

# An Algorithm for Three-Dimensional Voronoi S-Network

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**Abstract:** The paper presents an algorithm for calculating the three-dimensional Voronoi–Delaunay tessellation for an ensemble of spheres of different radii (additively-weighted Voronoi diagram). Data structure and output of the algorithm is oriented toward the exploration of the voids between the spheres. The main geometric construct that we develop is the Voronoi S-network (the network of vertices and edges of the Voronoi regions determined in relation to the surfaces of the spheres). General scheme of the algorithm and the key points of its realization are discussed. The principle of the algorithm is that for each determined site of the network we find its neighbor sites. Thus, starting from a known site of the network, we sequentially find the whole network. The starting site of the network is easily determined based on certain considerations. Geometric properties of ensembles of spheres of different radii are discussed, the conditions of applicability and limitations of the algorithm are indicated. The algorithm is capable of working with a wide variety of physical models, which may be represented as sets of spheres, including computer models of complex molecular systems. Emphasis was placed on the issue of increasing the efficiency of algorithm to work with large models (tens of thousands of atoms). It was demonstrated that the experimental CPU time increases linearly with the number of atoms in the system, O(n).

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# Introduction

Wide application of computer simulation techniques in the condensed matter, material science, and molecular biology stimulates increasing interest in Voronoi–Delaunay method, which is a convenient technique to study the structure of computer models of various atomic systems. The method allows gaining information both on the mutual location of atoms, and on the interatomic voids. We note only some of the recent researches that utilized the method in its different aspects: the study of the structure of liquids and glasses,<sup>1–4</sup> the problems of crystallization,<sup>5–8</sup> the composition of granular<sup>9–12</sup> and colloid systems,<sup>13–15</sup> the analysis of complex molecular systems and polymers,<sup>16–19</sup> the study of intermolecular voids in liquids,<sup>20–22</sup> in lipid membranes,<sup>23–26</sup> in proteins,<sup>27–30</sup> and some other interesting applications.<sup>31,32</sup>

The method exploits an evident geometrical fact that for each atom in a system of atoms it is always possible to distinguish a part of the space closest to this atom. This region is called the Voronoi polyhedron or, in general case, the Voronoi region, and their partitioning, built for all the atoms, is called the Voronoi tessellation or Voronoi diagram, see for instance, ref. 33. For the Voronoi tessellation, there exists dual tessellation (Delaunay tessellation), consisting of simplexes (the most simple elements of 3D space) tetrahedrons, whose vertices are the atoms of the system. These simplexes are called Delaunay simplexes. A significant feature of the Delaunay simplexe is the fact that it determines the simplest interatomic cavity (between four atoms). These tessellations are basic geometrical data for structure investigations.

The mathematical foundations of the method were laid by G.F. Voronoi and B.N. Delaunay. The former explored in detail the properties of these tessellations by using analytical methods for lattice systems, and the latter proved the correctness of Voronoi's main theorems for random position of points in space.<sup>34–36</sup> At present both tessellations are used successfully in different branches of mathematics, computational geometry, graphics, geography, GIS, and many other applications, where geometrical

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properties of a system of discrete points given on plane or in the space have to be explored.<sup>33,37,38</sup>

The wide utilization of the method to atomic and molecular systems was started by J. Bernal, who was the first to use the Voronoi polyhedra to study the structure of disordered packings of spheres.<sup>39–41</sup> However, the representation of atoms as points (their centers) is not sufficient for some physical problems. Specifically, when studying the empty interatomic space, one needs to know not only the coordinates of the centers, but also the radii of atoms, since it is exactly the van der Waals surfaces of atoms that determines the boundaries of the voids. Research papers<sup>42,43</sup> demonstrated that classic Voronoi polyhedra (built for the system of centers of atoms) do not result in correct the closest regions of atoms of different size; they may intersect surfaces of atoms. All this stimulated the generalization of the classic Voronoi–Delaunay approach for the system of differently sized spheres.

At first, to take into account radii of atoms, it was suggested to use radical polyhedra instead of classic Voronoi polyhedra.44 In this case the distance from a point in space to the sphere is measured by a segment of a tangent to this sphere.<sup>45</sup> In mathematics this generalization of Voronoi tessellation is called radical, weighted, power, or Laguerre one.33,46,47 The radical polyhedrons, contrary to the classic Voronoi polyhedrons, do not intersect the surfaces of the spheres for any system of spheres of different radii. In this sense they can be reasonably used for characterization of free volume of atoms.48-53 The advantage of the radical polyhedrons is their simplicity. To calculate them, a small modification of algorithms of calculation of classic Voronoi polyhedrons is sufficient. The disadvantage lies in the fact that the proposed method of "measuring distance" to the atom does not have a clear physical meaning. Nevertheless, this approach is quite applicable as a simple method of partitioning space between atoms of different size.

From the physical point of view, it is more accurate to assign those points in space to the given sphere that, according to the Euclidian measure, are closer to its surface, than to the surfaces of other spheres. Such region, determined by the surfaces of objects, may be denoted as Voronoi S-region.54-56 These regions, in full analogy with the classic Voronoi polyhedrons, cover space without gaps and superposition, that is, they form Voronoi S-tessellation. Such generalization of Voronoi tessellation is well known in mathematics. For a system of spheres it corresponds to the so called additively-weighted Voronoi diagram.<sup>33,57</sup> However, the concept of Voronoi S-region is wider; it may be determined for objects of any shape, for instance, for cylinders.<sup>58</sup> In physics such kind of regions are known in kinetics of crystallization, in processes of nucleation and growth. If nuclei are born in different moments, but all of them grow with a constant velocity, then final mosaic of the nuclei-filled space will be the additively-weighted Voronoi diagram, and such final nuclei are called Johnson-Mehl cells.59-61

The vertices and edges of all Voronoi S-regions of a given system form a network, which would be natural to be denoted as Voronoi S-network. By construction, it is the navigation map of the empty interatomic space. Its vertices lie "in depth" between atoms, and its edges serve as fairways from one vertex to the neighboring one.<sup>54,56,62,63</sup> In other terminology, it represents medial axes for the voids between the atoms,<sup>33</sup> that is, moving along the edges of

the Voronoi S-network we are always maximally removed from the surfaces of neighboring atoms. This network is the main tool for the analysis of the empty space within a system of spherical atoms and any convex objects.<sup>58,64</sup>

Regardless of its physical significance, Voronoi S-tessellation has not been used, until recently, to a full extent. The reason is that the algorithm of calculation of the S-tessellation is more complicated than that used for the calculation of classic Voronoi diagram. Dealing with the surfaces of objects, we have to solve a nonlinear problem (the system of equations of second order in the case of spheres). Besides, the geometrical properties of a set of spheres of different radii in some aspects differ significantly from the properties of a system of discrete points or of equal spheres. In this paper we solve these problems. We discuss the properties of a system of spheres of different sizes, and propose an algorithm, applicable to exploration of the structure and empty space between spheres.

