
Friction dependence of shallow granular flows from discrete particle simulations

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Abstract – A shallow-layer model for granular flows down inclines is completed with a closure relation for the macroscopic bed friction or basal roughness obtained from micro-scale, discrete particle simulations of steady flows over geometrically rough bases. We systematically vary the bed friction by changing the contact friction between basal and flowing particles. We extend the known friction closure relation to be a function of both bulk flow and bed properties. Surprisingly, we find that the macroscopic bed friction is only weakly dependent on the contact friction of the bed particles and is predominantly determined by the properties of the flowing particles.

INTRODUCTION. – Free-surface flows of granular material occur in many geophysical and engineering applications, such as rockslides, avalanches, or production-line transport. They have been studied extensively both experimentally and numerically. The most direct way to simulate granular flows is by methods such as the Discrete Particle Method (DPM), which computes the movement of individual particles based on a model of the contact forces between the particles [1, 2]. However, realistic flow situations often involve billions of particles, and can only be modeled on a coarser level by continuum solvers (or hybrid methods), in which the particulate flow is described by a small number of continuum fields governed by the conservation of mass, momentum, and often energy. For shallow flows, the mass and momentum conservation equations can be further simplified by averaging over the flow depth, yielding granular shallow-layer equations [3–5]. In order to obtain a closed system of equations, closure relations for the normal stress differences, velocity shape factor, and macro basal friction, have to be provided in terms of the flow variables: height, h , and the depth-averaged velocity, $\bar{\mathbf{u}} = (\bar{u}, \bar{v})$. While closure models are usually developed to retain the qualitative behaviour of the microscopic system, they often cannot describe the quantitative behaviour as the relations between the micro- and macroscopic quantities are not well known.

Here, we focus on one closure relation: the effective macro-friction coefficient $\mu = \mu(h, |\bar{\mathbf{u}}|)$ and its dependence on the bed friction. Concerning nomenclature: in the literature, the word friction is used for both the macroscopic frictional forces felt by a large mass of material moving over a surface, as well as the contact frictional force between two individual particles, *i.e.*, the contact friction used in the DPM simulation. In this paper we will refer to the macroscopic (shallow-layer) friction as μ , use μ^f for the particle-particle contact friction between flowing particles, and take a different value for the contact friction between flowing and base particles, μ^b .

The effective macro-friction coefficient, μ , determines the range of inclinations and heights at which the flow either arrests, reaches steady flow, or accelerates indefinitely. The rougher the base, the larger the range of inclinations at which steady flow is reached. Basal roughness can be realised in various ways. Goujon *et al.* [6], created a rough base by glueing particles onto a flat surface. The roughness was changed by varying the diameter ratio between fixed basal and free flowing particles. They observed a peak in the measured macro-friction coefficient at a certain diameter ratio depending on the compactness of the basal layer. In their work on enduring contacts, Louge and Keast [7] modeled the base as flat frictional incline. Later, Louge [8] extended their theory to bumpy,

geometric rough, inclines. Silbert *et al.* [9,10] used DPM to simulate chute flow over a base of disordered particles and obtained the closure relations as a function of flow height and velocity.

In our research we aim to obtain the closure relations as a function of the basal properties, as well as flowing properties, by studying relatively small steady-state DPM simulations. The ultimate aim is to be able to perform shallow-granular simulations in complex geometries with spatially and temporally evolving basal properties. First, we developed a statistical method in [11] to extract the continuum fields from the microscopic degrees of freedom that is valid near the base of the flow. Then, an extensive parameter study was undertaken in [12] to obtain the full set of closure laws for the shallow granular equations. Here, we study the closure relation for the macro-friction coefficient as a function of the contact friction between basal and flowing particles, μ_b .

