# Shape Representation Using Trihedral Mesh Projections 

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#### Abstract

This paper explores the possibility of approximating a surface $b$ y a trihedral polygonal mesh plus some triangles at strategic places. The presented approximation has several attractiv e properties. It turns out that the Z-coordinates of the vertices are completely governed by the Z-coordinates assigned to four selected ones. This allows describing the spatial polygonal mesh with just its 2D projection plus the heights of four v ertices. As a consequence, these projections essemially capture the "spatial meaning" of the given surface, in the sense that, whatever spatial in terpretations are drann from them, they all exhibit the same shape, up to some trivial ambiguities.


## 1 Introduction

A polygonal meshis a piecewise linear 2-manifold made up with planar polygonal patc hes, glued along the edges, and possibly cortaining holes. A polygonization method is an algorithm able to construct a polygonal mesh approximating a given surface. The literature on polygonization methods, mainly on triangulations, is vast (see [3] for a recen tsurv ey on triangulations and algorithms to simplify them). In general, the main goal is to obtain meshes that are close to the surface within a known error, as a way to understand and represent the surface shape [7]. Other goals have been to increase the speed of polygonization and the abilit y of the polygonizer to satisfy some constraints in the solution (e.g., one might request the most accurate approximation using a given $n$ unber of line segments or triangles).

In general, a polygonal mesh cannot be reconstructed from its projection onto a plane because infinitely many meshes generate exactly the same projection. F or example, for the triangular mesh projection in figure 1, there are many different reconstructions, as illustrated. The first two seem to have no meaning; but, actually, there is a rather "hidden" meaningfull reconstruction: Nefertiti's face! Can we obtain a spatial mesh approximating Nefertiti's face in such a way that its projection still keeps its spatial meaning?


Fig. 1. Arbitrary reconstructions of this triangulated projection have no spatial meaning. But actually, a very specific one of them really does: it shows Nefertiti's face.

There is a class of meshes whose projections fully determine the spatial shape once the heights of four vertices are given. We call these projections une quivoad because their reconstructions represent essen tially the same object, up to some trivial ambiguities. For example, the projection in figure 2 a unequivocally represen ts a truncated tetrahedron, as seen in figures 2 d , e, and f . Observe that it suffices to set the heights of $P, Q, T$ and $R$ to determine those of $S$ and $U$, using the fact that all cofacial vertices must be coplanar and, hence, $S$ must lie on the face-plane $R P Q S$, and $U$ on $S Q T U$.

One of our goals is then to approximate any giv en surface with a polygonal mesh yielding unequivocal projections that uniquely identify the spatial shape up to the trivial ambiguities produced by changing the heights of only four vertices. Section 2 presents the trihedral polygonal mesh, the model we use to this end, and shows how its projections are unequivocal in the sense given above.

Nevertheless, we need to go beyond this goal if this representation is to be useful. Consider what happens if the $(x, y)$ vertex positions in figure 2a are sligh tlyaltered (figure 2b). The new projection no longer represents a correct truncated tetrahedron for, to be so, the edges joining the tw o triangular faces, when extended, should be concurrent at the apex of the (imaginary) original tetrahedron. Equivalen tly, note that once $P, Q, R$ and $T$ are given, the height of $U$ is overconstrained, for it can be calculated fromboth the coplanarity of $S Q T U$ or that of RPTU. For generic vertex positions, the two values of this height do not necessarily coincide, and the only spatial reconstruction that keeps cofacial vertices coplanar is a trivial one, with all vertices lying on a single plane [5, 6]. This makes the four provided heights inconsistent betw een eadı other. In sum, the consistency of the four heights only holds at very specific positions of the vertices and inevitable discretization errors will make this representation useless. This problem is common in Computer Vision [8] and Computer Graphics [12, 10], and mathematical characterizations of generically consistent projections are given in $[11,9]$. The way we use to make this representation robust against these


Fig. 2. A truncated tetrahedron (a) and three possible reconstructions (d, e, f). The sligh test perturbation destroys the correctness of the projection (b), but this can be avoided adding new triangular faces (c).
errors follo ws from this observation: if the height of a vertex in a projection is overconstrained because the vertex lies on several planes that fix it, we just in troduce new triangular faces around it for preven ting this to occur (figure 2c). Section 3 gives a fast algorithm to this end, derived from this observation, using the so-called T/TT-transformations. Section 4 describes a complementary optimization step that properly places these transformations to minimize the reconstruction errors by reducing the problem to a cyclic AND/OR graph search. We finally conclude in section 5 .