Many algorithms have been devised for the calculation of classic Voronoi diagram, and for its multiple generalizations,<sup>33,38</sup> see also some recent papers on this issue in refs. 65-68. However, there are relatively few papers dedicated to the construction of the Voronoi S-regions. Additive-weighted diagrams have been explored in sufficient detail only for 2D.69-72 For 3D the problem provided to be more complicated. The first calculation of 3D additive-weighted diagram (Voronoi S-network) was performed in an earlier paper<sup>54</sup> to explore the structure of voids in the packings of polydispersed spheres. The idea of algorithm was borrowed from refs. 73 and 74, where in order to build Voronoi polyhedron, the first vertex is determined initially, and then, step by step, all the other vertices are found. When calculating the network, similarly, the starting vertex of the network is determined first, and all the other vertices and their connectivity are determined by sequential determination of the neighbors of the known vertices of the network. The works<sup>65,75,76</sup> have been dedicated to the calculation of 3D additively-weighted diagram, where, specifically the issue of the accuracy of calculating the vertices of the network is considered. A recent paper<sup>77</sup> suggested the algorithm utilizing the idea of sequential determination of the vertices for the construction of additive-weighted diagram. However, its realization is somewhat different from that of ours. Besides, it provides for an apparent presentation of segments of curves and pieces of surfaces representing edges and faces of Voronoi S-regions as output data, thus helping to visualize Voronoi S-region. Individual Voronoi S-regions are also calculated for different problems. The papers78-81 are dedicated to the calculation of their volume and surface for molecular biology. Volume and surface of cavities inside polydisperse packings of spheres are calculated in ref. 82. A comparative analysis of characteristics of classic, radical, and Voronoi Sregions for binary packings of spheres was made in ref. 83. The volume of the Voronoi S-regions and areas of its faces are interesting physical parameters. They are determined unambiguously by vertexes of the S-region and radii of atoms. However, we do not know a simple analytical formula to calculate them; numerical methods are usually used.77,82,83

The calculation of Voronoi S-network for a system of nonspherical object in a 3D (straight lines and spherocylinders) was realized in previous works.<sup>58,84</sup> However, the efficiency of the calculation of the network there turns out to be significantly lower than that for a system of spheres. It is caused by the fact that the analytical formula for the calculation of the coordinates of a Voronoi S-network vertex can be obtained only for spheres, while for the objects of other forms, in general, no explicit formula exists. That is why the method of numeric determination of vertexes and step-by-step calculation of edges was developed in ref. 58.

In a previous work<sup>85</sup> the algorithm of calculating Voronoi Snetwork for a packing of spheres in a cylindrical container is suggested. In this case, the walls of the cylinder are regarded as one of the objects of the ensemble, and are used equally for the calculation of the network. In this particular case it was possible to receive an explicit formula for the calculation of the Voronoi vertices between spheres and the cylinder.

Thus, in this paper we propose an algorithm for calculating Voronoi S-network for a system of spheres of different radii. It exploits a simple idea of sequential determination of the vertexes, which was used earlier for calculation of the classical Voronoi network<sup>64</sup> and Voronoi polyhedra<sup>73,74</sup> for systems of points or identical spheres. Implementation of this idea to spheres of different radii is not obvious because of specific geometry of such systems. In the paper we examine geometrical properties of such systems in detail and also discuss nontrivial peculiarities of the algorithm, induced by this problem. The paper contains complete geometrical and technical information, which is necessary for understanding of the algorithm and also for its independent implementation.

For the first time this algorithm was used in our works<sup>54,55</sup> for studying polydisperse packings of hard spheres. A possibility of application of the algorithm to systems of overlapping atoms (molecular systems) has been described in refs. 23 and 86. Recently the algorithm was used to study voids in computer models of lipid membranes.<sup>23–25</sup> A demonstration program for the calculation of the Voronoi S-network is accessed at a website.<sup>87</sup>

In the following section we discuss geometric properties of spheres of different radii in 3D. Then, the algorithm scheme and the key steps of the algorithm are discussed. Also, the computational peculiarities of the algorithm and the problem of increasing algorithm efficiency to work with large systems are considered.

# **Preliminary Remarks**

#### System of Balls (Atoms)

Source information for the analysis is a 3D system of balls (atoms)  $\{A\}$ , where each ball is defined by its Cartesian coordinates and its radius. (We use here a term "ball" instead of mathematical word "sphere" to avoid misunderstanding between objects of the system and interstitial empty spheres inscribed between balls). Notation *nA* stands for the number of balls in the system, and arrays *A* and *Ra* stand for the set of coordinates and radii.

For simplicity we assume that the balls do not intersect each other. The case of partially overlapping balls can be easily reduced to the case of nonoverlapping balls, see for instance, refs. 23, 80, and 82. We do not consider cases when one ball is located entirely within another one, since such a ball does not participate in the formation of empty space between the balls. It is assumed that system  $\{A\}$  is nondegenerate, i.e., an empty sphere can be tangent simultaneously to no more than four balls of the system. Regardless of the fact that it is easy to imagine a multitude of configurations where an empty sphere can be tangent simultaneously to any number of balls, these configurations are not encountered in models resulting from computer experiment. Such degenerative configurations decompose into nondegenerate from the infinitely small shift of balls or variation of their radii. The assumption of nondegeneracy of the system significantly simplifies the algorithm.

In this paper we leave aside the issue of the boundaries of system  $\{A\}$ . This problem is not relevant for the essence of the algorithm, and it is easily resolved in each specific case. Thus, periodic boundary conditions are usually used in the computer modeling of liquids, and in this case no problems with boundary atoms arise. If a system has open boundaries, for instance while examining a single molecule of protein, it suffices to specifically mark the edges of the Voronoi diagram extending to infinity. The problem becomes more complicated when the system has a wall (a container). However, in some special cases, for instance for balls in a cylinder, or at a flat wall, it is possible to explicitly take into account the boundary.<sup>85</sup>

Finally, we assume that system  $\{A\}$  does not contain small balls in the narrow gap between a pair of larger balls. As becomes clear from the following, the occurrence of such configurations may result in the disconnection of the Voronoi S-network. By the way, this feature concerns directly to the known fact that faces of the additive-weighted Voronoi regions may have "holes".<sup>64,80</sup> Fortunately, models of molecular systems, as a rule, do not have such features. We mention this property of the system of balls of different sizes, because our algorithm is intended for the computation of simply connected network.

#### Auxiliary Geometrical Constructions

First of all, let us discuss the necessary geometrical concepts and their properties for sets of three and four balls in the space, since it is crucial for the understanding of the algorithm. The proofs of the main properties may be found elsewhere, in particular, in some previous papers,<sup>33,57,75</sup> as well as in ref. 64.

#### Voronoi S-Surface (Voronoi Hyperboloid)

The geometric locus of points, equidistant from the surfaces of two balls *i* and *j*, is defined as Voronoi S-surface (Voronoi bisector, Voronoi hyperboloid)  $H_{ij}$  (see Fig. 1). It divides the space into two parts, so that points of one half-space are closer to the surface of their ball than to the surface of the ball in the other half-space. This surface in 3D represents an axial–symmetrical hyperboloid. For balls with equal radii it becomes obviously a plane.

#### Voronoi S-Channel

Geometric locus of points equidistant from the surfaces of three balls i, j, k is defined as Voronoi S-channel and is denoted as  $C_{ijk}$ . It may be represented as a trajectory of movement of the center of an empty sphere simultaneously tangent to this set of three balls. S-channel is the common line of intersection of all



**Figure 1.** Two-dimensional illustration of Voronoi S-surface for two balls of different radii. It divides the space into two parts. Points of one part of space are located closer to the surface of the first ball, and points of the other one are closer to surface of the second ball. For any point p on this surface the difference of distances from this point to the centers of the balls  $(R_1 + r) - (R_2 + r) =$  $R_1 - R_2$  is a constant value, i.e., Voronoi S-surface is a hyperboloid (hyperbole in 2D case).

the three Voronoi hyperboloids  $(H_{ij}, H_{ik}, \text{ and } H_{jk})$  of pairs of these balls. Below are the necessary properties of Voronoi S-channel.