MATHEMATICAL BACKGROUND. –

Shallow layer model. The granular shallow-layer equations have proved to be a successful tool in predicting both geological large-scale [13–17] and laboratory-scale experiments [4, 18–20] of granular chute flows. They have been derived in many papers, starting with [3], but here we use the form presented in [4,5]. Shallow-layer theories assume that the flow is incompressible, the stress is isotropic and the velocity profile is uniform in depth. We will consider the flow down a slope with inclination θ with the x -axis downslope, y -axis across the slope and the z -axis normal to the slope. In general, the free-surface and base locations are given by $z = s(x, y)$ and $z = b(x, y)$, respectively. Here, we will only consider flows over rough flat surfaces where b can be taken as constant. The height of the flow is $h = s - b$ and velocity components are $\mathbf{u} = (u, v, w)^T$. Depth-averaging the mass and momentum balance equations and retaining only high-order terms (in the ratio of height to length of the flow) yields the depth-averaged shallow-layer equations, *e.g.*, [4],

$$\frac{\partial h}{\partial t} + \frac{\partial}{\partial x}(h\bar{u}) + \frac{\partial}{\partial y}(h\bar{v}) = 0, \quad (1a)$$

$$\frac{\partial}{\partial t}(h\bar{u}) + \frac{\partial}{\partial x}\left(h\bar{u}^2 + \frac{g}{2}h^2 \cos\theta\right) + \frac{\partial}{\partial y}(h\bar{u}\bar{v}) = S_x, \quad (1b)$$

$$\frac{\partial}{\partial t}(h\bar{v}) + \frac{\partial}{\partial x}(h\bar{u}\bar{v}) + \frac{\partial}{\partial y}\left(h\bar{v}^2 + \frac{g}{2}h^2 \cos\theta\right) = S_y, \quad (1c)$$

where g is the gravitational acceleration, $\bar{\mathbf{u}} = (\bar{u}, \bar{v})$ the depth-averaged velocity and the source terms are given by

$$S_x = gh \cos\theta \left(\tan\theta - \mu \frac{\bar{u}}{\sqrt{\bar{u}^2 + \bar{v}^2}} \right)$$

and

$$S_y = gh \cos\theta \left(-\mu \frac{\bar{v}}{\sqrt{\bar{u}^2 + \bar{v}^2}} \right).$$

We note that various assumptions can be relaxed by introducing closure relations for the mean density, the normal

stress differences, and the shape of the velocity profile. This, however, is beyond the scope of this paper; we refer the interested reader to [12].

Friction law for rough surfaces. The closure to eqs. (1) is achieved by determining the bed macro-friction in terms of the flow variables, such that $\mu = \mu(h, |\bar{\mathbf{u}}|)$. In the early models a constant friction coefficient was used [3,21], *i.e.*, $\mu = \tan\delta$, where δ is a fixed slope angle. For these models, steady uniform flow is only possible at a single inclination, δ , below which the flow arrests, and above which the flow accelerates indefinitely. However, detailed experimental investigations [22–24] for the flow over rough uniform beds showed that steady flow emerges at a range of inclinations, $\delta_1 < \theta < \delta_2$, where δ_1 is the minimum angle required for flow, δ_2 is the maximum angle at which steady uniform flow is possible. In [23], the measured height $h_{stop}(\theta)$ of stationary material left behind when a flowing layer has been brought to rest, was fitted to

$$\frac{h_{stop}(\theta)}{Ad} = \frac{\tan(\delta_2) - \tan(\theta)}{\tan(\theta) - \tan(\delta_1)}, \quad \delta_1 < \theta < \delta_2, \quad (2)$$

where d is the particle diameter and A is a characteristic dimensionless length scale over which the friction varies. Here, we will investigate how the parameters A , δ_1 and δ_2 change as a function of the contact friction between bed and flowing particles.

For $h > h_{stop}$, steady flow exists where the Froude number, $F = |\bar{\mathbf{u}}|/\sqrt{gh \cos\theta}$, is assumed to fit a linear function of the height,

$$F = \frac{\beta h}{h_{stop}(\theta)} - \gamma, \quad \delta_1 < \theta < \delta_2, \quad (3)$$

where β and γ are constants independent of the chute inclination and particle size.

From eqs. (2) and (3) we can derive a relation between the inclination θ and the flow variables F and h . For steady flow over a uniform bed, the momentum eqs. (1) reduce to $\mu = \tan\theta$, and by combining this with (2) and (3) we can derive the friction law

$$\mu(h, F) = \tan(\delta_1) + \frac{\tan(\delta_2) - \tan(\delta_1)}{\beta h / (Ad(F + \gamma)) + 1}. \quad (4)$$

Even though (4) is derived for steady-flow conditions it is expected to hold, in an asymptotic sense, for unsteady situations; therefore, it can be used as a closure relation for (1).

