## CSCI 4560/6560 Computational Geometry

## Lecture 18: Isocontours \& Level Sets

## Outline for Today

- Homework 5 Questions?
- Last Time: Quad Trees
- Explicit vs. Implicit Surface Representations
- Signed Distance Field
- Level Sets (Surface $\rightarrow$ Signed Distance)
- Fast Marching Method
- Medical Imaging
- Marching Cubes (Signed Distance $\rightarrow$ Surface)
- Marching Tetrahedra
- Next Time: ?

Homework 5 Questions?



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## Motivation: Finite Element Modeling (FEM) \& Computational Fluid Dynamics


https://www.scienceworld.ca/resource/plane-wing-simulator/


Figure 9: Numerical flow simulation for the Airbus A380 (picture credit: Airbus. Copyright: Dr. Klaus Becker, Senior Manager Aerodynamic Strategies, EGAA, Airbus, Bremen, Germany)

## Motivation: Finite Element Modeling (FEM) \& Computational Fluid Dynamics (CFD)

"Delaunay
Refinement
for Curved
Complexes",
Adriano Chaves
Lisboa, 2008.


## Quad Tree Analysis

- $n=\#$ of points
- $c=$ smallest distance
between any two points
- $s=$ side length of initial square
- $d=$ depth $=\log (s / c)+3 / 2$
- $m=\#$ of nodes in unbalanced tree

$$
=O((d+1) n)
$$

- time to construct $=O((d+1) n)$
- $\#$ of nodes in balanced tree $=O(m)$
- Time to balance a tree $=O((d+1) m)$

balancing


Computational Geometry Algorithms and Applications, de Berg, Cheong, van Kreveld and Overmars, Chapter 14

## 3D Mesh Simplification




10K tetras
(3K faces)

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## Explicit Surface Mesh Representation

- Often we focus on modeling surfaces with polygon or triangle meshes separating "inside" from "outside"



## Implicit Surfaces

- Alternately, some objects are easily represented by an equation:
- E.g., a sphere:

$$
H(x, y, z)=x^{2}+y^{2}+z^{2}-r^{2}
$$

- If $H(x, y, z)=0$, on surface
- If $H(x, y, z)>0$, outside surface
- If $H(x, y, z)<0$, inside surface



## Isocontours / Isosurfaces

- "iso-" (from Greek word meaning 'equal')
- Everywhere that the data equals a specified value
- E.g., different radii for a circle or sphere centered at the origin

$$
H(x, y, z)=x^{2}+y^{2}+z^{2}-r^{2}
$$

## Implicit Surfaces: Blobby Surfaces / Metaballs

- Compact representation to model soft, round objects

http://paulbourke.net/geometry/implicitsurf/index.html
"A Generalization of Algebraic Surface Drawing", Blinn, 1982.


## Explicit vs. Implicit Surface Representations

- Some objects can accurately represented either implicitly or explicitly
- Can we convert the bunny mesh into an implicit equation? Why might we want to do this?


$$
H(x, y, z)=?
$$

## Motivation: Collision Detection

"Simulation of Clothing with Folds and Wrinkles",
Bridson, Marino, \& Fedkiw, SCA 2003

- Detecting Intersections between rigid (or deformable!) objects



## Motivation: Collision Detection

- Detect the intersection
- Depth of intersection penetration
- Gradient \& normal of closest surface -
"An Implicit Finite Element Method for Elastic Solids in Contact",
Hirota, Fisher, State, Lee, \& Fuchs, SCA 2001

Determine penalty force to resolve collision


## Motivation: Alternate Surface Representation


"Adaptively Sampled Distance Fields: A General Representation of Shape for Computer Graphics",

## Motivation: Surface Sculpting



Figures 4a "R" and 4b 3-color quadtree containing 23,573 cells.


Figures 4c Distance field of "R" and 4d ADF containing 1713 cells
"Adaptively Sampled Distance Fields: A General Representation of Shape for Computer Graphics",

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## Explicit vs. Implicit Surface Representations

- We may not be able to construct a compact mathematical function...
- But can we convert the bunny mesh into a signed distance field?



## Computing a Signed Distance Field

- Given a shape/surface
- Cost to compute shortest distance to original shape for each point (on a grid) in the volume?



## Computing a Signed Distance Field

- Given a shape/surface
- Cost to compute shortest distance to original shape for each point (on a grid) in the volume?

