Sole maker: towards ultra-personalised shoe design using voronoi diagrams and 3D printing

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Sole Maker: Towards Ultra-personalised Shoe Design Using Voronoi Diagrams and 3D Printing

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Abstract. In this article, we describe the design of a program that allows users to create their personal shoe soles. The program has a backend which generates different components of the sole, such as the treads, the surface, the insole pattern and the contour (where the sole will be connected to the rest of the shoe). Instead of the traditional fixed grids, we use Voronoi diagrams, which have another aesthetic appeal and which allow influencing the dynamic behavior of the sole. This program shows an example of the possibilities of digital fabrication (3D printing) for the personalization of material properties and behavior when combined with mathematical algorithms. Moreover, we highlight our approach and interesting algorithmic aspects like intersecting edges and contours, generating Voronoi diagrams, finding polygons, solving the Chinese postman problem, and solving the travelling salesman problem.

1 Background and vision

We envision future product service systems where the user has more influence on the products he or she purchases and plays a role in the programming of the material. The primary technological enablers for this change are twofold: first the advent and widespread application of digital manufacturing equipment which may gradually replace the traditional manufacturing equipment.

In traditional manufacturing, there is one expensive mold or one machine setup, or one human drill, which is prepared once and then executed many times. The efficiency of this type of manufacturing demands that there are large numbers of the same products which are produced in large batches. With digital manufacturing, one machine can produce a huge variety of designs without mold making, training or machine reconfiguration. Examples are digital printers, digital embroidery machines, CNC milling machines, and of course 3D printers. At present, traditional manufacturing can still provide better quality at lower cost, but as additive manufacturing improves quickly, the vision of the users personalizing products gains feasibility. The second technological enabler is the Internet, which allows any user to create, share and manage digital information. There are other enablers as well, such as changes in logistics chains. Web shops with online payments and fast delivery services are getting very common. Consumption is changing (users are now willing to wait days or weeks to get their products sent to them). The role of the user in programming a material is a research topic in itself, and there are subtle differences between customization and personalization. In general the difference goes from a predefined choice (customization) to an adaptive system without explicit choices from the user or made for the individual in every instance (personalization) [1]. A good example of the approach is the work by Leonie Tenthof van Noorden [2].

Algorithms have the power to generate two- and three-dimensional patterns which are carriers of considerable aesthetic and cultural value or which are tools to study or revitalize existing artworks and patterns. Examples of such efforts are documented in Leonardo [3,4], Bridges [5,6,7,8] and related publications such as [9,10,11].

In this article, we present one example of a tool which is meant to show the feasibility of the approach in one specific area: shoe design, in particular the sole. We create new software, solving a variety of technical hurdles and thus learn about shoe design, 3D printing, software, and algorithms.

2 Sole Maker

Besides the general philosophy outlined in the previous section, the central idea of this project is to use Voronoi diagrams for the grid pattern inside the sole. Nowadays there is always a pattern inside, such as a rectangular or honeycomb pattern. The purpose is to enclose air (low stiffness, soft support), and reduce weight (light walking).
Our idea is to deploy Voronoi diagrams instead of these traditional grid structures. The advantages of Voronoi diagrams are threefold:

- The diagrams have a modern aesthetic appeal which refers to nature and looks more contemporary than old-school traditional regular tessellations;
- There is not just one Voronoi diagram, but depending on the number of cells, the size of the cells, their orientation etcetera there is an infinity of possible variations.
- Depending on the directionality of the cells, the sole may be flexible in one direction at a specific place and support another type of flexion elsewhere. Also the stiffness (spring-like behaviour) can thus be influenced. Well-chosen diagrams can contribute to the structural integrity of the shoe (further testing is required);

The use of a Voronoi diagram in a shoe is not new, for example Nike used it in the Nike Free collection of running shoes (but not end-user programmable).

