

# LOG-NORMAL AND MONO-SIZED PARTICLES' PACKING INTO A BOUNDED REGION

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**Abstract** Many systems can be modeled with hard and various size spheres, therefore packing and geometrical structures of such sets are of great importance. In this paper, rigid spherical particles distributed in different sizes are randomly packed in confined spaces, using a parallel algorithm. Mersenne Twister algorithm was used to generate pseudorandom numbers for initial coordination of particles. Distribution of packing densities and reproducibility of particles packing factor, with log-normal size distribution and also mono-sized particles have been compared. In addition, the effects of container size on regional particle packing density, the effect of wall on packing density and symmetry of packed structure have been investigated. The results confirm that particles in log-normal size distribution have higher packing densities, but the obtained results have less reproducibility than mono-sized particles. Also, in comparison, particles in log-normal size distribution have uniform density and regions with higher local density.

**Keywords** Powder Metallurgy, Porous Materials, Simulation, Packing, Log-Normal, Mono Size

**چکیده** بسیاری از سیستم‌ها می‌توانند به روش کره‌های سخت با اندازه‌های مختلف مدل‌سازی شوند و بنابراین فشردگی و ساختار هندسی چنین مجموعه‌هایی از اهمیت بالایی برخوردار است. در مقاله حاضر، ذرات کروی صلب در توزیع‌های اندازه مختلف به صورت تصادفی در یک فضای محدود با استفاده از الگوریتم موازی چیده شده‌اند. الگوریتم توئیستر به منظور تولید اعداد شبه تصادفی برای مختصات اولیه ذرات استفاده شده است. توزیع چگالی‌های فشردگی و تکرار پذیری فاکتور تراکم ذرات با توزیع اندازه log-normal و ذرات هم‌اندازه مقایسه شده‌اند. همچنین، اثرات اندازه ظرف بر روی چگالی فشردگی ذرات و اثر دیواره بر روی چگالی فشردگی و تقارن ساختار فشرده شده مورد بررسی قرار گرفته است. نتایج بدست آمده تایید می‌کنند که ذرات در توزیع اندازه log-normal چگالی فشردگی بالاتری دارند ولی تکرارپذیری کمتری از ذرات تک‌اندازه دارند. همچنین چگالی ذرات در توزیع اندازه log-normal یکنواخت و نواحی با چگالی موضعی بیشتری وجود دارد.

## 1. INTRODUCTION

Random packing of particles has been studied for many years because of their interesting geometrical properties and technological applications in porous media [1]. The term, particle 'Packing' means 'putting together' and 'arranging' particles in a confined space. Random packing means; all particles of the same size and shape have the same probability to occupy each unit volume of the mixture [2]. Particle packing affects the efficiency of powder compaction, the final surface properties

and corrosion resistance of powder metallurgy products. The porosity of powder metallurgy products can be controlled using powders with different sizes. Pore size distribution has a significant importance in production of implants and capillary porous powder metallurgy materials [3-12]. The initial step of production in powder metallurgy method is filling the mold, so it is important to simulate the loose packing of particles.

Many parameters affect the packing characteristics of particles, such as particle's size

distribution, particle shape, interparticle friction, elasticity, surface chemistry (interparticle forces), agglomeration and vibration (rearrangement of particles upon shaking) [13-21]. Random packing of particles can be classified into random close packing, that is the state of maximum volume fraction of packed powders and random loose packing which is the loosest powder packing of mechanically stable condition [22,23]. Among these parameters, particles size distribution, due to its ease of adjustment in industrial applications, is probably the most significant.

One of the most important parameters in the study of granular materials is its packing factor. It is defined as the fraction of powder volume to their total occupied space.

Research on particle packing can be classified into three different approaches: experimental, theoretical, and numerical. Due to difficulties associated with experimental methods of investigating particle packing, theoretical and computational approaches are usually preferred [24].

A random variable  $x$  is said to be log-normally distributed if  $\log(x)$  is normally distributed. The dispersions produced by milling, grinding or crushing provide example of powders with log-normal distribution [25]. Also it's an approximation to the expected particle size distribution for nucleation and growth process, assuming only random interactions between existing particles [26].

Packed particles can be unconfined where there are no walls to contain them, or particles can be packed in containers of various shapes. In the case of random pack, a so-called wall effect exists because the proximity of a solid surface will introduce some local order into a random packing. Thus, the particles next to the solid surface tend to form a layer of the same shape as the surface. This so-called base layer is a mixture of cluster of square and triangular units. Randomness increases by increasing distance from the base layer, which results in the disappearance of the distinct layer. Another important aspect of wall effects is the existence of a region with relatively high void next to the wall, due to the discrepancy between the radii of the wall curvature and the particles [27,28].

