# Direction Fields over Point-Sampled Geometry 

Marc Alexa $\quad$ Tobias Klug $\quad$ Carsten Stoll<br>Interactive Graphics Systems Group<br>Department of Computer Science<br>Technische Universität Darmstadt<br>Fraunhoferstr. 5<br>64283 Darmstadt, Germany<br>\{alexa,tklug,cstoll\}@gris.informatik.tu-darmstadt.de


#### Abstract

We describe techniques to establish local frames over point-sampled manifold surfaces. The tangential alignment of local frames is determined using a wave front algorithm starting from a set of pre-defined directions and conquering the remaining points. The repeated application of this algorithm is a relaxation procedure that maximizes coherence along the surface and minimizes the discrepancy to user defined or surface features. The resulting direction field serves as a parameterization for subsequent processes.


## Keywords

Point-sampled geometry, surface processing, local frames, surface parameterization.

## 1. INTRODUCTION

Representing surfaces using point samples without additional topology becomes increasingly popular [Gro01]. Point-based methods seem to originate from the idea of using points as rendering primitives [LeW85, GrD98, PZ+00, RuL00, KaV01]. In addition, real-world geometry is often scanned [LP+01, RHL02] and, naturally, represented as a set of points (possibly together with other information). Consequently, surface processing methods that do not require an explicit topology are appealing (e.g. [PaG01, $\mathrm{ZP}+02$ ]) because they avoid the conversion steps to and from other representations such as meshes.

A particular problem in surface processing is to find a suitable parameterization in order to apply techniques from the Euclidean domain to surfaces (e.g., texture mapping, fairing, filtering). Lots of work has been devoted to parameterize meshes [ED+95, Tau95, ZSS97, KC+98, LS+98, GSS99, GV+00]. Generating parameterizations for point-sampled geometry seems

Permission to make digital or hard copies of all or part of this work for personal or classroom use is granted without fee provided that copies are not made or distributed for profit or commercial advantage and that copies bear this notice and the full citation on the first page. To copy otherwise, or republish, to post on servers or to redistribute to lists, requires prior specific permission and/or a fee.

## Journal of WSCG, Vol.11, No.1., ISSN 1213-6972

WSCG'2003, February 3-7, 2003, Plzen, Czech Republic. Copyright UNION Agency - Science Press
even more difficult than for meshes because of the missing neighborhood information among the points (see e.g. [PaG01, ZP+02, FC+02]).

We propose to solve the parameterization and neighborhood ambiguities in one step by computing smooth direction fields over the surface. As a primitive operation to separate tangential from normal direction (i.e. if normals are not given as part of the data) we use the tangent plane fitting technique from Levin [Lev01,AB+01]. We smooth an arbitrary initial set of directions in tangential direction using relaxation techniques. A relaxation approach allows optimizing additional measures, for example, the discrepancy with principal curvature directions.

Involving the user in the specification process allows the specification of a mapping from one surface to another. In addition, user specification of discontinuities in the direction field makes the relaxation procedure more robust, as it avoids the problem of automatically generating the necessary discontinuities on shapes different from a torus.

If the direction field is smooth it can serve as a parameterization. Around a discontinuity, it essentially provides a polar coordinate system. If discontinuities are used to specify point-to-point correspondences, the direction field may completely specify a bijective mapping.
We demonstrate the use of direction fields with some applications, i.e. generating a radial parameter domain and texture synthesis on surfaces.

## 2. RELATED WORK

The idea of this work is to use direction fields as local parameterizations of point sampled geometry. This idea has been used for texture synthesis on manifold meshes.

Praun et al. [PFH00] let the user define the local frames of a few vertices. The remaining directions are computed using an RBF scattered data interpolation approach, where distances are determined using Dijkstra's algorithm on the edge graph.
Wei and Levoy [WeL01] use a relaxation technique to generate a smooth vector field. The energy functional takes into account different types of symmetries.
Turk [Tur01] exploits a multi resolution representation of the mesh and employs a push-pull technique to interpolate sparse user information about the vector field.

