

GIS-based Numerical Modelling of Debris Flow Motion across Three-dimensional Terrain

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Abstract: The objective of this study is to incorporate a numerical model with GIS to simulate the movement, erosion and deposition of debris flow across the three dimensional complex terrain. In light of the importance of erosion and deposition processes during debris flow movement, no entrainment assumption is unreasonable. The numerical model considering these processes is used for simulating debris flow. Raster grid networks of a digital elevation model in GIS provide a uniform grid system to describe complex topography. As the raster grid can be used as the finite difference mesh, the numerical model is solved numerically using the Leap-frog finite difference method. Finally, the simulation results can be displayed by GIS easily and used to debris flow evaluation. To illustrate this approach, the proposed methodology is applied to the Yohutagawa debris flow that occurred on 20th October 2010, in Amami-Oshima area, Japan. The simulation results that reproduced the movement, erosion and deposition are in good agreement with the field investigation. The effectiveness of the dam in this real-case is also verified by this approach. Comparison with the results were simulated by other models, shows that the present coupled model is more rational and effective.

Key words: Debris flow; Numerical simulation; GIS; Movement; Erosion; Deposition; Equilibrium concentration

Introduction

Debris flow is a rapid flow which may lead to severe flooding with catastrophic consequences such as damage to properties and loss of human lives. For example, in the ‘Minamarta debris flow disaster’ in 2003, 21 people were killed by the debris flow. Two hundred houses, many office buildings and the Hakata-eki subway station were inundated with muddy water (Sidle and Chigira 2004). More recently, a giant debris flow burst on August 8th, 2010 in Zhouqu City, China, killing 1,765 people. More than 5,500 houses were inundated and the total economic losses reached 212 million RMB (Chinese Yuan) (Tang et al. 2011). Therefore, debris flow disasters have been recognized as a critical problem today and increasing attention has been focused on the study of debris flows.

Debris flows consist of sediment and water mixture moving as a highly mobile, continuous fluid flow driven by gravity. There is often significant erosion and deposition associated with debris flow movement that can dramatically change the channel bed. At the beginning of the fan, where the slope of the bed decreases significantly, debris flow slows significantly, depositing large amounts of sediments (Armanini et al. 2009).

Due to the complexity of the debris flow process, a number of models have been developed

Received: 13 August 2012
Accepted: 28 February 2013

to simulate movement behavior of debris flow. These models can be classified as either: single-phase models (Hungri 1995; Hungri and Evans 1997; Naef et al. 1999; Rickenmann and Koch 1997; Coussot 1994; Whipple 1997), or two-phase models (Brufau et al. 2000; Nakagawa et al. 1997, 2000; Shieh 1996; Takahashi 1991; Takahashi et al. 1992; Zanre and Needham 1996; Lai 1991; Morris and Williams 1996; Quan et al. 2011, 2012). Single-phase models are often used in situations with no significant morphological changes. These integrated models present only the volume conservation and momentum equations. They have the advantage to obtain the parameters from current debris flows. However, they cannot simulate the important erosion and deposition process. The two-phase models treat the solid and fluid separately and the integrated model presents one momentum equation, derived for a fluid with the bulk density. The equations, which describe the flow, are completed by a mass conservation equation for each of the two phases (Fraccarollo and Papa 2000). Two-phase models permit a non-homogeneous treatment of the mixture. They can simulate the erosion and deposition processes through the movable channel bed. Two-phase models are suitable to solve problems where the morphological evolution is to be determined. In this study, we adopted the more favored Takahashi model which incorporated the possibility of erosion and deposition.

For hazard mapping and risk assessment, the geographic information system (GIS) has been recognized as a useful tool to process spatial data and to display results. The GIS-based approaches in assessing debris flow developed by Lin and Jeng 1995; Cheng et al. 1997; Lin et al. 1998, Lin et al. 2000, Kappes et al. 2011, and Blahut et al. 2011 allows numerical simulation by incorporating GIS and provides important prediction and analysis tools. One significant advantage of numerical simulation coupled with GIS is that the grid networks for simulation can be extracted from GIS raster data and all the calculated results displayed in GIS can be used for direct debris flow evaluation.

In this study, we adopted the flow dynamic model from Takahashi et al. (1992) (referred as T-model hereafter) and developed a debris flow simulation program incorporating with GIS by deriving the computation networks from GIS raster

data. To illustrate the advantage of this approach, we used it to simulate a well-documented Yohutagawa debris flow in Japan.

