POROSIMETRY BY RANDOM NODE STRUCTURING IN VIRTUAL CONCRETE

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ABSTRACT

Two different porosimetry methods are presented in two successive papers. Inspiration for the development came from the rapidly-exploring random tree (RRT) approach used in robotics. The novel methods are applied to virtual cementitious materials produced by a modern concurrent algorithm-based discrete element modeling system, HADES. This would render possible realistically simulating all aspects of particulate matter that influence structure-sensitive features of the pore network structure in maturing concrete, namely size, shape and dispersion of the aggregate and cement particles. Pore space is a complex tortuous entity. Practical methods conventionally applied for assessment of pore size distribution may fail or present biased information. Among them, mercury intrusion porosimetry and 2D quantitative image analysis are popular. The mathematical morphology operator "opening" can be applied to sections and even provide 3D information on pore size distribution, provided isotropy is guaranteed. However, aggregate grain surfaces lead to anisotropy in porosity. The presented methods allow exploration of pore space in the virtual material, after which pore size distribution is derived from star volume measurements. In addition to size of pores their continuity is of crucial importance for durability estimation. Double-random multiple tree structuring (DRaMuTS), introduced earlier in this journal (Stroeven *et al.*, 2012) and random node structuring (RaNoS) provide such information.

Keywords: DEM, pore connectivity, porosimetry, star volume, virtual concrete.

INTRODUCTION

Modern computer facilities have made studies on virtual concrete simulated by discrete element method (DEM) a liable alternative for experimental investigations. The two porosimetry methods introduced in Stroeven et al. (2012) and herein are therefore intended to be applied to virtual cement pockets between neighboring aggregate grains in concrete. They are produced in an analogue version by the dynamic concurrent algorithm-based physical DEM system HADES. This is not a unique system, of course. Since the introduction of physical methods for DEM in rock mechanics by Cundall and Strack (1979), also many systems have been developed world-wide in concrete technology; in many cases however this was accomplished for specific and thus restricted purposes. Reference can be given to Jodrey and Torey (1981), Ansell and Dickinson (1986), Mościński et al. (1989), Bentz et al. (1993), O'Connor et al. (1997); Stroeven (1999), Tsunekawa and Iwashita (2001), Puri and Uomoto (2002), Williams and Philipse (2003), Li et al. (2006) and Markauskas and Kačianauskas (2006). Relevant discussion on this issue can be found in Stroeven *et al.* (2009).

For (super) high performance concrete ((S)HPC) the cement particle packing will be dense, with values of water to cement ratio (w/c) as low as 0.2. The fresh state is thereupon hydrated, a process that does not change the position of the cement grains.

During hardening, pore space is generally accepted to gradually de-percolate. This process has been demonstrated depending on the dispersion of the cement particles and will thus be reflected in a biased way by random generator-based (RG) simulation systems popular in concrete technology. References to a selection of such RG systems can be found in Stroeven *et al.* (2009). For specific examples, see Diekkämper (1984), Roelfstra (1989), van Breugel (1991), Bentz *et al.* (1993), Meakawa *et al.* (1999) and Bishnoi and Scrivener (2009). Significant differences between the de-percolation process characteristics obtained by (analogue) DEM- and RG-based systems and with the digitized model of Garboczi and Bentz (2001) have been shown in Chen *et al.* (2006). For details of the hydration algorithms in the case of spherical cement grains, see Stroeven *et al.* (2011). This is similar to hydration algorithms developed elsewhere (Navi and Pignat, 1999; Stroeven, 1999).

Experimental approaches can provide information on porosity and pore size distribution. An obvious method is quantitative image analysis, which is also used in concrete technology. However, the most popular approach is definitely mercury intrusion porosimetry (MIP). The latter offers significantly biased information, however, because of the unrealistic schematization of the geometry of the pore channels and the neglect of the so called bottle necks in the pore system (Diamond, 2000). Insight into pore connectivity, which is of crucial importance for estimating durability risks, therefore requires other approaches.

