THE ROLE OF PARTICLE SHAPE ON THE HYDRAULIC CONDUCTIVITY OF GRANULAR SOILS CAPTURED THROUGH KOZENY-CARMAN APPROACH

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Abstract

 Previous studies indicate that particle shape plays an important role in the hydraulic conductivity (*k*) of granular materials, often represented through the Kozeny-Carman (KC) concept. Several recent studies have improved the accuracy of the KC approach using the particle size distribution (PSD) to estimate the specific surface area of particles but overly simplifying the effect of particle shape. This current study innovatively adopts the Micro- Computed Tomography (CT) technique to compute particle shape parameters of different granular materials (e.g., glass beads, sand and crushed gravel) and then incorporate these parameters into the KC equation to estimate *k* more accurately, which is then validated with experimental data. The results indicate that *k* varies significantly according to different particle shapes even if the same mean porosity and PSD are retained. Particles that are less spherical and rounded have a larger fluid-particle contact area (i.e., larger shape factor), 19 hence a smaller hydraulic conductivity. The study suggests a shape factor of $1.28-1.52$ for 20 natural sand and 1.84–2.1 for crushed sand and gravel can be used for KC method to estimate *k* while a porosity-dependent equation is proposed to estimate the tortuosity for different shaped materials.

Keywords: Microscopy; Permeability; Sands

List of notation

44 **Introduction**

 The effect that the micro-characteristics of particles have on the hydraulic behaviour of geomaterials has received considerable attention, especially in recent years thanks to advanced micro-scanning and computational methods [\(Matyka et al. 2008;](#page-10-0) [Zhou and Wang](#page-11-0) [2015;](#page-11-0) [Nguyen and Indraratna 2017a\)](#page-10-1). Although computer-based approaches have indicated certain advantages in predicting the hydraulic behaviour of porous geomaterials, empirical methods such as Kozeny-Carman (KC) are still used widely in practice due to their simplicity [\(Chapuis and Aubertin 2003;](#page-9-0) [Zheng and Tannant 2017;](#page-11-1) [Feng et al. 2019\)](#page-9-1). The KC method uses the fundamental parameters of a porous medium such as the specific surface area of 53 solid particles (A_0) , the porosity (n) and the tortuosity (τ) to estimate the hydraulic conductivity (*k*), which can be represented by [\(Trani and Indraratna 2010\)](#page-11-2):

$$
k(m/s) = \frac{1}{2\tau} \frac{\gamma}{\mu} \frac{1}{A_o^2} \frac{n^3}{(1-n)^2}
$$
 [1]

55 where γ and μ are the unit weight and dynamic viscosity of the fluid.

56 The main problem with this solution is how to determine *A^o* accurately. Previous 57 studies [\(Trani and Indraratna 2010;](#page-11-2) [Ozgumus et al. 2014;](#page-10-2) [Zheng and Tannant 2017\)](#page-11-1) have 58 considered an equivalent uniform particulate medium, however, *A^o* can actually be 59 determined directly from the particle size distribution (PSD) of soil. Basically, A_o is defined 60 as the ratio between the total surface area $\sum S_i$ and the total volume $\sum V_i$ of particles in a 61 medium, so given the PSD of a perfectly spherical assembly, the value of A_0 (i.e., $A_{0,s}$) can 62 be estimated by:

$$
A_{o,s} = 6 \sum \frac{p_{mi}}{d_i} \tag{2}
$$

63 where p_{mi} is the probability of particle size d_i occurring. Since most granular materials used 64 for geoengineering purposes are irregular in shape, the actual value of *A^o* (i.e., *Ao,i*) deviates

65 from $A_{0,s}$; thus the shape factor α is needed to consider this difference, i.e.,

$$
A_{o,i}^2 = \alpha A_{o,s}^2 \tag{3}
$$

66 Clearly, α approaches 1 when the particles are more spherical. In many versions of the KC 67 method, α and τ can be combined into the empirical Kozeny constant k_k (Ozgumus et al. [2014;](#page-10-2) [Nguyen and Indraratna 2017b\)](#page-10-3).

 Trani and Indraratna [\(2010\)](#page-11-2) improved the KC method by using the surface area distribution (PSDsa) instead of conventional particle size distribution based on mass (PSDm), 71 however, α , τ and k_k have not been addressed properly. While considerable effort (Matyka et [al. 2008;](#page-10-0) [Ozgumus et al. 2014;](#page-10-2) [Zheng and Tannant 2017\)](#page-11-1) has gone into evaluating these parameters, there is still a lack of experimental methods to quantify them accurately. The current study therefor uses a high resolution Micro-Computed Tomography (Micro-CT) scanning followed by image processing to compute micro-parameters such as the surface area and volume of soil particles that are then used to estimate the KC parameters (i.e., *Ao,i* and the 77 associated α). Hydraulic conductivity tests of selected soils are also carried out to validate the KC method.