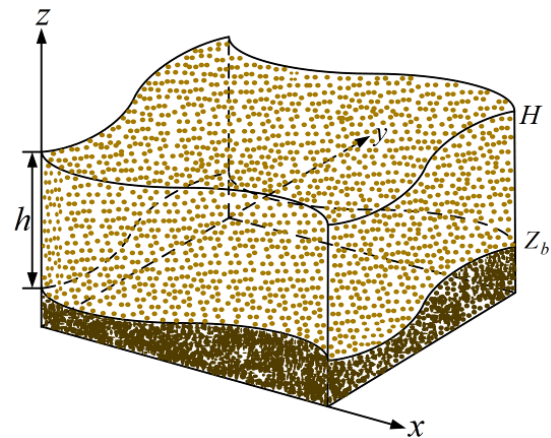


Figure 1 Definition of coordinate system for two dimensional governing equations

1 Description of Numerical Model

1.1 Governing equations

Debris flow is treated as a two-phase mixture flow of solid and fluid in the T-model. An important feature of this model lies in considering the dynamics of the mixture and the morphological evolution of the river bed. The depth-averaged partial differential equations of the T-model are derived from the conservation balances of mass (solid and mixture) and of momentum (mixture) in a coordinate system (Figure 1). The detail deduced process is based on the work of Takahashi et al. (1986). The governing equations describing the process of debris flow may be described as follows.

The depth averaged momentum conservation equations in x – and y – directions are respectively given as:

$$\frac{\partial M}{\partial t} + \beta \frac{\partial (uM)}{\partial x} + \beta \frac{\partial (vM)}{\partial y} = -gh \frac{\partial (h + Z_b)}{\partial x} - \frac{\tau_{bx}}{\rho_d} \quad (1)$$

$$\frac{\partial N}{\partial t} + \beta \frac{\partial (uN)}{\partial x} + \beta \frac{\partial (vN)}{\partial y} = -gh \frac{\partial (h + Z_b)}{\partial y} - \frac{\tau_{by}}{\rho_d} \quad (2)$$

The continuity Eq. of debris flow mixture is:

$$\frac{\partial h}{\partial t} + \frac{\partial M}{\partial x} + \frac{\partial N}{\partial y} = i \quad (3)$$

The continuity equation of the solid fraction is:

$$\frac{\partial (Ch)}{\partial t} + \frac{\partial (CM)}{\partial x} + \frac{\partial (CN)}{\partial y} = i \cdot C_b \quad (4)$$

The equation for the change of river bed elevation is:

$$\frac{\partial Z_b}{\partial t} = -i \tag{5}$$

where $M = uh$ and $N = vh$ are the flow flux components in x - and y - directions, respectively; u and v are the depth-averaged velocity components in x - and y - directions, respectively; h is the flow depth; Z_b is the vertical bottom coordinate of the channel bed; β is the quadratic correcting coefficient taking into account the shape of the velocity profile; ρ_d is the debris flow mixture density, and $\rho_d = C(\sigma - \rho) + \rho$, σ and ρ are the solid density and fluid density, respectively; C and C_b are the volume concentration of solids fraction in the flow and on the bed, respectively; g is the gravitational acceleration; i is the erosion or deposition velocity; τ_{bx} and τ_{by} are the bottom resistance on the river bed in x - and y - directions, respectively.

1.2 Implementation of erosion and deposition

To complete the five equations above, two closure equations are needed for computing the velocity of erosion or deposition and the bottom resistance. According to the empirical equations of Takahashi (2007), the velocity of erosion or deposition in Eqs.(3) (4) and (5) can be written as follows.

When erosion ($C < C_\infty$):

$$i = \delta_e \frac{C_\infty - C}{C_b - C_\infty} \frac{\sqrt{u^2 + v^2} h}{d} \tag{6}$$

When deposition ($C > C_\infty$):

$$i = \delta_d \frac{C - C_\infty}{C_b - C_\infty} \frac{\sqrt{u^2 + v^2} h}{d} \tag{7}$$

where δ_e and δ_d are the erosion and deposition coefficient, respectively; d is the represent diameter. C_∞ is the equilibrium concentration and can be represented as follows (Nakagawa et al. 2003):

$$\text{If QUOTE } \tan \theta \geq \tan \varphi, C_\infty = 0.9C_b \tag{8}$$

If QUOTE $\tan \varphi > \tan \theta > 0.138$,

$$C_\infty = \frac{\rho \tan \theta}{(\sigma - \rho)(\tan \varphi - \tan \theta)} \tag{9}$$

