# A generalization of Distinct Element Method to tridimensional particles with complex shapes

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The distinct element method was originally designed to handle spherical particles. Here, this method is generalized to a wider range of particle shapes called *spherosimplices*. A contact detection method is given as well which uses weighted Delaunay triangulations to detect contacts occurring in a population of particles with such shapes. Finally, a set of numerical experiments is performed indicating that the overall contact detection complexity is linear in the number of particles.

# 1 INTRODUCTION

The distinct element method (DEM) is widely used to perform granular media simulations. The two key elements this requires are an adequate model for interparticulate contact forces and an efficient contact detection method. Although this method originally handles granular media composed of spherical particles, making it possible to process non-spherical particles has turned out to be of utmost importance. Indeed it is such grains that one finds in nature and many important phenomena cannot be reproduced just using spherical grains. Here, we propose a generalization of the distinct element method to a wide range of non-spherical particles. In the following, we describe some of the shapes this generalization will be able to work with and explain how the contact force models should be handled. Then, we address the question of detecting contacts between pairs of such particles, by generalizing the method described in (Ferrez and Liebling 2002) which relies on the properties of the weighted Delaunay triangulations to detect contacts in the spherical particles case.

# 2 PARTICLE SHAPES AND CONTACT MODEL-ING

From here on, a particle P will be the Minkowski sum of a simplex s (either a point, a line segment, a triangle or a tetrahedron) with a ball of radius r centered at the origin. We say s is the skeleton of P and r its radius. Those particles, shown on figure 1 will appropriately be called *spherosimplices*, or depending on their skeletons *spherosegments* (also called spherocylinders (Pournin et al. 2005)), *spherotriangles* and



Figure 1: The three non-spherical *spherosimplices* used to model particle shapes, together with their skeletons.

# spherotetrahedra.

These shapes are special cases of more general structures (not necessarily convex *spheropolyhedra*) which we can also treat, and which we will discuss elsewhere. Two particles P and Q are in contact whenever they overlap, that is if  $P \cap Q \neq \emptyset$ . The overlapping between P and Q models the deformation at the contact point.

In the original distinct element method, that is when P and Q are spheres, the amount of overlapping at the contact point is quantified by the *normal overlap*  $\xi_n$  as :

$$\xi_n = r_P + r_Q - \|s_Q - s_P\|, \tag{1}$$

where  $s_P$  and  $s_Q$  are the centers of P and Q respectively and  $r_P$  and  $r_Q$  are their radii (see figure 2). A



Figure 2: Geometrical modeling of a contact between spherical particles P and Q in the usual DEM framework with the contact force f applied by particle P on particle Q.

unit vector  $\boldsymbol{u}_n$  normal to the contact area can be defined as  $\boldsymbol{u}_n = \frac{s_Q - s_P}{\|s_Q - s_P\|}$ . A force  $\boldsymbol{f}$  is applied on the particles at contact point accordingly to the third Newton law (that is  $\boldsymbol{f} = \boldsymbol{f}_{P \to Q} = -\boldsymbol{f}_{Q \to P}$ ) and its normal component  $f_n = \boldsymbol{f}.\boldsymbol{u}_n$  will be given as a function of  $\xi_n$  and its time derivative  $\dot{\xi}_n$ . The most popular model for this contact force, first introduced in (Cundall and Strack 1979) reads :

$$f_n = k_n \xi_n + c_n \dot{\xi}_n \tag{2}$$

The parameters  $k_n$  and  $c_n$  depend on the geometrical and mechanical properties of the contacting spheres (Pournin et al. 2002). Other expressions for  $f_n$  have been proposed in (Walton and Braun 1986; Pournin et al. 2002). The point  $x_C$  on either P and Q to which the total contact force is effectively applied is the intersection of segment  $[s_P, s_Q]$  with the plane C containing the circular intersection of the boundaries of P and Q. A tangential overlap  $\boldsymbol{\xi}_{\perp}$  accounting for the tangential deformation at sticky contacts can be defined as well by integrating the tangential relative speed of P and Q at the contact point  $x_C$ . The tangential component  $f_{\perp} = f - f_n u_n$  of the contact force can therefore be modeled from  $\xi_{\perp}$  the same way  $f_n$  has been from  $\xi_n$ . This tangential force can be bounded according to Coulombian friction law in order to account for slippery contacts.