*C1.* Voronoi S-channel is simply-connected line. It can be either nonclosed, i.e., with endpoints extended into infinity, or closed. The property of the S-channel is substantially utilized in our algorithm. It is worth noting that for objects of other shape, for instance cylinders, Voronoi S-channel may not be connected.<sup>84</sup> For equal balls, Voronoi S-channel is apparently a straight line, and for different balls nonclosed channel is a hyperbole, and a closed one is an ellipse. (Parabola and circle are also possible for degenerate configurations.) Figure 2 demonstrates Voronoi S-channels and corresponding configurations of sets of three balls. Three types of configurations may be distinguished: (a) planar, with nonclosed channel; note that each of these configurations has two tangential planes; (b) nonplanar, with closed channel, without a tangential plane, and finally, (c) configurations without S-channel.

It is worth mentioning that in 2D, when the Voronoi S-channel is determined by two disks, S-channels exist for any pair of disk. Besides, in 2D S-channels may be only nonclosed. This determines the significant difference between additively-weighted Voronoi diagrams in 2D and 3D. C2. Voronoi S-channel is symmetrical in relation to the central plane for the given set of three balls. This useful property of the S-channel reflects the symmetry of any set of three balls in relation to its central plane, i.e., the plane passing through the centers of these spheres (Fig. 2).

It is convenient to define radius of Voronoi S-channel. It is determined at each point of the channel and is equal to the distance from this point to the surfaces of the balls. In other words, it is the radius of a sphere with the center at this point tangent to the set of three balls. The minimal value of this radius determines the bottleneck on S-channel. The following property is important for applications of the method, since it determines the location of the bottleneck in the channel.



**Figure 2.** Different types of configurations of sets of three balls and corresponding Voronoi S-channels. (a) Planar set of three balls (one that may be placed on a plane) has a nonclosed channel. (b) Nonplanar set of three balls with a closed channel. (c) Configuration without channels. Voronoi S-channel is always symmetrical in relation to the central plane of the set of three balls. [Color figure can be viewed in the online issue, which is available at www.interscience. wiley.com.]

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**Figure 3.** Four Voronoi S-channels intersect in each Voronoi S-vertex (left), three ones for 2D case (right). [Color figure can be viewed in the online issue, which is available at www. interscience.wiley.com.]

C3. Bottleneck on the Voronoi S-channel is realized at the point of its intersection with the central plane of the given set of three balls. If S-channel is nonclosed, it intersects the central plane only in one point, where bottleneck is realized. We shall call this point the beginning point (beginning) of Voronoi S-channel. Upon moving away from this point the radius of the channel, apparently, steadily grows.

If S-channel is closed, it intersects the central plane twice. At that, the minimum value of the S-channel radius is to be realized in one point, and the maximum value in the other. We also call the first point as the beginning point (beginning), and the second as end point (end) of the Voronoi S-channel.

# Voronoi S-Vertex

It is known from elementary geometry that two nonoverlapping spheres, when touching, are tangent at one common point. It also known that four noncoplanar points in space uniquely determine a sphere. This means that a set of four balls in space specifically fixes the empty sphere tangent to all four balls in the space enclosed by the four balls. The center of this sphere is defined as Voronoi S-vertex for the given set of four spheres. For balls i, j, k, l it is denoted as  $V_{iikl}$ .

The following simple but significant property of Voronoi Svertex is utilized in the algorithm.

V1. Exactly four Voronoi S-channels intersect in each Voronoi S-vertex. Indeed, a set of four balls i, j, k, l determines four different sets of triplets of balls: i, j, k, y, i, j, l, y, i, k, l, and j, k, l, each one with its Voronoi S-channel:  $C_{ijk}$ ,  $C_{ijl}$ ,  $C_{ikl}$ , and  $C_{jkl}$ . The center of the empty sphere tangent to all the four balls has to be located simultaneously at each of these channels, and this means that all the four channels intersect in this point (see Fig. 3). It is worth mentioning that this statement is true not only for spheres, but also for any convex bodies. A convex body, for instance a cylinder or an ellipse, just like a sphere, has only one point of contact with the empty sphere. That is why in this case, too, a set of four bodies determines the tangent sphere, and therefore, the four Voronoi S-channels converging in its center.

Nontrivial feature for balls of different size is the fact that a set of four balls can have one or two Voronoi S-vertices, or not have them at all. There exist three principally different types of configurations of sets of fours balls. They are determined by the number of empty spheres that can be tangent to the balls of the given set of four (see Fig. 4). Configurations of the first type (one inscribed sphere, one Voronoi S-vertex) will be denoted as singlet. These are the most probable configurations which can be realized in space (see Fig. 4a). Note that in case of equal balls all the sets of four ones are of this type.

An example of a configuration with two inscribed empty spheres would be the location of a relatively small ball between a triplet of large balls (see Fig. 4b). Such quadruplet of balls is



**Figure 4.** Different types of configurations of four balls in 3D (left) and three disks in 2D (right). (a) Singlet set: one inscribed sphere; (b) Double set: two inscribed spheres; (c) Nonsimpliciable: no inscribed spheres. [Color figure can be viewed in the online issue, which is available at www.interscience.wiley.com.]



**Figure 5.** 2D illustration of Voronoi S-region: closed region around a central disk (solid line). Dotted line depicts Voronoi polyhedron built for the centers of the spheres.

denoted as doublet, and the corresponding pair of Voronoi Svertices as doublet vertices. Occurrence of such configurations is not fatal for the method application. Both doublet S-vertices may be considered as equivalent. Such configurations occur quite often in the models of molecular systems. Configurations of the third type (see Fig. 4c) are obtained when relatively small balls "hide" from each other at different sides of the big one. We refer to such configurations as nonsimpliciable (not resulting in Delaunay S-simplex; see later).

# Voronoi–Delaunay S-Tessellation (Voronoi Additive-Weighted Diagram)

Having considered geometry for two, three, and four balls, we now move on to the system of many balls.

# Voronoi S-Region

Voronoi additively-weighted or S-region for a system of balls is a region of space whose points are closer to the surface of a given ball than to the surfaces of other balls of this system. The faces of the Voronoi S-region are represented by pieces of Voronoi hyperboloids, the edges are segments of Voronoi S-channels, and the vertices are Voronoi S-vertices of the quadruplets of balls whose S-regions meet in this vertex (see Fig. 5).

Voronoi S-region is a generalization of the Voronoi polyhedron known for a system of discrete points. For systems of balls of equal size they identically coincide. However, in a general case of different balls, the faces and edges of the S-region are curves; moreover, some topological properties may differ from the properties of the classical polyhedrons: specifically, there are dihedrons (two faces without vertex), trihedrons (two vertices with three diangular faces), as well as, in theory, there may exist arbitrarily complex formations combining all the above-mentioned characteristics; see for instance, refs. 64 and 80. Study of Voronoi S-regions presents a separate topic of research. In this paper we focus on another aspect of the problem.

#### Voronoi S-Tessellation

Voronoi S-regions generated for all the balls of the system cover space without gaps or overlapping, resulting in the partition (tessellation) of space. In analogy with the classic Voronoi tessellation, four Voronoi S-regions converge in each vertex, and three at each common edge. For a system of balls this construction is the known in mathematics additively-weighted partition, which is determined for a system of distance  $r_i$  between a point in space and the center *i* with  $r_i^{aw} = r_i + W_i$ , that is a constant value  $W_i$ , individual for each center of the system. Additiveweighted partition will coincide with S-tessellation if the value of the radius of the ball is taken as  $R_i = -W_i$ .

#### **Delaunay S-Simplex**

In analogy with the classic Voronoi tessellation, a dual partition occurs here too. In this case a simplicial quadruplet of balls is determined by the Voronoi S-regions, sharing a common vertex. Centers of these balls are vertices of Delaunay S-simplex. Empty space between the balls is occupied by an inscribed (interstitial) sphere. This sphere is an important characteristic of the S-simplex.