If QUOTE $0.138 \geq \tan \theta > 0.03$,

$$C_\infty = 6.7 \left[\frac{\rho \tan \theta}{(\sigma - \rho)(\tan \varphi - \tan \theta)} \right]^2 \tag{10}$$

If QUOTE $\tan \theta \leq 0.03$,

$$C_\infty = \frac{(1 + 5 \tan \theta) \tan \theta}{\sigma / \rho - 1} \left(1 - \alpha_c^2 \frac{\tau_{*c}}{\tau_*} \right) \left(1 - \alpha_c \sqrt{\frac{\tau_{*c}}{\tau_*}} \right) \tag{11}$$

In which,

$$\tau_{*c} = 0.04 \times 10^{1.72 \tan \theta}$$

$$\alpha_c^2 = \frac{2 \left(0.425 - \frac{\sigma \tan \theta}{\sigma - \rho} \right)}{1 - \frac{\sigma \tan \theta}{\sigma - \rho}}$$

$$\tau_* = \frac{\rho}{\sigma - \rho} \frac{h \tan \theta}{d}$$

where θ is the slope angle; φ is the Coulomb or basal friction angle. τ_{*c} is the non-dimensional critical shear stress, and τ_* is the non-dimensional shear stress.

1.3 Bottom resistance laws

One of the most important parts of the model is the incorporation of different rheological flow behaviors. The bottom resistance τ_{bx} and τ_{by} in Eqs.(1) and (2) are described as follows.

For stony-type debris flow ($C \geq 0.4C_b$):

$$\tau_{bx} = \frac{\rho_d u \sqrt{u^2 + v^2} d^2}{8h^2 [C + (1 + C)(\rho_d / \sigma)] [(C_b / C)^{1/3} - 1]^2} \tag{12}$$

For immature debris flow ($0.01 \leq C \leq 0.4C_b$):

$$\tau_{bx} = \frac{\rho_d u \sqrt{u^2 + v^2} d^2}{0.49h^2} \tag{13}$$

For bed load transportation ($C \leq 0.01$):

$$\tau_{bx} = \frac{\rho_d g n_m^2 u \sqrt{u^2 + v^2}}{h^{1/3}} \tag{14}$$

where n_m is pseudo-Manning's coefficient which accounts for both turbulent boundary friction and internal collisional stress. d is representative diameter.

1.4 Stop condition

In this study, we use a simple stop condition of debris flow in deposition area (Takahashi et al. 1987):

$$\sqrt{u^2 + v^2} \leq U_{TH} \quad (15)$$

2 Numerical Simulation Coupled With GIS

In this section, we show how to produce numerical simulation incorporating GIS technology.

2.1 Generation of DEM for simulation

In order to generate the topographical data required for the simulation using T-model, we use GIS to generate DEM for simulation. Three schemes for structuring elevation data for DEMs are: triangulated irregular networks (TIN), grid networks, and vector or contour-based networks (Moore and Grayson 1991). The most widely used data structures are square grid networks with rows and columns where each cell contains a value such as elevation (Figure 2b). The grid based discretization of the study area is immensely useful for numerical solution of the partial differential equations governing the propagation of debris flows. Finite-difference methods on rectangular grids are widely used in numerical models of environmental flows when using this method, the studied region is discretized into rectangular grids. Therefore, in this paper, we used the rectangular grid networks from GIS for finite difference method.

2.2 Source identification and upstream boundary setting

Next step is to identify the initiation area of debris flow. After field investigation in the area and after studying the available aerial photographs, the source zone boundary can be identified by GIS. It is labeled as yellow shaded area as denoted in Figure 2b. According to field observation an approximate total volume of source zone soil that may be available. So the average thickness of slide discharge in initiation area is estimated from the soil volume

in initiation area divided by its area, and we can set the initial concentration based on investigation of source zone. This average thickness and initial concentration in the initiation area of debris flow are used as the upstream boundary for numerical simulation.