Now, if P and Q are not necessarily spherical, let  $x_P$  and  $x_Q$  be the points in  $s_P$  and  $s_Q$  respectively so that  $||x_Q - x_P||$  is minimal (see figure 3). Of course there may be several such pairs in degenerate cases, for example when  $s_P$  and  $s_Q$  are two parallel triangles, but then  $x_P$  (resp.  $x_Q$ ) should be chosen as the barycenter of the possible points on  $s_P$  (resp.  $s_Q$ ) which provides an easy, yet intuitive solution. A normal overlap, a unit vector normal to the contact area and a contact point can be defined in this general case by replacing  $s_P$  and  $s_Q$  by  $x_P$  and  $x_Q$  in the spherical case definitions of those quantities. This actually



Figure 3: Geometrical modeling of a contact between nonspherical particles P and Q (here, a spherotriangle and a spherosegment). According to the model,  $x_P$  and  $x_Q$  are points in  $s_P$  and  $s_Q$  so that  $||x_Q - x_P||$  is minimal and the contact between P and Q has same  $\xi_n$ ,  $u_n$  and  $x_C$  as the imaginary contact between spheres  $S_P$  and  $S_Q$ .

amounts to considering that the contact between Pand Q actually occurs between the sphere  $S_P$  of radius  $r_P$  centered at point  $x_P$  and the sphere  $S_Q$  of radius  $r_Q$  centered at point  $x_Q$ .

The contact point  $x_C$  (to which the contact force is applied) will therefore be the intersection of segment  $[x_P, x_Q]$  with the plane C containing the circular intersection of the boundaries of  $S_P$  and  $S_Q$ , the overlap  $\xi_n$  will read :

$$\xi_n = r_P + r_Q - \|x_Q - x_P\|, \tag{3}$$

and  $u_n$  will read  $u_n = \frac{x_Q - x_P}{\|x_Q - x_P\|}$ . The normal component of the contact force should then be computed from  $\xi_n$  according to (2) or to any other contact force model. Besides, the knowledge of  $x_C$  allows the computation of  $\boldsymbol{\xi}_{\perp}$  by integration of the tangential relative speed of P and Q at point  $x_C$  and  $\boldsymbol{f}_{\perp}$  will be found from  $\boldsymbol{\xi}_{\perp}$  following an appropriate force model. Once the forces and their application points are known, the velocities, spins and trajectories of the particles are obtained by integration of the usual motion equations. This requires that the inertia matrix of every particle be known. While those matrices have analytical expressions for all spherosimplices, we do not reproduce them here.

### 3 A TRIANGULATION-BASED CONTACT DE-TECTION METHOD

When simulating large populations of particles, an efficient contact detection method is required. Indeed, the quadratic complexity of testing all possible pairs of particles for contact quickly becomes prohibitive when the number of particles increases. This section focuses on adapting to our particular non-spherical shapes the triangulation-based method introduced in (Müller 1996; Ferrez and Liebling 2002) in the spherical case. The weighted Delaunay triangulation D generated by a number of spheres  $S_1, ..., S_n$  centered at points  $x_1, ..., x_n$  is a particular mesh of the convex hull of  $\{x_1, ..., x_n\}$  whose basic elements are tetrahedra. Its regularity properties are greatly appreciated particularly when it comes to numerically solving spatial differential equations. Furthermore, one of its properties turns to be useful for our contact detection concerns : if two spheres  $S_i$  and  $S_j$ ,  $i \neq j$  intercept, then the segment  $[x_i, x_j]$  is an edge of D. Detecting contacts among the spherical particles  $P_1, ...,$  $P_n$  then amounts to building the weighted Delaunay triangulation generated by  $P_1$ , ...,  $P_n$  and testing for contact the pairs of particles which are linked by an edge of D. Considering that in our practical cases the number of edges of D is linear in the number n of generating spheres (see section 4), this method allows to reduce the complexity of contact detection from  $O(n^2)$  to O(n), which is about the best one can hope for in this context. Of course, building and handling the weighted Delaunay triangulation requires special attention, but this issue will not be addressed here and one may refer to (Ferrez 2001) for more details.

Now, suppose  $P_1$ , ...,  $P_n$  are non-spherical particles with skeletons  $s_1$ , ...,  $s_n$  and radii  $r_1$ , ...,  $r_n$ . The triangulation based contact detection method can be adapted to those non-spherical particles as follows. Assign to each particle  $P_i$  a set  $\Sigma_i$  of spheres having no relative motion with respect to  $P_i$  and so that the two following conditions are satisfied :

**Covering Condition** : The point-wise union of the spheres in  $\Sigma_i$  contains  $P_i$  for all  $i \in \{1, ..., n\}$ .

**Orthogonality Condition** : Independently of the relative position of any two particles  $P_i$  and  $P_j$ ,  $i \neq j$ , for two spheres  $S_i \in \Sigma_i$  and  $S_j \in \Sigma_j$  with radii  $R_i$  and  $R_j$  and centers  $x_i$  and  $x_j$  respectively,  $||x_i - x_j||^2 > R_i^2 + R_j^2$ .

If the covering condition is satisfied, the spheres in sets  $\Sigma_i$  are also called covering spheres. The orthogonality condition actually bounds the overlap of any two spheres assigned to different particles at any time during the simulation process. Calling Dis the weighted Delaunay triangulation generated by the spheres in all  $\Sigma_i$ ,  $i \in \{1, ..., n\}$ , provided the two above conditions are satisfied, the following holds : *if two particles*  $P_i$  and  $P_j$ ,  $i \neq j$  intercept, then there exist two spheres  $S_i \in \Sigma_i$  and  $S_j \in \Sigma_j$  whose centers are linked by an edge of D.