## 2 Trihedral Polygonal Meshes

$T$ rihe dral meshesi. e., those where all vertices have exactly three incident faces, produce unequivocal projections. Indeed, figure 3 shows that in them, after fixing the planes of tw o adjacert faces, we have enough data to derive the heights of the remaining vertices. Clearly, the heights of the bold vertices fix the shadow ed face-planes and the heights of other vertices on them. At this point, any other surrounding face has three vertices whose height is kno wn and, so, its plane can be fixed too. The same argument can be iteratively applied and the result is a height propagation reac hing all vertices in the projection.

In the schematic representation of this height propagation (figure 3) every face $f$ receiv esthree incoming arro wsfrom the three vertices that fix it. The deriv ation of heiglts for the rest of vertices on $f$ is indicated with outgoing arrows from $f$. The result is a tree-shaped structure spanning all vertices and faces. In this tree, a path from an y of the initial four vertices to an y other vertex will be hereafter referred to as a propagationwave. Note that, height propagations
where a face is fixed from three (almost) collinear vertices must be avoided. Section 4 gives a way to compute propagations eluding these collinearities.

A trihedral mesh approximating a convex or concave surface can be readily obtained by distributing a set of random points all over the surface and computing its tangent planes at these points. This leads to a plane arrangement whose upper envelope -if the surface is con vex-or low eren velope -if it is concavepro vides a good mesh approximation of the surface. Since the tangent plane orien tations are random, ary three of such planes meet in a single point, and hence the mesh is trihedral.

Alternatively, a trihedral mesh approximation of a piece of concave or convex surface can be obtained by starting with a rough mesh approximation and iterativ ely applying a bevel-cutting [2] and/or a corner-cutting [1] operation to attain the desired approximation.


Fig. 3. A heigh t propagation starting at four pre-specified (bold) vertices. Sev eral vertices can havean overconstrained height.

Obviously, the situation becomes much more complex when concavities and con vexities are simultaneously present. The first step in these cases would be to decompose the surface in to patches ha ving congruent signs for the maximum and minimum curvatures at all their points. If this is done for a general $C^{\infty}$ surface, we w ould get pathes labeled $(+,+),(+,-)$, $(-,+)$ or $(-,-)$ separated by curv es which could be labeled with $(-, 0),(+, 0)$, $(0,-)$, or $(0,+)$, and isolated points (actually, maxima or mimima) whid would be labeled with $(0,0)$. Saddle points would be also labeled with $(0,0)$ but they would appear as intersections of separating curves. If w e extend this treatment to $C^{2}$ surfaces, w ecould get en tire patc hes with one of the above nine possible labels. For example, all plane patches would have the label $(0,0)$.
P atc heslabeled with $(+,+)$ or $(-,-)$ represent fully con vexor concave patc hes and this they can be polygonized as described above. Patches labeled as $(*, 0)$ or $(0, *)$ can be polygonized by locating random points along the direction of maximum curvature. Patches $(0,0)$ would only require a single point on them. Unfortunately, the treatment of $(+,-)$ or $(-,+)$ patches remains as an open problem for us.

The connection betw een polygonized pathes can be obtained by computing tangent planes on points along their common boundaries. In sum, the polygonization we propose can be done, first for each patch by generating the tangent planes in a sufficiently high densit y, and next by connecting them using the tangent planes generated along their common boundaries.


Fig. 4. (a and b) T and TT-transformations. (c) Overhanged and self-intersecting reconstructions induced by T-transformations at locally non-convex faces.

