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Numerical issues in computing inundation areas over natural terrains using Savage-Hutter theory

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Abstract When characterizing geologic natural hazards, specifically granular flows including pyroclastic flows, debris avalanches and debris flows, perhaps the most important factor to consider is the area of inundation. One of the key parameters demarcating the leading edge of inundation is the run-out distance. To define the run-out distance, it is necessary to know when the flow stops. Numerical experiments are presented for determining a stopping criterion and exploring the suitability of the Savage-Hutter theory for computing inundation areas of granular flows. The stopping criterion is a function of dimensionless average velocity, pile aspect ratio and internal and bed friction angle and can be implemented on either a global (entire flow) or local (small areas of the flow) level. Slumping piles on a horizontal surface, and geophysical flows over complex topography were simulated. Mountainous areas, such as Colima volcano, Mexico; Casita, Nicaragua; Little Tahoma Peak, USA, and the San Bernardino Mountains, USA, were used as test regions. These areas have combinations of steep, open slopes and sinuous channels. Because of differences in topography and physical scaling, slumping piles in the laboratory and geophysical flows in natural terrain must be scaled differently to determine a reasonable dimensionless relationship for the stopping criterion.

Keywords Geologic hazard · Debris flow · Inundation area · Run-out · Numerical model · TITAN2D · Colima · Casita · Little Tahoma Peak · San Bernardino Mountains · Mexico · Nicaragua · Washington · California

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1 Introduction

Gray et al. [\(1999\)](#page-18-0) and Pudasaini and Hutter [\(2003\)](#page-18-0) recently discussed the potential for computation of granular flows over realistic topography. They looked forward to the day when such computations could be implemented on digital elevation models within Geographic Information Systems (GIS), but cautioned about the potential difficulties involved in calculations over complex digital terrain. In a series of articles, Iverson and Denlinger [\(2001](#page-18-0)), and Denlinger and Iverson [\(2001,](#page-17-0) [2004\)](#page-17-0) presented results comparing numerical models with laboratory flows over somewhat complex simulated terrain.

In recent study, we have developed a numerical granular flow model (TITAN2D) that works in conjunction with a standard Geographic Information System (GIS) program on digital elevation models of terrain from standard sources, such as the U.S. Geological Survey and the National Geospatial-Intelligence Agency (NGA) (Patra et al. [2005](#page-18-0)).

Despite our current position in being able to calculate flow paths over complex topography, there is yet no discussion in the literature of several critical issues involved with numerical computation of flow over natural terrain as depicted by standard digital elevation models. We explore in this article issues related to defining a numerical ''stopping criterion'', i.e., a basis upon which we can decide that a flow has stopped. In so doing, we also address the relative importance of flow resistance due to internal and basal frictional dissipation, and the appropriateness of a dry granular flow model verses a viscous flow model for some classes of flows. We investigate aspects of shallow-water models that relate to flow inundation area (perhaps the critical parameter for any potential future user of such models) by analyzing flow interaction with channels and flow run-out lengths. We develop a model of run-out length, and use numerical experimentation to determine the coefficients characterizing run-out distance for a simple, well-characterized laboratory ''collapsing column'' or ''slumping pile'' test case, and for several geophysical granular flows over complex topography.

2 Conceptual framework

2.1 Modeling geophysical flow

We begin our discussion by briefly reviewing the models of geophysical flows used in our studies. The basic methodology was introduced by Savage and Hutter [\(1989](#page-18-0)), and developed further by many researchers (Pudasaini and Hutter [2007](#page-18-0)). The governing equations are obtained by applying conservation laws to an incompressible continuum, providing appropriate constitutive modeling assumptions and then taking advantage of the shallowness of flows (flows are much longer and wider than they are deep) to obtain simpler depth-averaged representations. In this study, we deal only with granular material that has not been fluidized. Therefore, following Patra et al. ([2005](#page-18-0)), the continuity and momentum equations can be written in Cartesian coordinates:

$$
\frac{\partial h}{\partial t} + \frac{\partial (h\bar{v}_x)}{\partial x} + \frac{\partial (h\bar{v}_y)}{\partial y} = 0
$$
 (1)

$$
\frac{\partial (h\bar{v}_x)}{\partial t} + \frac{\partial (h\bar{v}_x^2)}{\partial x} + \frac{\partial (h\bar{v}_x\bar{v}_y)}{\partial y} \n= -\frac{\bar{v}_x}{\sqrt{\bar{v}_x^2 + \bar{v}_y^2}} gh \cos \theta_x \left[1 + \frac{\bar{v}_x^2}{r_x g \cos \theta_x} \right] \tan \phi_{\text{bed}} - ehk_{\text{max}} \frac{\partial}{\partial x} (gh \cos \theta_x) \tag{2} \n- sgn\left(\frac{\partial \bar{v}_x}{\partial y}\right) ehk_{\text{max}} \frac{\partial}{\partial y} (gh \cos \theta_x) \sin \phi_{\text{int}} + gh \sin \theta_x
$$

where $[x, y, t]$ are the independent variables, h is the flow depth, g is the gravitational acceleration, $[\bar{v}_x, \bar{v}_y]$ are the velocity components, θ_x is the slope angle in the x-direction, r_x is the slope curvature in the x-direction, ϕ_{hed} is the basal friction angle, $k_{\text{act}/\text{pass}}$ is the earth pressure coefficient, and ϕ_{int} is the internal friction angle. There is a cognate expression for the y-momentum.

