

# Homogeneous SW system

- Relaxation model (v1) : Direct extension

$$\partial_t h + \partial_x \tilde{Q} = 0$$

$$\partial_t \tilde{Q} + c_1^2 \partial_x h = \frac{1}{\epsilon} (h \bar{u} - \tilde{Q})$$

$$\partial_t (h \bar{u}) + \partial_x \tilde{H} = 0$$

$$\partial_t \tilde{H} + c_2^2 \partial_x (h \bar{u}) = \frac{1}{\epsilon} \left( h \bar{u}^2 + \frac{gh^2}{2} - \tilde{H} \right)$$

- Eigenvalues (distincts and associated to LD fields)

$$(\lambda_1)_\pm = \pm c_1, \quad (\lambda_2)_\pm = \pm c_2$$

- Stability criterion

$$\max(c_1, c_2) > |\bar{u}| + \sqrt{gh}$$

# Homogeneous SW system

- Relaxation model (v2) : Suliciu approach

$$\begin{aligned}\partial_t h + \partial_x h \bar{u} &= 0 \\ \partial_t h \bar{u} + \partial_x (h \bar{u}^2 + \pi) &= 0 \\ \partial_t h \pi + \partial_x (h \pi \bar{u}) + c^2 \partial_x \bar{u} &= \frac{1}{\epsilon} \left( \frac{gh^2}{2} - \pi \right)\end{aligned}$$

- Eigenvalues (distincts and associated to LD fields)

$$\lambda_{\pm} = \bar{u} \pm \frac{c}{h}, \quad \lambda_u = \bar{u}$$

- Stability criterion

$$c \geq h \sqrt{gh}$$

# Homogeneous SW system

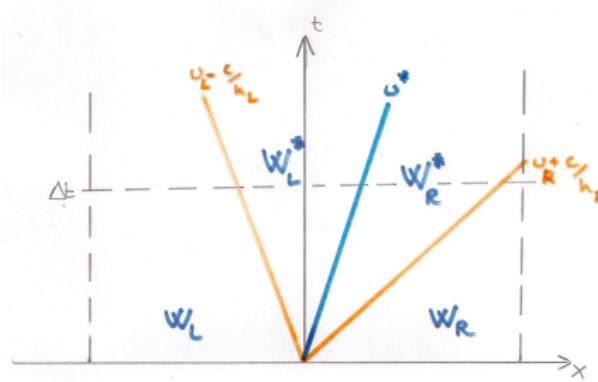
## ► Initialization

~ Computation of auxiliary variables : System with " $\epsilon = 0$ "

$$\pi_i^n = g(h_i^n)^2/2$$

## ► Solution of the (homogeneous) Riemann problem

$$w_{[W_l, W_r]}^R(t, x), \quad W = (h, \bar{u}, \pi)^T$$



# Homogeneous SW system

- ▶ Computation of the intermediate states

$$u^* = u_M - \frac{1}{2c} \Delta \pi, \quad \pi^* = \pi_M - \frac{c}{2} \Delta u$$

$$\tau_I^* = \tau_I + \frac{1}{2c} \Delta u - \frac{1}{2c^2} \Delta \pi, \quad \tau_r^* = \tau_r + \frac{1}{2c} \Delta u + \frac{1}{2c^2} \Delta \pi, \quad " \tau = \frac{1}{h}"$$

- ▶ Computation of the physical solution

~~> Projection of the solution onto piecewise constant space

$$h_i^{n+1}, (h\bar{u})_i^{n+1}$$

- ▶ Stability criterion

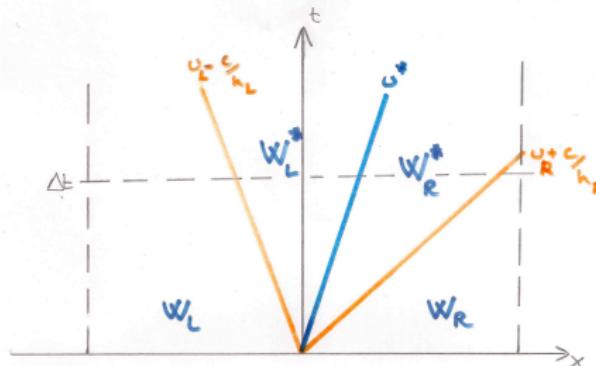
$$c = \max \left( h_l \sqrt{gh_l}, h_r \sqrt{gh_r} \right)$$

- ▶ Extension to vacuum

(Bouchut [04])