The presented novel methods (see also Stroeven *et al.*, 2012) allow making a distinction between continuous pores (trunks) stretching over the full dimensions of the cement pocket, isolated pores and deadend pores branching off the trunks. Particularly the latter have been demonstrated making the connections between pore trees of neighboring interfacial transition zones (ITZs), so that finite values of connected porosity were found for bulk paste. This was demonstrated by the earlier described DRaMuTS example in Stroeven *et al.* (2012).

Volume-based pore size distribution is derived from star volume measurements in 3D, as demonstrated also earlier. Of course, this information can be transferred to a traditional number-based pore size distribution.

RANDOM NODE STRUCTURING

ALGORITHM

Random node structuring (RaNoS) is a general approach, which can be used for porosimetry in hydrated virtual (blended) cement pastes or for other purposes, such as porosimetry in packing of grains. Fig. 1 presents a 2-D scheme for RaNoS. It starts by generating with a pseudo-random generator algorithm a system of nodes uniformly at random (UR) dispersed in container space. Then, the nodes situated in solid phase are eliminated from further consideration. This yields nodes UR dispersed inside pores as a detection system of the 3D capillary pore system in cement paste. The next step is a structuring process for the node system in which the relationships between the nodes are built up by unobstructed straight line segments connecting the nodes.



Fig. 1. Structure of random nodes in RaNoS method.

When two nodes can be connected together by a straight line that does not intersect with any part of the solid phases, such two nodes have 'direct connection'. This initiates the node-clustering process. A cluster involves all nodes that are directly connected. When two of such clusters during this process can be directly connected, they merge into a new one. Hence, once the clustering process is finished, there are a number of structured clusters of nodes. In each of these clusters, the nodes are mutually connected reflecting the connectivity among pores in the virtual cement paste. Based on the node structure, pore characteristics such as porosity, degree of percolation, pore location distribution and pore size distribution are assessed.

IMPLEMENTATION

Elimination of nodes in solid phases

As mentioned above, to obtain nodes that are uniformly at random distributed in pore space, an elimination process is required of the nodes interfering with solid phase. For particles simulated by spheres, this can easily be accomplished. For particles simulated by digital-image-based model (Bentz and Garboczi, 1991) this is also easily carried out by determining the phase of the voxel in which the considered point is situated. For particles simulated by polyhedrons, this is more complicated. Such particles have been employed earlier for simulating crushed rock aggregate and for cement grains (He, 2010). An efficient way to detect if a point is inside a convex polyhedron was presented in He (2010). If $n_i \cdot (X - V_i) < 0$ is satisfied for all facets of the polyhedron, the considered point X is inside. n_i is the normal vector of facet *i* pointing outside of the polyhedron; V_i is a vertex of facet *i*. This, however, can not be used for the case of nonconvex polyhedrons.

Fig. 2 illustrates a more general way for this detection. A probing ray emanating from the considered node in a random direction is generated. In fact, this ray is a line segment (limited by two ends) and its length must be long enough to possibly go through the polygon. If the number of intersections of the ray and the polyhedron's surfaces (polygons) is odd then the point is inside the polyhedron, otherwise it is outside the polyhedron.



probing ray intersections of probe rays and the polyhedron's facets

Fig. 2. Determination whether a point is inside or outside a polyhedron.

Although the example case is a simple one, whereby spherical cement grains are used, recent synchrotron-based X-ray imaging results by Garboczi and Bullard (2004) revealed cement particles to explicitly display convex as well as non-convex parts in their surface. In our research, so far, mixtures of ellipsoidal cement particles or of polyhedrons were employed for simulating cement particle packing (He, 2010). Hereby the surface to volume ratio is similar to that found by Garboczi and Bullard (2004) in the aforementioned experiments. Since hydration is a surface-driven phenomenon this would be a next step in simulating hydrating systems among other things for porosimetry. Ultimately, also particles with non-convex surface elements should be considered, since this will influence the formation of hydration products in a densely packed binder system. For this purpose, the hydration algorithms will require significant adaptations. Yet, the HADES simulation system should be advanced enough to render possible performing such investigations in the near future.