## 3 T and TT-Transformations

In a trihedral mesh a projection is overconstrained because any of its vertices lies on three faces and, potentially, up to three propagation waves can determine a height at the same time. How ever, asdone in figure 2c, this can be avoided by adding triangular faces. Tothis end, wefirst compute an arbitrary height propagation spanning all vertices, and chec k whid of them receives more than one wave. We then take one ov erconstrained vertex $v$ at a time and prevent all but one w aves from realcing $v$ as follo ws. B stop the wave getting $v$ from face $f$, we apply either of these tw o transformations (figure 4 a and b ):

- A T-tr ansformation which places a new edge joining the tw oneighboring vertices of $v$ in $f$, say $v_{l}$ and $v_{r}$.
- A TT-transformation, which places a new vertex $v^{\prime}$ on $f$ near $v$ and the three new edges $\left(v^{\prime}, v\right),\left(v^{\prime}, v_{l}\right)$ and $\left(v^{\prime}, v_{r}\right)$.

After either transformation, $f$ cannot constrain the height of $v$ anymore. Also, the added triangles are innocuous because all heights can still be determined from the four initial ones.

Which transformation is preferred depends on the geometry of face $f$ around vertex $v$. If all points inside the triangle $v_{l} v_{r} v$ belong to $f$, w esay that $f$ is lo cally convex at $v$. So, for situations where $f$ is locally con vexat $v$, simplicity prev ails and T-transformations are enough (figure 4a). When local noncon vexities are presen (figure 4b), T-transformations yield occluded or partially occluded crossing edges whose spatial reconstructions ha veoverhanged parts, or self-in tersecting faces (figure 4c). Here, TT-transformations are preferred for they can avoid this.

An observation complements the strategy .In an overconstrainedvertex $v$, either t w o or three incoming propagation wes arriv e. Ifno more than one of


Fig. 5. A projected dodecahedron (a) together with a height propagation (b) and the T-transformations it yields (c). A protruded tetrahedron (d) and tw o possible corrections: (e), in volving TT-transformations, and (f), iw olving only T-transformations.
them comes through a locally non-convex face, then w ecan always drop the incidence constraint in this vertex just with T-transformations: w ejust leave the ev en tual "bad" we to determine the height of $v$ and stop the others with T-transformations. This completes the description of a one-sweep algorithm removing ov erdetermination. As an example, figures 5a-c show a projected dodecahedron before and after applying T-transformations.

In general, when the approximated surface is uniformly convex, or uniformly concave, all faces of the resulting trihedral polygonal mesh will be locally convex, and hence T-transformations will suffice. How ev er,ev en when local noncon vexities exist at the faces, there still migh be some height propagations where only T-transformations suffice. In figure 5e, for example, an algorithm computing an arbitrary propagation can be forced to use TT-transformations, whereas with a proper search, a robust projection is obtained only with T-transformations (figure $5 f$ ). But one certainly finds correct projections where no propagation strictly using $T$-tr ansformationscan be found [5, Section 8.4].

## 4 Optimal Propagations and Cyclic AND/OR Graphs

The algorithm in the preceeding section corrects the incidence structure by finding an arbitrary height propagation and inserting a T or a TT-transformation whenever a vertex height is determined by tw o or more faces. Hov ev er, arbitrary propagations might travel along "degenerate paths" where the planes for some of the faces are determined by three aligned (or almost aligned) vertices. Clearly,
these de gener ate pr op agatiomast be avoided if we wan to minimize the errors during the reconstruction of the spatial shape from the initial set of four heights. This section provides an algorithm to find height propagations that avoid these degeneracies by formulating the problem as that of finding the least cost solution of a cyclic AND/OR graph [4]. We now recall some preliminary concepts about this kind of graphs.

An AND/OR directe dgraph $G$, can be regarded as a hierarchic representation of possible solution strategies for a major problem, represented as a root node, $r$, in $G$. An y other node $v$ represents a subproblem of low er complexity whose solution contributes to solve the problem at hand.

There are three types of nodes: AND nodes, OR nodes and TERMINAL nodes. Every node $v$ has a set $S(v)$ of suc cessor nales, possibly empty, to which it is connected in either of two ways:

- An AND node $v$ is link ed to all nodes $s_{i} \in S(v)$ through directed AND arcs $\left(v, s_{i}\right)$, meaning that the subproblem for $v$ can be trivially solved once all subproblems for the nodes in $S(v)$ have been solved.
- An OR node $v$ is link edto all nodes $s_{i} \in S(v)$ through directed OR arcs $\left(v, s_{i}\right)$, meaning that the subproblem for $v$ can be trivially solved once any one of the subproblems for the nodes in $S(v)$ has been solved".
- A TERMINAL node represents a y et-solv ed or trivial subproblem and has no successors.