2.3 Numerical solution and results display

The Takahashi model is solved in rectangular grid networks from GIS. The flow direction of a cell is expressed in degrees: left=0°, up=90°, right=180°, down=270°; and the diagonals: 45°, 135°, 225°, 315°. Within a cell, overland flow is routed along one flow direction. The flow direction is the maximum downslope direction which is determined from the raster-based DEM (Figure 2a). The numerical solution of the above Eq. (1) to (5) is based on a leap-frog difference scheme that is accurate in space and time, the linear terms use forward difference scheme, and the nonlinear terms use central difference scheme. As denoted in Figure 2c, the flow depth, concentration or elevation of the debris flow mass in each grid is arranged at the midpoint, and the flux M and N are arranged at the central point of the grid boundary. These specific difference equations were derived by means of explicit staggered leap-frog

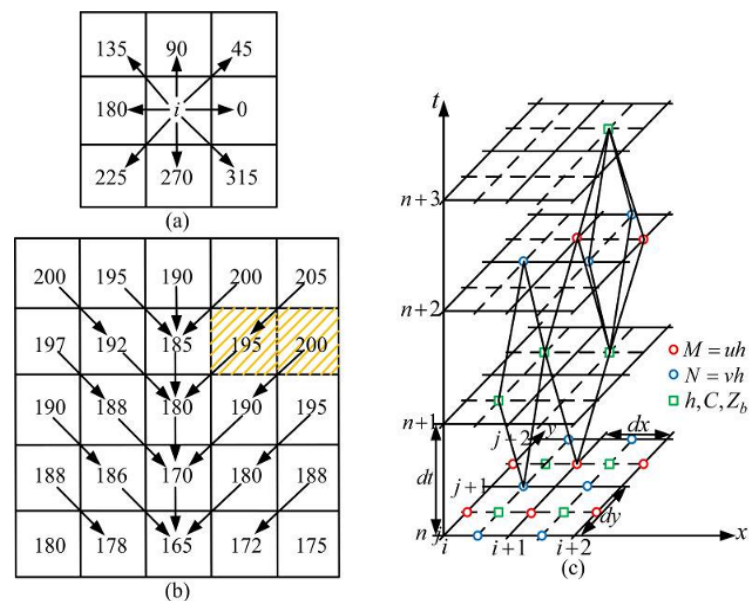


Figure 2 Leap-frog finite difference formulation based on the DEM grid (a) Possible flow direction in a cell; (b) Flow direction in a DEM; (c) Grids and flow for debris flow computation

scheme proposed by Yoshiaki and Akihide (1988). Finally, these five equations have been coded by C++ language. All the input and output data are processed in ArcGIS. The tool is embedded in a GIS to simplify the input data such as the DEM and to help the interpretation of numerical simulation results.

3 Case Study

3.1 Outline

To verify the model and illustrate its validation, the model is applied to a real debris flow that occurred in Japan. Many landslides were triggered by the heavy rainfalls in the Amami-Oshima Island, Kagoshima Prefecture, in October, 2010. Especially, the 2010 rainfall at Amami city from October 18th to 21st was the highest recorded torrential downpour in a century. The landslide and resultant debris flow at (28°24' N, 129°31' E) was the largest of the October disasters in Amami-Oshima area (Figure 3). The debris flow occurred 6 hours after the beginning of the rainstorm, at 12:00 am on 20th October 2010, during the time of highest rainfall intensity. The debris flow initiated from highly weathered andesite. The debris flow began after the landslide entered residential area and moved about 1.1 km along the channel. The gradient of the channel was about 17°-9°, and the

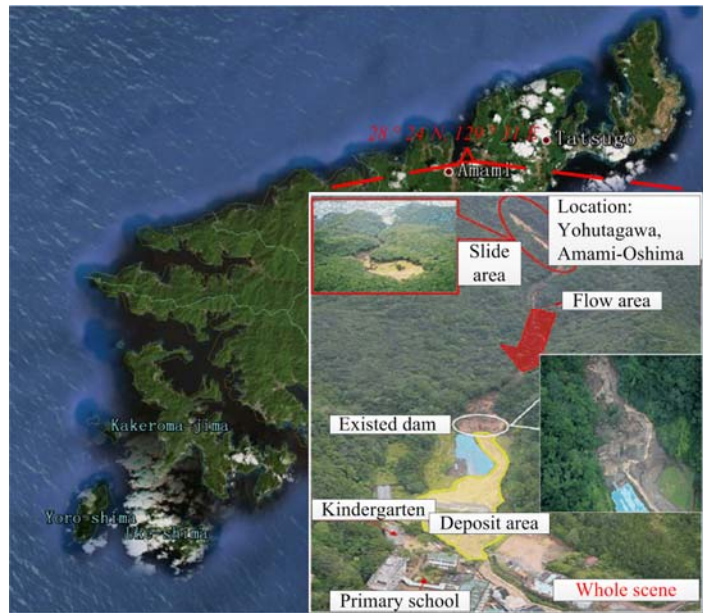


Figure 3 Photograph of Yohutagawa debris flow (modified from KKG's photograph), Japan

mean gradient of the fan was about 5°. Because of an existing dam in its path this debris flow only destroyed one building and one house. The kindergarten and primary school were not affected by this disaster (Figure 3).