# Homogeneous SW system

- ▶ **Conservative system**
  - ▶ Averaging process
  - ▶ Flux computation
- ▶ **Properties of the Suliciu solver**  
Consistency, Positivity, Entropy inequality
- ▶ **Riemann problem**  
Eigenvalues always ordered  $\rightsquigarrow$  One single Riemann pb to solve



# SW system with source

## ► Equations

$$\begin{aligned}\partial_t h + \partial_x(h\bar{u}) &= 0 \\ \partial_t(h\bar{u}) + \partial_x\left(h\bar{u}^2 + \frac{gh^2}{2}\right) &= -gh\partial_x B \\ \partial_t B &= 0\end{aligned}$$

## ► Stationary States

$$\bar{u} = 0, \quad h + B = 0$$

## ► Eigenvalues

$$\lambda_{\pm} = \bar{u} \pm \sqrt{gh}, \quad \lambda_0 = 0$$

## ► Riemann problem

Multiple waves and (very !) complex structure

# SW system with source

## ► Relaxation Model v1

$$\begin{aligned}\partial_t h + \partial_x h \bar{u} &= 0 \\ \partial_t h \bar{u} + \partial_x (h \bar{u}^2 + \pi) + gh \partial_x B &= 0 \\ \partial_t h \pi + \partial_x (h \pi \bar{u}) + c^2 \partial_x \bar{u} &= \frac{1}{\epsilon} \left( \frac{gh^2}{2} - \pi \right) \\ \partial_t B &= 0\end{aligned}$$

## ► Eigenvalues (associated to LD fields)

$$\lambda_{\pm} = u \pm \frac{c}{h}, \quad \lambda_u = u, \quad \lambda_0 = 0$$

(Bouchut [04])

# SW system with source

- ▶ Non conservative system

Integration process

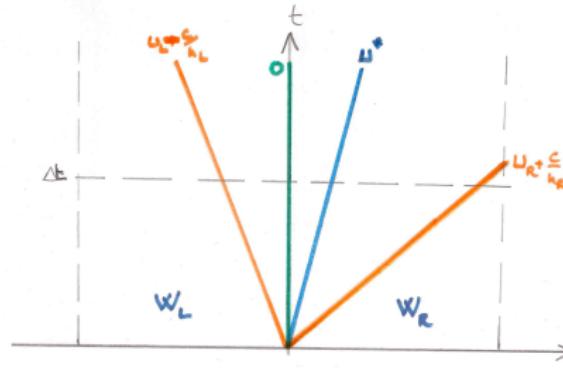
- ▶ Properties

Consistency, WB, Positivity, Entropy inequality

- ▶ Riemann problem

Eigenvalues not ordered  $\rightsquigarrow$  Multiple Riemann pbs to solve

Possibility of resonance  $\rightsquigarrow$  Difficulty to define the solution



# SW system with source

## ► Relaxation model v2

$$\begin{aligned}\partial_t h + \partial_x h \bar{u} &= 0 \\ \partial_t h \bar{u} + \partial_x (h \bar{u}^2 + \pi) + gh \partial_x \tilde{B} &= 0 \\ \partial_t h \pi + \partial_x (h \pi \bar{u}) + c^2 \partial_x \bar{u} &= \frac{1}{\epsilon} \left( \frac{gh^2}{2} - \pi \right) \\ \partial_t \tilde{B} + \bar{u} \partial_x \tilde{z} &= \frac{1}{\epsilon} (B - \tilde{B}) \\ \partial_t B &= 0\end{aligned}$$

## ► Eigenvalues (associated to LD fields)

$$\lambda_{\pm} = u \pm \frac{c}{h}, \quad \lambda_u = u \text{ (double)}, \quad (\lambda_0 = 0)$$

Riemann problem is under-determined...

# SW system with source

## ► Relaxation model v3

$$\begin{aligned}\partial_t h + \partial_x h \bar{u} &= 0 \\ \partial_t h \bar{u} + \partial_x (h \bar{u}^2 + \pi) + g \bar{h} \partial_x \tilde{B} &= 0 \\ \partial_t h \pi + \partial_x (h \pi \bar{u}) + c^2 \partial_x \bar{u} &= \frac{1}{\epsilon} \left( \frac{gh^2}{2} - \pi \right) \\ \partial_t \tilde{B} + \bar{u} \partial_x \tilde{z} &= \frac{1}{\epsilon} (B - \tilde{B}) \\ \partial_t B &= 0\end{aligned}$$

## ► Eigenvalues (associated to LD fields)

$$\lambda_{\pm} = u \pm \frac{c}{h}, \quad \lambda_u = u \text{ (double)}, \quad (\lambda_0 = 0)$$

Riemann problem is well-posed !