With this setting, a feasible solution to the problem becomes represented as a directed subgraph $T$ of $G$ verifying:
$-r$ belongs to $T$.

- If $v$ is an OR node and belongs to $T$, then exactly one of its successors in $S(v)$ belongs to $T$.
- If $v$ is an AND node and belongs to $T$, then every successor in $S(v)$ belongs to $T$.
- Every leaf node in $T$ is a TERMINAL node.
- $T$ con tains no cycle, it is a tree.

One can also assign a cost $c(u, v)>0$ to every $\operatorname{arc}(u, v)$ in $G$ and ask for the solution $T$ with minimum overall cost $C(T)=\sum_{(u, v) \in E(T)} c(u, v)$, where $E(T)$ is the set of arcs of $T$. Note that, as defined, $G$ can contain cycles. This turns out to be the main difficulty for this optimization problem, which, in the past, w as usually tadkled by a rather inefficient trick: "unfolding" the cycles and applying standard AND/OR search methods for acyclic graphs. How ev er, explicit treatment of cycles has recently been considered, and an efficient algorithm is achiev ed in [4].

The search for an optimal height propagation is next reduced to this model. This amounts to (1) constructing an AND/OR graph $G_{h p}$ whose feasible solutions define a height propagation, and (2) define a cost function that promotes non-degenerate propagations ov er degenerate ones.

(a)

(b)



Fig. 6. AND/OR subgraphs for the propagation rules. AND nodes are indicated by joining all their emanating arcs. (a) Constructed subgraph translating rule R2 for a quadrilateral face. Dummy-face nodes are shadowed in grey. Note that, actually, there is only one vertex node for each vertex in the trihedral mesh, but for clarity they are here duplicated. (b) Propagation waves reaching a ertex. (c) Subgraph for rule R3, with an arc for each of the possibilities in (b).

### 4.1 F easible Height Propagations

A height propagation can be defined by the following rules, with the giv en straigh tforward translation into AND/OR subgraphs.

R1: Four seleted vertic es of the pvjection trigger the prop agation. F or this, ne put a TERMINAL node for each of the triggering vertices.
R2: Every face in the polygonization can be determind once the heights of any three of its vertic es are determinde If deg $(f)$ denotes the number of vertices of face $f$, then there are $c_{f}=\left(\begin{array}{c}\operatorname{deg}_{3}(f)\end{array}\right)$ possible combinations of three vertices determining $f$. If we put a node in $G_{h p}$ for every vertex, except for the four triggering ones, then this rule is translated by adding an OR node for every face, linked to $c_{f}$ new "dummy-face" AND nodes, each representing one of the above combinations. Each dummy-face node is in turn linked with arcs to the three inv olv ed vertices in the conination. Figure 6 gives a sc hematic representation. The newly introduced vertex nodes have not been assigned a type yet. This type is induced by the following rule.
R3: Exc ept for the initial four verties, the height of every other vertex is determined once one of its incident faces has a determined plane. This implements the fact that the propagation wave fixing the height of a vertex can come from any of its three incident faces (figure 6b). This rule can be represented by setting each vertex node as OR type, and linking it to the face nodes of its incident faces figure 6 c .
R4: The height prop agation must reach all vertices. F or this, we add a root AND node $r$ to $G_{h p}$ and link it to all vertex nodes.

Note that a feasible solution tree of $G_{h p}$ pro videsinstructions to deriv ea height propagation that reac hes all vertices, starting at the four pre-specified heights.

### 4.2 Cost Function

In order to penalize propagations using sets of almost-aligned vertices, we proceed as follows. Consider a height propagation that fixes a face-plane $f$ from the point coordinates of three previously fixed vertices $v_{i}, v_{j}$ and $v_{k}$. We can simply penalize the corresponding arcs in $G_{h p}$ emanating from $f$ by giving them a cost that is inversely proportional to the area of the triangle defined by $v_{i}, v_{j}$ and $v_{k}$ in the projection. The rest of arc costs are actually irrelevant, but need to be positiv ely defined [4]. In sum, for ery directed $\operatorname{arc}(u, v)$ we define its cost as follows:

1. $c(u, v)=1 / \operatorname{det}\left(v_{1}, v_{2}, v_{3}\right)$, if $u$ is a dummy-face AND node and $v$ is any one of its descendants. Here, $v_{i}, v_{j}$ and $v_{k}$ are the homogeneous coordinates of the v ertices associated with the three descendarts of $u$.
2. $c(u, v)=1$, if $u$ is an OR node.
3. $c(u, v)=1$, if $u$ is the root AND node.