A good way to generate a Voronoi diagram is choosing the seed points first and then run an algorithm to produce the mesh. In an earlier project [3] we used a parameterized formula so we could morph from one grid type (rectangular) to another grid type (honeycomb), but here we decided to give maximal choice to the user. The main idea is simple: let the user choose the contour of the sole and then choose seed points. For Sole Maker we worked with Processing 2.0, a Java based open-source platform, which is also the main carrier for teaching programming in our department (WEB site: processing.org).

The user interface guides the user through three consecutive phases. In the first phase, the user loads a given image of a foot, an earlier contour, a regular grid, or any combination of those. This gives some orientation when defining the contour, which is done by clicking points on the contour. A screenshot made during contour definition is given below:
After transition to the second phase, the contour will be closed and the user defines the seed points for the Voronoi diagram. After each new seed point, the entire diagram is recalculated (which appears instantaneous to the user). It will be easy to add an option for re-positioning the contour points and the seed points later (recalculation of the Voronoi diagram is instantaneous – the back-end code generation involves optimisation, it could be slower). Two consecutive screenshots are shown next (Figure 3):

![Figure 3: Defining the seed points.]

As can be seen in the second screenshot of Fig. 3, the seed points need not be inside the contour, they can also be outside. The shaded area shows the treads (which will be printed first during 3D printing).

In the third phase, the back-end of Shoe Maker is activated, which produces G-code for the 3D printer. Each sole has four layers, which correspond to:

- the treads (roughly speaking, one polygon for each Voronoi cell, although the polygons are smaller than the Voronoi cells themselves),
- the surface of the sole, which is a filled version of the contour;
- the insole pattern consisting of the edges of the Voronoi diagram (and also contour edges);
- the outer contour, which is printed with considerable height, because this is where the upper part of the shoe will be connected later.

3 Sole Maker Software

The structure of the software is given by the following dataflow diagram. Each circle represents a function and each box represents a global data structure. The user interface generates events such as “key press”, “mouse click” and “stop” in Figure 4, whose callback functions put the main algorithmic functions. Roughly speaking, the data propagated from left to right.

The main data structures are arrays, for example two-dimensional arrays of of contour points and insole points (we call the seed points “insole points” even though they are allowed to be positioned outside of the contour. The first two arrays are chosen very large and there is a counter to keep track how many entries are filled-in (during the interactive phases). The other arrays have no free space, everything is packaged or repackaged so everything just fits.

The reader might guess that the polygons in Fig. 3 correspond precisely to the cells of the Voronoi diagram, but actually the situation is slightly more complicated because the edges of the Voronoi diagram would stick out of the contour. This is solved in two steps:

- First, the edges of the Voronoi diagram are intersected with the edges of the contour. Edges which are entirely outside the contour are removed (only a few exceptional lines). Edges which have both end points inside the contour are left untouched (formally this is not correct as one can have an edge with two end points
inside the contour but the edge itself will be partially outside, as the contour is not necessarily convex; in practice this hardly ever happens once there are more than a few seed points). If an edge has one end point inside the contour and one end point outside the contour, then the latter end point is replaced by the intersection point of that edge and the contour. This is called “prune Edges” in Fig. 4.

Secondly, the intersection points of the pruned edges and the contour have to be added explicitly to the contour (otherwise we cannot find proper polygons in the contour later. This is called “refine Edges” in Fig. 4.

Fig. 4: dataflow diagram of the Sole Maker software.

After these two steps there is no more difference between the edges originating from the contour (“co-Edges”) and the edges originating from the insole (“inEdges”). They are combined in “allEdges”. From here, subsequent calculations prepare for printing of the mesh. This amounts to calculating two new data tables.

The first data table to be calculated is called “cppEdges”, where CPP abbreviates Chinese Postman Problem. The problem is finding an optimal tour along all edges, where each edge is traversed at least once and with a minimal number of second or third traversals. This is a so-called Chinese postman problem and the function to prepare a tour thus is indicated as “allPrepChinese” in Figure 4. More details about that function are in the next section.