# SW system with source

- ▶ Non conservative system

Integration process

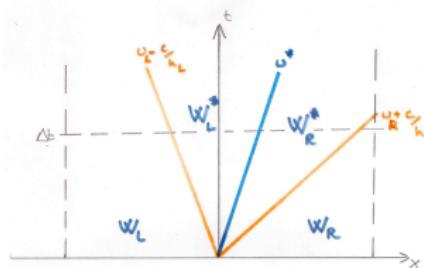
- ▶ Properties

Consistency, WB ( $\bar{h} = h_M$ ), Positivity

- ▶ Riemann problem

Eigenvalues always ordered  $\rightsquigarrow$  One single Riemann pb to solve

Same structure as homogeneous case,  $\neq$  intermediate states



(Introduced as a wb simple Riemann solver : Galice [02])

# SW-Exner system

## ► Equations

$$\partial_t h + \partial_x q_w = 0,$$

$$\partial_t q_w + \partial_x \left( \frac{q_w^2}{h} + \frac{g}{2} h^2 \right) = -gh\partial_x b - \frac{\tau_b}{\rho_w},$$

$$\partial_t b + \partial_x q_s = 0,$$

## ► Properties

- Hyperbolicity depends on the choice of  $q_s$
- Eigenvalues hard to compute except for special choices of  $q_s$
- No energy associated to the present version

# SW-Exner system

## ► Relaxation model v1 (CEMRACS 2011)

$$\begin{aligned}\partial_t h + \partial_x h \bar{u} &= 0 \\ \partial_t(h \bar{u}) + \partial_x(h \bar{u}^2 + \pi) + g \bar{h} \partial_x b &= 0 \\ \partial_t \pi + \bar{u} \partial_x \pi + \frac{\alpha^2}{h} \partial_x u &= \frac{1}{\epsilon} \left( \frac{gh^2}{2} - \pi \right) \\ \partial_t b + \partial_x \omega &= 0 \\ \partial_t \omega + \left( \frac{\beta^2}{h^2} - \bar{u}^2 \right) \partial_x b + 2 \bar{u} \partial_x \omega &= \frac{1}{\epsilon} (q_s - \omega)\end{aligned}$$

## ► Definitions

- $(\pi, \omega)$  : Auxiliary variables (fluid pressure, sediment flux)
- $\epsilon > 0$  : (Small) relaxation parameter
- $(\alpha, \beta) > 0$  : Have to be fixed to ensure stability

# SW-Exner system

## ► Mathematical properties

- Formally tends to SW-Exner model when  $\epsilon$  tends to 0
- Stability requirement (diffusive correction)

$$\alpha^2 \geq h^2 p'(h) = gh^3, \quad \beta^2 \geq (hu)^2 + gh^2 \partial_u Q_s$$

- Relaxation parameters ratio

$$\frac{\beta^2}{\alpha^2} = Fr^2 + \frac{1}{h} \partial_u Q_s$$

- Sub- or supercritical flow
- Low or strong erosion coefficient

## ► Physical properties

- No explicit dependency on sediment flux  $q_s$
- Same as previous model when  $u = 0 \rightsquigarrow$  Stationary states
- Not the same as previous model when  $Q = 0 \dots$