Local frames for point sample geometry have been established in the context of processing operations and scale-space representations.

Pauly and Gross [PaG00] grow patches of points that allow a projection onto a planar domain. Starting from a set of seeds, points are merged if their normal cone stays bounded. The set of planar parameter domains is used to define spectral transforms on the point-sampled geometry.
Zwicker et al. $[\mathrm{ZP}+02]$ define a discrete version of the surface's gradient using k-nearest neighbors. This gradient is used to define the parametrization as an optimization problem. The solution minimizes a measure of distortion of the gradient along the surface. The local parameterizations are used for local operations on the geometry or texture mapping operations.
Fleishman et al. [FC+02] build local frames that minimize a weighted least squares problem. The union of origins of the frames form a manifold surface, while each frame locally approximates the surface. The generation process of local frames defines a subdivision operation on the point set, which is used to build a multi scale representation of the surface.

## 3. COMPUTING DIRECTION FIELDS

The goal of the following procedure is to assign each point in a set $P$ a direction that conforms with userdefined or automatically detected directions so that the discrepancy of close points is minimized. We assume that each point $p_{i}$ has a corresponding normal $n_{i}$. If the normals are not given we compute them using Levin's projection operation [Lev01].
Any point might contain information about its (initial) direction $d_{i}$. Points may be constrained or


Figure 1. Dragon model with several user defined discontinuities while calculating the directions.
unconstrained., i.e. their direction is changeable during the process, or not.
The first phase of the process assignes each point $p_{i}$ a direction $d_{i}$ using a Dijkstra-like approach. In subsequent processing steps each point has a direction.

## Specifying initial directions

The specification of initial directions can be done in different ways. In most application we expect the user to position the discontinuities like sources and sinks explicitly within the point set (see, e.g., Figure 1). A source or sink is defined by a position and a radius $r$. Any point within a sphere of radius $r$ gets a direction that points either to the center of the sphere (sink) or away (source) from it. This direction is then projected onto the tangent plane of each point.
Initial directions could be also assigned by computing surface features such as principal curvature directions.

To start our process we need to assign at least one point a direction. If no preferred directions are specified, this could be done randomly.

## Calculating initial directions

Let $I_{0} \subset P$ be the set of points with an initial direction (constrained or unconstrained) and $O_{0} \subset P$ be the set of points without information about the direction. In general, $O_{k}$ and $I_{k}$ are the sets after k iterations of the following procedure.
In each iteration we select a point $p_{j}$ from $O_{k}$, calculate a direction for this point and move it from $O_{k}$ to $I_{k}$.


Figure 2. Directions are computed for each point iteratively. The sets $O_{k}$ (grey) and $B_{k}$ (red) contain points that need to be processed. The set $I_{k}$ (green) represents points with direction information. The border $B_{k}$ is used to speed up the determination of the next point to be treated.

## Selecting the next point

The selection of the point for the next iteration is essential for the success of the algorithm and the quality of its output. It is necessary to select a point near points of $I_{k}$ so that it is possible to determine a direction for the new point based on the directional information of the points in $I_{k}$.
The easiest way to ensure a sufficient neighbourhood of directions is to select the point from $O_{k}$ that is closest to any point from $I_{k}$.
Our approach to this problem introduces another set of points $B_{k}$ - the border set (see Figure 2). It contains all points in $O_{k}$ that are near points from $I_{k}$. For each of these points a distance to the next point in $I_{k}$ is stored. We select the point with the smallest distance.
Every point in the set $I_{k}$ and $B_{k}$ contains information about the distance dist to the closest point with an initial direction. The distance dist for points in $B_{k}$ is calculated as

$$
\operatorname{dist}_{k}\left(p_{j}\right)=\min \left\{\operatorname{dist}\left(p_{i}\right)+\left\|p_{i}-p_{j}\right\| \mid p_{i} \in I_{k}\right\}(1)
$$

The distances of points from $I_{k}$ are final while those of the points in $B_{k}$ may change if we find a shorter path to that point at any given time (resembling a Dijkstra-like strategy of computing shortest paths).