Experimental investigation into the effect of particle shape on hydraulic conductivity

Soil samples

 In this study, coarse sand (CS) and crushed gravel (CG) were used in comparison to artificial glass beads (GB). While the PSDm of these soils was almost the same (i.e., the uniformity 83 coefficient $C_u = 1.4$), they had different shapes that could distinctly affect their hydraulic conductivity. Two other natural soils, i.e., medium (MS) and fine (FS) sand with *C^u* of 1.6 and 2.1, respectively were also used. The PSD of these soils (measured by Mastersizer 3000 based on laser diffraction technique) is shown in Fig. 1 where they are compared with granular materials used in previous studies. Optical microscopic view (Fig. 2a) shows that the CG particles are very angular, whereas CS particles are more rounded while the GB particles are almost perfectly spherical. Particles of MS are of similar shape to that of CS, whereas particles of FS are more angular.

Micro-CT scanning and laboratory procedure

 Micro-CT scanning is a cost effective method of capturing the geometric properties of porous materials [\(Zhou and Wang 2015;](#page-11-0) [Zhou et al. 2018;](#page-11-3) [Nguyen and Indraratna 2019\)](#page-10-4), so it was used to determine the micro-geometric parameters of soil in this study. An X-ray scanner 95 (Sky-Scanner model 1275) which could produce images of the sample to a resolution of 4 μ m to ensure an acceptable accuracy (i.e., < 3% difference in the computed area compared to optical scanning for the current materials) was employed [\(Nguyen et al. 2020\)](#page-10-5). The sample 98 (in loose states by pouring particles into a container) was scanned every 0.1° to achieve accurate 3 dimensional (3D) geometric characteristics. Imaging techniques including filtering, binarizing, de-speckling, and watershed (i.e., for separating particles in contact) were applied to the CT images to enhance the computational accuracy [\(Nguyen and](#page-10-4) [Indraratna 2019\)](#page-10-4). The final process is a 3D analysis of the sample to capture the geometric parameters of particles; this image processing took place using CTan.1.18 software [\(Brucker-](#page-9-2) [microCT 2018\)](#page-9-2). Specifically, the surface area and volume of particles were computed so that 105 their $A_{0,i}$ and the associated α could then be obtained (i.e., Eq. [3]).

 Some of the fundamental geometric parameters that are commonly used to evaluate the shape properties of particles can be estimated using CT scanning images. Table 1 shows the detailed equations and their corresponding results of sphericity *S* (i.e., represents how close the particle geometry is to a sphere), the aspect ratio *AR* (i.e., the ratio between the major and minor axes of a particle) and the angularity *AG* (the degree of sharpness of particle

 corners and edges) [\(Cho et al. 2006\)](#page-9-3). Fig. 2b shows 3D samples reconstructed from Micro- CT scanning images, which indicates a high accuracy of the technique in computing particle shape characteristics.

 A series of laboratory tests based on ASTM D2423 [\(2005\)](#page-9-4) were carried out to determine the hydraulic conductivity (*k*) of the current samples. Each sample was first poured into the cell in a loose state to which different levels of compaction (i.e., tamping by layer) were then applied to achieve different degrees of packing, but over-compaction was avoided to prevent undue degradation (i.e, scanning specimen after compaction before hydraulic test to identify the limit of compaction). Measurement was repeated at each specimen and 120 porosity to ensure the reliable results (i.e., the coefficient of variation $\leq 1\%$).

Results and Discussion

Quantitative characteristics of particle shape

123 Table 1 shows that GB has the largest sphericity $(S = 0.95)$, followed by CS $(S = 0.73)$ and 124 CG ($S = 0.5$). The *AR* of CS is about 1.49 which is much larger than GB ($AR = 1.06$), but this is still smaller than CG (i.e., 2.45). Undoubtedly, the CG particles are very angular because their average angularity is only about 0.27 which is much smaller than that of CS (0.57) and 127 GB (0.98). As a result, CG has the largest α (2.1), followed by CS (1.45) and GB (1.02). In essence, the more angular and less spherical, the larger is the surface area per a unit particle 129 volume (i.e., the larger the α). Moreover, the geometric parameters are dispersed more widely (i.e., the larger the coefficient of variation *cv*) when the particles are less spherical. For instance, the *c^v* of angularity increases from 15.5% in CS to 34.9% in CG.