It should be emphasized that Delaunay S-simplex is a tetrahedron with flat faces. They differ from classic Delaunay simplexes only in that they may correspond to different balls of the system (see Fig. 6).

Note that M. I. Karavelas,<sup>71</sup> working in a 2D space, defines a dual element of Voronoi S- tessellation somewhat differently. Its vertices are chosen in the same way; however, the edges are curves. Such elements realize partition of a system of disks without gaps or overlapping. However, a simplex with flat faces is more convenient for physical application regardless of some difficulties with the partition (see below).

# Delaunay S-Covering

The sum total of all Delaunay S-simplexes constructed for a given system of balls forms a mosaic covering the entire space. In this aspect S-simplexes are similar to classic Delaunay simplexes. A difference between them is that in some cases Delaunay S-simplexes can overlap. This happens, in particular, due to the existence of doublet quadruplets of spheres; that is close



**Figure 6.** Partition of configurations shown in Figure 5 into Delaunay S-simplexes (left) and classic Delaunay simplexes (right). They may be determined by different atoms.

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**Figure 7.** 2D illustration of superimposing Delaunay S-simplexes. The simplex formed by disks 2, 3, and 4, is located inside the simplex formed by disks 1, 2, and 3.

proximity of small balls to big ones (see Fig. 7). It should be emphasized that S-simplexes may superimpose, but there are no gaps between them. So, one can say that they form a covering of space, but not a tessellation in the strict mathematical sense. In a previous work<sup>71</sup> this issue is resolved in 2D; however, for 3D space this question has not yet been researched in detail.

The fact that S-simplexes may superimpose should be taken into consideration in applications while calculating the volume of the void as the sum of empty volumes of Delaunay S-simplexes. Our experience shows that superimposing simplexes do occur in the models of molecular systems, but it happens rarely. The error in the calculation of the volume of system as the sum of volumes of all Delaunay S-simplexes amounts to tenths of percent.<sup>23</sup> If superimposing S-simplexes are essential for a problem, it is not difficult to establish all of them; for instance, by marking them while plotting Voronoi S-network.

#### Voronoi S-Network

Voronoi S-network is a grid of vertices and edges of Voronoi Sregions. It is depicted by solid lines in Figure 5. Voronoi S-network fully determines the entire Voronoi-Delaunay S-tessellation of the system and is a convenient way of presenting geometric data for solving physical problems. In the course of working with networks, the words "site" and "bond" are typically used instead of "vertex" and "edge." Thus, each vertex of Voronoi S-tessellation is a site of the Voronoi S-network, and each edge is a bond.

#### General Properties of Voronoi S-Network

The following are the properties of Voronoi S-network that are explicitly or implicitly used in our algorithm.

N1. Each site of Voronoi S-network is a center of an interstitial sphere determining Delaunay S-simplex in the given system of balls. This statement allows to connect a Delaunay S-simplex (quadruplet of atoms) to a single point (site of the Voronoi network). Because of this, any task of studying spatial distribution of the simplicial quadruplets of atoms can be converted to studying clusters of sites on the network (site-percolation problem).<sup>88,89</sup>

N2. Exactly four bonds converge in each site of Voronoi S-network. This statement follows from the property V1 of Voronoi S-



**Figure 8.** Binomial cycles in Voronoi S-network (right). Configurations of balls resulting in such cycles (left): a small ball in the narrow channel between a triplet of large balls and two small balls between a pair of large ones. [Color figure can be viewed in the online issue, which is available at www.interscience.wiley.com.]

vertex (see earlier). It means that any Voronoi S-network (as simply connected as well as unconnected) has the power of all vertices equal to four in complete analogy with the classic Voronoi network. It is worth mentioning that Voronoi S-network for system of any nonspherical convex bodies has the same feature.<sup>58,64</sup> It should be remembered that we deal with nondegenerate systems.

N3. Each bond of the Voronoi S-network is a fairway on the way between the neighboring sites. This statement reflects the fact that each bond of Voronoi S-network is a segment of the Voronoi S-channel. This property guaranties that the most "passable" ways between the atoms are realized only along the bonds of the Voronoi S-network.<sup>62,63,82</sup>

#### Peculiarities of Voronoi S-Network

First of all, we recall that bonds of the S-network are segments of curves as distinct from classic Voronoi network where they are segments of straight lines. However, this fact does not play a major role in many applications. In particular, for interatomic space analysis it can be suffice to know the radius of the bottleneck at the bond, while the functional type of the representing segment of curve is not that important.<sup>62,90</sup>

A more significant fact is that the topology of S-network may differ from the topology of the classic one (see Fig. 8). It can have binomial cycles not possible in classic case. Such cycles are manifestations of Voronoi doublet S-vertices (see above). We shall call them doublet sites. This, however, does not result in crucial complication of the network. Doublet sites have the same characteristic as ordinary singlet sites. Each of them is the center



Figure 9. An example of the simplest unconnected fragment at Voronoi S-network. A small ball in a narrow gap between a pair of large balls represents a ring without sites. [Color figure can be viewed in the online issue, which is available at www.interscience.wiley.com.]

of its interstitial sphere, and four bonds of the network converge in each of them. The only peculiarity lies in the fact that the same quadruple of spheres corresponds to both of them.

An unpleasant characteristic of Voronoi S-network is that, in general case, it can be unconnected, that is, it can consist of separate fragments not connected with bonds to each other. Disconnectedness occurs when one (or many) small ball happens to be located between a pair of big balls (see Fig. 9). It is worth noting that this happens only in a 3D case; Voronoi S-network is always simply connected on the plane.

Our algorithm calculates only the simply connected part of the network (see later). However, it can be used to find all the isolated parts of the network. To determine whether the S-network is simply connected, it is sufficient to check whether, after it has been plotted, any "unused" balls of the system  $\{A\}$ remain, but did not take part in the construction of the network. If all the balls of the system took part in the construction of the network, the S-network is simply connected and fully represents the Voronoi-Delaunay S-tessellation of the system. If a sub-system of unutilized spheres was left, we can apply our algorithm to this sub-system, and plot an S-network for it, and so on. If the sub-system consists of one ball, as demonstrated in Figure 9, the isolated fragment of S-network would be a ring without vertices (closed Voronoi S-channel in its entirety). Our algorithm does not find such trivial rings, since it uses essentially the sites of the network.

#### Voronoi S-Network Representation Method

For the purposes of calculations and effective usage it is convenient to represent Voronoi S-network as follows (see Fig. 10).

Coordinates of the sites of the network are recorded in an array

The order of listing of sites in this array determines the numbering of the sites. The total number of sites nD is unknown in advance. It depends both on the number of balls in the system and on their arrangement, and it is usually six to eight times larger than the number of spheres in the system nA.<sup>64</sup> The exact meaning of nD may be determined only after the calculation of the entire network.

An integer array is required for recording the connectivity of the network sites

It represents a connectivity matrix of the sites. The numbers of sites adjacent to a site *j* are recorded in the *j*th column of this array. In other words, if bonds from a site *j* extend to sites *j*1, *j*2, *j*3, *j*4, then DD(1,j) = j1, DD(2,j) = j2, DD(3,j) = j3, DD(4,j) = j4. Note that array DD(.) is symmetrical, that is, columns numbered *j*1, *j*2, *j*3, *j*4 will necessarily contain number *j*, denoting the connection of these sites with site number *j*. Control over such symmetry serves a test of the correctness of the calculation of the network.

An integer array is required for recording the number of balls determining Delaunay S-simplexes. For every site we should record numbers of four corresponding balls

DA(1:4, 1:nD).



Figure 10. Illustration of the structure of recording in arrays *DD* and *DA* for a 2D system of disks (see text).

