# SPH MODELLING OF FLUID AT THE GRAIN LEVEL IN A POROUS MEDIUM

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## ABSTRACT

Computational modelling of the flow of fluids in porous media has traditionally been at a macroscopic level where the medium's permeability and porosity are an input (from experiments for example). In many cases this is difficult, especially if the porous medium changes its solid structure as a function of time. This situation occurs in reactive systems such as "heap-leaching" where biological and/or chemical solutions are introduced into the heap to dissolve or react with valuable materials. In this case, modelling fluid flow at the grain level is paramount and we show how this can be done with the SPH technique. We present three-dimensional SPH simulations of fluid flow in an idealised porous medium and show that the technique yields flows which are physically realistic. The permeability of the medium is then predicted.

## NOMENCLATURE

- L characteristic length
- P pressure
- v velocity
- $\rho$  density
- $\mu$  dynamic viscosity

## INTRODUCTION

Porous media flow is important in a number of areas such as oil recovery, groundwater flow, carbon sequestration, flow in biological materials and recovery of valuable minerals (or metals) from ores via the process of heapleaching. In each case, one is interested in how the structure of the porous medium affects the fluid flow. Generally these flows have low Reynolds number (Bear, 1972), where  $\text{Re} \equiv \rho Lv / \mu$ , where  $\rho$  is the fluid density, *L* is a typical length scale for the flow, v is the typical fluid speed and  $\mu$  is the fluid viscosity. For these low Re, the flow is in the laminar regime and its macroscopic behaviour can be described by Darcy's Law:

$$v = \frac{k}{\mu} \nabla P \tag{1}$$

where P is the pressure and k is the permeability of the medium.

In this study we model fluid flow in a representative porous medium at the grain-scale. By doing this we would like to be able to calculate the permeability without making any a priori assumptions. To date there are only two other published works which have used SPH methods to determine the permeability of a porous medium from first principles. They are the studies by Zhu, Fox and Morris (1999) and by Jiang, Oliveria and Sousa (2007). The study by Zhu *et al* (1999) considered a twodimensional (2D) porous medium made up of circular, solid particles either arranged in a square or hexagonal array. This corresponds to fluid flow around long fibres. They were able to compute the discharge velocity as a function of the applied pressure gradient and found that it followed a linear relationship. From the gradient of this linear relationship they evaluated the medium's permeability. They compared their SPH simulations with Finite Element calculations and found good agreement.

The second work by Jiang *et al* (2007), considered flow through a slit, with the slit placed at a sequence of angles with respect to the applied pressure gradient. This angle was varied from zero (parallel to pressure gradient) to 90 degrees (orthogonal to the pressure gradient). Once again this was a two-dimensional study. They were able to compute the average fluid velocity as a function of the applied pressure gradient and found that this also followed a linear relationship. From this they determined the medium's permeability. These results were then compared to the Blake-Kozeny-Carman (Bear, 1972, Faber, 1995) theoretical predictions and good agreement was found.

Our study continues the development of the SPH method by considering flow in a three-dimensional (3D) porous structure. It is well known that permeability of 3D media is quite different to 2D because the extra dimension results in a vast increase in the number of possible flow paths. We note here that a current technique popular for obtaining permeabilities for porous media flow is the Lattice-Boltzmann (LB) method. See for example Chen and Doolen (1998) or Heijs and Lowe (1995).