PROBLEM DESCRIPTION. –

Contact description. The DPM is used to perform simulations of a collection of mono-dispersed spherical granular particles of diameter d and density ρ_p ; each particle i has a position \mathbf{r}_i , velocity \mathbf{v}_i and angular velocity $\boldsymbol{\omega}_i$. It is assumed that particles are soft and each contact is assumed to be relatively small and point-like. The relative distance is $r_{ij} = |\mathbf{r}_i - \mathbf{r}_j|$, the unit normal $\hat{\mathbf{n}}_{ij} = (\mathbf{r}_i - \mathbf{r}_j)/r_{ij}$ and the relative velocity $\mathbf{v}_{ij} =$

$\mathbf{v}_i - \mathbf{v}_j$. Two particles are in contact if their overlap, $\delta_{ij}^n = \max(0, d - r_{ij})$, is positive. The normal and tangential relative velocities at the contact point are given by

$$\mathbf{v}_{ij}^n = (\mathbf{v}_{ij} \cdot \hat{\mathbf{n}}_{ij}) \hat{\mathbf{n}}_{ij}, \quad (5a)$$

$$\mathbf{v}_{ij}^t = \mathbf{v}_{ij} - (\mathbf{v}_{ij} \cdot \hat{\mathbf{n}}_{ij}) \hat{\mathbf{n}}_{ij} + \frac{d - \delta_{ij}^n}{2} \hat{\mathbf{n}}_{ij} \times (\boldsymbol{\omega}_i + \boldsymbol{\omega}_j). \quad (5b)$$

For interactions the normal, \mathbf{f}_{ij}^n , and tangential, \mathbf{f}_{ij}^t , forces are modeled as a spring-dashpot with linear elastic and linear dissipative contributions. Hence

$$\mathbf{f}_{ij}^n = k^n \delta_{ij}^n \hat{\mathbf{n}}_{ij} - \gamma^n \mathbf{v}_{ij}^n, \quad \mathbf{f}_{ij}^t = -k^t \boldsymbol{\delta}_{ij}^t - \gamma^t \mathbf{v}_{ij}^t, \quad (6)$$

with spring constants k^n , k^t and damping coefficients γ^n , γ^t ; the elastic tangential displacement, $\boldsymbol{\delta}_{ij}^t$, is defined to be zero at the initial time of contact, and its rate of change is given by

$$\frac{d}{dt} \boldsymbol{\delta}_{ij}^t = \mathbf{v}_{ij}^t - r_{ij}^{-1} (\boldsymbol{\delta}_{ij}^t \cdot \mathbf{v}_{ij}) \mathbf{n}_{ij}. \quad (7)$$

In eq. (7), the first term is the relative tangential velocity at the contact point, and the second term ensures that $\boldsymbol{\delta}_{ij}^t$ remains normal to \mathbf{n}_{ij} , see [12] for details. When the tangential-to-normal force ratio becomes larger than a contact friction coefficient, μ^c , the tangential spring yields and the particles slide, and we truncate the magnitude of $\boldsymbol{\delta}_{ij}^t$ as necessary to satisfy $|\mathbf{f}_{ij}^t| \leq \mu^c |\mathbf{f}_{ij}^n|$. Here $\mu^c = \mu^f$ for contacts between two flowing particles and μ^b for contacts between flow and basal particles. For more details on the contact law used in these simulations we refer the reader to [12]; whereas, in [2] a more complete discussion of contact laws, in general, can be found.

The total force on particle i is a combination of the contact forces $\mathbf{f}_{ij}^n + \mathbf{f}_{ij}^t$ between two particles i, j in contact and external forces, which for this investigation will be limited to gravity, $m\mathbf{g}$. We integrate the resulting force and torque relations in time using Velocity-Verlet and forward Euler [25] with a time step $\Delta t = t_c/50$, where t_c is the collision time [2]. The fixed bed particles are modeled as having an infinite mass and are unaffected by body and contact forces: they do not move.