In this paper the packing of mono-sized powders and powders in log-normal size

distribution have been investigated, using a parallel packing algorithm and reproducibility of the obtained values of packing factors, also regional packing densities of these packed structures have been compared.

## 2. EXPERIMENTAL

**2.1. Modeling** We assumed particles to be ideal rigid hard spheres with mono-sized and log-normal particle size distributions. Log-normal distribution can be expressed as:

$$f(D) = \frac{1}{D\sigma\sqrt{2\pi}} \exp\left(-\frac{1}{2\sigma^2}(\log(D) - \mu)^2\right) \quad (1)$$

Two parameters are needed to specify a log-normal distribution. Traditionally, the mean  $\mu$  and the standard deviation  $\sigma$  (or the variance  $\sigma^2$ ) of  $\log(x)$  are used. However, there are clear advantages in using 'back-transformed' values (the values in terms of the measured data):

$$\mu^* = e^\mu \quad (2)$$

$$\sigma^* = e^\sigma \quad (3)$$

Since  $\mu$  is the median of  $\log(x)$ , the median of log-normal distribution is  $\text{med}(x) = \mu^* = e^\mu$ .

In this work, we assumed friction to be infinite. This assumption affects the obtained values for packing factor, but doesn't affect the behavior of system from standpoint of reproducibility also the assumption affects both PSD's packing factor values, so we can compare their reproducibility [29,30].

**2.2. Packing Algorithm** We used a time-independent model for packing particles, based on Event Dynamics (ED) model as reported in our previous paper [31]. Event dynamics method is commonly used for simulation of systems consisted of rigid spherical particles. The collisions are assumed to be instantaneous and binary. By the velocity and the coordination of the powder, their next movement could be calculated. In our model, collisions are considered

to be soft. This assumption obviously requires computing each effect several times during the collision, which also increases the accuracy obtained in the model.

The particles' X-Y coordinates were randomly generated. Then in each step particles dropped a predefined distant until they reach the floor ( $Z=0$ ) or collide with one another. The stability and the movements of the particles in each step is determined from the particle's coordinate and its contact points with boundary walls or other particles. The falling of particles into container was in random sequence and also no particles rearrangement was done in their stable state. The resulting state may be described as random loose packing [32].

**2.3. Random Numbers** We used Mersenne twister algorithm for generation random numbers which is 32-bit length number generator and complies with MT19937 standard. This algorithm produces pseudorandom numbers with very long period length. Its main advantage is rapid generation of random numbers due to bitwise operators usage, higher order of dimensional equi-distribution compared to other algorithms and passing diehard tests [33,34].

**2.4. Parallel Implementation** Message Passing Interface (MPI) is a protocol for communication of computers in a cluster. This feature enables us to distribute computational tasks among computers and gather resultant data [35]. We have implemented our parallel algorithm using MPICH2 implementation of MPI library. This implementation enabled us to use Microsoft Windows operating systems and use their network enhancements. Another advantage of this MPI implementation is its complete object orientation support.

**2.5. Hardware** The hardware used in this simulation consisted of six dual Intel 3.4Ghz processor PCs with 512MB RAM one of which was used for distribution of jobs and gathering resultant data. These PCs were connected together in a star topology. Each simulation and analysis of data took almost 72 hours.

**2.6. Calculation Parameters** In this paper the

friction was assumed to be infinite. For investigating relative size of particles to container effects, all dimensions are without any defined unit.

The accuracy of all calculation was 0.0001. The integration of the PSD diagrams were done by 1 unit steps in lower-Riemann method.

Minimum and maximum diameters of particles in log-normal PSD were 1 and 60, respectively. The median of Log-normal PSD was assumed to be 30. The diameter of mono-sized particles was assumed to be 30. In each case, four random seeds for Mersenne twister algorithm were used. Regional density of packing structures was calculated using  $l^3$  cubic elements.

### 3. RESULTS AND DISCUSSION

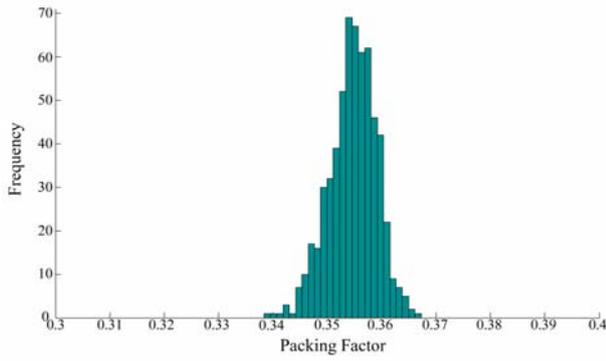
Figure 1 illustrates the reproducibility of obtained packing factors of 800 samples consisted of 500 monosized particles and 500 particles in log-normal size distribution in a  $350 \times 350 \text{nm}^2$  container.