It represents an incidence matrix for the sites and balls of a system. The indexes of balls incident to the *j* site of the network are recorded in the *j*th column of the array. Thus, if site *j* is a Voronoi S-vertex for balls number A1, A2, A3, A4, then DA(1,j) = A1, DA(2,j) = A2, DA(3,j) = A3, DA(4,j) = A4.

The radii of interstitial spheres are computed in the process of algorithm application and are recorded in an array

At the calculation of the network it is convenient to calculate straight away the values of bottlenecks of the bonds, and to record them in an array

It has the structure similar to array DD(,), that is, the radii of bottlenecks corresponding to the bonds originating from the *j* site of the network are recorded in *j*th column.

#### **Algorithm Scheme**

Our algorithm realizes the simple idea of sequential determination of the sites of Voronoi S-network. First, based on certain considerations, the first site of the network is determined. Then neighboring sites are located, and so on, step-by-step, neighboring sites join the established ones. The procedure continues until all neighbors are determined for each site.

For simply connected network such sequential determination of sites will inevitably result in the determination of all the sites of the network. However, as discussed above, there are systems of spheres where Voronoi S-network is not simply connected (see Peculiarities of Voronoi S-Network). In this case, evidently, our algorithm will generate that simply connected piece of the Voronoi S-network, to which the starting site of the network belonged.

Figure 11 demonstrates the scheme of the algorithm indicating the main stages of the calculation. The first nontrivial step of the work is the determination of the starting site of the network; it is convenient to distinguish it in a separate block (BLOCK1). After the determination of the starting site, the rest of the work can be compactly combined in one block (BLOCK2), where for each of the newly determined site (cycle in sites), all the bonds, originating in this site are examined (cycle in bonds), and for each such bond (Voronoi S-channels) a new site is found by sorting the atoms of the system (cycle in atoms). The bulk of the computational effort of the algorithm is the determination of Voronoi Svertexes, that is, the finding of an inscribed sphere between a random quadruple of balls. This is realized as a separate subroutine SPHERE (see later). For the determination of Voronoi S-channel the CIRCLE procedure is used, which finds the circle tangent to the three balls and located in the central plane of these balls.

# Key Steps of the Algorithm

#### **Procedure SPHERE**

Procedure SPHERE finds an inscribed sphere (spheres) between a random quadruple of different-sized balls, that is, it solves the Apollonian problem in a 3D space. The answer is obtained



Figure 11. The scheme of the Voronoi S-network generation.

through solving a system of equations

$$(x - x_i)^2 + (y - y_i)^2 + (z - z_i)^2 = (R + R_i)^2, \quad i = 1, 2, 3, 4$$
 (1)

where  $x_i$ ,  $y_i$ ,  $z_i$ , and  $R_i$  are the coordinates of the centers and radii for a given quadruple of balls, and x,y,z and R are coordinates of the center and radius of the sought inscribed sphere. This system is solved in an explicit form. Subtracting, for instance, the first equation from the rest, we can obtain a system of linear equations for three variables. By solving it, we express these variables through the fourth one. As a result, the coordinates of the center of the sought sphere may be represented as follows

$$x = \frac{A_1R + B_1}{Det}, \ y = \frac{A_2R + B_2}{Det}, \ z = \frac{A_3R + B_3}{Det},$$
(2)

Here variables  $A_i$ ,  $B_i$  (i = 1,2,3), and *Det* depend only on the coordinates and radii of the original quadruple of balls. By substituting these expressions into the first equation we get a square expression for R, the solution of which is represented by the following formula

$$R = \frac{-G \pm \sqrt{G^2 - EF}}{E},\tag{3}$$

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where variables G, F, and E also depend only on the original quadruple of spheres. By substituting the determined value of R in formulas (2), we find the required coordinates of the center.

Expression (3), depending on the configuration of the spheres, gives one, two, or none real solutions for R. This result serves as an analytical confirmation of the existence of three types of configurations of quadruples of balls shown in Figure 4. For our problem, evidently, only positive values of R make sense. Negative values of R determine a sphere circumscribed about a quadruple of balls, while complex values mean that it is impossible to inscribe a sphere between this quadruple of balls. In spite of eq. (1) being a task of elementary geometry, we do not know general geometrical books where it was examined. For details of the solution of system (1) and ways of improving the accuracy of the solution refer to refs. 64 and 69.

### **Procedure CIRCLE**

Procedure CIRCLE for a triple of random balls finds a circle (sphere) inscribed between them and located in the central plane of these three balls. To do this, the following system of equation is solved

$$(x - x_i)^2 + (y - y_i)^2 + (z - z_i)^2 = (R + R_i)^2, \quad i = 1, 2, 3$$
  
$$P_1 x + P_2 y + P_3 z = P_0. \tag{4}$$

Here too,  $x_i$ ,  $y_i$ ,  $z_i$ , and  $R_i$  are the coordinates of the centers of balls and radii of the given quadruple of balls, and x, y, z and Rare the coordinates of the center and the radius of the sought circle. The latter equation is the equation of the central plane, where all the coefficients  $P_k$  (k = 0,1,2,3) are expressed by the usual way through the coordinates of the centers of the given triple of balls. System (4) is solved in an explicit form similarly to system (1), whereby the required coordinates of the center of the circle and its radius are defined by formulas similar to (2) and (3). As a result, for the radius of the sought circle also one, two, or none solutions are possible, depending on the specific values of the coordinates and radii of the balls. Unique solution means that the given set of three balls has Voronoi S-channel that intersects the central plane once (nonclosed channel). The point obtained (x, y, z) is the beginning point of the S-channel, and variable R determines its bottleneck radius (see Preliminary Remarks). The existence of two positive solutions for the radius of the sought circle means that S-channel is closed. The center of the circle of smaller radius  $R_1$  represents the beginning point of this channel and determines the bottleneck at this channel. The center of the larger circle determines the ending point of the channel. Corresponding value of radius  $R_2$  is the maximum value of radius for this S-channel. Absence of positive solutions for R signifies that the given set of three spheres does not have the Voronoi S-channel. Possible types of triples of balls and corresponding channels are shown in Figure 2.

# Determination of the First Site of Voronoi S-Network: BLOCK1

The first (starting) site for the generation of the Voronoi S-network can be any one of its sites. For simplicity, we choose this site closer to the center of the system (away from borders) and make sure that it is not doublet. All this can be easily done by the selection of the starting ball in the procedure of searching for the first site.

Thus, the first site of Voronoi S-network is determined as follows:

- 1. We choose in the system  $\{A\}$  a ball *i*.
- 2. Sorting through all the other balls of the system, we find among them ball *j*, such that the distance between the surfaces of balls *i* and *j* were minimal among all the distances between the ball *i* and any other ball of the system.
- 3. Sorting through the remaining balls, we find among them a ball *k*, such that the radius of the Voronoi S-channel bottleneck for the triple *i*, *j*, *k* were minimal. Procedure CIRCLE is utilized for the solution of this problem.
- 4. Sorting through the remaining balls we find among them a ball *l*, such that the sphere inscribed between balls *i*, *j*, *k*, *l* had a minimum radius. Procedure SPHERE is utilized here.