*Hydraulic conductivity of diff*e*rent materials*

Fig. 3 shows the hydraulic test results where *k* varies with *n* over different materials (medium

134 to loose state). Apparently, GB has the largest *k* $(8.1 \times 10^{-3} \text{ m/s})$ followed by CS with $k =$ 135 4.3×10^{-3} m/s at the same porosity, i.e., $n = 0.39$. The CG particles are more angular and less 136 spherical, thus they have a much lower k , i.e., 2.0×10^{-3} m/s at the same porosity. Unlike CS, 137 MS and FS with larger specific surface areas as shown in Table 1 (i.e., the fluid-particle contact area) give a much smaller value of *k*, for example about 1.0×10^{-3} m/s and 5.2×10^{-4} 138 139 m/s, respectively at $n = 0.39$.

140 *Evaluating the shape factor in the Kozeny-Carman (KC) approach*

141 Using the value of $A_{0,i}$ shown in Table 1, the hydraulic conductivity of the current soils can 142 be estimated by Eq. [1]. The tortuosity (τ) generally varies with porosity (n) , which can be 143 represented by [\(Comiti and Renaud 1989\)](#page-9-5)

$$
\tau = 1 - pln(n) \tag{4}
$$

144 where *p* is an empirical parameter varying with different materials. By comparing the 145 predicted and experimental results, $p = 0.6$, 1.15 and 2.4 were found to provide reasonable 146 predictions for 3 different distinct levels of particle shape parameters, i.e., glass beads, sand 147 and crushed gravel, respectively. As a result, [Fig. 3a](#page-17-0) shows an accurate prediction with the 148 average error less than 4% across all specimens. Without properly determining α , the 149 predicted *k* could deviate considerably, for example, from 8.1×10^{-3} in GB to 2.0×10^{-3} in CG 150 despite using the same PSD and porosity (*n* = 0.39). In other words, the current study has 151 corrected the previous limitations (e.g., Trani and Indraratna 2010) where the role of α is 152 ignored while computing *k*.

 Fig. 3b is an application of the current findings to other granular soils such as Ottawa, Toyoura, Nevada and crushed sand which have commonly been used in previous studies [\(Lin](#page-10-6) [2006;](#page-10-6) [Kokusho and Fujikura 2008;](#page-10-7) [Cote et al. 2011;](#page-9-6) [Fleshman and Rice 2014\)](#page-9-7). Without 156 knowing the specific shape parameters and an accurate method to measure τ of these materials, it might be assumed that other natural (uncrushed) sands should be similar in particle shape compared to the current sands while particles of crushed sands would be highly angular [\(Cote et al. 2011\)](#page-9-6). Therefore, the same values of *p*, i.e., 1.15 and 2.4 for natural and 160 crushed sands, respectively can be assumed to estimate τ while α is varied in a range (i.e., 1.28 to 1.51) that is close to the current findings for natural sands, and 1.84 for crushed sand. 162 Note that $A_{0.5}$ of these soils is computed by Eq. [2] based on their PSD curves (Fig. 1). The results (Fig. 3b) show that the current KC prediction matches relatively well the experimental data, i.e., the average error in prediction across different soils about 5.7%. Despite this 165 success, a detailed computation of α for specific materials based on micro-CT scanning is still recommended to further enhance accuracy of the predicted *k*.

167 *Behaviour of the flow tortuosity* $(τ)$

168 A back-analysis of τ (Fig. 4) based on experimental data ($A_{o,i}$ and k) shows 3 distinct levels of τ corresponding to different levels of particle shape parameters (glass beads, sand and crushed gravel). In essence, the more compacted the particles (i.e., the smaller the *n*), the more complex the resulting seepage flow; and the less spherical and rounded the particles, the 172 greater the tortuosity. The current estimate $\tau = 1 - 1.15\ln(n)$ for sandy soils shows better agreement with experimental data than previous models, i.e., Comiti and Renaud [\(1989\)](#page-9-5), and 174 Iversen and Jorgensen [\(1993\)](#page-10-8) while $\tau = 1 - 0.6ln(n)$ for glass beads is relatively close to the theoretical derivation of Weissberg [\(1963\)](#page-11-4) for overlapping spheres. However, *p* = 2.4 for crushed materials indicates a lower degree of agreement with experimental data where the particles might rearrange themselves due to compaction. Thus an alternative relationship, i.e., $\tau = 1 + 3.55(1 - n)$ is proposed to improve the accuracy. As a result from the current study, 179 the Kozeny constant k_k (i.e., $k_k = 2\alpha\tau$) can then be established as about 5.1–6.8 for natural 180 sands, and 10.9–13.6 for crushed materials for future KC applications.