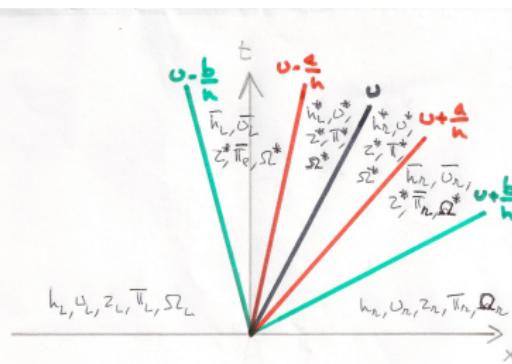
# SW-Exner system

## ► Numerical properties

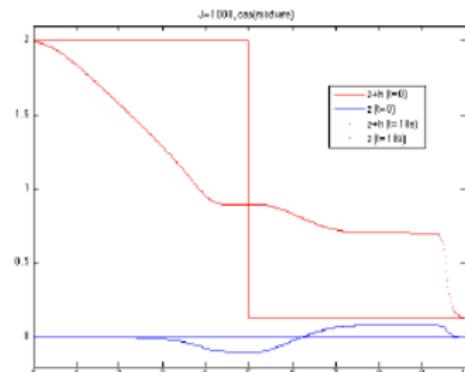
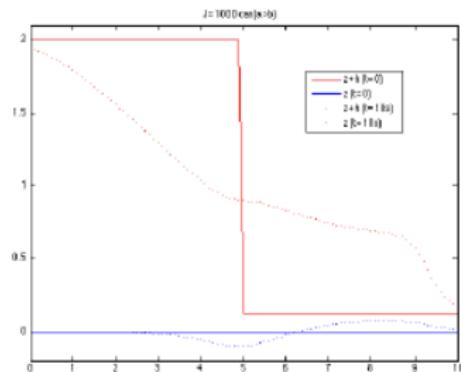
- Always hyperbolic ( $h \neq 0$ ) and LD fields
- Ordered eigenvalues (two possibilities)

$$u - \frac{\beta}{h} < u - \frac{\alpha}{h} < u < u + \frac{\alpha}{h} < u + \frac{\beta}{h}$$

~~ Two Riemann problems to solve



# Dam break on moveable flat bottom



- ▶ Stable computation (no oscillations)
- ▶ Strong numerical diffusion

# SW-Exner system

## ► Relaxation model v2

$$\begin{aligned}\partial_t h + \partial_x h \bar{u} &= 0 \\ \partial_t(h \bar{u}) + \partial_x(h \bar{u}^2 + \pi) + g \bar{h} \partial_x \tilde{b} &= 0 \\ \partial_t \pi + \bar{u} \partial_x \pi + \frac{\alpha^2}{h} \partial_x u &= \frac{1}{\epsilon} \left( \frac{gh^2}{2} - \pi \right) \\ \partial_t \tilde{b} + \partial_x \omega &= \frac{1}{\epsilon} (b - \tilde{b}) \\ \partial_t \omega + \left( \frac{\beta^2}{h^2} - \bar{u}^2 \right) \partial_x \tilde{b} + 2 \bar{u} \partial_x \omega &= \frac{1}{\epsilon} (q_s - \omega) \\ \partial_t b + \partial_x q_s &= 0,\end{aligned}$$

## ► Comments

- Three auxiliary variables  $(\pi, \omega, \tilde{b})$
- Same Riemann problem as before ( $b$  is "not" coupled)