Naive: $O$ (\# of volume grid samples * \# of surface elements) $=O\left(w^{2} h^{2}\right)$


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## Level Sets

- For a 2D problem... we can visualize level sets with time ( $T$ ) as the 3rd dimension


Level Set Methods and Fast Marching Methods, Sethian, 1999

## Level Sets - Topology / Connectivity Changes!

- Depending on the application, we may want to grow/advance the surface in the outward direction
- Or we may want to shrink the surface in the inward direction
- Sharp corners will round
- Smooth areas may pinch at sharp point



## Level Sets - Topology / Connectivity Changes!

- As we trace the level sets the topology of the surface may change!
- The surface may become disconnected
- Disconnected pieces may merge



## Level Sets - Speed \& Direction of Propagation

## Depending on the application

- Speed may not be uniform or constant
- Direction of propagation may be inward and/or outward in different places along the curve/surface!
- And may change over time.

Level Set Methods and Fast Marching Methods, Sethian, 1999


Original curve


Decrease in variation


Increase in variation

## Level Sets - Topology / Connectivity Changes!

- Locally grow/expand where the curvature is concave
- Locally shrink where the curvature is convex
- All complex curves will collapse to a point!



## Computing Level Sets / Signed Distance Field

- Marker \& string method:

Copy the mesh \& move the vertices...


## Computing Level Sets / Signed Distance Field

- Marker \& string method: Copy the mesh \& move the vertices...



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## Fast Marching Method

- Efficient method for computing the signed distance field.
- For applications where the front does not change direction - it moves outward only (alternately, inward only)

Level Set Methods and
Fast Marching Methods, Sethian, 1999


## Fast Marching Method Implementation (DS HW!)

Initially, only the surface pixels are "known" to have level set value, a.k.a. distance $=0$

input image

| $\infty$ | $\infty$ | $\infty$ | $\infty$ | $\infty$ |
| :---: | :---: | :---: | :---: | :---: |
| 4,0 | 4,1 | 4,2 | 4,3 | 4,4 |
| $\infty$ | $\infty$ | $\infty$ | $\infty$ | $\infty$ |
| 3,0 | 3,1 | 3,2 | 3,3 | 3,4 |
| $\infty$ | $\infty$ | $\infty$ | 0 | $\infty$ |
| 2,0 | 2,1 | 2,2 | 2,3 | 2,4 |
| 0 | 0 | $\infty$ | $\infty$ | $\infty$ |
| 1,0 | 1,1 | 1,2 | 1,3 | 1,4 |
| $\infty$ | $\infty$ | $\infty$ | $\infty$ | $\infty$ |
| 0,0 | 0,1 | 0,2 | 0,3 | 0,4 |

initialization of the signed distance field

## Fast Marching Method Implementation (DS HW!)

We compute the distance of all neighbors of these "known" pixels

Put all these new pixels in a priority queue, ordered by distance

| $\infty$ | $\infty$ | $\infty$ | $\infty$ | $\infty$ |
| :---: | :---: | :---: | :---: | :---: |
| 4,0 | 4,1 | 4,2 | 4,3 | 4,4 |
| $\infty$ | $\infty$ | 1.4 | 1 | 1.4 |
| 3,0 | 3,1 | 3,2 | 3,3 | 3,4 |
| 1 | 1 | 1 | 0 | 1 |
| 2,0 | 2,1 | 2,2 | 2,3 | 2,4 |
| 0 | 0 | 1 | 1 | 1.4 |
| 1,0 | 1,1 | 1,2 | 1,3 | 1,4 |
| 1 | 1 | 1.4 | $\infty$ | $\infty$ |
| 0,0 | 0,1 | 0,2 | 0,3 | 0,4 |

propagating initial values

initial priority queue of pixels

## Fast Marching Method Implementation (DS HW!)

## Grab the top item from the priority queue...


after popping \& fixing the top value, grab the last leaf \& percolate down

| $\infty$ | $\infty$ | $\infty$ | $\infty$ | $\infty$ |
| :---: | :---: | :---: | :---: | :---: |
| 4,0 | $\infty, 1$ | 4,2 | 4,3 | 4,4 |
| 2.4 | 2 | 1.4 | 1 | 1.4 |
| 3,0 | 3,1 | 3,2 | 3,3 | 3,4 |
| 1 | 1 | 1 | 0 | 1 |
| 2,0 | 2,1 | 2,2 | 2,3 | 2,4 |
| 0 | 0 | 1 | 1 | 1.4 |
| 1,0 | 1,1 | 1,2 | 1,3 | 1,4 |
| 1 | 1 | 1.4 | $\infty$ | $\infty$ |
| 0,0 | 0,1 | 0,2 | 0,3 | 0,4 |

propagate fixed value to neighbors

Lock its value, and update its immediate neighbors

## Fast Marching Method Implementation (DS HW!)

Grab the next pixel in the priority queue and repeat....