For laboratory slumping pile experiments referenced herein, $O(H^*) = 0.1$, and $Q(L^*) = 1$. so $O(\varepsilon) = 0.1$. However, for geophysical flows, $O(H^*) = 10$ m. $O(L^*) = 1,000-10,000$ m, so $O(\varepsilon) < 0.01$ is typical. In Eq. 2, all terms on the right-hand side that depend on the internal friction angle are multiplied by the scaling factor ε . Since ε is small, only the bed friction angle and topography play important roles in flow propagation. That is to say, most flows spread out a great deal reducing the amount of influence internal friction may have on flow dynamics making it a relatively unimportant parameter in geophysical flows.

Many real geophysical flows, such as debris flows are fluidized. Recent study including that of Iverson and Denlinger [\(2001](#page-18-0)) has attempted to model the effects of the fluid using appropriate constitutive modeling and additional field variables describing pore pressure. However, there remain many open questions regarding the modeling of fluidized debris flows by this and other such approaches. For the purposes of exploring some aspects of the suitability of granular flow models for particular geophysical flows, we introduce here a viscous flow model wherein a simple basal resistance term is used. A form of the St. Venant equations is used for the depth-averaged mass and momentum conservation equations of viscous flow for motion in the x - and y -directions:

$$
\frac{\partial h}{\partial t} + \frac{\partial (h\bar{v}_x)}{\partial x} + \frac{\partial (h\bar{v}_y)}{\partial y} = 0
$$
\n(3)

$$
\frac{\partial (h\bar{v}_x)}{\partial t} + \frac{\partial (h\bar{v}_x^2 + \frac{1}{2}g_z h^2)}{\partial x} + \frac{\partial (h\bar{v}_x \bar{v}_y)}{\partial y} = gh \sin \theta_x - \tau_{bf} h \bar{v}_x \tag{4}
$$

$$
\frac{\partial (h\bar{v}_y)}{\partial t} + \frac{\partial (h\bar{v}_y^2 + \frac{1}{2}g_z h^2)}{\partial y} + \frac{\partial (h\bar{v}_x \bar{v}_y)}{\partial x} = g_y h - \tau_{bf} h \bar{v}_y \tag{5}
$$

where τ_{bf} is a parameter with dimension s⁻¹ that characterizes the resistance to movement, expressible in any standard Manning, Chezy, or friction factor form (Molinaro and Natale [1994\)](#page-18-0).

TITAN2D uses a parallel, adaptive grid, second-order accurate Godunov shock capturing method to solve the equations for dry granular flow (Patra et al. [2005\)](#page-18-0). A principal feature of the code is the incorporation of topographical data into the simulation and grid structure. We have written a preprocessing routine in which digital elevation data is imported from one of several GIS sources. Because of its wide use in the geoscience community and its easy availability, we principally use Geographic Resources Analysis Support System (GRASS) which is an open source software for data management, spatial modeling, image processing, and visualization. The GIS data define a two-dimensional spatial box in which the simulation will occur and consist of elevations at specified grid locations. Using these data, and interpolating between data points where necessary, creates a rectangular Cartesian mesh. This mesh is then indexed in a manner consistent with our computational solver. The elevations provided on this mesh are used to create surface normals, tangents, and curvatures, ingredients in the governing equations. Computational load balancing is handled using a space filling curve and bin-weighting to distribute work among participating processor units. Finally, together with simulation output the grid data is written out for use in post-computation visualization. The synthesis of these computational techniques makes possible the solution of geophysical flow propagation problems over realistic terrain.

2.2 Inundation area computation

In this contribution, inundation area is considered in an overall sense as characterized by the run-out distance. The inundation area is the area covered by a geophysical flow over the course of its run-out. The front or leading edge of the flow causes the most damage and is the most dangerous part. For this reason determining the run-out distance for inundation is very important. For large block and ash flows on volcanoes, the run-out distance is on the order of several kilometers (Saucedo et al. [2005](#page-18-0)); for large debris flows, it is on the order of tens of kilometers (Vallance and Scott [1997;](#page-18-0) Plafker and Ericksen [1978](#page-18-0); Pierson [1985;](#page-18-0) Fairchild and Wigmosta [1983](#page-17-0)). This contribution investigates run-out distance from a numerical perspective. It is important to keep in mind that the stopping criteria investigated may or may not be physically significant in nature, even though they appear to have some meaning in numerical experiments.