### SPH METHOD

The SPH method is reviewed in detail by Monaghan (2005). The method starts with the interpolation of any function A at any position  $\mathbf{r}$  using SPH smoothing which is given by:

$$A(\mathbf{r}) = \sum_{b} m_{b} \frac{A_{b}}{\rho_{b}} W(\mathbf{r} - \mathbf{r}_{b}, h) , \qquad (2)$$

where  $m_b$  and  $\mathbf{r}_b$  are the mass and density of particle *b* and the sum is over all particles *b* within a radius 2h of **r**. Here  $W(\mathbf{r},h)$  is a C<sup>2</sup> spline based interpolation or smoothing kernel with radius 2h that approximates the shape of a Gaussian function. The gradient of the function *A* is given by differentiating the interpolation equation (2) to give:

$$\nabla A(\mathbf{r}) = \sum_{b} m_{b} \frac{A_{b}}{\rho_{b}} \nabla W(\mathbf{r} - \mathbf{r}_{b}, h)$$
(3)

Using these interpolation formulae and suitable Taylor series expansions for second order derivatives, any parabolic partial differential equations can be converted into ordinary differential equations for the motion of the particles and the rates of change of their properties.

The SPH continuity equation, taken from Monaghan (1994, 2005) is:

$$\frac{d\rho_a}{dt} = \sum_b m_b \left( \mathbf{v}_a - \mathbf{v}_b \right) \bullet \nabla W_{ab} \tag{4}$$

where  $\rho_a$  is the density of particle *a* with velocity  $\mathbf{v}_a$  and  $m_b$  is the mass of particle *b*. We denote the position vector from particle *b* to particle *a* by  $\mathbf{r}_{ab} = \mathbf{r}_a - \mathbf{r}_b$  and let  $W_{ab} = W(\mathbf{r}_{ab}, h)$  be the interpolation kernel with smoothing length *h* evaluated at distance  $|\mathbf{r}_{ab}|$ . This form

of the continuity equation is Galilean invariant (since the positions and velocities appear only as differences), has good numerical conservation properties and is not affected by free surfaces or density discontinuities.

The SPH method used here is quasi-compressible and an equation of state is used to specify the relationship between particle density and fluid pressure. A form suitable for incompressible fluids is:

$$P = P_0 \left[ \left( \frac{\rho}{\rho_0} \right)^{\gamma} - 1 \right]$$
<sup>(5)</sup>

where  $P_0$  is the magnitude of the pressure and  $\rho_0$  is the reference density (Monaghan, 1994, 2005). For water and similar fluids  $\gamma = 7$ .

The momentum equation when converted to SPH form becomes the acceleration for each particle *a*:

$$\frac{d\mathbf{v}_{a}}{dt} = \mathbf{g} - \sum_{b} m_{b} \begin{bmatrix} \frac{P_{b}}{\rho_{b}^{2}} + \frac{P_{a}}{\rho_{a}^{2}} \end{bmatrix} - \begin{bmatrix} \frac{\xi}{\rho_{a}\rho_{b}} \frac{4\mu_{a}\mu_{b}}{(\mu_{a} + \mu_{b})} \frac{\mathbf{v}_{ab}\mathbf{r}_{ab}}{\mathbf{r}_{ab}^{2} + \eta^{2}} \end{bmatrix} \nabla_{a} W_{ab} \quad (6)$$

where  $P_a$  and  $\mu_a$  are pressure and viscosity of particle aand  $\mathbf{v}_{ab} = \mathbf{v}_a - \mathbf{v}_b$ . Here  $\xi$  is a factor associated with the viscous term (Cleary (1998)),  $\eta$  is a small parameter used to smooth out the singularity at  $\mathbf{r}_{ab} = 0$  and  $\mathbf{g}$  is gravity.

The pressure scale factor  $P_0$  is given by:

$$\frac{gP_0}{r_0} = 100V^2 = c^2 \tag{7}$$

where V is the characteristic or maximum fluid velocity and c is the speed of sound. This means that the sound speed is ten times the characteristic speed. This ensures that the density variation is less than 1% and that the flow is close to incompressible. The speed of sound is much less than the actual (physical) speed of sound so as to increase the numerical time-step.

As two particles approach each other, their relative velocity is negative (as is the gradient of the kernel) so that there is a positive contribution to  $d\rho_a/dt$ . If this rate of change is positive then the density of particle *a* rises. This leads to a positive pressure that pushes the particles apart again. If two particles move apart, then their densities decrease creating a negative pressure that pulls the particles back towards each other. This interplay of velocity and density/pressure ensures that the particle remains "on average" equally spaced and that the density is close to uniform, so that the fluid is close to incompressible.