Conclusion

 This study explained how particle shape could influence the hydraulic conductivity (*k*) of granular soils, and then reinvigorating the Kozeny-Carman method using Micro-CT data. The results showed that particle shape would play an important role in the hydraulic conductivity of granular materials, thus the less spherical and rounded the grain shape, the larger would be 186 the fluid-particle contact area (i.e., the larger the shape factor α), and therefore, the lower the 187 *k*. Crushed gravel had an α that is 2.1 times larger than that of corresponding glass beads, making its hydraulic conductivity 4.0 times lower, despite having the same *n* (0.39) and PSD. 189 This study recommended an α of about 1.28–1.52 for natural (uncrushed) sand and 1.84–2.1 for crushed materials can be adopted when using KC concept to predict *k*. Also in this regard, 191 the tortuosity estimate $\tau = 1$ - $p\ln(n)$ where $p = 0.6$ and 1.15 for spheres and natural sand, 192 respectively, and $\tau = 1 + 3.55(1-n)$ for crushed materials can be suggested for computing *k*.

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Tables

N _o	Material	Specific gravity (G_s)	Uniformity coefficient (C_u)	Sphericity $(S = \frac{4 \pi A_p}{P_n^2})$	Aspect ratio (ratio between the major and minor axes)	Angularity $(AG = \frac{\sum r_i/n_c}{n})$ r_{max}	$A_{o,s}$ $(\Sigma S_i / \Sigma V_i)$ (based on PSD) (1/m)	$A_{o,i}$ $(\Sigma S_i / \Sigma V_i)$ $(CT-$ scanning) (1/m)	Shape factor $(\alpha =$ $A_{o,i}^2/A_{o,s}^2$
-1	Glass beads (GB)	2.46	1.4	0.95 $(c_v = 5.0\%)$	1.06 $(c_v = 11.5\%)$	0.98 $(c_v = 5.1\%)$	7812	7892.0	1.02
$\overline{2}$	Coarse sand (CS)	2.65	1.4	0.73 $(c_v = 12.3\%)$	1.49 $(c_v = 21.6\%)$	0.57 $(c_v = 15.5\%)$	7809	9410	1.45
3	Crushed gravel (CG)	2.58	1.4	0.50 $(c_v = 25\%)$	2.45 $(c_v = 46.7\%)$	0.27 $(c_v = 34.9\%)$	7829	11352	2.10
$\overline{4}$	Medium sand (MS)	2.68	1.6	0.74 $(c_v = 11.5\%)$	1.53 $(c_v = 24.5\%)$	0.56 $(c_v = 21.8\%)$	15921	19328	1.47
5	Fine sand (FS)	2.67	2.1	0.705 $(c_v = 14.4\%)$	1.63 $(c_v = 32.5\%)$	0.48 $(c_v = 22.5\%)$	22073	27260	1.52

Note: c_v is the coefficient of variation (%); A_p and P_p are the area and perimeter of particle's cross-section; r_i and r_{max} are the radii of the corner and the maximum inscribed circle of the particle, and n_c is the number of corners in the particle. More details can be found in Cho et al. [\(2006\)](#page-9-8)

Table 1 Micro-parameters of granular soils used in the current study

List of figures

Fig. 1 Particle size distribution of soils used in this study

Glass beads (GB) Coarse sand (CS) Crushed gravel (CG)

Medium sand (MS) Fine sand (FS)

Fig. 2 Micro-scanning techniques: a) optical microscopic observation; b) 3D reconstruction under Micro-CT scanning

Fig. 2 Micro-scanning techniques: a) optical microscopic observation; b) 3D reconstruction under Micro-CT scanning (**continued**)

Note: The experimental data are taken from following studies: Nevada sand [\(Lin 2006\)](#page-10-6); Toyoura sand [\(Kokusho and Fujikura 2008\)](#page-10-7); Ottawa sand [\(Fleshman and Rice 2014\)](#page-9-7) and crushed sand [\(Cote et al. 2011\)](#page-9-6).

b)

Fig. 3 Hydraulic conductivity of different materials by experimental and KC methods: a) current study; b) compared to previous granular soils

Fig. 4 Tortuosity of fluid flow through different shaped materials in comparison with previous studies