Once the least cost solution $T$ is found, the projection can be made robust to slight vertex perturbations as follows. At a vertex $v$ receiving more than one propagation wave, we puta T/TT-transformation on all facesfixing $v$, except on the one in the propagation wave represerted in $T$.

### 4.3 Complexity Analysis

The worst-case complexity of computing the optimal solution of a cyclic AND/OR graph with $n$ nodes is $O\left(n^{3}\right)$ [4]. We now prove that the number of nodes in $G_{h p}$ gro ws linearly with the number of vertices of the trihedral polygonal mesh.

Let $e, v$ and $f$ be the number of edges, vertices and faces of the given mesh. Then, $2 e=3 v$ because the mesh is trihedral. Moreov er, if the mesh has $h$ holes, with "the outside" of the mesh counting as a hole too, then Euler's relation says that $v-e+f=2-h$. From these tw oequalities the number of faces of the mesh can be written in terms of the number of vertices and holes, $f=\frac{v+4}{2}-h$. Let us now count the $n$ unber of nodes added by each of the rules $\mathbf{R 1}, \ldots, \mathbf{R 4}$ :

- Rule R1 adds four vertex nodes.
- Rule R2 adds one OR node for each face, amounting to $f=\frac{v+4}{2}-h=O(v)$ total nodes, assuming a constant number of holes. Also, for every face $f$ this rule adds $c_{f}=\binom{\operatorname{deg}(f)}{3}$ dummy-face AND nodes. Although this number is clearly in the worst case $O\left(\operatorname{deg}(f)^{3}\right)$, if w e divide the sum of face degrees by the number of faces, the av erage face degree is six, at an increasing number of randomly placed vertices in the mesh:

$$
\frac{\sum_{\text {allfaces }} \operatorname{deg}\left(f_{i}\right)}{f}=\frac{3 v}{\frac{v+4}{2}-h}=\frac{6 v}{v+4-2 h}
$$

which will keep the number of dummy-face AND nodes linearly growing:

$$
\binom{6}{3} f=20\left(\frac{v+4}{2}-h\right)=O(v)
$$

- Rule R3 adds a linear number of OR vertex nodes.
- Rule R4 only adds one AND node, the root.

Up to no ww eha ve assumed thatthe four v ertices triggering thepropagation are a priori selected. But other height propagations starting at other four vertices could yield better height propagations. To test all possibilities, wedo not need to repeat the AND/OR search for every different combination of four vertices. Indeed, note that these vertices just fix the planes of the faces they belong to. So, an y other set of four vertices on thesefaces will yield the same optimal propagations, provided that tw o of them lie on the common edge. We can equivalen tly think of pairs of faces triggering the propagation and use their face nodes as TERMINAL in $G_{h p}$. The choice of TERMINAL vertices (instead of TERMINAL faces) $w$ as doneto be coherent with previous explanations. In sum, if one wan ts to seard over all possible starting places of propagation, then for eac h pair of adjacert faces the AND/OR search needs to be repeated. This amounts to solv $e e=\frac{3}{2} v$ optimization problems in the worst case, meaning that the o verall complexiy will be $O\left(v^{4}\right)$, under the assumption that the face degree is six.

## 5 Conclusion

We have shown how trihedral mesh projections can capture the spatial shape of a giv en object's surface, up to some trivial anbiguities. We have also presented a local strategy that takes a trihedral projection as input and places some triangular faces at strategic places until it is made robust to perturbations in its v ertex coordinates. Finally, we have found how to put these triangles so that the spatial reconstruction is performed in the most accurate way possible, av oiding height propagations along degenerate paths.

Although we can deal with an important range of surfaces, no algorithm has been devised yet to obtain trihedral meshes approximating surfaces with saddlecrests or saddle-valleys. This constitutes a main issue for further research.

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