The quadruple of balls found in this way i, j, k, l forms a Delaunay S-simplex for system  $\{A\}$ , and the center of the found sphere is the sought site of the Voronoi S-network. The proof of correctness of such a method of finding the first site of the S-network may be presented similarly to the way it had been done for the calculation of the classic Voronoi network.<sup>64</sup>

After the determination of the first site we can write its coordinates x,y,z into array D, numbers of balls i,j,k,l incident to this site, into array DA, and radius ri of the determined inscribed sphere into Ri. Symbolically it can be represented as follows:

$$D(*, 1) = (x, y, z)$$
  
 $DA(*, 1) = (i, j, k, l)$   
 $Ri(1) = ri.$ 

#### Determination of the New Sites: BLOCK2

#### Calculation of a New Site

After the first site is determined, we can proceed to the determination of the remaining sites of the network. Thus, let us assume that we know a site  $V_{ijkl}$ , with corresponding balls i, j, k, l. Four Voronoi S-channels originate from this site:  $C_{ijk}$ ,  $C_{ijl}$ ,  $C_{ikl}$ , and  $C_{jkl}$ . Let us assume, for instance, that the neighboring site has not yet been determined at channel  $C_{ijk}$ . Our task is to find this neighboring site, that is to select a ball m, which, together with balls i,j,k has an empty inscribed sphere.

To find the neighboring site it is convenient to use the consideration that this site is the Voronoi S-vertex which is closest to a given original site. Thus, we have to find such ball m of the system {A}, which, together with balls i, j, k produces S-vertex  $V_{ijkm}$  closest to the starting site  $V_{ijkl}$ . It must be emphasized that all the Voronoi S-vertices, in which the triple of balls i, j, k, participates, are located at S-channel  $C_{ijk}$ , and the distance to these vertices from the starting site has to be measured along this channel. In other words, a ball m is the required one if there are no other Voronoi S-vertices between  $V_{ijkl}$  and  $V_{ijkm}$  at the Voronoi S-channel  $C_{ijk}$ . Figure 12 demonstrates the aforesaid for a 2D.



**Figure 12.** 2D illustration of determining a new S-network site at a given Voronoi S-channel. Let a known site  $V_{ijk}$  have a S-channel *Cij*. Points *m*, *n*, *q* at this channel are Voronoi S-vertices for disks *i*, *j* with the disks *m*, *n*, *q*, correspondingly. Vertex *m*, closest to the starting site  $V_{ijk}$ , determines the neighboring network site  $V_{ijm}$ . The inscribed circle for disks *i*, *j*, *m* is empty. [Color figure can be viewed in the online issue, which is available at www.interscience.wiley.com.]

Coordinates x, y, z of the new network site are recorded in array D. Simultaneously, numbers of balls i, j, k, m incident to the site (they determine new Delaunay S-simplex) are recorded in array DA. Finding of a new site determines a new bond of Voronoi network, which is recorded in array DD. To do that, in the column, corresponding to the ordinal number of site  $V_{ijkl}$ , the index of the determined site  $V_{ijkm}$  is recorded, and in the column corresponding to the index  $V_{ijkm}$  the ordinal number of the starting site  $V_{ijkl}$  is recorded. The radius ri of the new interstitial sphere is recorded in array Ri, and the radius of the bottleneck rb on the way from one site to the other—in array Rb. To illustrate the above, the sample of data recording after the determination of the second site of the network is shown.

$$D(*,2) = (x, y, z)$$
  

$$DA(*,2) = (i,j,k,m)$$
  

$$DD(1,1) = 2$$
  

$$DD(1,2) = 1$$
  

$$Ri(2) = ri$$
  

$$Rb(1,1) = rb$$
  

$$Rb(1,2) = rb.$$

The radius of the bottleneck is recorded twice; however, these expenses are justified by the convenience of the subsequent work with array Rb.

#### Verification of the Calculated Site

In our algorithm the sequence of the determination of the network sites is not controlled in any way, that is why it is necessary each time to check if the found site is really new, or if it had been established before. Indeed, one and the same site may be calculated several times (four in the worst case scenario), since it may be found through any of the four Voronoi channels entering it. We can compare the new site with the known sites based on the coincidence of coordinates. However, to increase the reliability of the algorithm, we identify the sites by integers: by four numbers of balls it corresponds to, and the fifth integer, necessary to distinguish between doublet sites corresponding to the same quadruple of atoms. For singlet sites it equals 0, and for doublet: 1 and 2.

Thus, if the newly found site already exists under number nd\_old, this means that a new bond of the network is determined, between sites nd\_old and nd\_current, starting from which we were searching for a new site. This is recorded as follows:

 $DD(ni, nd\_current) = nd\_old$  $DD(nj, nd\_old) = nd\_current$ Rb(ni, current) = rb $Rb(nj, nd\_old) = rb.$ 

Here indices ni and nj may have values from 1 to 4 and denote the ordinal number of the bond determined at this site, and rb is the radius of the bottleneck at this bond.

If the determined site is new, and its ordinal number turned out to be equal to nd\_new, then the recording in the arrays looks like this.

 $D(*, nd_new) = (x, y, z)$   $DA(*, nd_new) = (i, j, k, m)$   $DD(l, nd_new) = nd_current$   $DD(ni, nd_current) = nd_new$   $Ri(nd_new) = ri$   $Rb(l, nd_new) = rb$   $Rb(ni, nd_current) = rb.$ 

Here x, y, z and i, j, k, m are the coordinates and numbers of balls for the determined site, ni is a number of bond at site nd\_current where we were looking for the site, and ri is a radius of the interstitial sphere of this site. It is worth mentioning that for site nd\_new the determined bond is the first, and so it has the ordinal number 1 in array *DD*.

# **Computational Peculiarities of the Algorithm**

Let us consider the main computational details of the algorithm, important for its realization, and distinguishing the computation of the Voronoi S-network from the classic case.

# Measurement of Distance Between the Sites along Voronoi S-Channel

Computation of a distance between two points along a curve is not a simple task. However, in this case we do not need to know the concrete value of the distance; our goal is to choose the minimal one. For this reason we suggest, instead the length of a segment of the curve, calculating a simple measure of the length of the segment. In case of convex curves, this task is solved easily: a segment of a curve may be approximated either by one segment of a straight line, or by a broken line.

In the case of a nonclosed Voronoi S-channel (Fig. 13) the problem is easily solved. If the distance is to be measured between the points that are located at one side of the central plane (Fig. 13 (left)) then it would suffice to use a usual Cartesian measurement



**Figure 13.** Estimation of the length of a segment on a nonclosed Voronoi S-channel. Point  $v_l$  is a known site of the network, points  $v_n$  and  $v_m$  are Voronoi S-vertices, from among which the one closest to site  $v_l$  has to be selected. In case when a segment of the channel is located entirely at one side of the central plane, to estimate the distance it is sufficient to use the segment of the straight line, connecting these points (left). If the points are located at both sides of the central plane, then it is necessary to use two linear segments passing through the beginning point of the channel (right). This allows to avoid a situation shown by a dotted line, where the distance  $v_l v_n$  along the strait line is shorter than  $v_l v_m$ , while along the channel point  $v_m$  is closer to  $v_l$ , than  $v_n$ . Point *b* marks the beginning point of the channel.

as a distance between them, that is, the measurement can be done along a straight line. This is evident, since a nonclosed channel is a hyperbole: a flat convex curve. If the points are located at different sides of the central plane, then, to avoid a situation shown with a dotted line in Figure 13 (right), we should use, as a measure of distance along the channel, two linear segments passing through the beginning point of channel b.