Detection of connection between two nodes

As mentioned above, the RaNoS method involves a system of random nodes that are pair wise connected by unobstructed line segments. The line segment will be considered as being unobstructed if it does not have any intersection with neighboring particles. In case particles are simulated by spheres, the intersection detection reduces to that of a line and a sphere. In case particles are simulated by the digital-imagebased model (Bentz and Garboczi, 1991), a series of points with constant spacing is distributed along the line segment. Hence, the segment line is unobstructed if there is no point situated in any voxel representing a solid phase. In case particles are simulated by polyhedral shapes, the detection procedure is the same as earlier described. Since two ends of the line segments are outside particles, the number of intersections is only either zero or an even number. If the number is zero then there is no intersection. Otherwise, such an intersection exists.

Localized and parallel computing

The RaNoS method centers on finding direct connections between neighboring nodes. The cell method is utilized for this purpose. Each cell contains a list of particles that interfere with the cell and a list of associated nodes. The cells render possible executing localized operations to improve the speed of computation. So, the clustering process is first applied locally in each cell. Thereupon, the clustering process is applied in the whole simulated space. Moreover, since local clustering processes can be implemented independently and simultaneously, 'parallel computing processing', the advanced feature of some programming languages, is also applied to speed up the computations.

Detection of pore connectivity

Considering a cubic sample pocket of cement paste, two types of capillary pores can be distinguished. The percolated pores form continuous entities connecting two opposite sides of the specimen. The de-percolated pores or the isolated pores might be connected together but are not connected to both sides of the pocket. The connectivity of pores is defined as the volume ratio of percolated pores to the total of capillary pores. Since the system of UR dispersed nodes can be considered as a discretized system of pore space, the pore connectivity can be estimated as the ratio of the number of nodes that are connected to the two opposite sides, to the total number of random nodes. For assessment of pore connectivity, nodes should also be uniformly at random distributed on the opposite outer surfaces of the specimen and incorporated in the clustering process. When a cluster of nodes contains at least one node in each of the two opposite surfaces, this cluster represents a percolated pore channel. In analyzing characteristics of the pore system, e.g., porosity, connectivity, pore size distribution, the nodes situated in the two end surfaces are not taken into account, however.

RaNoS EXAMPLE

Two cubic pockets of simulated cement paste are considered in this study. The characteristics of the two pockets are shown in Table 1 (P = periodic, R =rigid boundary). Fresh cement particles were generated and packed with the HADES system. The initial size of the pocket was eight times reduced in the dynamic packing process. A rigid surface leads to the formation of an interfacial transition zone (ITZ); an interesting feature in concrete technology. However, it is the inevitable result of the well-known wall effect, because the cement particles will pile up differently close to the wall, constituted by the aggregate grain's surfaces. In general, higher porosity and lower strength are reported as in bulk (Ollivier et al., 1995; Maso, 1996; Scrivener, 1999; Diamond and Huang, 2001; Stroeven and Stroeven, 2001). This paper does not pursue discussing the phenomenon of ITZ development in concrete, however.

Next, hydration was realized by the hybrid simulation approach described in Stroeven *et al.* (2011). Finally, the pore structure of the samples was investigated by RaNoS at ultimate degree of hydration (DOH). Due to shortage of water for chemical reactions, the hydration process of the samples stops at ultimate DOH of 0.727. Note that the maximum grain size of the simulated cement is about three times smaller than in practice. Hence, this should be accounted for in the evaluation of obtained results (such as the extension of the boundary zone).