3.2 Field investigation

According to the investigation by the Kokusai Kogyo Group (KKG) who study geological hazard surveys, the actual movement of sediment is shown in Figure 4, we can see that the total volume in initial and erosion area was approximately 8,697 m³, the volume in intercept area by dam was about 5,621 m³, and the volume rush out of the dam in deposition area was about 3,076 m³. The specific location of each area is also shown in Figure 4.

3.3 Source identification and parameter determination

Based on a topographic map 1/2,500 in scale, a vector contour line file was generated, with vertical spacing of 2 m. This file was converted to TIN (Triangulated Irregular Network), and subsequently DEM (Digital Elevation Model) in ArcGIS (Figure 5). The DEM resolution is 2.5 m × 2.5 m. According to field work in the area and after studying the available aerial photographs, the source zone was identified as blue color in Figure 6.

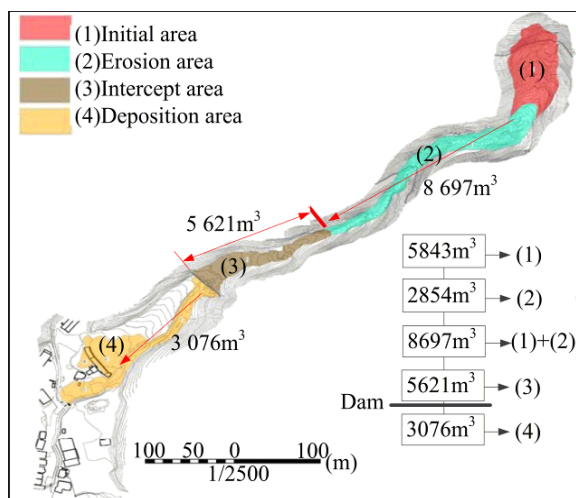


Figure 4 Actual movement of sediment (Photograph modified from the report of KKG)

Because the volume of sediment discharge in the source zone was estimated to be 5,843 m³ and the source zone area was about 3,895 m², thus the average thickness of discharge was estimated 1.5 m from the soil volume in initiation area divided by its area. In this simulation, the average thickness 1.5 m and the concentration 0.44 given by KKG were used as the upstream boundary of simulation. The other material properties and rheological parameters well-documented by the investigation of KKG for simulation are listed in Table 1.

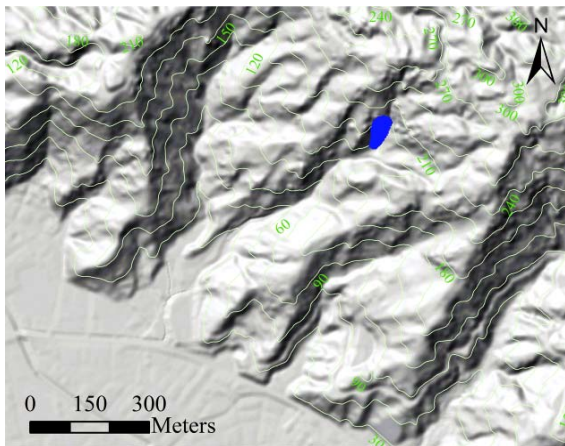


Figure 5 DEM and source zone

Table 1 Material properties and rheological parameters for simulation

Parameters	Value
Solid density: σ (kg / m^3)	2,550
Fluid density: ρ (kg / m^3)	1,180
Volume concentration of river bed: C_b	0.60
Representative diameter: d (m)	0.03
Gravitational acceleration: g (m / s^2)	9.8
Erosion coefficient: δ_e	0.0007
Deposition coefficient: δ_d	0.05
Friction angle: ϕ	28°
Pseudo-Manning's coefficient: n_m	0.04
Time interval: Δt (s)	0.001
Mesh size: $\Delta x = \Delta y$ (m)	2.5
Velocity of stop condition: U_{TH} (m / s)	0.4

4 Results and Discussions

The results of numerical simulations displayed in GIS provided a time-lapse simulation of the

movements and affected regions of debris flow over the three-dimensional complexity terrain (Figure 6). The simulation results show that it took about 214 seconds to move 1.1 km along the channel at an average flow velocity of 5.14 m/s. The affected region was dynamically displayed again at different time. Figure 7 shows the recalculated area and bed variation of this debris flow, and we can see that the maximum erosion depth and maximum deposition depth were 1.47 m and 1.9 m, respectively, and the volume in each area could be calculated in GIS. Comparing with field investigation (Figure 4), we see that each area has good agreement in terms of both location and volume. It shows that the present model based on GIS which considered erosion and deposition is effective and rational. In order to evaluate the effectiveness of the existing dam, the case where the dam did not exist was modeled. The flooded area and the variation of river bed without the dam are shown in Figure 8 (a), and show that the deposit area without dam, 2,150 m², is much larger than that of case with the dam, 820 m². This result explains that the existing dam was very important to reduce this debris flow. We also tested the use of different dam heights and showed that the dam height must be increased by 1.62 m (Figure 8b).