To estimate the distance at a closed Voronoi S-channel it is also possible to use linear segment. However, here it is necessary to take into consideration all the existing possibilities of reciprocal location of the sites in relation to the central plane (see Fig. 14). (In our experience all of them are realized in molecular



**Figure 14.** Estimation of the length of a segment on closed Voronoi S-channel. Point  $v_l$  is the known site of the network, points  $v_q$ ,  $v_n$ , and  $v_m$  are Voronoi S-vertices, from among these the closest to site  $v_l$  should be selected. The arrow shows the direction along which to measure the distance (correct direction). In case when both points are located to the same side of the central plane, and the distance has to be selected in the direction indicated by the arrow, it is sufficient to use the linear segment ( $v_l v_m$ ) to estimate the distance. If points are located at different sides of the central plane (point  $v_n$ ), then two linear segments ( $v_l e$ ) and ( $e v_n$ ) should be used. If the points are located at one side, but in wrong direction, (point  $v_q$ ), then the sum of three segments: ( $v_l e$ ), and ( $b v_q$ ) should be used. Points b and e mark the beginning and the end points of the channel.

systems.) First, the original and the sought sites may be either on one, or on different sides of the central plane. Second, for a closed channel the direction along which the distance is calculated is significant (see below). Thus, for instance, in Figure 14 points  $v_q$  and  $v_m$  are located to the same side of the central plane as the initial point  $v_i$ ; however, the distance along the channel to point  $v_m$  is estimated by one segment, and to point  $v_a$  by three.

The alternative estimate of the distance along the closed channel is the measurement of the angle between the rays passing through the points under study (Fig. 15). As a vertex of the angle we can choose, for instance, the symmetry center of this S-channel. The distance along the channel from initial point  $v_l$  to any other point is symbate to the value of the angle between corresponding rays. The correctness of this method of distance estimation is evident, since we know that a closed Voronoi S-channel is a flat convex curve (an ellipse).

#### Determination of the Correct Direction at Voronoi S-Channel

There are two opposite directions from the site on the Voronoi Schannel along the channel. The question then arises: in what



**Figure 15.** Estimation of the distance between Voronoi vertices at closed Voronoi S-channel by measuring the angle between rays originating in the center of the channel (see comments to Figure 14).



**Figure 16.** Determination of the correct direction at Voronoi S-channel, 2D illustration. Point  $V_{ijk}$  is the Voronoi S-vertex for the triple of disks *i*, *j*, *k* (left). In the correct direction (indicated by an arrow), the empty sphere may move along the channel, while maintaining contact with the disks, forming this channel. This movement is impossible in the opposite direction, since the sphere will immediately overlap with the third disk: shown with a dotted circle for channel  $C_{ij}$  (right).

direction should a new site of the network be sought? The difference between the correct and wrong direction of search for a new site lies in the fact that in one direction the shift of an empty sphere along Voronoi S-channel is possible (while maintaining its contact with the triple of balls of this channel), and in another it is not. In this latter case we will immediately run into the fourth ball determining this site of Voronoi network (Fig. 16).

The following actions may be followed in order to find the correct direction along Voronoi S-channel  $C_{ijk}$  from the given site  $V_{ijkl}$  determined by balls i, j, k, l. Let us draw a vector  $t_{ijk}$  tangent to S-channel in the point of location of this site. It is directed along the channel and can be pointed in one of two possible directions. Let us draw vector l directed from this site to the fourth ball (l, in this example). If the scalar product of these vectors  $(t_{ijk}*l) < 0$ , then vector  $t_{ijk}$  specifies the correct direction at the channel; otherwise a new site should be sought in the opposite direction.

#### Calculation of the Radius of the Bottleneck

The method of calculating the radius of the bottleneck at the bond of the Voronoi S-network depends on the location of this bond on



Figure 17. Location of the bottleneck (indicated by arrows) at a Voronoi S-network bond (bold segment) located on nonclosed Voronoi S-channel: beginning point b of the channel belongs to the bond (left), and it is outside of the bond (right).

the Voronoi S-channel. For this reason, it is convenient to calculate the radius of the bottleneck in the process of the network generation, while we "remember" the necessary information.

The problem is solved easily for the case when the bond is a segment of nonclosed Voronoi S-channel (Fig. 17). If the sites of this bond are located at both sides of the central plane of the channel, that is, the beginning point is located at the bond, then the most narrow point of the bond is determined by the bottle-neck of this channel (see Fig. 17 (left)). If both sites of this bond are located to one side of the central plane (see Fig. 17 (right)), then the bottleneck is realized at the site which is closer to the beginning of this S-channel. For more detail see Preliminary Remarks.

For closed channel, similarly, the location of bottleneck is determined by the fact whether or not the beginning of the channel (point b) belongs to this bond (Fig. 18). If the beginning belongs to the bond (Fig. 18 (right)), then the bottleneck at the bond is determined by the bottleneck of the channel; otherwise the bottleneck of the bond is located at the site which is closest to the beginning of the channel (Fig. 18 (left)).

# Increasing Algorithm Efficiency to Work with Large Systems

The efficiency of the program realizing our algorithm is estimated as O(nA), that is, the time of calculating Voronoi S-network for system {*A*} containing *nA* atoms grows linearly with the number of atoms. Experimental time of network calculation for different systems is shown in Figure 19, taken from a paper,<sup>86</sup> where the program, realizing our algorithm, was tested on models of molecular systems and packings of spheres.

The initial configurations, which served as basis for large models, were generated using Monte Carlo method, and contained about 10,000 atoms in a box with periodic boundary conditions. The increase of model size was attained by translating the initial configuration in accordance to the periodic boundary conditions. Time spent on reading the initial data (arrays A, Ra)



**Figure 18.** Location of the bottleneck (indicated by arrows) at a Voronoi S-network bond located on closed Voronoi S-channel. Points *b* and *e* mark the beginning and the ending points at the channel.

and saving results to the disk (arrays *D*, *DD*, *DA*, *Ri*, *Rb*) was not taken into consideration. The work with monodisperse packings requires somewhat less time than with polydisperse and molecular systems. However, in every case the time of calculations grows linearly with the increase in the number of atoms in the model (Fig. 19).

In our algorithm the calculation of one site of the network is proportional to the number of atoms *na* to be sorted through in order to find the site. In this spot our algorithm realizes the approach suggested in refs. 73 and 74 which states that, in order to determine the vertex of Voronoi polyhedron it is sufficient to sort through the atoms from the given environment once. Such approach realizes the best efficiency for the calculation of one site. (Notably, in theory special configurations are possible where the calculation of one site of the network will require time  $O(na^2)$ ,<sup>91,92</sup> but this does not relate to our systems.) Thus, if a network contains *nD* site, then the time for calculating the entire network is estimated as  $O(nD^*(na + nd))$ . Here *na* is



**Figure 19.** The time of calculating Voronoi S-network in relation to the number of atoms in the systems for different types of structures: (1) disordered packing of spheres of equal radii, (2) polydisperse packing of spheres with radii values in the interval from 0.5 to 1.0, and (3) molecular system (lipid bilayer in water). The test calculations were performed using PC P4-1700, RAM 256. The figure is borrowed from ref. 86. [Color figure can be viewed in the online issue, which is available at www.interscience.wiley.com.]

the number of atoms to be sorted through in order to determine one site, and *nd* is the number of the known sites of the network to be sorted through in order to find out whether the determined site is new, or whether it had already been calculated before (see Verification of the Calculated Site). The value *na*, in the simplest case of sorting through all the atoms is estimated as a complete number of atoms *nA*. The value *nd*, similarly, may be estimated by a value proportionate to *nD*. But since *nD* is proportionate to the number of atoms in the system: nD = k\*nA, where *k* depends on the structure of the system and usually is located in the interval 6–8,<sup>64</sup> we may assume that *nd* is also proportionate to *nA*. Thus, without undertaking special measures, the time used by our algorithm to generate the network grows quadratically to the number of atoms in the system  $O(nA^2)$ . To achieve linear correlation, we have to optimize the sorting of atoms and network sites, and this requires additional efforts (see below).