Fig. 3 presents the random nodes distributed in pore space of the two cement pockets. Based on these systems, porosity of the C1 and C2 pockets was found to amount 5.57 % and 5.59 %, respectively. The associated connected pore fractions of the C1 and C2 pockets were 98.53% and 97.58%. The gradient structure of pore volume as a function of distance from the rigid (R) surface is displayed in Fig. 4 and compared with observations on bulk paste (container with six periodic (P) boundaries). Note the similarity with the gradient structures shown in Fig. 6 in Stroeven *et al.* (2012). Fig. 5 presents volume-based pore size distribution functions assessed by the star volume measurements.

Fig. 6 shows sensitivity analyses for the connected fraction of porosity of the C1 pocket by RaNoS and by the *digital technique* proposed by Hosen and Kapelman and cited in Navi and Pignat (1999). In order to check connectivity in the digital technique, the microstructure is subdivided into a 3D regular lattice of cubic volume-pixels (voxels), each of which represents either a solid or a pore part. Then a clustering process for pore voxels is implemented to distinguish two types of pore voxels: voxel clusters that can be connected to both top and bottom surfaces and those which are isolated. The connected fraction is then calculated as the ratio of the number of voxels belonging to the first type to that belonging to the second type.

	Boundary conditions	Diameter range (µm)	Specific surface area (cm ² /g)	Size of pocket (µm)	Initial <i>W/C</i> ratio	Number of particles
C1	6P	1~30	1838	100	0.304	4060
C2	4P + 2R					

Table 1. Characteristics of simulated cement samples.



Fig. 3. System of nodes distributed uniformly at random in pore space of cement pocket C1 (top) and C2 (bottom) (unit of axes is μm).



Fig. 4. Density distribution of pore volume as function of distance from the left rigid surface.



Fig. 5. Effect of boundary conditions on volume-based pore size distribution functions of Portland cement pocket in concrete.



Fig. 6. Sensitivity analyses of connected fraction of porosity on a number of sampling nodes (C1 pocket) by RaNoS versus 'digital technique' (cited in Navi and Pignat, 1999).

Fig. 6 demonstrates that the connected pore fraction becomes stable (accepting only a very small change) with more than 1 million of random points in RaNoS. In the digital technique a far higher number would be required, revealing the efficiency of the new technique.

DISCUSSION

The two novel porosimetry methods introduced herein (RaNoS) and in Stroeven *et al.* (2012) (DRaMuTS) are somewhat similar but still have different characteristics and potentialities. In RaNoS a system of UR dispersed nodes is first generated and then a clustering process starts, ultimately resulting in groups of connected nodes. Contrary, in DRaMuTS a system of virtual trees consisting of vertices (nodes) and edges (line connecting a pair of nodes) are first generated in pore space. Note that the vertices are distributed randomly but not uniformly as a result of introduced improvements to speed up exploration of pore space. So, this cannot be used to analyze pore characteristics. For that purpose, a second system of UR dispersed nodes is generated. A common point of the two methods is therefore that pore characteristics (such as pore size distribution) are analyzed on the basis of a system of UR dispersed nodes. The tree systems in DraMuTS additionally render possible exploring pore space with respect to topological properties. Trunks of the trees can be defined as pore network parts connected to external sides of the pocket, whereas others parts of the trees branch off the trunks, basically form-ing dead-end pores unless coalescing with those of a neighboring tree. Finally, isolated pores can be distinguished. This topological exploration is impossible in RaNoS.

The porosimetry study by Chen *et al.* (2004; 2006), whereby use was made of serial sectioning and 3D reconstruction, led to the conclusion that (for low w/c-ratios) continuous porosity was zero outside a narrow zone adjacent to the aggregate surface. Hence, diffusivity of concrete would rely on a spatial pore network structure whereby a significant degree of ITZ percolation should provide for the connection in the continuous pore channels circumventing the aggregate grains. This would not be in agreement with the fore-going.

Instead, the porosimetry applications of the presented methods demonstrate that pore continuity is realized outside the aforementioned narrow zones with high degree of continuous porosity. The significant bulk value displayed in Fig. 4 is most probably due to dense network structures of (basically dead-end) pores branching off the continuous channels in the narrow zones. Even without ITZ percolation, these pore network structures can connect to form transport routes in bulk paste.