To simulate confined or partially confined fluid flow, such as is typically found in industrial and geophysical fluid flows, the modelling of physical boundaries is important. Boundaries in SPH can be modelled in a range of ways, but here we use approximately evenly spaced SPH particles at which a Lennard-Jones type force (a very steep polynomial potential relating the force with the displacement into the boundary) is applied in the normal direction. In the tangential direction, the boundary particles are included in the summation for the shear stress using equation (6) (with the pressure gradient term set to zero) to give non-slip boundary conditions on the walls.

### SPH POROUS MEDIA CONFIGURATION

In this work we seek to model flow around individual (pore-sized) grains. To do this we model the solid grain as a sphere made up of stationary SPH particles. The sphere has diameter D and is placed in a cube of fluid with sidelength L. Periodic boundary conditions are imposed in all three directions at the edges of the fluid cube. The remainder of the region is filled with fluid particles. The density of the fluid used is 1000 kg/m<sup>3</sup> and the viscosity is 1 Pa.s. In all the cases reported the solid particle has a diameter of 4 mm. We estimate the Reynolds number for the flow to be of the order of 0.001 to 0.1, given the average flow velocities are in the range of 0.001 to 0.1 m/s and a characteristic length scale of 1-10 mm. The important length scale here is the distance between particles, rather than particle size, since it is this distance which has the dominant effect on the flow. No-slip boundary conditions are implemented at the solid sphere boundary. Gravity (or a constant body force) is imposed downward along the z direction and this drives the fluid flow. This set-up was also implemented for 2D flow, by replacing a solid circle (of diameter 4 mm) for a sphere and a square of fluid for the cube.

The two-dimensional simulations represent flow around a pack of cylinders, for example flow around long fibres while the three-dimensional simulations represent flow around a periodic cubic array of spherical grains. Initially, simulations were run in 2D with a number of different fluid particle sizes to test resolution dependence. We then monitored quantities such as kinetic energy of particles, fluid density and particle velocities to determine the largest fluid particle size at which these quantities did not show significant changes. By doing this we are able to achieve accurate results in a reasonable time.

#### FLUID FLOW RESULTS

We first consider 2D simulations primarily to decide on the resolution for further simulations. In all simulations reported in this paper the speed of sound is set at 10 m/s. Figure 1 shows the fluid velocity at different times for a driving acceleration of 9.8 m/s<sup>2</sup> downwards. The square has side length of L = 14 mm giving a solid volume fraction of 0.064 and the fluid particle size is 0.25 mm. Initially all fluid particles are at rest and over time maximum flow velocities appear in the gap (red coloured particles) between the solid particle and its periodic image while above the solid particle the fluid velocities are small. The time taken to reach a stable velocity profile (which is determined by the competition between the gravitational force and viscous drag) is 0.3 s. To make a suitable resolution study we ran a number of simulations for different fluid particle sizes from 0.28 mm down to 0.1 mm. Figure 2a shows the fluid velocity for the case of a resolution of 0.1 mm. The steady-state limit is around 0.13, which is slightly larger than for the much coarser 0.25 mm resolution. To make a quantitative comparison of the effect of fluid resolution we monitored the average kinetic energy over all the particles as a function of time. Here we observed that by about 0.2 s this reaches a plateau value (steady-state conditions) which was approximately 0.55 mJ.



**Figure 1**: Fluid and solid particle distribution at three different times: (a) t = 0 s, (b) at t = 0.2 s, and (c) t = 2.0 s for 2D simulation with L = 14 mm. Particles are coloured by velocity from blue (stationary) to red (0.11m/s

Fig. 2b shows the steady state value of the average kinetic energy for different resolutions. It is almost constant over the entire range, so a resolution of 0.25 mm is suitable for giving sufficiently accurate results. However, it is important to note that as the separation between solid grains decreases the fluid particle size also needs to decrease so that fluid particles can access the decreasingly small crevices between solid grains. In all subsequent simulations we monitored relevant quantities (such as average particle velocities, kinetic energies etc) to ensure resolution was adequate.