#### Acceleration of the Atoms Sorting Procedure

The solution of the problem of speedy location of closest atoms has been long known in computer modeling.<sup>93</sup> It is based on the utilization of linked lists. A connection is established between the numbers of atoms and their coordinates. As a result, it becomes possible to read the atoms not in the order of their registration in the initial file, but to start immediately with those located close to the given point in space. In particular, working with a given site of the network we can immediately determine the atoms which are closest to this site without sorting through all the atoms of the system. This is achieved by breaking the model box into relatively small cells with ordinal numbers expressed through the coordinates of the cells. Then each cell is assigned the atoms that ended up in it. As a result, it becomes possible while calculating a site of the network, to sort through a relatively small number of atoms *na*, regardless of the size of the model.

# Acceleration of the Sites Sorting Procedure

The acceleration of sorting through the atoms does not yet provide the linear relationship with the number of atoms. It is also necessary to increase the efficiency of sorting through the sites of the network, to make value *nd* independent of the size of the model. For this too, we use the idea of linked list. However, here it is not necessary to break the model box into cells. As discussed in Verification of the Calculated Site, we identify the site not by its coordinates, but by the numbers of corresponding atoms. Making lists we can group the sites, for instance, based on the value of the sum of numbers of atoms forming these sites:  $Z_{ijkl} = i + j + k + l$ . To work with sites, it is sufficient to have two one-dimensional integer arrays: array of titles of the list  $TL(1:Z_{max})$  and array of continuation of the list CL(1:nD). Here *nD* is the expected number of the sites of the network, and  $Z_{max}$  is the maximal value for the sum of numbers of quadruple of atoms, which evidently does not exceed  $Z_{max} = 4*nA$ . (More accurately,  $Z_{max} = 4*nA - 6$ , since in one quadruple numbers do not repeat.)

Thus, let us assume that in the process of the work of the program we determined a new site with number nd\_new. To find out whether this indeed is a new site of the network, or whether it already had been determined and recorded, we will do the following:

At first we calculate the sum of numbers of atoms corresponding to this site (let us denote it as  $Z_{nd\_new}$ ).

If the value of the corresponding element of array *TL* equals zero, that is  $TL(Z_{nd\_new}) = 0$ , it means that site nd\_new is the first with the given sum of the numbers of atoms, that is, it is the new site of the network. The number of this site is recorded in the array of the titles of list:  $TL(Z_{nd\_new}) = nd\_new$ .

If a number in the title of the list turned out to be not zero, but a number nd\_one, that is  $TL(Z_{nd_new}) = nd_one$ , this means that the site with this sum of the numbers of atoms had already been determined earlier, and its number is nd\_one. To determine if these sites indeed coincide, we have to check whether the numbers of all the atoms related to these sites match, and if the atoms match we have to check additionally whether they are not doublet (see Verification of the Calculated Site).

If the sites coincide, then the determined site nd\_new is not a new site of the network, and the corresponding information regarding this site is recorded as shown in Verification of the Calculated Site, and work with arrays *TL* and *CL* in this case is stopped.

If site nd\_new does not coincide with site nd\_one, we check the value of the element of array CL numbered nd\_one. If  $CL(nd_one) = 0$ , this means that there are no more sites with such sum of atomic numbers, that is, the site nd\_new indeed is new, and has to be processed accordingly (see Verification of the Calculated Site). Besides, its number is recorded into the element of array CL with number nd\_one, that is  $CL(nd_one) = nd_new$ . If, however, element  $CL(nd_one)$  does not equal zero, that is it already has a record of site number nd\_two:  $CL(nd_one) = nd_two$ , then we have to check whether site nd\_new matches this site. If it does not, then we look for the value of element  $CL(nd_two)$ . If it is zero, we record there the number of our site nd\_new:  $CL(nd_two)$ = nd\_new. If it is not zero, then we continue checking.

This procedure continues until we encounter a site coinciding with site nd\_new, (in this case the determined site nd\_new is not a new one of the network), or until we encounter zero in the corresponding element of array *CL*, where we record number nd\_new.

Let us illustrate the above with an example. Let site number 10 have the sum of numbers of atoms equal to 100, and let us assume that there are no other sites with such sum. In this case arrays TL and CL look as follows:

_		
1	Τ.	٠
1	L	•

д.		
1	 100	 4* <i>nA</i>
0	 10	 0

CL:		
1	 10	 nD
0	 0	 0

Let site number 15 has the same sum of the numbers of atoms, however, site 15 does not match site 10. In this case array CL will look as follows (array TL stays the same):

CL:			
1	10	 15	 nD
0	15	 0	 0

Further, let site number 20 has the same sum of numbers of atoms, however, it matches neither site 10, nor site 15. In this case array CL looks as follows:

CL:				
1	10	 15	 20	 nD
0	15	 20	 0	 0

Using such lists, linking the numbers of sites, we can quickly confirm whether the determined site is really the new site of the network, or if it had been calculated previously. The number of sites *nd*, to be worked with, no longer depends on the size of the model.

Thus, after speedy sorting through both atoms and sites of the network, values na and nd no longer depend on the size of the model, and for this reason the time spent on the generation of the entire network will be  $O(nD^*(na + nd)) \sim O(nA)$ , that is, will grow in linear relation to the number of atoms in the model.

#### Conclusions

This paper presents the algorithm of generating Voronoi S-network for a system of balls (atoms) of different sizes. This network, like the classical Voronoi network, is formed by edges and vertices of Voronoi regions, and the difference lies in the fact that in the classic case the Voronoi regions are generated in relation to the centers of atoms, and in this case are in relation to the surfaces of atoms. The important feature of the Voronoi S-network is that it serves as a "navigation map" of the empty space between atoms, that is, every site (vertex) of the network, by construction, is the most distant point from the surfaces of the nearest quadruple of atoms, and each edge (bond) is a "fairway" between two neighboring sites. Due to this feature, Voronoi S-network is a very convenient instrument for the analysis of interatomic space. This algorithm opens prospects for work with a broad class of packings of polydispersed spheres, as well as with molecular systems.

Arrays of the coordinates of the centers of atoms (A) and their radii (Ra) are the initial data for the work of the algorithm. The output results of the calculation are the coordinates of sites of the S-network (D), connectivity matrix of sites (DD), and incidence matrix for the sites and atoms (DA). Additionally, for the purpose of analysis of the interatomic voids, values of radii

of interstitial spheres (empty inscribed spheres) are stored in array (Ri), and radii of the bottlenecks for each bond of the network are recorded in (Rb).

The idea of the algorithm is that, for a given known (determined) site of the network we find its neighbors, that is, new sites located at the bonds originating from this site. Thus, starting from a known site of the network, we sequentially find the whole network. The starting site is easily determined based on certain considerations.

Voronoi S-network for a system of atoms of different radii may differ significantly from its classic analog built for the centers of the same atoms. First, the bonds of the S-network are curves (they are segments of hyperbole or of ellipse). In the classic case the bonds of Voronoi network are always straight lines. Second, the topology of Voronoi S-network has its special features. In particular, "doublet" sites corresponding to the same quadruple of atoms may exist. This results in the occurrence of binomial rings at the network, which is impossible in the classic case. Nevertheless, the degree of the sites of the network always equals to four for any nondegenerate systems. For some unique systems of atoms, such, where one (or many) small sphere is contained in a narrow gap between a pair of large spheres, the Voronoi S-network may turn out to be not simply connected. We do not work with such systems, since the majority of physically interesting objects, in particular molecular systems, are not like that.

We examined the issue of increasing the efficiency of the algorithm to work with large models. Using some tricks, in particular the idea of linked lists, we managed to obtain linear relationship between the time of calculation of network and the number of atoms in a model, O(N). This algorithm was used in research papers<sup>23–25</sup> to analyze interatomic voids in the models of lipid bilayers.

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