To estimate the run-out distance, it is necessary to know when the flow stops. In numerical simulations the flow velocity will never be zero. Thus we cannot construct a criterion based on this notion. Instead, it is necessary to suppose that when the velocity of a flow is reasonably small, it essentially stops in nature. A small absolute velocity will not work for this stopping velocity because piles of different sizes have different initial energies and different characteristic velocities. It is possible (even easy) to define a dimensionless velocity for a geophysical flow, such as

$$
V_1^* = V_{\text{ave}} / (gH_0)^{1/2} \tag{6}
$$

where $V_{\text{ave}} = \int |\bar{v}| d\hbar / \int dh$ is the mass-averaged pile velocity, and H_0 is the maximum thickness of initial mass. However, V_1^* does not rely upon internal friction angle, bed friction angle, or transient aspect ratio, which intuitively can be thought to play important roles in the momentum equations describing granular flows.

One idea that has been proposed is to use a critical value of the basal friction force to stop a simulated flow (Mangeney-Castelnau et al. [2003](#page-18-0)):

$$
T_t < \sigma_c = \rho g r_z h \tan(\varphi_{\text{bed}}) \rightarrow \textcircled{s}
$$
 (7)

where \circledS means stop; $T_t =$ friction force, the amplitude of the stress at the bottom; σ_c = upper bound of the admissible stresses; $r_z = \cos \beta$, with β defined as the angle between the vertical axis and the normal to the topography. In this stopping criterion internal friction is ignored, utilizing only bed friction. In general, however, internal friction must be taken into account in granular flow models for the following reasons: (1) The

internal friction force can sometimes be large relative to the bed friction force, as shown in numerical collapse column experiments (Fig. 1); (2) thus in geophysical flows where the pile height is large such as in steep, narrow channels, the aspect ratio can be more than unity, in which case, internal friction is important and cannot be thrown out, and finally (3) although the scaling of the internal friction term often results in it having a small magnitude, the cross-channel internal friction can be still high. A stopping criterion that includes internal friction is thus needed to stop model simulations when the flow moves extremely slowly and the velocity is negligible.

Fig. 1 Relationship between non-dimensionalized time, t^* , internal and bed friction force, and initial aspect ratio, AR, for simulated slumping pile. In each case, initial pile radius is 0.1 m and shape is cylindrical. $a AR = 0.5$, $b AR = 1$, and $c AR = 2.5$. As AR increases, the magnitude of the aggregate internal friction force can exceed the basal friction force. The ratio friction force/weight is taken as ratio between given force terms in equations of motion and similarly normalized vertical gravitational term

A stopping criterion can be implemented on either a local or global level. For the global stopping criterion, after V_{ave} reaches a predetermined minimum value the entire flow stops. For the local stopping criterion, the flow is sectioned into small areas. Each area can be analyzed individually to measure flow velocity. Once flow velocity in an area reaches a predetermined minimum value, flow in that area stops. To further characterize the goodness of the stopping criteria discussed in the following sections, we also investigate inundation area on the local level by studying how granular flows interact with channel elements. We have observed that some computed flows go uphill with excessive superelevation when channels in mountainous areas have a sharp bend around a topographic buttress. These computed flows could make the simulations invalid when the velocity is large. In low friction angle simulations ($\varphi_{\text{bed}} < 10^{\circ}$), flowing masses sometimes go over mountainous areas irrespective of peak or valley. Physically this does not make sense, and is a result of attempting to push a granular flow model beyond its limit.

2.3 Theory of run-out distance

Although we all know when something has stopped, the mechanics of a continuum that can be said to be no longer moving remains ill-defined. In general, one cannot define ''stopping'' such that it requires every parcel within a mass to lack momentum. Such a situation cannot last for any long period given the ensuing numerical instabilities if no control is placed on the solver.

The derivation of numerical stopping criteria may be done by exploring either a global criterion based on the motion of the entire flow, as characterized by a flow average velocity, or a local criterion based on force balances which indicate when the flow is considered to be stopped in a small area as characterized by individual computational cell analysis.

2.3.1 Global stopping criterion

In the first method, we seek a global minimum critical average pile velocity, V_{ave} , below which the entire flow has essentially stopped. Based on the work of Pouliquen and Forterre ([2002\)](#page-18-0), it is hypothesized that this velocity can be found as:

$$
f(V_{\text{ave}}, g, H, \alpha, \tan \varphi_{\text{int}}, \tan \varphi_{\text{bed}}) = 0
$$
 (8)