The second data table contains the tread polygons, the collection of polygons formed by the combined contour and insole edges. This called “trPolygons” in Figure 4; the polygons can be seen in Figure 3. Finally there are four phases of printing, corresponding to the four layers of the shoe sole:

- The treads (the face which will touch the ground), which are downsized and filled versions of the abovementioned tread polygons;
- The central sole layer (the closed and thin layer which comes next);
- The insole mesh (the printed edges of the polygons);
- The contour going up in tapered fashion up to 10 mm.

No external slicer is needed, the software takes care for slicing, which amounts to slicing polygons (easy, just intersect lines). In total Sole Maker now has 1431 lines of Code in Processing 2.0 (essentially Java).
4 Algorithms

There are five interesting algorithmic aspects we like to mention: (1) intersecting edges and contours, (2) generating Voronoi diagrams, (3) finding polygons, (4) solving the Chinese postman problem, and (5) solving the travelling salesman problem. We highlight our approach and interesting aspects for each of them.

4.1 Intersecting edges and contours

In the heart of Sole Maker is the task of intersecting edges (lines) and contours (closed set of connected lines), finding intersection points and to find out which points are either inside or outside the contour.

Although it is not hard to derive the formulas, we consider Paul Bourke’s geometry website helpful (paulbourke.net/geometry/pointlineplane/). The following equations are essentially obtained from that website. If we have four points \(P_1, P_2, P_3, P_4\) whose coordinates are given by \((x_1,y_1), (x_2,y_2), (x_3,y_3), (x_4,y_4)\), respectively, then we want to know whether line segments \(P_1P_2\) and \(P_3P_4\) intersect. Calculate:

\[
d = (y_4 - y_3) \times (x_2 - x_1) - (x_4 - x_3) \times (y_2 - y_1)
\]

\[
f_1 = (x_4 - x_3) \times (y_1 - y_3) - (y_4 - y_3) \times (x_1 - x_3) / d
\]

\[
f_2 = (x_2 - x_1) \times (y_1 - y_2) - (y_2 - y_1) \times (x_1 - x_2) / d
\]

then the line segments intersect if and only if \(0 < f_1 \leq 1\) and \(0 < f_2 \leq 1\). If they intersect, then the \(x\) coordinate of the intersection point is \(x_1 + f_1 \times (x_2 - x_1)\) and the \(y\) coordinate is \(y_1 + f_1 \times (y_2 - y_1)\). If we want to know whether a point intersects a contour (or polygon) we test all edges of the contour in a for loop. If we want to know whether a point \(P\) is inside or outside a contour we take an edge \(PQ\) where \(Q\) is very far away, at coordinates \(x = 0\) and \(y = 10000\) say, and then check whether \(PQ\) has an odd or even number of intersection points with the contour.

4.2 Generating Voronoi diagrams

To convert the point set into a set of polygons we used Lee Byron’s Processing Mesh library [12]. The latter library in turn is based on the QuickHull library since the problem of generating Voronoi diagrams in two dimensions can be reduced the problem of finding convex hulls in three dimensions. We have used the same Mesh library in an earlier project, Drapely-o-lightment by Marina Toeters and Loe Feijs [4]. The library is reliable and easy to use in Processing. If \(nrInPoints\) equals \(inPoints.length\) then the code is simply:

```
Voronoi myVoronoi;
myVoronoi = new Voronoi( inPoints );
inEdges = myVoronoi.getEdges();
```

4.3 Finding polygons

The initial vague assumption that the tread polygons are simply the cells of the Voronoi diagram is not generally true. Particularly near the contour, there is a mix of contour edges and Voronoi edges. So we are faced with a connected set of edges and the question is how to find the faces of the corresponding graph? This abstract problem had been discussed already on the forum /mathoverflow.net/questions/23811/ reporting-all-faces-in-a-planar-graph. The problem was refined, in the forum, by noting that it is about a planar graph together with an embedding of the graph into the plane. Therefore it is clear what clockwise and counterclockwise mean. An algorithm is described informally by Darsh Ranjan:

*I’ll assume the graph is connected, and that you have the clockwise or counterclockwise ordering of the edges around each vertex. Then it’s easy, given a directed edge \(e\), to walk around the face whose counterclockwise boundary contains \(e\). So make a list of all directed edges (i.e., two copies of each undirected edge). Pick one directed edge, walk counterclockwise around its face, and cross off all the directed edges you traverse. That’s one face. Pick a directed edge you haven’t crossed off yet and walk around its face the same way. Keep doing that until you’ve crossed off all of the edges. (Note that the “counterclockwise” boundary of the exterior unbounded face actually goes clockwise around the outside of the graph.)*
We coded the clockwise version of this in Java, which was actually slightly trickier than we thought (it is easy if you see the plane graph in front of you, but the computer is not so smart). The details are explained in Figure 5.

In step 3, after we have assembled the edge end points from \((c_x, c_y)\) perspective, we must now sort them with respect to their outgoing direction \(\arctan\) (use function \(\text{atan2}\)). For the sorting, we deploy a classical “selection sort” algorithm.

### 4.4 Solving the Chinese postman problem

In order to prevent the 3D printer to travel through areas where no printing is needed we decided that during the printing of the edges of the polygon, all jumping from one position to an arbitrary other position is to be avoided. Instead, it is much better to let all traveling happen along the edges only. Otherwise there would be ugly filament lines (just because the nozzle does not close fast enough or well enough or because surplus melted material will form a thread). Finding a tour along all edges of a connected graph which traverses each edge at least once is known as the Chinese Postman Problem (CPP). We soon realized that this is not a very simple problem.

There is large literature on the problem, but few good implementations are around. We found just one, by Harold Thimbleby [13]. In fact we first found the algorithm on sanfoundry.com, but it was not mentioned that this was the directed version of the problem (the origin was also not mentioned). Initially we were looking for an undirected version, which would be good enough for the Sole Maker. Of course the directed algorithm does not work if you assume it is undirected, so we found out after some mysterious error messages that our graph was not connected (it looked very connected though). Therefore we add each edge twice as an arc to Thimbleby’s graph, so the resulting directed graph is connected. We use that to generate a closed Chinese postman tour. The algorithm works by adding extra arcs (so travelling some directed edges more than once) in order to get a “balanced” graph (equal number of in-edges and out-edges at each node). As Thimbleby [13] explains: A standard theorem is that a graph has an Euler circuit if and only if every vertex is balanced. So the algorithm looks for a minimal number of extra arcs to get the graph balanced. As a result of all this, one traversal of all polygon edges will visit each edge twice, once in either direction. That is fine for our application. We are thankful for Harold Thimbleby’s efforts. As he puts it, the CPP is a nice case study in integrating algorithms, which interesting for being a simple problem with a complex solution.
4.5 Solving the traveling salesman problem

We tested three Java programs to solve the problem of printing all tread polygons while minimizing the extra jumps of the nozzle when moving from one tread to the next. This is a typical instance of the famous traveling salesman problem. We easily wrote a naive solution, which is called either “greedy” or “nearest neighbour”. It finds a closed tour along the gravity centers of the polygons, although not necessarily the shortest. Later we started wondering whether the tours would be too inefficient and perhaps we should write a decent algorithm which finds the optimal solution. So we coded a brute force search, trying all tours. We thus find that in typical test runs the greedy tour is between 10% and 15% longer than the optimal tour. But we also find that the brute force algorithm has high runtime for more than 14 polygons. Based on Kevin Buchin’s course notes [14], we coded a backtracking version using the well-known branch-and-bound technique, which is at least 1000 times faster. This is the algorithm as given by Buchin [14]:

**Algorithm TSP_Backtrack(A, ℓ, lengthSoFar, minCost)**

1. \( n \leftarrow \text{length}[A] \) // number of elements in the array \( A \)
2. if \( ℓ = n \)
3. \[ \text{then} \quad \text{minCost} \leftarrow \min(\text{minCost}, \text{lengthSoFar} + \text{distance}[A[n], A[1]]) \]
4. else for \( i \leftarrow ℓ + 1 \) to \( n \)
5. \[ \text{do} \quad \text{Swap } A[ℓ + 1] \text{ and } A[i] \text{ // select } A[i] \text{ as the next city} \]
6. \( \text{newLength} \leftarrow \text{lengthSoFar} + \text{distance}[A[ℓ], A[ℓ + 1]] \)
7. if \( \text{newLength} > \text{minCost} \) // this will never be a better solution
8. \( \text{then skip} \) // prune
9. else \( \text{minCost} \leftarrow \min(\text{minCost}, \text{TSP_Backtrack}(A, ℓ + 1, \text{newLength}, \text{minCost})) \)
10. \( \text{Swap } A[ℓ + 1] \text{ and } A[i] \) // undo the selection
11. return \( \text{minCost} \)

Buchin [14] only describes how to calculate tour length; we have to add an extra structure to extract the tour itself, later.

But sooner or later the problem is hopeless — as is to be expected because the travelling salesman problem is “hard” in the theoretical sense. The effect is obvious in Figure 6.

![Fig. 6: Brute force calculation of optimal path for printing tread polygons (leftmost, red) and backtracking calculation using branch and bound (rightmost, blue). Execution time is in ms on a DELL Optiplex 360 PC.](image)

The execution times of both versions are shown in Figure 6. In practice we use the “greedy” algorithm, which is good enough for the time being. In Figure 7 we show the the greedy and optimal tours for an arbitrary set of 14 tread polygon centers.
5 Results

We can print experimental shoe soles as can be seen in Fig. 8. These are in size 36 and are made on an Ultimaker machine. At present we are still improving details, such as tapered profiles for the treads and the contour. We are also building the complete shoe, which will be brought to the event.

The shoes are printed in a commercially available version of the polymer TPEs known as FilaFlex. It was chosen for its high degree of flexibly and abrasion resistance as demonstrated in Fig. 9.
6 Claims and outlook

We believe that this work is a first step toward implementing the vision of personalized shoes with the end-user contributing as a co-designer and exploiting the power of digital manufacturing.

We claim that we demonstrate the technical feasibility of the \textit{personalized + Voronoi + generative + 3D printing} approach. It is interesting that we encountered both “dual” versions of the famous graph traversal problem in the same project (Chinese postman and traveling salesman). The development of new business propositions and optimizations to reach economic feasibility is research which will take more time. Troy Nachtigall and others in TU/e explore this further in the coming years.

We also claim that it is fruitful for designers with different backgrounds to work together. In particular, the joint efforts of Troy, with his background in fashion and shoe design, and Loe, with his background in mathematics and software, is fun and gives extra creative energy. The outcome is probably much more and is achieved faster than what each of us could do alone.

Finally, we claim that projects such as [4,5,6] and the current project benefit significantly from a variety of earlier projects, open-source developments, forums and related on-line resources. This is essential. We mention Drapely-O-Lightment with Marina Toeters, Processing, Paul Bourke’s geometry website, Lee Byron’s Mesh library, the mathoverflow.net forum, Kevin Buchin’s on-line course notes, and last but not least Harold Thimbleby’s publication. Although we still have to do serious coding, most of the work is \textit{integrating technology} rather than \textit{pure invention}. Many additional new possibilities arise:

- Adjusting the foldability and the torque stiffness of the sole from physical measurements of the user’s foot and the user’s walking dynamics;
- Although we cannot be sure yet how viable the Voronoi solution is in terms of orthopedic support and performance, but we plan to test several variations. Moreover we have shown the work to a podiatrist and an orthopedist who considered it promising.
- Designing for recognizable personal footprints, which can be used for all kinds of aesthetic effects, leaving footprints in the sand or any other playground (changing forensics too).
- Applying a similar approach to the rest of the shoe.
- Still the chief designer, company or brand can have a recognizable brand identity by putting limitations on the seed points or other parameters. Beyond Voronoi diagrams, there is a rich variety of mathematical or cultural principles which can be used as a creative space the user has to work in (e.g. Lissajous curves, Heesch-Kienzle tessellations and so on).

We leave these as options for future research.

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