Figure 3. The direction field resulting from the first pass of the algorithm starting in one, respectively two, user specified discontinuities.

In every iteration we select that point from $B_{k}$ that has the smallest dist. After adding the selected point to $I_{k}$ we find the points with maximal distance h to the point in $O_{k}$ and add them to $B_{k}$. This way the set of calculated points grows with constant speed into all directions.

## Computing the new direction

In order to calculate the new direction we define a new set $T_{k, i, h}$ containing all points in $I_{k}$ that are within a distance $h$ from $p_{j}$. In practice this set is calculated using an octree structure for storing the positions of the points. The new direction $d_{j}$ is calculated as the sum of the directions of all points in $T_{k, i, h}$ weighted using the Gaussians $w_{i}$.

$$
\begin{align*}
T_{k, i, h} & =\left\{p \in I_{k} \mid\left\|p-p_{i}\right\|<h\right\} \\
w_{i}(p) & =e^{\frac{-\left\|p_{i}-p\right\|^{2}}{h^{2}}}  \tag{2}\\
d_{k}^{\prime} & =\sum_{p_{j} \in D_{i, 2 h}} d_{j} * w_{i}\left(p_{j}\right)
\end{align*}
$$

The resulting direction is projected onto the plane defined by the normal of $p_{k}$ and then normalized:

$$
d_{k}=d_{k}^{\prime}-\left\langle d, n_{k}\right\rangle^{*} n_{k}
$$



Figure 4. Starting from a set of random directions this point set is smoothed iteratively by repeatedly averaging directions of the points.
If either the sum of directions or the projected vector results to be zero, the result needs to be dropped and the point has to be processed again later.
These steps are repeated and the direction field grows uniformly from all specified initial directions (see Figure 1) until all directions are calculated. Results are depicted in Figure 3.
The choice of $h$ is a factor for global smoothness of the directions generated. If $h$ is small only few local points will be used to calculate the new direction and thus the directional field will only be locally smooth while a big $h$ will lead to a global smoothness but has the deficit of slower processing.

## Smoothing the directions

Since it may happen that the initial generation of directions does not result in a satisfactory smooth directional field it may be necessary to perform successive relaxation passes to smooth the directions to a certain degree.

These passes are calculated like the first, with the difference that all points are already contained in $I_{k}$. Because of this, all points have enough points in their environment which already have a direction, so the order of calculation is not as important as in the first pass.
We recalculate the direction for every point using Equation (2) but limiting the calculation to points that are unconstrained. Figure 4 shows the result of this procedure starting from a random set of directions.
Filtering a directional field several times in this way can lead to much better results in prospect of smoothness, especially if the factor $h$ is increased for the passes, though even subsequent relaxation steps cannot resolve some problems arising through poorly positioned discontinuities.

## 4. APPLICATIONS

We demonstrate how to compute user-defined parameterizations for mapping one geometry to another. In addition we show how to use the coherent


Figure 5. Specifying sinks and sources allows defining polar coordinate systems, which could be used to map information from one surface to another. If the same number of discontinuities is defined, a global mapping might be defined.
directions to generate globally smooth textures on point sampled geometry.

## User-defined parameterizations

By defining the same number of sinks and sources in two models the resulting direction fields are topological equivalent (assuming the shapes have the same genus) and define a bijective mapping from surface to the other. This mapping is most easily exploited as local polar coordinate systems around sinks and sources. Figure 5 illustrates this idea for the Stanford bunny and a sphere.
By selecting a starting point $p$ on the surface of the object we can travel along this surface by calculating the surface direction of this point, moving in this direction a fixed distance $e$ and projecting this new point back onto the surface using Levin's projection operation [Lev01] (blue lines in Figure 5).


Figure 6a. Projection of the points onto the tangent Plane of $p$
Figure 6b. Schematic of the grid tij used for texture synthesis.