In this study, we used the equilibrium concentration fitting curve from the Takahashi experiments (Takahashi 1982) to simplify Equations (8), (9), (10) and (11) (Figure 9), and derived Eq.(15) as follow:

$$C_\infty = 0.0048\theta^{1.7078} \quad (16)$$

Using this simple equation, the simulated result (Figure 10), was compared with that used by Nakagawa et al. (2003) (Figure 7), we showed that this simple equation is also useful for simulation and easier to use.

Using the fixed bed model (Wang et al. 2008), which does not consider the erosion and deposition (Figure 11), we could only simulate the thickness of deposit in one time step, but could not simulate the morphological variations, hence the result did not agree with the actual situation. Figure 12 shows the results simulated by using the New-SASS model developed by Sabo and Landslide Technical Center in Japan named. All the comparisons of calculated results are listed in Table 2. We can see that the present coupled model is more reliable than either the fixed bed model or New-SASS model.

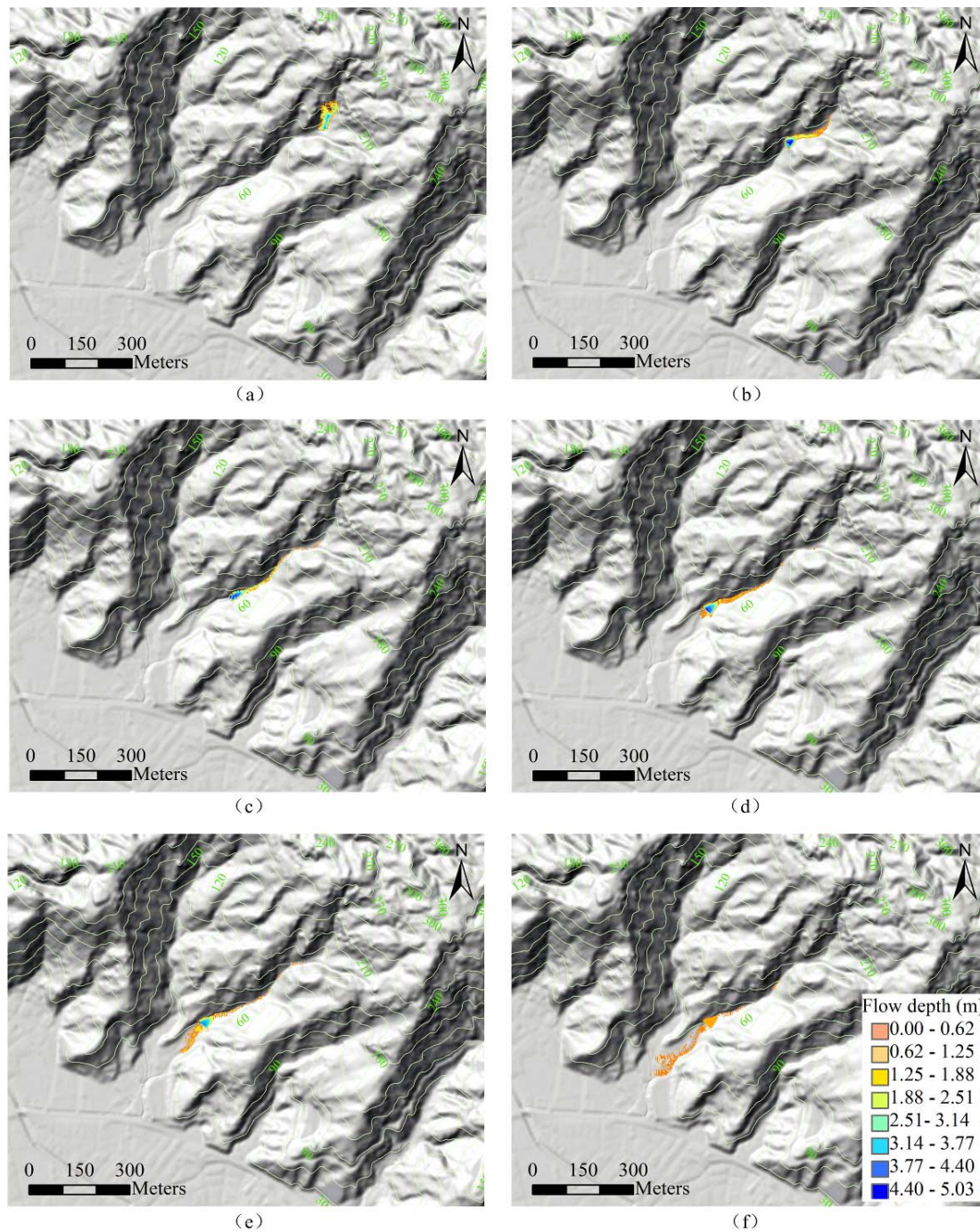


Figure 6 Movements and affected regions in different times ((a) 2s, (b) 30s, (c) 94s, (d) 110s, (e) 150s, (f) 214s).