In which H is the transient maximum pile height and $\alpha = H/A^{1/2}$ is the transient aspect ratio of pile (A is the pile area). According to the Buckingham Π -theorem, we have six parameters and only two dimensions; thus, there are four dimensionless groups that can be formed. Given that three of the variables are dimensionless angles, we already have three of these groups, thus:

$$
\frac{V_{\text{ave}}}{\sqrt{gH_0}} = f(\alpha, \tan \varphi_{\text{int}}, \tan \varphi_{\text{bed}})
$$
\n(9)

or assuming that the function f is homogeneous

$$
\frac{V_{\text{ave}}}{\sqrt{gH_0}} = c_0 \alpha^{c_1} \tan \varphi_{\text{int}}^{c_2} \tan \varphi_{\text{bed}}^{c_3} \tag{10}
$$

where the c_i are the constants determined by numerical experimentation. The relationship in Eq. 10 can also be stated as:

$$
V_2^* = \frac{V_{\text{ave}}}{\sqrt{gH_0\alpha^{c_1}\tan\varphi_{\text{int}}^{c_2}\tan\varphi_{\text{bed}}^{c_3}}} = c_0
$$
\n(11)

where V_2^* is a second global dimensionless stopping velocity for a given type of granular flow. Pouliquen [\(1999](#page-18-0)) and Pouliquen and Forterre [\(2002](#page-18-0)) have already noted a velocity of this form and that for a uniform, steady, open-channel granular flow of glass beads (regardless of bed roughness), $c_0 = 0.136$ and $c_i = 0$ for $i = [1,2,3]$.

2.3.2 Local stopping criterion

In the case of a local stopping criterion, we can examine flow characteristics in each computational cell. This stopping criterion can be formulated as a two-part test. First we check if the pile will continue to slide and then we check if it will slump. Sliding is motion of the mass relative to the substrate. Slumping is motion of particles relative to other particles in the flow. Stopping occurs only if both tests are passed. Test $1(T_1)$ checks to see if the pile will stop sliding within a negligible amount of time that is less than the characteristic time to slump, t^* . It is of the form:

$$
\frac{a}{v}t^* \geqslant 1 \to T_2 \tag{12}
$$

where T_2 is Test 2, a, acceleration, is the net force per unit mass, v is the local flow speed, and \rightarrow indicates go to Test 2 if the criterion is met.

Including the pressure from adjacent cells, for a control volume within a moving granular mass, acceleration is given by:

$$
a = g \left(k_{\text{act/pass}} \frac{\mathrm{d}h}{\mathrm{d}s} + \frac{\mathrm{d}e}{\mathrm{d}s} - \frac{\tan \varphi_{\text{bed}}}{\sqrt{1 + \left(\frac{\mathrm{d}e}{\mathrm{d}s} \right)^2}} \right) \tag{13}
$$

where the first term on the right-hand side is the acceleration from the change in height within the volume, the second term is the acceleration from the change in elevation, and the third term is the deceleration from the basal friction resolved onto the elevation plane. In addition, e is the basal surface elevation, s is the distance in the direction of maximum velocity or downhill if speed is zero. In the event that ν is zero, the flow is locally stopped.

The second test consists of a check on whether the internal friction can support the pile shape:

$$
\tan \varphi_{\rm int} - \left\| \frac{\mathrm{d}(h+e)}{\mathrm{d}s} \right\| \geq 0 \to \textcircled{s}
$$
 (14)

where

$$
\left(\frac{\partial (h+e)}{\partial s}\right)^2 = \left(\frac{\partial (h+e)}{\partial x}\right)^2 + \left(\frac{\partial (h+e)}{\partial y}\right)^2 \tag{15}
$$

for which the derivatives are computed by difference quotient.

There remains a question of "what to do?" in the computation when the criteria are satisfied. For the global criterion, the calculations are halted. For the local criterion the options are:

- 1. Zero the (local) momenta (velocities)
- 2. Treat the momenta as if they were zero until such time as additional material entering the cell causes the stopping criterion to become unsatisfied, or
- 3. Increase frictional dissipation such that $\varphi_{\text{bed}} = \varphi_{\text{int}}$ (bed friction must be able to support the pile specified to be supported by the internal friction)
- 4. Reset the magnitude of the driving force on the bed so that it is at most the value for a static mass and does not exceed the net frictional forces

Although it is likely that option 1 is too simplistic, it is not otherwise clear which of the options best reflects the physical reality.

3 Numerical experiments on run-out distance

3.1 Simulations of slumping piles

Slumping pile experiments were conducted by Lajeunesse et al. ([2004,](#page-18-0) p. 2371) and Lube et al. ([2004,](#page-18-0) p. 175; [2005\)](#page-18-0). In their experiments, slumping piles were rapidly released onto a horizontal surface and allowed to spread out unhindered. For the purpose of estimating parameter values for a global stopping criterion sufficient to model the slumping pile experiments performed by Lube et al. ([2005](#page-18-0)), slumping pile simulations were performed using two different equations for velocity. What we will call the ''dimensionless velocity'', V_1^* (Eq. 6), does not incorporate initial pile geometry (aspect ratio), internal friction angle or bed friction angle, whereas "stopping velocity", V_2^* (Eq. 11), incorporates all of the previously stated variables. In the slumping pile numerical simulation, the bed is flat and bed slope is 0.