Due to the existence of the container and also because of infinite friction, our packing factor results are less than the values expected for unconfined packing. Particles in log-normal size distribution have higher packing factors but their results have broader distribution and thus lower reproducibility.

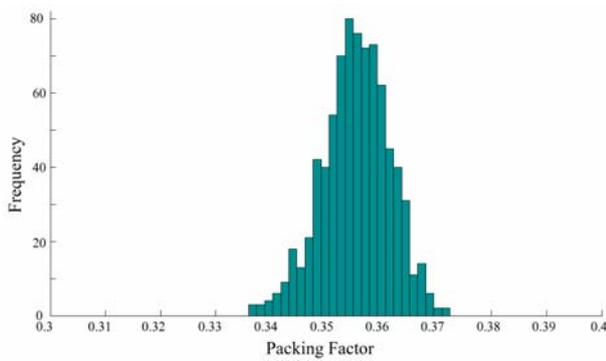
The sum of all elements with same x and y coordinates which have been occupied by particles gives a measure of regional density in that position. Non-Photorealistic Rendering (NPR) is one of the scientific visualization methods that are used for making comprehensible but simple picture of complex 3D graphs [36]. Figure 2a-c illustrates the Non-Photorealistic Rendering (NPR) of regional packing density of 500 mono-sized particles in  $150 \times 150$ ,  $250 \times 250$  and  $350 \times 350 \text{nm}^2$  containers, respectively.

Figure 3a-c illustrates NPR of regional packing density of 500 particles in log-normal size distribution in  $150 \times 150$ ,  $250 \times 250$  and  $350 \times 350 \text{nm}^2$  containers, respectively.

Small size and low ratio of container to particles size, causes some kind of symmetry in packing structure. This symmetry can be seen in

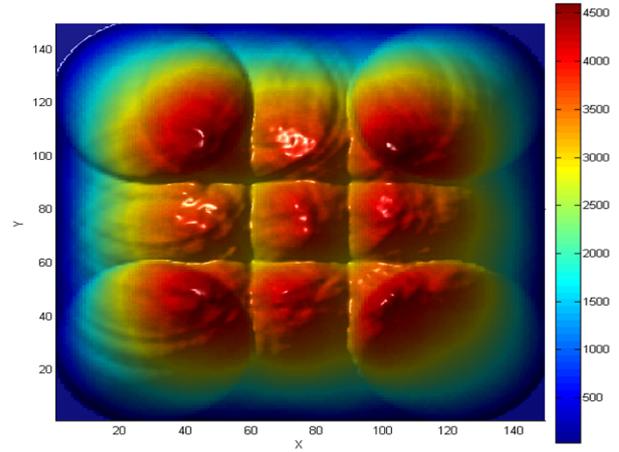


(a)

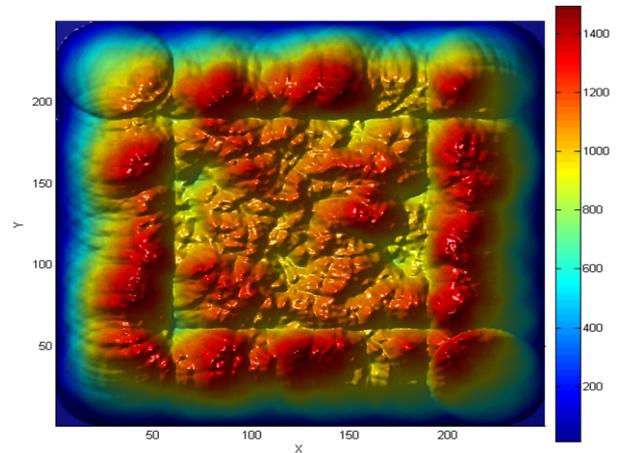


(b)

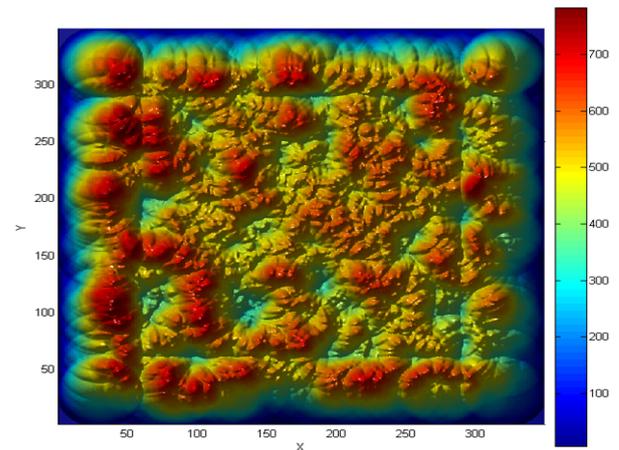
**Figure 1.** Reproducibility of packing factor in (a) monosized, (b) log-normal particle size distribution.