5 Conclusion

The results of numerical simulation and GIS technology provide a good platform for coupling a numerical model of a debris flow. As raster grid networks of a digital elevation model in GIS were used as the finite difference mesh, the governing equations were solved numerically using Leap-frog

difference scheme. All the input and output data are processed in GIS. As a real case study, the model achieved reasonable results in comparison with field investigation. The conclusions and advantages of this method are:

(1) The numerical model describes debris flow covering both erosion and deposition processes. Comparing with the simulation results with field

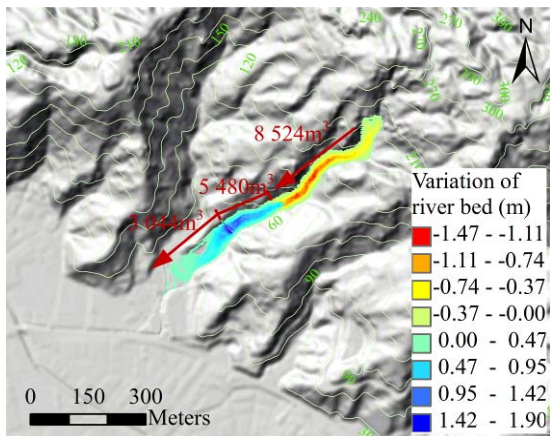
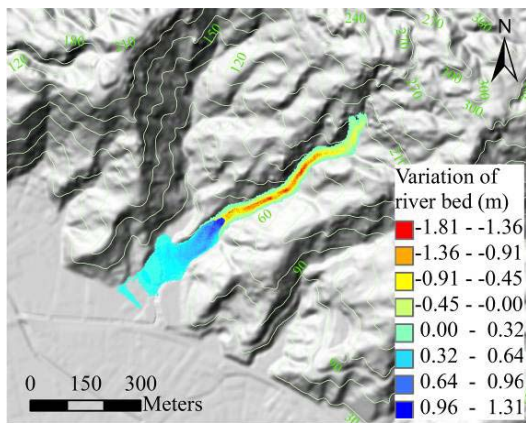
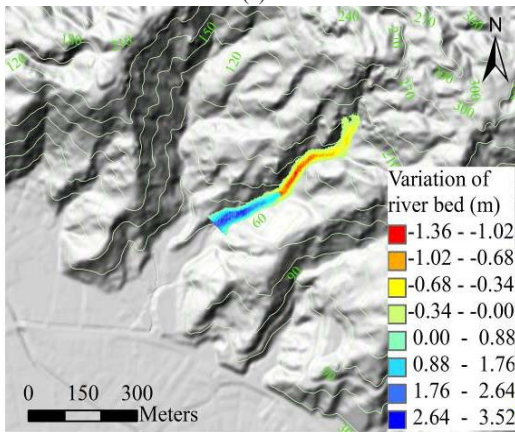


Figure 7 Variation of river bed (The equations of Nakagawa et al. 2003 were used to calculate equilibrium concentration)



(a)



(b)

Figure 8 Flooded area (a) no dam, (b) dam height increased 1.62 m

investigation and other models, it shows that this model can well simulate the erosion and deposition.