Figure [1](#page-4-0) shows the relationship between time (non-dimensionalized by the free fall time of a particle released at the initial pile height), internal and bed friction angle, and initial aspect ratio (AR) for slumping pile experiments. The initial pile radius is 0.1 m. In all cases the initial pile shape is cylindrical with uniform height. As mentioned previously, the internal friction angle is generally unimportant in controlling granular flow movement. However, if the aspect ratio is high enough it is possible for the sum of the internal friction forces to be more dominant than the bed forces. This behavior is demonstrated in Fig. [1](#page-4-0) graphs A, B, and C: as the aspect ratio increases so does the influence of the internal friction angle on the granular flow dynamics of a slumping pile.

In Fig. [2,](#page-8-0) each graph (A, B, C, D, E, and F) exhibits the same two trends: as the initial aspect ratio increases, the velocity at time 1 increases, and the average velocity decreases smoothly with increasing time, leveling out to nearly constant values at large time. When the pile reaches this large-time velocity, it has essentially stopped moving; we therefore give this ''final'' velocity the label ''negligible''.

In most cases, the pile is not circular in the $x-y$ plane. The effective radius is the radius of a circle with the same area as the ellipse. If r_x and r_y are the radii along the major axis and minor axis then:

$$
r = \sqrt{r_x r_y} \tag{16}
$$

where $r =$ effective radius of pile. In Titan, the pile can be rotated so that the major and minor axes are not aligned with the x- and y-axes. Simulations of slumping piles show that no matter what the shape of the pile is in the $x-y$ plane, the average velocity is only a function of effective radius.

Fig. 2 Relationship between time (t^*) , internal-bed friction angle, initial aspect ratio (AR), and dimensionless velocity (V_1^*) or stopping velocity (V_2^*) for the slumping pile. Different curves are for different internal-bed friction angle pairs. **a**, **b** AR = 0.2; **c**, **d** AR = 0.5; **e**, **f** AR = 1. **a**, **c**, and **e** use V_1^* ; **b**, **d**, and **f** use V_2^* . In this and following figures, we seek a value of time at which all curves have a relatively constant velocity below some threshold value

In Fig. 2, dimensionless velocity graphs A, C, and E show that for the same internal and bed friction angles, as the aspect ratio increases, the average negligible velocity decreases. These graphs also show that for each aspect ratio, as the internal and bed friction angles increase, the negligible velocity increases. In the stopping velocity graphs B, D and F, the increase in aspect ratio shows no affect on the average negligible velocity. Negligible velocity is independent of the bed slope because the bed is flat.

Through numerical experimentation we estimated values for coefficients in Eq. 11 of: $c_0 = 0.03$, $c_1 = -1$, $c_2 = 0.5$, and $c_3 = 0.5$. The negligible slumping velocity is thus:

$$
V_2^* = \frac{V_{\text{ave}} \alpha}{\sqrt{gH_0} \tan \varphi_{\text{int}}^{0.5} \tan \varphi_{\text{bed}}^{0.5}} = 0.03 \tag{17}
$$

Regardless of initial shape, the transient aspect ratio takes on the same value after one dimensionless time, $t^* = t/(2h_0/g)^{0.5}$. The dimensionless time when the pile "stops" is approximately $t^* = 2$, which is close to the total time for collapse in the experiments performed by Lube et al. [\(2005](#page-18-0)):

$$
t_{\infty} = 2.6 \left(\frac{2h_0}{g}\right)^{0.5}
$$
 (18)

By using an internal friction angle of 40° and bed friction angle of 30° , we achieved results that most closely matched the results of the experiments of Lube et al. ([2005](#page-18-0)).

In the simulations of collapsing columns, when the radius and height of pile match with those of experiment, the simulation time is one third to a half as long as experiment time. At this time, the average velocity in the simulation is still increasing. If the simulation is stopped at the stopping velocity, the radius is larger and height smaller than in the experimental deposit. This is because the model uses the shallow water formulation for the equations of motion. The initial collapse column has un-modeled variations in the vertical direction and is poorly modeled by a thin layer assumption.

3.2 Simulations of geophysical flows

For the global stopping criterion, digital elevation models of complex mountainous terrain are used to determine the coefficients characterizing the stopping criterion to use in numerical experimentation. The following areas were chosen for the locations of their relict debris and block and ash flows. They are generally representative of mountainous areas and have experienced a variety of geophysical flow events. Colima Volcano located in Southwestern Mexico had experienced block and ash flows occurring throughout the 1990s, probably with little interstitial fluid having contributed to propagation, and situated on steep open slopes leading to lower confining channels (Saucedo et al. [2005](#page-18-0); Rupp et al. [2006\)](#page-18-0). Waterman Canyon and City Creek in the San Bernardino Mountains, southern California, during Christmas, 2003, experienced debris flows in sinuous channels (Cannon et al. [2008](#page-17-0)). Casita Volcano, western Nicaragua, recently (1998) experienced a large debris avalanche/debris flow situated on steep open slopes (Scott et al. [2004\)](#page-18-0). Little Tahoma Peak located on Mount Rainier in Washington experienced a debris avalanche (1963) on steep open slopes as well as in a broad channel (Crandell and Fahnestock [1965](#page-17-0); Sheridan et al. [2005\)](#page-18-0). At the completion of a numerical simulation, visual output is available at regular time-step intervals on the distribution of inundation depth and propagation velocity.