By starting in a sink or source of the direction field we can now parametrize the local surface around this discontinuity with polar coordinates as any point can be identified by an angle and a distance (found by backtracing the direction field from the point to the discontinuity).
The iso-contours (red lines in Figure 5) can be obtained by connecting points of the same distance to a discontinuity along several angles.

## Texture synthesis

The calculated directions can be used to generate texture information for the point set surface by using an approach similar to [Tur01,WeL01].
We start in an initial point by assigning a random color from the texture. Selecting the point with the shortest distance to our initial point each step (similar to our method used in the directional field generation) a new color for that point is calculated by generating a NxN texture neighbourhood of the colors already generated and finding the point in the original texture that has the smallest error compared to the neighbourhood.

The calculation of the texture neighbourhood is done by projecting the direction between $p$ and all surrounding points $q_{i}$ onto $p$ 's tangent plane. The resulting vectors $d_{i}$ are normalized and multiplied by the distance between $p$ and $q_{i}$. In this way we preserve a certain degree of distance information between the points on the surface, which would be lost by simply projecting them onto the tangent plane. (Figure 6a)
Now a regular grid $G$ of NxN points $t_{i j}$ with a distance of $h$ (centered on $p$ ) is generated on the plane in alignment with the direction of the point and the vector orthogonal to the direction and the normal (in effect defining the up and right direction for the texture). (Figure 6b)
Each of these points $t_{i j}$ is assigned the color of the closest point $d_{i}$. If no point $d_{i}$ is closer than a certain


Figure 7. An anisotropic texture synthesized on the Stanford bunny. Note that the pattern are orthogonal and the textured bunnies together define local orthogonal grids on the surface.
multiple of $h$ (usually 2) the point is marked as unassigned. The central point of the grid (being the one we want to calculate a color for) is also marked as unassigned.
The grid $G$ is now compared to the source texture at all possible positions and the Gaussian of the error defines the likelihood for the position to be chosen. The color at the center of the grid is selected as the new color for our point. Figure 7 shows the Stanford bunny textured with anisotropic textures, several different isotropic textures synthesized on different point-sampled geometries are depicted in Figure 8.

## 5. CONCLUSIONS

We have presented an efficient technique to establish smooth direction fields over point-sampled geometry. Starting from a few user defined directions our approach typically establishes a smooth direction field in one pass over the surface. This process takes only a few seconds for all models depicted in this paper, which enables an interactive specification process.
Smooth direction fields serve as parameter domains for local synthesis operations. If discontinuities are placed adequately, direction fields might specify a bijective mapping from one surface to another.
In our future work we will exploit mappings among surfaces further. Together with hierarchical representations of point sets $[\mathrm{FC}+02]$ they would
allow to apply linear techniques for the analysis and synthesis of shapes [PSS01]. With point sets, however, topological changes are possible, so that the linear space of shapes would no longer be fixed to a certain homotopy group.