# Time Splitting : The come back !

- ▶ Usual Time Splitting : Unstable

Fluid software + Exner equation

- ▶ Relaxation solver : Stable

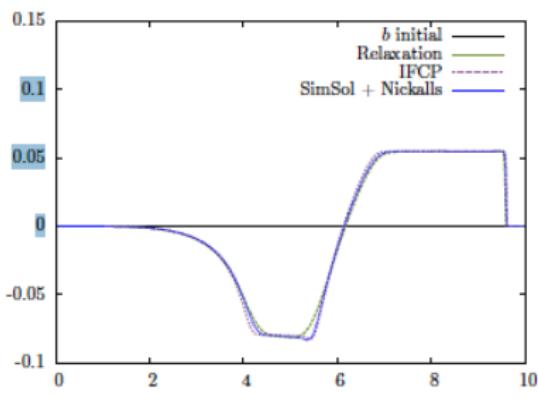
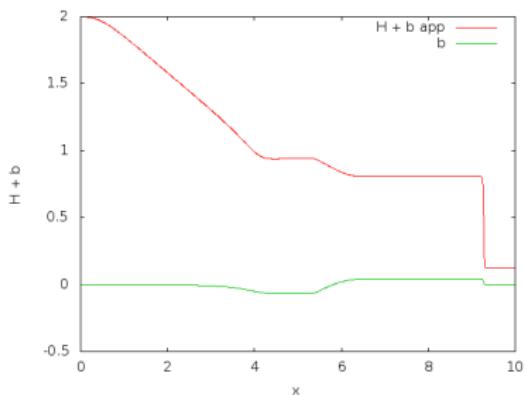
Modified Fluid software + Exner equation

~~~ The fluid solver has to take into account some information from the sediment

- ▶ Modified Time splitting : Stable

- ▶ Consider a fluid solver using a bound of the largest eigenvalue of the SW Jacobian (Rusanov, HLL, Relaxation...)
- ▶ Replace it by a bound of the largest eigenvalue of the SW-Exner Jacobian

# Dam break on moveable flat bottom



- ▶ Stable computation (no oscillations)
- ▶ Accurate results

# Uncertainty quantification for SW-Exner system

- ▶ Friction coefficient formula

$$\tau_b = \kappa(h)u^2$$

- ▶ Sediment flux formula

$$q_s = A(\theta - \theta_c)_+^{3/2} \sqrt{g(s-1)d_m^3}$$

- ▶ Uncertain parameters

$$\kappa, A, \tau_c$$

- ▶ Uncertainties on  $q_s$  directly impact bottom topography  $b$
- ↝ Study of SW system with uncertain topography

# Uncertainty quantification for SW system

- ▶ Equations

$$\begin{aligned}\partial_t h + \partial_x q &= 0, \\ \partial_t q + \partial_x \left( \frac{q^2}{h} + \frac{g}{2} h^2 \right) &= -gh\partial_x b - \frac{\tau_b}{\rho},\end{aligned}$$

- ▶ Flow on a constant slope  $S$

$$h = H_0, \quad q = Q_0, \quad Q_0 = K_s S^{1/2} H_0^{5/3}$$

- ▶ Study of perturbations of this stationary state

# Uncertainty quantification for SW system

## ► Perturbated bottom topography

$$\begin{aligned} B_{i+1/2}^n &= B_{i+1/2}^0 + \tilde{B}_{i+1/2}, \\ \tilde{B}_{i+1/2} &= \alpha \sqrt{\Delta x} \sum_{k=1}^{N/2} \frac{1}{k^\beta} \left( a_k \cos \left( 2k\pi \frac{i+1/2}{N} \right) \right. \\ &\quad \left. + b_k \sin \left( 2k\pi \frac{i+1/2}{N} \right) \right), \end{aligned}$$

## ► Characteristics of the noise

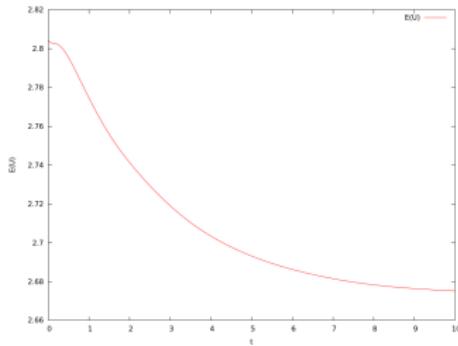
- Amplitude  $\alpha$
- Regularity  $\beta$
- Random coefficients  $a_k$  and  $b_k$  (Normal law)

# Uncertainty quantification for SW system

- ▶ Monte Carlo simulations
- ▶ Water depth
  - ~~> Mass conservation

$$\frac{1}{L} \int_X \mathbb{E}(h) = H_0$$

- ▶ Discharge



# Uncertainty quantification for SW system

- ▶ Objective

Preservation of the unperturbed stationary state

$$\frac{1}{L} \int_X \mathbb{E}(q) \approx Q_0$$

- ▶ Modification of the friction coefficient

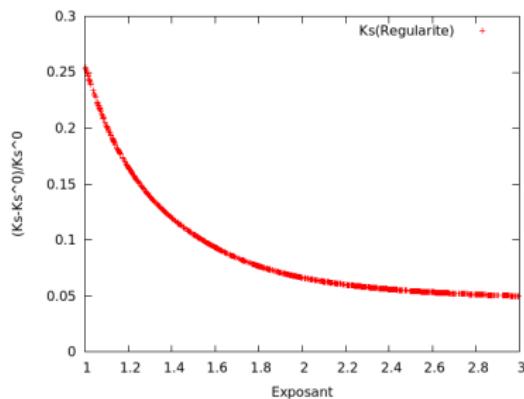
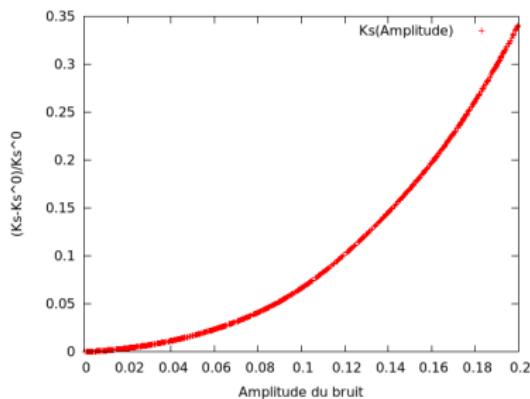
$$K_s \rightarrow \tilde{K}_s$$

- ▶ Physical motivation

Friction coefficient takes into account roughness of the bottom

# Uncertainty quantification for SW system

- ▶ Friction coefficient as a function of the noise



- ~~ May help to characterize suitable bounds for noise
- ▶ More results in P. Ung PhD thesis (december 2015)