**Figure 2**: (a) Fluid and solid particle velocities for a 2D simulation (L = 14 mm) with fluid particle size of 0.1 mm. The maximum velocity (red) is 0.15m/s. (b) Average steady-state kinetic energy as a function of fluid particle size in 2D simulations.

#### 3 dimensional simulations

In 3D, we initially consider the case where the solid volume fraction is 0.012 (which is a small solid fraction but results here are typical of all simulations). The fluid particle size for all simulations in this section is 0.25 mm. We impose a body force (per unit mass) of 9.8  $m/s^2$ downwards. The density variation throughout this simulation was less than 0.1% indicating the fluid is virtually incompressible. Figure 3a shows the particle and velocity distribution after the system has reached steadystate conditions. One slice is displayed which is a fluid particle spacing thick in the x-z plane and located at the centre of the periodic cell. The colour of particles represents their velocity from blue (stationary) to red (0.4m/s). The flow is similar to that described for the 2D case, with high velocities in the gap between solid grains and lower velocities just above and below the solid grain.

For purposes of determining a medium's permeability we are interested in the average steady-state fluid velocity. To calculate this we consider a (virtual) plane which is perpendicular to the gravity vector and calculate the velocity, averaged over all particles passing through this plane at any particular instant, as a function of time. We chose two such planes, the first one placed through the centre of the solid grain and the second one just below the solid grain. The velocity through these planes is shown in Fig. 3b and tends to equilibrate after about 0.2 s. The light blue curve is for the plane that goes through the centre of the solid grain while the pink curve corresponds to the plane just below the solid grain. Since fluid particles have a smaller cross-sectional area to pass through when flowing around the solid grain, to conserve fluid incompressibility they must move correspondingly faster. Hence the average velocity of particles passing through this plane is slightly larger than for the plane placed just below the solid grain. The difference in average fluid velocity between these two planes is, however, quite small and we can take an average of these quantities for the overall (average) fluid velocity.



**Figure 3**: (a) Steady-state fluid velocity distribution in 3D for a solid fraction of 0.012, and (b) average flow velocity through two planes which are orthogonal to gravity. The first plane goes through the centre of the solid grain while the second plane is just below the solid grain.

Simulations were also run for body forces per unit mass of 4.9, 2.45, 1.23 and 0.61 N/kg giving flow velocities in the same way as was shown in Fig. 3a. Fig. 4a shows these steady-state flow velocities as a function of imposed body force. In addition to the points from simulations we also know that with a zero body force there is no flow. Since the flow is laminar we expect to find a linear relationship. The best fit line that goes through these points has gradient 0.034 s. Note that the permeability is related to the imposed body force per unit mass,  $F_{\rm b}$ , and average velocity,  $\langle u \rangle$ , via

$$k = \frac{\mu}{\rho F_b} \langle u \rangle \,. \tag{8}$$

Since our fluid viscosity is 1 Pa.s and density is 1000 kg/m<sup>3</sup> this yields a permeability of  $k = 3.4 \times 10^{-5} \text{ m}^2$ .

Simulations were performed in 3D for a number of different fluid volumes, i.e. decrease the edge length of the periodic cube in regular steps (of 2 mm) from L = 14 mm to 8 mm. In each case, a series of different body forces were used and the average steady-state flow velocity was determined. These are plotted in Fig. 4a

along with a line of best fit. The average steady-state velocity is clearly a linear function of the imposed body force, which is in agreement with Darcy's Law (Eq. 1). Moreover, the gradient of the graph is related to the permeability of the medium and hence we have demonstrated that we can determine, from first principles, the permeability of a 3D medium using SPH simulations. The numerical values of the permeabilities derived from these simulations are plotted in Fig. 6.