| $\infty$ | $\infty$ | 2.4 | 2 | 2.4 |
| :---: | :---: | :---: | :---: | :---: |
| 4,0 | ${ }_{4,1}$ | 4,2 | 4,3 | 4,4 |
| 2 | 2 | 1.4 | 1 | 1.4 |
| 3,0 | 3,1 | 3,2 | 3,3 | 3,4 |
| 1 | 1 | 1 | 0 | 1 |
| 2,0 | 2,1 | 2,2 | 2,3 | 2,4 |
| 0 | 0 | 1 | 1 | 1.4 |
| 1,0 | 1,1 | 1,2 | 1,3 | 1,4 |
| 1 | 1 | 1.4 | 2 | 2.4 |
| 0,0 | 0,1 | 0,2 | 0,3 | 0,4 |

after fixing all pixels $<=1$

priority queue after fixing all pixels $<=1$

## Fast Marching Method Implementation (DS HW!)

$\left.\begin{array}{l|c|c|c|c|c|}\hline \text { Final result: } & 3 & 2.8 & 2.4 & 2 & 2.4 \\ \hline \text { Every pixel } \\ \text { stores the } \\ \text { (approximate) }\end{array} \quad \begin{array}{c}4,0\end{array}\right)$
final distance field

output image

## Analysis of Fast Marching Method

- For an image/grid of size $w \times h$, with $t$ pixels/triangles:
- Naive:
$\rightarrow O$ (\# of volume grid samples * \# of surface elements) $=O\left(w^{2} h^{2}\right)$
- Fast Marching:



## Analysis of Fast Marching Method

- For an image/grid of size $w \times h$, with $t$ pixels/triangles:
- Naive:
$\rightarrow O$ (\# of volume grid samples * \# of surface elements) $=O\left(w^{2} h^{2}\right)$
- Fast Marching:
$\rightarrow O$ (\# of volume grid samples * log active front) $=O\left(w^{*} h * \log (t)\right)$



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## Motivating Application: Medical Imaging

- Problem Statement: Convert 2D slices of MRI or CT image data into a 3D triangle mesh of the different organs and structures
- This will facilitate more intuitive visualization

https://chaos.grand-challenge.org/Data/


## Motivating Application: Medical Imaging

- Input: a stack of 2D images, closely spaced parallel "slices" of the 3D object
- Step 1: Segment the different regions (by density / color / texture)

https://chaos.grand-challenge.org/Data/


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## Marching Cubes

- Each point in the 3D grid is labeled "inside" (red dots) or "outside" (blue dots) the unknown surface.
- Any cell in the grid that has at least one red vertex and at least one blue vertex, must be crossed by the unknown surface.
- We can piecewise construct an approximation of the surface.

http://www.cs.carleton.edu/cs_comps/0405 /shape/marching_cubes.html


## Marching Cubes



- 256 possible inside/outside labelings of each grid cube.
- Merging rotations...

15 unique cases to implement
"Marching Cubes: A High Resolution 3D Surface Construction Algorithm", Lorensen and Cline, SIGGRAPH '87.


"Marching Cubes: A High Resolution 3D Surface Construction Algorithm", Lorensen and Cline, SIGGRAPH '87.


## More than Binary - Signed Distance Data!



Crossing point should be placed not at the midpoint of each edge,
but at the estimated position of the level set!

http://www.cs.carleton.edu/cs_comps/0405/shape/marching_cubes.html

http://gizmodo.com/ges-new-fast-ct-scanner-capture s-insane-images-in-a-he-1482904872 http://www3.gehealthcare.com/en/Products/ Categories/Computed_Tomography/Revolution_CT

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## Marching Tetrahedra

- Implementation Shortcut:

Chop every grid cube into 6 tetrahedra....


- Now only 3 unique cases for tetrahedra!

Jules Bloomenthal
"An implicit surface polygonizer"
Graphics Gems IV

"When the Blobs Go Marching Two by Two", Jeff Lander, Gamasutra

## Volumetric \& Multiple Materials


"Interval volume tetrahedrization" Visualization '97, Nielson \& Sung


## Implementation Details... Marching Tetrahedra

- Which cube $\rightarrow$ tetrahedra subdivision should we use?


6 tetrahedra
(all equal size \& shape)
diagonal bias


5 tetrahedra (1 equilateral that is 2 X the others in volume)
Orientation must be alternated


Crystal Lattice
All same size \& shape, but more complicated...

## Debugging Marching Tetrahedra

- Drawing (in 2D) didn't work
- Creating an OpenGL visualization didn't work (even with transparency)
- Solution: build lots of paper \& tape models



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