Data in Fig. 4 render possible roughly estimating in an *effective medium approach* the impact of higher ITZ porosity on global porosity, and thus on the expected ITZ contribution to durability issues such as chloride diffusion. Of course, ITZs partly overlap in a dense random packing of aggregate. Garboczi and Bentz (1997) analytically approached this problem for spherical aggregate grains. Zheng *et al.* (2011a) extended the analytical approach to RGsimulated dispersions of ellipsoidal aggregate and applied it for estimating chloride diffusivity in concrete (Zheng *et al.*, 2011b). Of course, further extension and generalization as to grain shape would readily be possible by HADES simulation.

As an example, for a Fuller distribution with maximum aggregate size of 16 mm, ITZ thickness is taken as $t = 30 \ \mu\text{m}$ or 50 μm (selected from literature). Zheng *et al.* (2011a) provide numerical data for ITZ volume fraction (V_{ITZ}) at spherical aggregate volume fractions (V_{agg}) of respectively 0.6 and 0.75 as listed in Table 2. Fig. 4 allows approximately estimating average porosity over an ITZ scaled down by a factor of 3.

Table 2. ITZ volume fraction for different values ofaggregate volume fraction and ITZ thickness.

	$V_{\rm ITZ}$		
V_{agg}	0.6	0.75	
t = 30 µm	0.045	0.060	
$t = 50 \ \mu m$	0.085	0.105	

For instance, with a chosen ITZ thickness of $t = 30/3 = 10 \ \mu\text{m}$ in the *virtual material*, a value of 1.98 is obtained for the ratio of ITZ porosity to bulk porosity, whereas with $t = 50/3 \approx 17 \ \mu\text{m}$ this value is 1.32. Hence, based on data in Table 2 and Fig. 4, the global *paste* porosity \overline{p} can be calculated for $V_{agg} = 0.6$:

$$\begin{cases} \left(t = 30\,\mu m\right); \overline{p} = \frac{p_{\text{bulk}}V_{\text{bulk}} + 1.98\,p_{\text{bulk}}V_{ITZ}}{V_{paste}} \\ = \frac{p_{\text{bulk}}\left(0.4 - 0.045\right) + 1.98\,p_{\text{bulk}}\left(0.045\right)}{0.4} = 1.110\,p_{\text{bulk}} \\ \left(t = 50\,\mu m\right); \overline{p} = \frac{p_{\text{bulk}}V_{\text{bulk}} + 1.32\,p_{\text{bulk}}V_{ITZ}}{V_{paste}} \\ = \frac{p_{\text{bulk}}\left(0.4 - 0.085\right) + 1.32\,p_{\text{bulk}}\left(0.085\right)}{0.4} = 1.068\,p_{\text{bulk}} \end{cases}$$

and for $V_{\text{agg}} = 0.75$:

$$\begin{cases} (t = 30 \mu m); \overline{p} = \frac{p_{\text{bulk}} V_{\text{bulk}} + 1.98 p_{\text{bulk}} V_{ITZ}}{V_{paste}} \\ = \frac{p_{\text{bulk}} (0.25 - 0.06) + 1.98 p_{\text{bulk}} 0.06}{0.25} = 1.235 p_{\text{bulk}} \\ (t = 50 \mu m); \overline{p} = \frac{p_{\text{bulk}} V_{\text{bulk}} + 1.32 p_{\text{bulk}} V_{ITZ}}{V_{paste}} \\ = \frac{p_{\text{bulk}} (0.25 - 0.105) + 1.32 p_{\text{bulk}} 0.105}{0.25} = 1.134 p_{\text{bulk}} \end{cases}$$

in which V and p denote, respectively, the volume fraction and porosity.

This demonstrates that the accuracy of estimating the thickness of the ITZ can be low. The aggregate grain surfaces increased overall porosity in the *paste* as a consequence by about 9% in the case of more dispersed aggregate grains and by 19% in the dense aggregate case. In this effective media approach, the porosity in the aggregate is neglected.