**Figure 4**: Average flow velocity after equilibrium steadystate conditions have been reached versus imposed body force per unit mass. (a) For 3D cases at different solid volume fractions of 0.012 (circles), 0.019 (squares), 0.034 (diamonds), and 0.065 (triangles). (b) Average steady state flow velocity for 3D simulation with solid volume fraction of 0.155 (circles), 0.393 (squares) and 0.5236 (triangles).

# 3 dimensional simulations - large solid fraction

The solid volume fractions used so far have been quite small (less than 0.1) while in most porous media one would expect this to be much larger. In the present set-up the maximum solid fraction we can reach is 0.5236 for the case where the spheres touch. However, simulating at this level requires us to have a much finer particle resolution otherwise fluid particles cannot access regions where solid grains touch. In each of the following simulations we decrease the fluid particle size until we are sure we are obtaining accurate results. We do this by monitoring the average fluid velocities and kinetic energies and make sure they do not fluctuate appreciably (after reaching steady state). Thus for the simulations reported in this section we use a fluid particle size of 0.1 mm.



**Figure 5**: Snap-shots (in the *x*-*z* plane) of the fluid and solid particle distribution at steady-state conditions at three different slices for maximum solid fraction of 0.5236 and a body force of 9.8 m/s<sup>2</sup>: At (a) y = 0, (b) y = 1 mm and (c) y = 2 mm. The colour of particles represents their velocity from blue (stationary) to red (large velocity). Note, even though there are some red-coloured particles near the solid boundary in c) these velocities are very small and the no-slip condition is still valid.

Fig. 5 shows vertical slices of the flow field after steady state has been reached for the case with a driving force (per unit mass) of 9.8 N/kg. We verified steady-state conditions had been achieved by monitoring the average fluid velocity and observing that it had reached a plateau. In Fig. 5a, which corresponds to a vertical plane through the middle of the solid grain, fluid is mostly stationary (blue), since in this plane the solid grains touch. Here fluid cannot move at any appreciable speed in the direction of the gravity vector. The next slice (Fig. 5b) cuts through part of the solid grain and hence fluid particles in this plane still have a small velocity. Finally in Fig. 5c we show a slice at the extremity of the solid grain. In this plane fluid has a comparatively unrestricted flow

path and so the fluid velocity is maximal, although still quite small (of the order of 0.001 m/s) compared to the previous cases reported.

Once again we predicted the permeability for this solid fraction (by running simulations at a variety of body forces) and found the permeability to be  $1.3 \times 10^{-7}$  m<sup>2</sup> (see Fig. 4b). Hence, we have shown the SPH method is applicable to real porous media with realistic solid fractions.

# THEORETICAL PREDICTIONS

At low solid fractions, the fluid flow becomes more like an infinite fluid flowing around an isolated solid grain. This is the Stokes limit where the fluid drag is  $3\pi\mu Dv$ . We are not quite at this infinite limit in our simulations even at low solid fraction. For us the fluid drag on a solid grain is modified by the flow and pressure effects of the surrounding particles in the lattice. The geometry of our simulations is that of a periodic array of spheres in a simple-cubic packing. Theoretical predictions from the permeability for this geometrical construction have been worked out numerically by Hasimoto (1959) at low solid fractions and by Zick and Homsy (1982) for high volume fractions. Note, that in this set-up the highest obtainable solid fraction is 0.5236. The Blake-Kozeny-Carman relationships, which assume a porous medium is composed of a bunch of capillary tubes of equal length (Bear, 1972, Faber, 1995), is appropriate for a random array of spheres rather than a regular/periodic array of spheres.