Therefore, detecting contacts among the nonspherical particles  $P_1$ , ...,  $P_n$  amounts to covering each particle with a set of spheres so that the orthogonality condition is satisfied, building the weighted Delaunay triangulation generated by those spheres and testing for contact those pairs of particles having at least one covering sphere each, whose centers are linked by an edge of D. A given pair of particles  $P_i$  and  $P_j$  will be in contact as soon as  $r_i + r_j - ||x_j - x_j|| > 0$ , where  $x_i$  and  $x_j$  are the points in  $S_i$  and  $S_j$  respectively so that  $||x_j - x_i||$  is minimal as defined in previous section. The actual computation of  $x_i$  and  $x_j$  is a simple, yet interesting optimization problem (see (Pournin et al. 2005) for the case of two segments).

Covering the particles with spheres so that the orthogonality condition is satisfied may be done in a variety of ways. Here, we only address the simple case of identical regular spherotetrahedra, each being covered by a single sphere. Suppose P is such a spherotetrahedron with skeleton s and radius r. Call M its mass center and l the distance between M and any vertex of s. The covering sphere S of P will be centered at point M and its radius will be l + rthat is, just enough for it to cover P. In such a situation, the distance between M and the boundary of P is l/3 + r. This means that the smallest possible distance between the centers of two covering spheres equals  $2l/3 + 2r - \xi_m$ , where  $\xi_m$  is an upper bound to the overlaps which will occur at any contact throughout the simulation. Therefore, if  $2l/3 + 2r - \xi_m \ge 1$  $\sqrt{2}(l+r)$  then the orthogonality condition is satisfied. Recall that the overlap accounts for the deformation at the contact point. Hence, any realistic simulation should lead to small values for  $\xi_m/r$ . With the acceptable value of  $\xi_m/r = 1/8$ , we obtain that for l < 0.61r, the orthogonality condition is satisfied. These dimensions were used to produce some of the numerical experiments discussed in next section.

### 4 RESULTS AND DISCUSSION

The above generalization of the traditional distinct elements method allows investigating granular phenomena involving non-spherical particles. For spherosegments, granular crystallization (Pournin et al. 2005; Ramaioli et al. 2005) has been successfully replicated with our model, providing a first validation. Still, further validations are needed and numerical experiments with more complex shapes may be conducted such as shape segregation or granular stratification (Makse et al. 1997). This section only aims at giving a feeling about the complexity of the contact detection method.

Snapshots of experiments performed with this nonspherical version of the distinct element method are shown on figure 4. Those experiments consist in pouring particles into a cylindrical container of diameter 20 mm. This means that the number of particles gradually increases while the simulation performs. All particles have eight times the volume of a sphere of diameter 1 mm, independently of their shapes. Experiment 1 involves 250 spherosimplices of each kind. Experiment 2 involves 500 spheres and 500 spherotetrahedra, and experiments 3 and 4, 1000 spheroseg-



Figure 4: Snapshots of final states of numerical experiments. Left : experiment 1, right : experiment 3.

ments each.

For the first two experiments, each particle only uses one covering sphere for contact detection. This is achieved by calibrating every shape the same way the spherotetrahedra have been calibrated at the end of section 4. This constraint actually limits the particle's sharpness. Still, those particles are far from spherical and this way, the complexity of contact detection is the same as if all particles were spheres. In experiment 3, particles have an elongation coefficient l/r of 3, where l is half the length of the segment constituting their skeletons and r is their radius. With such elongated shapes, 5 covering spheres per particle are needed. In experiment 4, l/r = 6, and 9 covering spheres are needed for a particle. In every experiment,  $\xi_m = 5 \times 10^{-5}$  m.

The computing time of the DEM process, including contact detection, is drawn on figure 5 against the number of simulated particles. In all cases it is almost linear. Observe that the slope of this linearity increases with particle elongation, naturally reflecting that the number of possible contacts is higher for elongated particles. The inset shows the number of edges of the triangulation, drawn versus the number of covering spheres and the four cases reveal identically linear. The slope of around 7 is close to the coordination number of random close-packed spheres, indicating that our method appropriately identifies the pairs of particles to be tested for contact.

### 5 CONCLUSION

This generalization of the distinct element method to non-spherical particles opens numerical simulation to a wide new range of granular media. Our linear triangulation-based contact detection method allows processing large populations of non-spherical particles. While many issues need to be further discussed, such as the influence of the shape of contact areas on the behaviour of a contact, the first trials to be found in (Pournin et al. 2005; Ramaioli et al. 2005) sug-



Figure 5: Actual computing time of the DEM process drawn versus the number of simulated particles for all experiments. The *time index* is normalized to 1 for 1000 of the last experiment's spherosegments. Each point is averaged over 400 DEM iterations. Inset : number  $\varepsilon$  of edges in the triangulation versus the number  $\sigma$  of covering spheres for the same experiments.

gest that this model successfully captures the reality of non-spherical particles.

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