At each simulation location, Colima, Little Tahoma Peak, Casita, and San Bernardino Mountains (Figs. [3,](#page-10-0) [4,](#page-11-0) [5,](#page-11-0) [6,](#page-12-0) [7\)](#page-12-0), the following trends were observed in both the dimensionless velocity and stopping velocity graphs: first, the average velocity decreases smoothly with increasing time, leveling out to nearly constant values at large time. This nearly constant, negligible velocity increases with decreasing bed friction angle and is not related to the position of the modeled flow within the local topography. Second, runs with the same bed friction angles achieved similar average velocities even though they had quite different internal friction angles. Third, the average velocity decreases with increasing bed friction angle. Fourth, in each graph at large time, regardless of bed friction angle, all of the runs converge close to the same negligible velocity. The dimensionless velocity runs

A

ţ

 $0.001 +$

 $0.001 +$
10

0.01 0.1 1 10

ŧ

0.01 0.1 1 10

Fig. 3 Colima volcano, Mexico. Relationship between dimensionless time (t^*) , and velocities V_1^* and V_2^* , and internal–bed friction angles (in legend). Initial pile: height = 50 m, radius = 300 m, and shape = paraboloid. Individual simulations have different initial pile locations. At location 646000, the x-coordinate of the starting pile is at the summit of Colima. At this location, the bed slope is large, flow thickness is small, flow length is large, and ε is very small. Location 652000 is situated on the slope of Colima close to the bottom of the upper steep cone. Compared to location 646000, the bed slope is small, flow thickness is large, flow length is small, and e is large (small in an absolute sense). Location 649000 is situated midway down Colima's steep upper slope, between the initial locations 649000 and 652000. The values for bed slope, flow thickness, flow length, e, and velocity of location 649000 are between those for locations 646000 and 652000

converge to within ± 0.2 and the stopping velocity runs converge to within ± 0.06 . Fifth, the stopping velocity compared to the dimensionless velocity for the same location always shows a smaller average velocity in the first time step and a smaller negligible velocity.

Because the scaling terms associated with the internal friction angle are small, the negligible velocity is independent of the internal friction angle. The negligible velocity is also independent of the initial aspect ratio because the relative height of the pile is insignificant when compared to the fall height of the pile. We found the best-fit coefficients in Eq. 11 to be: $c_0 = 0.03$, $c_1 = -0.5$, $c_2 = 0$, and $c_3 = 0.5$. The stopping velocity is thus:

Fig. 4 Little Tahoma Peak, Washington. Relationship between dimensionless time (t^*) , velocities V_1^* and V_2^* and internal–bed friction angles (in legend). Initial pile: height = 30 m, radius = 150 m, and shape = paraboloid. Individual simulations have different initial pile locations as well as different internal and bed friction angles. Locations 598500 and 5189800 are situated near the top of Little Tahoma Peak, and locations 599100 and 5190500 are situated on the middle of the slope

Fig. 5 Casita, Nicaragua. Relationship between dimensionless time (t^*) , velocities V_1^* and V_2^* , and internalbed friction angles (in legend). Initial pile: height = 20 m, radius, x-direction = 60 m, radius, y-direction = 70 m, and shape = paraboloid

$$
V_2^* = \frac{V_{\text{ave}} \alpha^{0.5}}{\sqrt{gH_0} \tan \varphi_{\text{bed}}^{0.5}} = 0.03 \tag{19}
$$

In some prototype slumping pile simulations, we tested a stopping criterion based on a match of the radius in the simulation to the final radius in experiments (Lube et al. [2005\)](#page-18-0). The

Fig. 6 Waterman Canyon, San Bernardino Mountains, California. Relationship between dimensionless time (t^*) , velocities V_1^* and V_2^* , and internal-bed friction angles (in legend). Initial pile: height = 20 m, radius = 100 m, and shape = paraboloid. In the Waterman Canyon area, geophysical flows occurred in channels. For all runs, the initial pile height is 20 m, the radius of the pile is 100 m, and the pile shape is paraboloid. As before, individual simulations have different initial pile locations as well as different internal and bed friction angles. The two starting locations used were (474130, 3787860) and (475160, 3786730)

Fig. 7 City Creek, San Bernardino Mountains, California: Relationship between dimensionless time (t^*) , velocities \vec{V}_1^* and V_2^* , and internal-bed friction angles (in legend). Initial pile: height = 20 m, radius = 200 m, and shape = paraboloid. In the City Creek area, geophysical flows occurred in channels

edge of the simulated pile was estimated to be where the minimum pile height, $h^* = H_0/512$. Using this edge definition, an internal friction angle of 40° and bed friction angle of 30° was found to most closely match the final maximum pile height in the experiments of Lube et al. ([2005\)](#page-18-0). However, the resulting definition of final time in the simulations was much shorter than in the experiments. This error increased with increasing aspect ratio, which suggests that it may be due to a breakdown of the thin layer or ''shallow water'' approximation, although other causes for model breakdown have been suggested (Doyle et al. [2007](#page-17-0)).