Here, we will report results using a simple linear spring dashpot model; however, we did perform a comparison of some of the results using more advanced contact models. A few simulations were undertaken using an elastio-plastic model. For this contact model as the strength of the plastic force was increased more energy was removed from the system and some previously flowing cases retarded; however it did not change the fact there is a range of angles at which steady flow is observed. A more detailed study using the Hertzian contacts was undertaken. The use of Hertz did not change the shape of the h_{stop} curve, but did slightly change the fit, despite these simulations having a different average contact duration (approximately five times that of the linear-dashpot) and coefficient of restitution (0.98). The most noticeable difference being

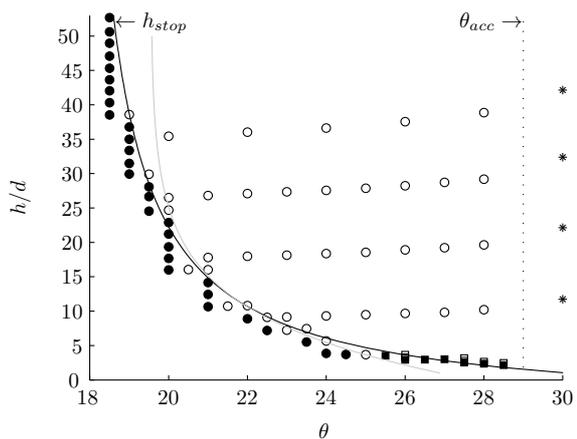


Fig. 1: Overview of DPM simulations for $\mu^b = 0.5$, with markers denoting the different states: arrested (filled-symbols), steady (open-symbols), and accelerating (*). The demarcation line is fitted to h_{stop} see eq. (2) (solid line). Note, circular symbols are for increasing number of particles and square symbols for decreasing. Grey line shows results using the Hertzian contact model.

around a 1° change in δ_1 , see grey line in fig. 1; however, the overall effect on the macroscopic friction was small. The main reason for focusing on the linear contact model is that we can be sure that non-linearities and interesting phenomena we observe are not due to the contact model, but are fundamental to the flow configuration.

In the following simulations, parameters are nondimensionalised such that the flow particle diameter $d = 1$, mass $m = 1$ and the magnitude of gravity $g = 1$. The normal spring and damping constants are $k^n = 2 \cdot 10^5$ and $\gamma^n = 50$; thus the contact duration is $t_c = 0.005$ and the coefficient of restitution is $\epsilon = 0.88$. The tangential spring and damping constants are $k^t = (2/7)k^n$ and $\gamma^t = \gamma^n$; hence, the frequency of normal and tangential contact oscillation and the normal and tangential dissipation are equal. These parameters are identical to those used by Silbert et al. [9] except that a dissipation in the tangential direction, γ^t , was added to dampen rotational degrees of freedom in arresting flow. In this investigation, the friction between bed and flowing particles, μ^b , is varied between $\mu^b = 0$ and ∞ .

Chute geometry. DPM simulations are used to simulate uniform granular chute flows. The chute is periodic and of size 20×10 in the x - and y -directions, with inclination θ . The base is created by performing a 12 particle deep simulation of particles, across a flat surface, relaxing the system and then taking a cross-section to use as a rough bottom. More details of the base creation process can be found in [12].

The height of the flow is determined by the number of flow particles, N , which are initially randomly distributed with a low packing fraction of about $\rho/\rho_p = 0.3$. From this state the particles collapse and compact to a height of approximately, $N/200$, giving the chute enough kinetic

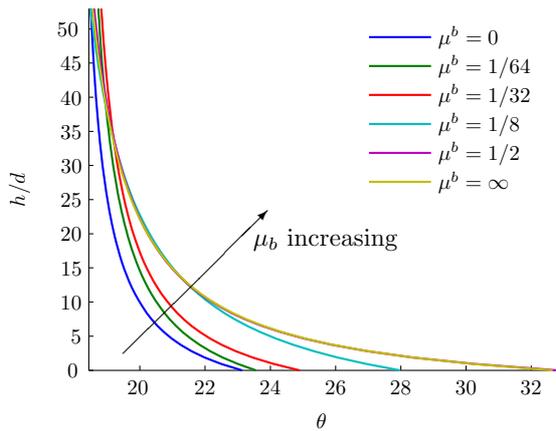


Fig. 2: Demarcation lines $h_{stop}(\theta; \mu^b)$ between retarding and steady flows for various values of μ^b . The demarcation line is fitted to eq. (2).

energy to initialise flow. Time is integrated from $t = 0$ to $t = 2000$ (20 million time steps) to allow the system to reach steady state.

Statistics. To obtain macroscopic fields from the DPM simulations, we use the coarse-graining statistical methods as described in [26, 27], extended to incorporate external boundary forces [11]. For this statistical method a coarse-graining function that spatially smears the discrete data has to be defined; we use a Gaussian of width, or variance, $d/4$.

