## Approximating Isosurfaces by guaranteed-quality triangular meshes

Joel Hass, University of California, Davis
Maria Trnkova, University of California, Davis


## Finding Optimal Meshes

A mesh is a 2-dimensional surface made from flat triangles.


Goal: Approximate a surface in $\mathbf{R}^{3}$ by a mesh whose triangles are as close to equilateral as possible.


Bad


A sliver is a triangle with one or more small angles. Slivers cause problems in applications and are to be avoided.

The GradNormal algorithm for smooth function inputs
Start with a surface defined implicitly by an equation $f(x, y, z)=0$, where $f$ is a differentiable function with regular value 0 .

$$
F=f^{-1}(0)
$$

Decide on how fine a mesh is desired. Output a mesh approximating $F$.

## Example

Input: A function $f(x, y, z)=x^{2}+y^{2}+z^{2}-4$.
Output: A high-quality mesh approximating the sphere of radius 2 .


Theorem. When F is smooth, then at a sufficiently fine resolution the GradNormal Mesh has all angles in the interval [35.2º, 101.5].

## The GradNormal Algorithm in 3D

We establish the following bounds.
Theorem. When F is smooth, then at a sufficiently fine resolution the GradNormal Mesh has all angles in the interval [35.20, 101.5].

Compare to:
P. Chew (1993): Delaunay with point insertion gives [30, 120́].

Labelle \& Shewchuck (2007): The Isosurface Stuffing algorithm triangulates the surface interior with high quality tetrahedra and also establishes boundary-mesh bounds of [16, $\left.145^{\circ}\right]$.
de Verdiere \& Marin (1990): There exist meshes realizing $\approx\left[51.6^{\circ}, 72^{\circ}\right]$ on any surface (best possible by Gauss-Bonnet).

## The GradNormal Algorithm for Mesh inputs

Alternately, start with input given by a surface defined by any mesh approximating $F$.
Produce a mesh approximating $F$ with good angle quality.
Example: Start with the Stanford Bunny mesh (58,029 vertices). This has angles as low as $0.5^{\circ}$. Output a new GradNormal mesh ( 34,834 vertices) with all angles larger than $10.4^{\circ}$.


The GradNormal Algorithm for Mesh inputs


Original Bunny Mesh
GradNormal Mesh

The GradNormal Algorithm for Mesh inputs


Original Mesh

## GradNormal Mesh

## We achieve Smooth Approximation

A mesh using pyramids stacked on cubes can be used to approximate a surface $F$ with a mesh consisting entirely of equilateral triangles. This optimizes angles but does not approximate normal directions.

Our goal is to produce a mesh with
a) good angles
and

b) good tangent space approximation. (A piecewise-C1 approximation)

## Illustrate idea - dimension two

The algorithm has some resemblance to Marching Tetrahedra.
Marching Tetrahedra is a commonly used meshing algorithm


Output Mesh

This method can result in very small angles in dimension three

The GradNormal Algorithm in dimension two
Step 1: Construct a MidNormal Mesh


## The GradNormal Algorithm in dimension two

Step 2: Project each MidNormal Mesh vertex to the closest point on $F$.


## Marching Tetrahedra

GradNormal


## In dimension three there is an extra step

## Step 3:

## The GradNormal Algorithm in 3D

Step 1. Tile space with tetrahedra and construct a MidNormal Mesh.




This requires a tetrahedral tiling. Which tiling should we use?

## The GradNormal Algorithm in 3D

## Step 1. Tile space with tetrahedra

The tetrahedral tiling we use is one of a family of tilings we investigated, discovered by Goldberg in 1974. The optimal Goldberg tiling turns out to coincide with a tetrahedral tiling discovered by Sommerville in 1923, with vertices located at the body centered cubic lattice.

We have shown that no tetrahedral shape can significantly improve the angles achieved by our method.


## The GradNormal Algorithm in 3D

Step 1. Construct a MidNormal Mesh


## The GradNormal Algorithm in 3D

 Step 1.Construct a MidNormal Mesh.
Tile space with tetrahedra. Determine the MidNormal triangles.

## The GradNormal Algorithm in 3D

Step 1. A MidNormal Mesh


## The GradNormal Algorithm in 3D

Step 2: Project each MidNormal Mesh vertex to the closest point on $F$.


## Step 3: Remove all valence-four vertices



Before removal


After

## GradNormal Angle Distributions

■ GradNormal with $6,748,416$ Tetrahedra ■ GradNormal with $52,931,340$ Tetrahedra $\quad$ Original Stanford Bunny

## Stanford Bunny



## GradNormal Angle Bounds (smooth F)

| Genus | $k_{M}$ | $\theta_{m}$ | $\theta_{M}$ | vertices | faces |  |  |  |  |  |  |  |
| :--- | :--- | :--- | :--- | :--- | ---: | ---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  |  |  |  |  | 0.23 | $33.0^{\circ}$ | $102.8^{\circ}$ | 1,082 | 1,988 |
|  |  | 0.09 | $34.2^{\circ}$ | $101.3^{\circ}$ | 6,782 | 12,564 |  |  |  |  |  |  |
|  |  | 0.05 | $35.4^{\circ}$ | $102.7^{\circ}$ | 27,104 | 50,300 |  |  |  |  |  |  |
|  |  | 0.03 | $35.2^{\circ}$ | $101.1^{\circ}$ | 433,208 | 866,412 |  |  |  |  |  |  |
|  |  | $\mathbf{2}$ | 0.57 | $10.9^{\circ}$ | $153.8^{\circ}$ | 1,336 |  |  |  |  |  |  |

## Hopefully Usefu!!