## 6. REFERENCES

[AB+01] Alexa, M., Behr, J., Cohen-Or, D., Fleishman, S., Levin, D., Silva, T. Point Set Surfaces, IEEE Visualization 01, pp. 21-28, 2001
[ABK98] Amenta, N., Bern, M., Kamvysselis, M. A new voronoi-based surface reconstruction algo-rithm. Proceedings of SIGGRAPH 98, 415-422, 1998
[ED+95] Eck, M., DeRose, T.D., Duchamp, T., Hoppe, H., Lounsberry, M., Stuetzle, W. Multiresolution analysis of arbitrary meshes. Proceedings of SIGGRAPH 95, 1995
[FC+02] Fleishman, S., Cohen-Or, D., Alexa, M., Silva, C. Progressive Point Set Surfaces. ACM Transactions on Graphics, to appear
[Gro01] M. Gross. Are points the better graphics primitives? Computer Graphics Forum, 20(3), 2001. ISSN 1067-7055.
[GrD98] Grossman, J.P., Dally, W.J. Point sample rendering. Eurographics Rendering Workshop 1998, 181-192, 1998
[GSS99] Guskov, I., Sweldens, W., Schröder, P. Multiresolution signal processing for meshes. Proceedings of SIGGRAPH 99, 325-334, 1999
[GV+00] Guskov, I., Vidimce, K., Sweldens, W., Schröder, P. Normal meshes. Proceedings of SIGGRAPH 2000, 95-102, 2000
[KaV01] Kalaiah, A., Varshney, A. Differential point rendering. In Rendering Techniques, S. J. Gortler and K. Myszkowski, Eds. Springer-Verlag.
[KC+98] Kobbelt, L., Campagna, S., Vorsatz, J., Seidel, H.-P. Interactive multi-resolution modeling on arbitrary meshes. Proceedings of SIGGRAPH 98, 105-114, 1998
[LS+98] Lee, A., Sweldens, W., Schröder, P., Cowsar, L., Dobkin, D. Maps: Multiresolution adaptive parameterization of surfaces. Proceedings of SIGGRAPH 98, 95-104, 1998
[Lev00] Levin, D. Mesh-independent surface interpolation. Tech. rep., Tel-Aviv University.
http://www.math.tau.ac.il//levin, 2000
[LeW85] M. Levoy and T. Whitted. The use of points as a display primitive. Tr 85-022, University of North Carolina at Chapel Hill, 1985
[LP+01] M. Levoy, K. Pulli, B. Curless, S. Rusinkiewicz, D. Koller, L. Pereira, M. Ginzton, S. Anderson, J. Davis, J. Ginsberg, J. Shade, and D. Fulk. The digital Michelangelo project: 3 d scanning of large statues. Proceedings of SIGGRAPH 2000, 131-144, July 2000
[Lin01] L. Linsen. Point cloud representation. Technical report, Fakultät fuer Informatik, Universität Karlsruhe, 2001
[PaG01] Pauly, M., Gross, M. Spectral processing of pointsampled geometry. Proceedings of SIGGRAPH 2001, 379-386, 2001
[PZ+00] Pfister, H., Zwicker, M., van Baar, J., Gross, M. Surfels: Surface elements as rendering primitives. Proceedings of SIGGRAPH 2000, 335-342, 2000
[PFH00] Praun, E., Finkelstein, A., Hoppe, H. Lapped Textures. Proceedings of ACM SIGGRAPH, 465-470, 2000.
[PSS01] Praun, E., Sweldens, W., Schröder, P. Consistent mesh parameterizations. Proceedings of SIGGRAPH 2001, 179-184, 2001
[RHL02] S. Rusinkiewicz, O. Hall-Holt, and M. Levoy. Real-time 3d model acquisition. ACM Transactions on Graphics, 21(3):438-446, July 2002 (Proceedings of ACM SIGGRAPH 2002)
[RuL00] Rusinkiewicz, S., Levoy, M. Qsplat: A multiresolution point rendering system for large meshes. Proceedings of SIGGRAPH 2000, 343-352, 2000
[Tau95] Taubin, G. A signal processing approach to fair surface design. Proceedings of SIGGRAPH 95, 351358, 1995
[Tur01] Turk, G. Texture synthesis on surfaces. Proceedings of SIGGRAPH 2001, 347-354, 2001
[WeL01] Wei, L.-Y., Levoy, M. Texture synthesis over arbitrary manifold surfaces. Proceedings of SIGGRAPH 2001, 355-360, 2001
[ZSS97] Zorin, D., Schröder, P. Sweldens, W. Interactive multiresolution mesh editing. Proceedings of SIGGRAPH 97, 259-268, 1997
[ZP+02] M. Zwicker, M. Pauly, O. Knoll, and M. Gross. Pointshop 3d: An interactive system for point-based surface editing. ACM Transactions on Graphics, 21(3):322-329, July 2000


Figure 6. An isotropic texture synthesized on the points of the hand model, the same texture on the stanford bunny in larger scale and a texture of bird seed on the bunny.