3.3 Local inundation

Figure 8 is a comparison of the three runs from Fig. [3e](#page-10-0) to results with the same three simulations rerun using the two-step local stopping criterion. Option 3 is implemented when the stopping criterion is met (bed friction angle is locally reset to the internal friction angle). The propagation histories are similar at all friction angles no matter whether a global or local criterion is used, indicating that stopping takes place during a small fraction of the entire history. Because a global criterion is easier to implement, it may be that for some applications, the details of stopping are not important.

Figure [9](#page-14-0) is a plot of the center of mass throughout flow duration for the same six runs as plotted in Fig. 8. In the simulations that used the local stopping criterion, the final center of mass is only slightly closer to the initiation point than is the final center of mass using the global criterion. Qualitatively this is same as one might intuitively suspect, and is also consistent with the observation that the details of stopping may not generally be important.

The granular flow model was used to simulate flows in the mountain areas of Colima, Little Tahoma Peak, Casita, and San Bernardino Mountains. In areas that do not have deep, narrow channels (Colima, Little Tahoma Peak, and Casita), the simulation results are good. For these simulations when the initial piles were located on the summit, or close to the summit the granular flow models worked well with a large bed friction angle $(>15^{\circ})$. The geophysical flows were able to flow with such a large bed friction angle because the bed slope was larger than the bed friction angle. When the initial pile was located close to the bottom of the mountain where the bed slope is small a small bed friction angle $(\leq 10^{\circ})$ allowed flows to go a long distance, in some sense, similar to like debris flows in nature.

Fig. 8 Nondimensional velocity, $V_1^* = V/\sqrt{gH_0}$ versus time, for local stopping criterion (squares) and global stopping criterion (circles). Option # 3 is used when stopping criteria are met for local stopping criterion. Dash-dotted lines have an internal friction angle of 11.85° and bed friction angle of 4.12° . Solid lines have an internal friction angle of 22.8° and bed friction angle of 8.21° . Dashed lines have an internal friction angle of 40° and bed friction angle of 16.1°

Fig. 9 Plot of path of center of mass for runs with *(squares)* and without *(circles)* the local stopping criterion. Local stopping criterion option #3 is used when stopping criterion are met. Dash-dotted lines have an internal friction angle of 11.85° and bed friction angle of 4.12°. Solid lines have an internal friction angle of 22.8 \degree and bed friction angle of 8.21 \degree . Dashed lines have an internal friction angle of 40 \degree and bed friction angle of 16.1°

3.4 Comparison with viscous flow models

Figure [10](#page-15-0) shows the flow paths in the San Bernardino Mountains at City Creek—an area with deep sinuous channels—for a test internal friction angle of 40° , bed friction angle of 4.12° , pile height of 20 m, and pile radius of 300 m. In these simulations the fronts of the flows crossed over buttresses at sharp bends in the channel. After the high-speed front crossed over a buttress, the flow tail ran within the channel. These phenomena occurred for any test in which the bed friction angle was $\langle 10^\circ$. When the bed friction angle was $>15^\circ$, the pile stopped in the channels because the channel slope was less than the bed friction angle.

To study whether this behavior was consistent with open-channel flow of a viscous fluid, the results were compared with those from a viscous flow simulation. In simulations of flows in the San Bernardino Mountains using the viscous flow model, flows moved within the sinuous channels even when the front velocity was very large. The flows did not cross the buttresses at stream meanders. Figure [10](#page-15-0) shows the flow paths in the San Bernardino Mountains at City Creek, with test values for pile height of 20 m, pile radius of 300 m, and τ_{bf} of 0.1 s⁻¹. In the San Bernardino Mountains, granular flows cannot move in the channels after flowing a short distance on the mountain slope. Comparing the simulated granular with viscous flows, it was found that for the fluid dominated debris flows of the San Bernardino Mountains, the viscous flow model suggests that the granular flow model is propagating in an unrealistic fashion. This is because the general slope of the channels is $\leq 5^{\circ}-10^{\circ}$; thus, granular flows cannot move in the channels except by using an unrealistically low value for the bed friction angle. For flow on low slopes, the current results must

be accepted only with caution, as they clearly are based on unrealistic propagation patterns. At Colima, Casita, and Little Tahoma Peak, the slope is $>20^{\circ}$ allowing granular flows to move. The granular flow model produced good simulation results at these locations—these flows may have propagated as granular materials.