(a)



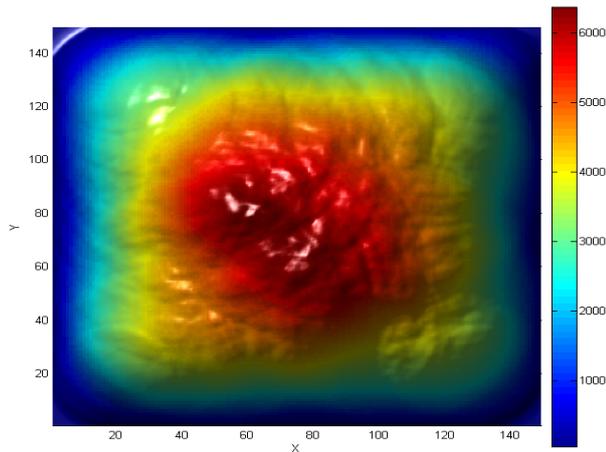
(b)



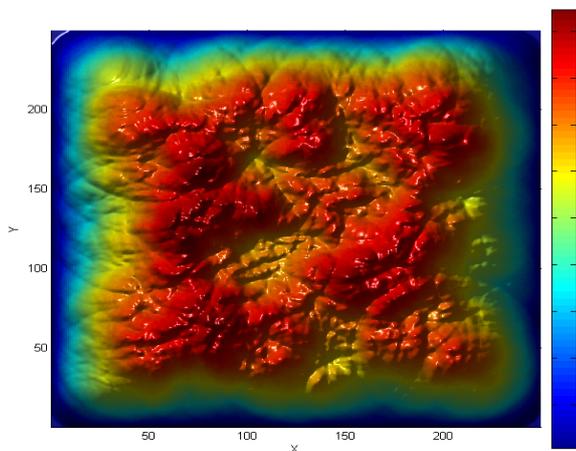
(c)

**Figure 2.** Regional packing density of mono-sized particles in (a) 150×150, (b) 250×250 and (c) 350×350nm<sup>2</sup> containers.

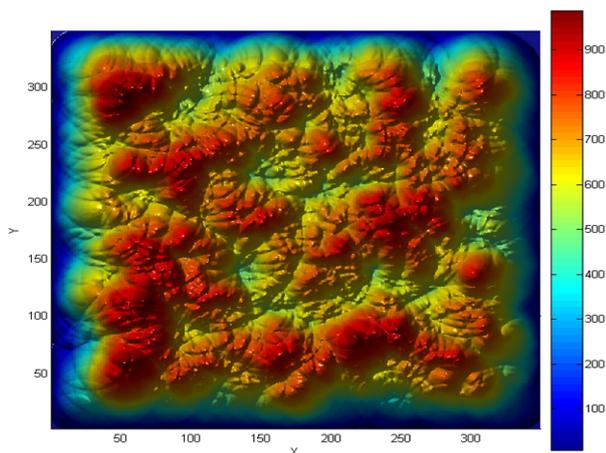
Figure 2a and Figure 3a. By increasing container size, wall effect decreases. As it can be seen in Figures 1 and 2, moving from walls to the centre of the container will increase regional density of particles packing. In comparison, particles in log-normal size distribution have higher and uniform packing density. As it can be seen in Figure 2a,b at a distance  $D$  (particles diameter) from container walls, we have the lowest packing density and the highest porosity that is in good agreement with previous studies [27] but particles in log-normal size distribution have more random regional density distribution and symmetry posed by wall decreases faster by moving to centre of the container. The edges of the container in packing particles with log-normal size distribution have



(a)



(b)



(c)

**Figure 3.** Regional packing density of particles in log-normal size distribution in (a) 150\*150, (b) 250\*250 and (c) 350\*350 containers.

higher density due to the existence of smaller particles.

#### 4. CONCLUSION

In this paper, packing behavior of mono-sized particles and particles in log-normal size distribution was compared using an Event Driven based packing model. Results confirm that particles in log-normal size distribution have higher packing factor but their results have broader distribution and thus lower reproducibility. Also, they have higher and more uniform regional density profile. Simultaneous effects of several walls cause high symmetry in low container to particle size ratios. These results provide a good starting point for the evaluation of the powder metallurgy products properties after sintering and choosing PSD for homogeneous packing and properties.

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