Hasimoto (1959) obtained a perturbation solution (in terms of Fourier series) for Stokes flow of an incompressible viscous fluid past an array of regularly ordered spheres. The expansion was made in terms of fractional powers of the solid fraction and is thus limited to relatively small solid fractions. In fact Hasimoto gave his results in terms of the fluid drag on each sphere and wrote his results as

$$F_{drag}(f_s) = 3\pi\mu D v C_D(f_s) , \qquad (9)$$

and  $C_D$  is called the drag coefficient and is a function of the solid fraction  $f_s$ . Thus  $C_D$  is 1 in the limit of an infinitely large fluid volume and increases as  $f_s$  increases. To obtain a permeability from this we need to obtain the force per unit mass of fluid. The mass of fluid in our simulations is  $\pi \rho D^3 (1 - f_s) / (6f_s)$ . Thus the fluid drag (per unit mass of fluid) is

$$F_{drag} = \frac{18C_D f_s}{D^2 (1-f_s)} \frac{\mu v}{\rho}$$
(10)

Comparing this equation with Eq. 8 gives us the permeability as

$$k_{theory} = D^2 \frac{\left(1 - f_s\right)}{18C_D f_s} \quad . \tag{11}$$

Zick and Homsy (1982) used a numerical method, based on reducing the Stokes partial differential equations to a set of integral equations and then using a Galerkin method to solve these equations. Their results are also expressed in terms of a fluid drag coefficient (Eq. 9) and hence the permeability can also be expressed as Eq. 11, but with a different value of the drag coefficient (compared to Hasimoto). The numerical result of Zick and Homsy is essentially the same as Hasimto's result for solid fractions less than 0.065, but shows increasing deviations at higher solid fractions. This permeability is a monotonic decreasing function of solid fraction and for small solid fractions is inversely proportional to  $f_s$ . Permeabilities calculated by this method are compared with SPH in Fig. 6. We see good overall agreement (Fig. 6a). Zooming into the region of higher solid fraction we see there is a small deviation around solid fractions of 0.1.



**Figure 6:** Comparison of permeability from the two methods described in this study as a function of solid fraction. Black circles correspond to SPH simulations. The red curve corresponds to the theoretical predictions of Zick and Homsy (1982). In (a) we show the entire range of solid fractions simulated and in (b) we zoom into the higher solid fraction region.

#### Comparisons between theoretical predictions and SPH

We have been able to estimate the permeability of idealized three-dimensional porous media from first principles using the SPH method. In principle this method can be extended to a medium with many more grains although, clearly, the method is limited by computational considerations. Looking at Fig. 4 it is clear the average fluid velocity is a linear function of the imposed body force. This is as one would expect in the laminar case, i.e. it follows Darcy's Law. This is reassuring and tends to lend support to the validity of the results of the SPH method. All predictions agree qualitatively in that the permeability decreases with increasing solid fractions. The overall agreement between SPH permeability predictions and the theoretical predictions is relatively good and validates the implementation of SPH for obtaining permeabilities in simple porous media geometries.

### CONCLUSION AND FUTURE DEVELOPMENTS

We have modelled flow through an idealized threedimensional porous medium using the SPH technique. As this is a first principle type study we have used a very simple model of the porous medium - flow around a single solid particle in a cubic cell with periodic boundary conditions at the edges. We have found the flow rate is a linear function of the imposed body force, which obeys Darcy's Law for laminar flow, and from this we have been able to estimate the medium's permeability. The SPH estimates of the permeability, are in qualitative and relatively good quantitative agreement with theoretical calculations based on solving Stokes equation in the presence of a periodic array of solid spheres.

The present SPH method can easily be used for solid particles of arbitrary shape and size. All that requires to be done is to construct digital images of the solid particle surface which would then be imported into our SPH code. As such, we can obtain the local permeability of an arbitrarily complex porous medium. Another important development of this procedure would be to use in cases where the solid particles change in shape and size. This is particularly relevant to applications such as heap-leaching. In principle, the modelling of a liquid which flows through a porous medium which dynamically changes due to the flow of the liquid can be implemented with an SPH technique. In fact SPH would be highly suitable for this process because each fluid and/or solid particle (individually) can carry additional information such as its acid concentration or whether it is moving.

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