4 Discussion and conclusions

An important characteristic to capture when modeling geologic hazards such as granular flows is the area of inundation. The run-out distance of a flow can be used to delineate this feature. To define the run-out distance, it is necessary to determine when a flow stops. In this article, numerical experiments are presented to determine a stopping criterion defined by the velocity of a flow. Numerical experiment results are also used to explore the suitability of the Savage–Hutter theory for computing the inundation area of granular flows.

In this contribution, we sought a reasonable, small velocity to be used as a stopping criterion when simulating geophysical flows. To analyze the importance of using initial pile geometry and internal and bed friction angles to determine when a flow stops, numerical experiments were run using three different velocity stopping criteria. A different mechanism of stopping is described by each stopping criterion. The first stopping criterion, a global "dimensionless" velocity, V_1^* , is only dependent upon the average velocity, gravitational forces and the height of the initial pile. The second stopping criterion, a global "stopping" velocity, V_2^* , incorporates average velocity, gravitational forces, initial pile height, aspect ratio, internal friction angle, and bed friction angle. The third stopping criterion, a local stopping velocity v, examines force balances in each computational cell. Simulations were performed of slumping piles on a horizontal surface, and geophysical flows over complex topography.

First, a collapsing column with different initial aspect ratio, and different internal and bed friction angles was simulated by granular flow model. It was found that the internal and bed friction angles are important for the moving velocity but transient aspect ratio is not important: it is almost the same after one dimensionless time no matter what the initial geometry. This is because the kinetic energy of a collapse column arises from the pile height and if the bed is flat, only the initial aspect ratio plays an important role in collapse. Comparing the different power law values of initial aspect ratio, and internal and bed friction angles, it is not difficult to get a nearly constant \vec{V}_2^* value for a range of initial pile geometries, $AR = 0.2$, 0.5, and 1.

Second, geophysical flows in mountainous areas with (San Bernardino Mountains, California) and without (Colima, Mexico; Little Tahoma Peak, Washington, and Casita, Nicaragua) channels were simulated. In these simulations a range of values were used for the internal and bed friction angle input parameter. It was found that because the scaling terms associated with internal friction angle are small and because the relative height of a pile in a mountainous area is small when compared to the fall height of the pile, the negligible velocity is independent of both the internal friction angle and initial aspect ratio. However, stopping velocities in Figs. [3](#page-10-0), [4](#page-11-0), [5,](#page-11-0) [6,](#page-12-0) [7](#page-12-0) generally exhibit a better similarity collapse than the dimensionless velocity, which means that it is important to use bed friction when determining a stopping criterion.

For a geophysical flow it is more complicated to determinate V_2^* than for a collapsing column. This is because terrain has a variety of topographic elements: open slopes and/or channels, divergences, convergences, and even changing slope angles. Although the initial

aspect ratio is not important in geophysical flow, the transient aspect ratio probably is, and has a value dependent on the topographic setting: on open slopes, the maximum pile height is small and the area of the pile is large; in channels, the maximum pile height is large and the area covered by the flow is small.

The topography traversed by geophysical flows is complex and can be dominated by open slopes as at Colima, location 646000 and Casita, or by channels as in the San Bernardino Mountains at Waterman Canyon and City Creek. Real topography can also have both open slopes and channels as at Colima, locations 649000, and 652000 and Little Tahoma Peak. On an open slope, a pile spreads wide and pile height rapidly becomes small relative to lateral extent. Due to the low aspect ratio, continued spreading is negligible at large times. In channels, pile height always has a significant value because of confinement. A pile will continue moving when the bed friction angle is less than channel slope even though the velocity is small because there is always a driving slope gradient within the pile. The pile will move until it propagates out of the channel onto a fan. For topography having both channels and open slopes, flow is more complex. Simple visualization techniques were introduced to check whether flow is confined to a channel, or collapses on an open slope, or both. With the aid of visualization one can obtain reasonable values for the parameters that control V_2^* .

Geophysical flows were simulated using both a local and global stopping criterion. These runs suggest that for many applications, there may not be sufficient difference in propagation behavior to warrant use of a local stopping criterion, which is more difficult to implement.

The results of these numerical experiments suggest that reasonable estimates of run-out distance for geophysical flows can be obtained by using the stopping criterion with values of $V_2^* = 0.03$ for flows both on open slopes and in channels. Three-dimensional, animated visualization shows that once this value is reached, the flowing material is spreading mostly around a stationary center of mass, and is therefore restricted in lateral extent.

In granular flow models, unreasonable simulation results are produced at the sharp bends of sinuous channels as the flow head passes. Thus, as one would suspect intuitively to be true, one cannot use granular flow models at low basal friction angles, despite the observation that such a model produces inundation areas similar to those seen in nature. Natural flows do not in general behave as a low-friction angle granular materials.

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