The presented method as well as the earlier introduced method, DraMuTS (Stroeven *et al.*, 2012), offers new information on the pore network structure in hardening cement paste. This should have influence on models nowadays used for prediction of transport through porous concrete. Such methods were discussed in Hu (2004). A new approach to durability estimation might however require setting sensitivity on a somewhat lower level than in the plateau range of Fig. 6. This would modify the pore network structure in Fig. 3 into a partly de-percolated one, which is more in accordance with the commonly accepted concept in this field.

Moreover, Fig. 5 already demonstrates that introduction of ITZs leads to pore refinement. In Le and Stroeven (2012) it is shown that this phenomenon primarily takes place in the ITZ. For durability estimation in the case that mechanical influences (*i.e.*, deformation and micro cracks developed due to loading in the ITZ) can be neglected, the effect of ITZ percolation can be expected not significant, which is in agreement with Zheng *et al.* (2011b).

The relative potentialities of the two methods should still be explored as to efficiency, reliability and capabilities for various applications (not necessarily limited to porosimetry in hydrated systems). At the moment we do so, but it is likely that both methods will have their own merits under different circumstances. Generally speaking, although DRa-MuTS is more advanced for pore space exploration, RaNoS is cheaper and simpler.

The new methods concern physical DEM producing an analogue representation of concrete. Not discussed herein are stochastic DEM that have been introduced in Stroeven *et al.* (2009), whereby among other things reference was made to Dequiedt *et al.* (2001), who claim such models to be even more promising than the physical ones.

CONCLUSIONS

Novel approaches to porosimetry in virtual concrete are presented that combine reliability and economy. These methods rely on realistic analogue

simulations of fresh cementitious materials by a dynamic algorithm-based DEM system, HADES. During maturation, a process of pore de-percolation takes place that can be numerically assessed. To do so, the developing pore network structure is analyzed by modern methods of which development is inspired by experiences in robotics. The first of the two presented methods (Stroeven *et al.*, 2012) renders possible separating between continuous pores (trunks), dead-end pores branching off such pores, and isolated dead-end pores. Tree-like pore network structures are obtained of which density is highest in the ITZ. As to this aspect they confirm results obtained by the far more laborious approach of serial sectioning and 3D reconstruction.

Aggregate grains have been demonstrated coming close enough to cause neighboring ITZs to overlap or percolate (at least) partly. This is the location where probability is highest for pore trees associated with neighboring aggregate grains to connect through their branches of dead-end pores. The result is that the dense random packing of the aggregate leads to connected pathways (trunks) over the full extension of concrete specimens or elements. However, it is demonstrated by application of the developed porosimetry methods that also bulk cement paste between somewhat more remote aggregate grains contains continuous pores through mutual connection of deadend pores branching off the trunks, although density is lower that in the ITZ. As to this aspect, results deviate from those obtained by serial sectioning and 3D reconstruction.

A simple effective medium approach demonstrates that overall porosity is as a consequence not dominated by higher (continuous) porosity in the ITZ. Moreover, the effect of somewhat higher average ITZ porosity on global hydraulic properties can be expected even further reduced because of the relative fineness of ITZ's pore system. Hence, transport of harmful substances (including water) through concrete can be expected not significantly influenced by the degree of ITZ percolation in case mechanical influences by loading are neglected.

The complex and tortuous pores in the network structure can easily be analyzed as to size distribution by application of star volume measurements. This is a well-known *experimental* approach in life sciences. Its usage is shown straight forward when dealing with the 3D virtual pore structure. However, it can equally be applied to 2D sections (physical experiments) from which an unbiased estimate of local pore size can be obtained. Such data (in 2D and 3D alike) obtained from a large number of random points in pore space (again, 2D and 3D alike) are readily transformed into volume-based cumulative pore size distributions and through differentiation into pore size distributions.

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