The flow is assumed steady at $t = 2000$ if the kinetic energy has been constant over the interval $1500 < t < 2000$. To obtain depth profiles of the macroscopic fields in steady state, an average is taken over $t \in [2000, 2100]$ and the x and y directions. The height of the flow is defined to be the distance between the point where the downwards normal stress σ_{zz} vanishes and where it reaches its maximum value. In order to avoid the effects of coarse graining, we used the height where the stress was 2% and 98% of the maximum stress; then we linearly extrapolated the bulk stress profile to define the base and surface locations (see [12] for details).

RESULTS. –

The steady flow regime. From the experiments of Pouliquen [22], steady granular flow over a rough base is known to exist for a range of heights and inclinations, $\theta_{stop}(h) < \theta < \theta_{acc}$, where $\theta_{stop}(h)$ denotes the inverse function of $h_{stop}(\theta)$. The range of steady flow was previously determined using DPM simulations by [9]. However, the simulations provided too few data points near the boundary of arrested and steady flow to allow an accurate fit of the stopping height.

To determine the demarcation line between arrested and steady flow with good accuracy (the h_{stop} -curve), a set of simulations were performed with initial conditions determined by the following algorithm: Starting with $N = 1000$

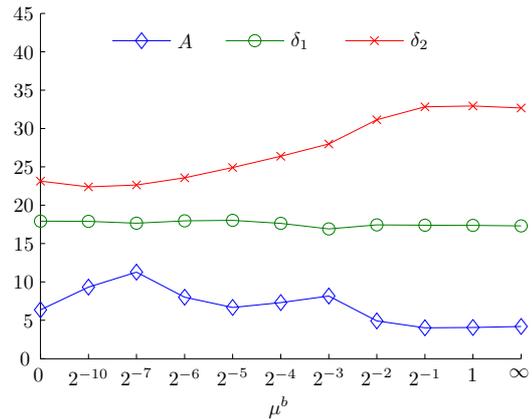


Fig. 3: Figure showing how A , δ_1 and δ_2 depend on the contact friction coefficient between base and flowing particles, μ^b . Please note the labels on the x -axis: the plot is not log-linear.

flow particles and inclination $\theta = 21^\circ$, the angle was increased in steps of 1° until a flowing state was reached (squares in fig 1). If the flow arrested, the number of particles was increased by 400 or else the angle decreased by $1/2^\circ$ (circles in fig 1). Flow was defined to be arrested when the ratio between kinetic energy and the elastic energy stored in the contact, E_{kin}/E_{ela} , fell below 10^{-5} before $t = 500$ was reached, otherwise the flow was determined as flowing. In contrast to [12], we also determined the demarcation line for thin flows: Starting with $N = 1000$, the angle was increased by $1/2^\circ$, if the flow arrested; otherwise the number of particles was decreased by 10% until $N < 200$ was reached. Note, these simulations are shorter than the ones used to determine the flow properties, due to the large number of simulations required to obtain high resolution h_{stop} -curves.

We thus obtain inclination intervals at various heights and height intervals at various inclinations between which the actual demarcation line lies, see fig. 1. The demarcating curve was then fitted to eq. (2) by minimising the distance of the fit to these intervals. This yields a family of demarcation curves between arrested and steady states, $h_{stop}(\theta; \mu^b)$, which can all be fitted to the Pouliquen h_{stop} -curve (2). The fits to these curves are shown in fig. 2; the fitting parameters $\delta_1(\mu^b)$, $\delta_2(\mu^b)$ and $A(\mu^b)$ can be found in fig. 3. The value of δ_1 shows little sensitivity to μ^b , which is to be expected as δ_1 is strongly related to the angle of repose of material [28], which is not a function of the base configuration. For, $\mu^b \leq 1/4$, δ_2 decreases as μ^b is decreasing; whereas A increases, resulting in a net reduction in the effective macro-friction coefficient, μ , as is clearly illustrated in fig. 2.