(2) The pre-processing and post-processing of numerical simulation are easily realized by using GIS technology. The grid networks for computation

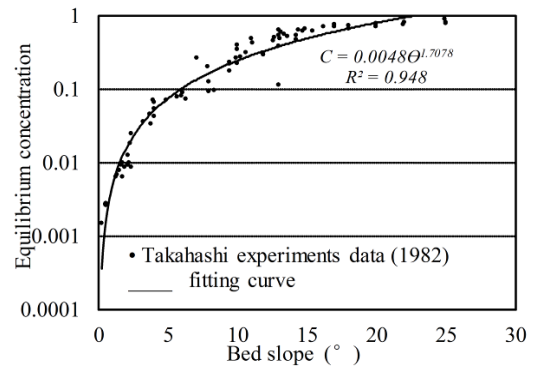


Figure 9 Fitting curve of equilibrium concentration getting from Takahashi experiments data (1982)

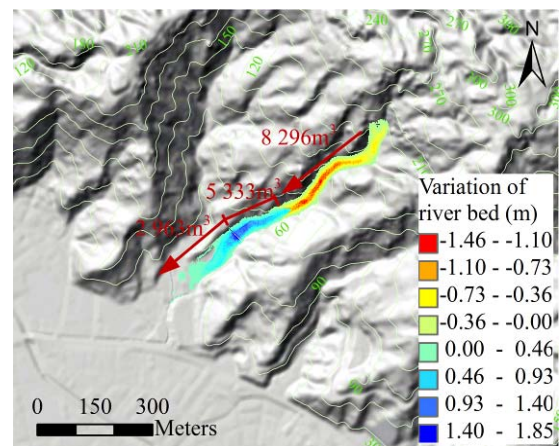


Figure 10 Variation of river bed (Use fitting Eq. to calculate equilibrium concentration)

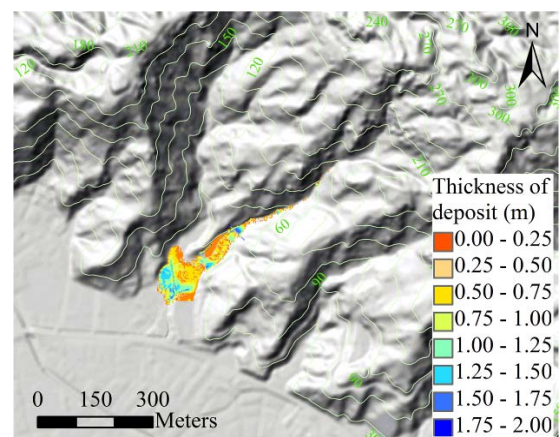


Figure 11 Thickness of deposit by fixed bed model (the model proposed by Wang et al. 2008)

can be extracted from GIS, and the simulation results can be converted to GIS to form the hazard map for debris flow.

(3) This coupled model can be used to evaluate the effectiveness of a dam for cutting debris flow. The

simulated results show that this method can offer a good pre-planning guideline for engineers.

(4) The simplified equilibrium concentration is easier and useful for the user.

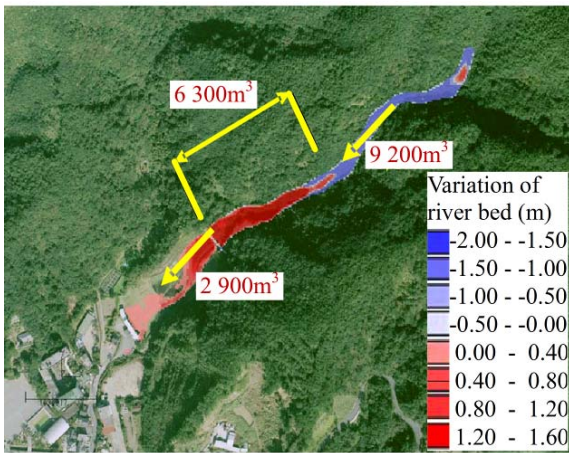


Figure 12 Variation of river bed by New-SASS model (The model proposed by Sabo and Landslide Technical Center in Japan)

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Table 2 Comparisons of calculated results (Unit: m³)

	Erosion volume	Intercept volume	Deposit volume
Field investigation	2,854	5,621	3,076
Fixed bed model	0	1,073	3,022
New-SASS model	3,357	6,300	2,900
Present coupled model	2,681	5,480	3,044

Note: Source volume for field investigation and modeling are 5,843 m³.

Acknowledgement

This study has received financial support from the Global Environment Research Fund of Japan (S-8) and from Grants-in-Aid for Scientific Research (Scientific Research (B), 22310113, G. Chen) from Japan Society for the Promotion of Science. The first author acknowledges the support of China Scholarship Council. These financial supports are gratefully acknowledged. We thank Professor Iain Taylor from the University of British Columbia for language editing.

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