A general friction law. In order to obtain a function for the bed macro-friction, we used the approach of Pouliquen who found that for rough bases the Froude number is a linear function of $h/h_{stop}(\theta)$. Our first approach was to fit the Froude number to $h/h_{stop}(\theta; \mu^b)$; however, it was found that a better collapse is obtained if the Froude

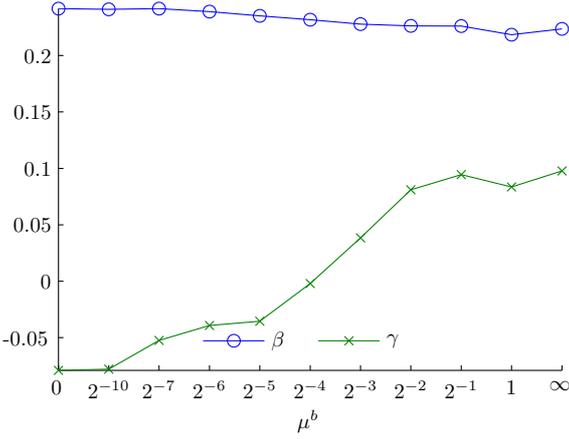


Fig. 4: Figure showing the dependence of β and γ obtained via a fit to (8) on the contact friction coefficient between base and flowing particles μ^b . Please note the labels on the x -axis: the plot is not log-linear.

number is fitted with the h_{stop} -curve for the case where the flowing and base particles are identical, *i.e.*, $\mu^f = \mu^b$ such that

$$F = \beta(\mu^b) \frac{h}{h_{stop}(\theta; \mu^f)} - \gamma(\mu^b),$$

$$\theta_{stop}(h; \mu^b) \leq \theta \leq \theta_{acc}(\mu^b), \quad (8)$$

for all steady flows. In other words, when plotting h/h_{stop} versus the Froude number, F , $h_{stop}(\theta; \mu^f)$ was used instead of $h_{stop}(\theta; \mu^b)$ because it gives a better collapse and is defined for all inclinations for which steady flow exists. This modification to h_{stop} is a key finding. The proportionality constant, β , and offset, γ , for the fit to (8) are shown in fig. 4. The gradient β appear almost independent of μ^b ; however γ has a weak dependence slowly increasing with μ^b . Thus, the friction coefficient of the depth-averaged eqs. (1) is given by

$$\mu(h, F; \mu^b) = \tan(\hat{\delta}_1) + \frac{\tan(\hat{\delta}_2) - \tan(\hat{\delta}_1)}{\frac{\beta(\mu^b)h}{Ad(F+\gamma(\mu^b))} + 1},$$

$$\theta_{stop}(h; \mu^b) \leq \tan^{-1} \mu \leq \theta_{acc}(\mu^b), \quad (9)$$

where the hat denotes *e.g.*, $\hat{\delta}^1 = \delta^1(\mu^f)$, etc. The values obtained for the parameters are given in figs. 3 and 4. The key results are that the only dependence of the macro-friction, μ , on the bed contact friction, μ^b , is through the coefficients β and γ , *i.e.*, *e.g.* (9) is valid for all steady flows, for beds with varying micro friction, and only β and γ are functions of μ^b , all other parameters are determined by μ^f . A detailed investigation of how A , δ^1 and δ^2 depend on other flow parameters has been undertaken in [12].

The values of β and γ reported here, differ from the values reported in [12] and [9] for the case $\mu_b = \mu_f = 1/2$. The source of this discrepancy lies in the higher resolution h_{stop} -curve produced here. The fitting parameters for the

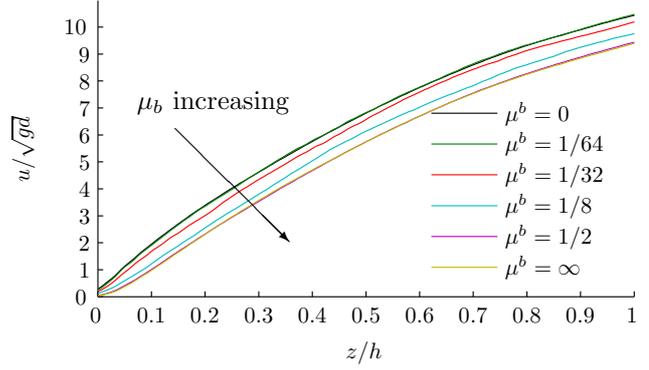


Fig. 5: Flow velocity profile for thick flow with $N = 6000$ ($H = 30$), inclination $\theta = 24^\circ$ and bed micro-friction $\mu^b = 0, 1/1024, 1/2, \infty$. The flow velocity roughly observes a Bagnold profile ($u(z) = 5/3\bar{u}(1 - (1 - z/h)^{3/2})$), except near the surface and the base.

h_{stop} -curves are very sensitive to small changes in the data. Hence, the higher resolution datasets changed the h_{stop} fit; however, this has the opposite effect on the values obtained for β and γ resulting in virtually no change in the macroscopic friction coefficient, μ . This implies that A , δ_2 , β and γ may not be the best way to characterise the friction.

Frictional dependence in the depth profiles. For all simulations we observe nearly constant density profiles, and linear stress profiles for σ_{xx} and σ_{xz} , with depth. These satisfy the mass and momentum balances for steady uniform flow. Additionally, we do find a normal stress anisotropy, *i.e.*, $\sigma_{xx} \neq \sigma_{zz}$. Fig. 5 shows a selection of velocity profiles. We observe a Bagnold profile as predicted in [29] for thick collisional flows. A small deviation from the Bagnold profile is observed at the surface, where the profile becomes linear and near the base where the shear rate decreases. For $\mu^b < 1/2$, the flow shows a slip velocity at the base, a characteristic of smoother flows. However, in [12] it was shown that both the density and the shape of the velocity depend on the inclination and height of the flow.

CONCLUSIONS. – An extensive parameter study of steady uniform flows was undertaken by varying height h , inclination θ and the basal contact friction μ^b . At small inclinations, the flow quickly retards and a static pile is formed; at large inclinations, the flow continued to accelerate; between these two regimes there was a range of inclinations at which steady flows were observed, see fig. 1. Depth profiles for density, velocity and stress were measured using coarse-grained macroscopic fields. The assumptions of depth-averaged theory are found to be valid for steady uniform flow: the density is almost constant in depth, and the downward normal and shear stress balances the gravitational forces acting on the flow (both local and in depth-averaged form).

A closure relation for the macroscopic basal friction in a

shallow-layer model of granular flow, over a geometrically rough bed, was obtained using DPM simulations. Here, the closure relation was obtained as a function of the basal and flowing particle properties. Therefore, this law can be used in shallow continuum models with spatially and temporally evolving surface properties. Many geophysical and industrial problems involve situations where the basal roughness is not uniform and in the future it will be possible to use this macro friction closure relation to perform large-scale computations (*e.g.*, [30]) of granular flows using depth averaged continuum equations.

The results of the DPM simulations did not vary significantly with the contact friction at the bed; variations were only observed for small values of the basal contact friction, $\mu^b < 1/4$. For small values of μ^b the demarcation curves $h_{stop}(\theta; \mu^b)$, $\theta_{acc}(\mu^b)$ between arrested, steady and accelerating flows shifted to the left, see fig. 2, implying a lower macro-friction coefficient, μ . For smoother surfaces $\mu^b < 1/2$, the flow developed a small slip velocity at the base, see fig. 5.

The bed friction, $\mu = \tan \theta$, was expressed as a function of height and flow velocity, cf. (9). This was done using the approach of Pouliquen for varying contact friction at the bed. It was found that the fit for A , β , γ and δ_2 are very sensitive to details of the datasets and by extending the range of flows simulated the values change. However, the changes in each parameter cancel resulting in only a minor change in the predicted friction coefficient. This suggests that these parameters are not the best way to parameterise the basal friction and a better set of variables with different physical interpretation may exist.

The friction law developed here is strictly only valid for steady flows of mono-dispersed particles for the established inclination range $\theta_{stop}(h; \mu^b) \leq \tan^{-1} \mu \leq \theta_{acc}(\mu^b)$. However, it is anticipated, that it will still hold for slightly poly-dispersed particles, slowly varying basal properties, and across a wider range of angles. The exact range of applicability of the closure law still has to be determined and this will form the theme of future work.

Both the results presented here and in [12], where the geometric basal roughness (size of basal particles) was changed, show that the flow rule for the case where bed and flow particles are the same gives the best collapse. Therefore, for the macroscopic friction coefficient, μ , the main result of these studies is: The only dependence of μ on the base properties is through the relationship of the Froude number against $h_{stop}(\theta; \mu^f)$. In other words, the macroscopic friction coefficient, μ is mainly determined by the properties of flowing material and, hence, the Pouliquen law may still give insight for flows over smooth surfaces, where at the moment it is thought to be of limited applicability.

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