## Fast Computation of Generalized Voronoi Diagrams Using Graphics Hardware

 paper by Kennet E. Hoff et al.(University of North Carolina at Chapel Hill)

presented by Daniel Emmenegger
GDV-Seminar ETH Zürich, SS2000

## Overview

- Introduction
- Motivation
- Basic Idea and Definitions
- The Distance Functions
- From 2D to 3D (basics)
- Error estimation
- Applications and Results
- Conclusions


## What is a Voronoi Diagram?

Given a collection of geometric primitives, it is a subdivion of space into cells (regions) such that all points in a cell are closer to one primitive than to any other.


## Ordinary vs. Generalized

- Primitives: Points
- Nearest Euclidean Distance
- Primitives: Points, Lines, Polygons, Curves, ...
- Varying distance metrics Higher-order Sites


## Voronoi Boundary

## Curves forming the boundary between the various cells

frontier between two cells of different color


## Delaunay-Triangulation

Duality structure to Ordinary Voronoi Diagrams:
Connect all primitives with their nearest neighbors


## What can we do with this stuff?

## FUNDAMETAL CONCEPT:

1644 Descartes
1850 Dirichlet
1908 Voronoi
1970 divers...

Astronomy
Math
Math
Computational geometry and related areas (first algorithms for computing Voronoi diagrams)

1999 E. Hoff et al. Fast Computation of Generalized Voronoi Diagrams Using Graphics Hardware

## What can we do with this stuff?



Nearest Site


Maximally Clear Path


Density Estimation
Nearest Neighbors

## Motivation

- Previous Work: Exact Algorithms no error but ...
- Boundaries composed of high-degree curves and surfaces and their intersections
- Complex and difficult to implement
- Robustness and accuracy problems
- Previous Work: Approximate Algorithms provide a practical solution but...
- Difficult to error-bound
- Restricted to static geometry
- Relativly slow


## Goals

Approximate generalized Voronoi Diagram computation with the following features:

- Easily generalized
- Efficient and practical
- Has tight bounds of accuracy
- Simple to understand and implement


## Formal Definition

Set of input sites (primitives) $\mathrm{A}_{1}, \mathrm{~A}_{2}, \ldots, \mathrm{~A}_{\mathrm{k}}$ dist(p, Ai): distance from the point p to the site Ai

The dominance region of $A_{i}$ over $A j$ is defined by

$$
\operatorname{Dom}\left(A_{i}, A_{j}\right)=\left\{p \mid \operatorname{dist}\left(p, A_{i}\right) \leq \operatorname{dist}\left(p, A_{j}\right)\right\}
$$

For a site $A_{i}$, the Voronoi region for $A_{i}$ is defined by

$$
V\left(A_{i}\right)=\bigcap_{i \neq j} \operatorname{Dom}\left(A_{i}, A_{j}\right)
$$

Partition of space into $\mathrm{V}\left(\mathrm{A}_{1}\right), \mathrm{V}\left(\mathrm{A}_{2}\right), \ldots, \mathrm{V}\left(\mathrm{A}_{\mathrm{k}}\right)$ :

## Generalized Voronoi Diagrams

## Discrete Voronoi Diagrams

Uniformliy point-sample the space containing Voronoi sites For each sample find closest site and its distance


Brute-force-Algorithm:

- iterate through all samplepoints (cells)
- iterate through all primitives => HARDWARE


## Basic Idea: Cones

To visualize Voronoi Diagrams for points ...

## Graphics Hardware Acceleration

Simply rasterize the cones using graphics hardware

Depth Buffer


## Basic Idea: Distance Function

Render a polygonal mesh approximation to each site's distance function.

Each site has:

- unique color ID assigned
- corresponding distance mesh rendered in this color using parallel projection

We make use of:

- linear interpolation across polygons
- Z-Buffer depth comparison operation


## The Distance Function


Cone "Tent"

And Polygons, Bezièr-Curves, ... What is their distance function?
Compose them of points and lines!

## Approximation Error

Distance Function: Meshing Error of a cone min


$$
\cos \left(\frac{\alpha}{2}\right)=\frac{R-\varepsilon}{R} \rightarrow \alpha=2 \cos ^{-1}\left(\frac{R-\varepsilon}{R}\right)
$$

## Distance Function

Evaluate distance at each pixel for all sites
Accelerate using graphics hardware


Line
Triangle

## Approximation of the Distance Function

Avoid per-pixel distance evaluation
Point-sample the distance function
Reconstruct by rendering polygonal mesh


## Shape of Distance Function



Sweep apex of cone along higher-order site to obtain the shape of the distance function

## Curves



Tessellate curve into a polyline
Tessellation error is added to meshing error

## Boundaries \&



Algorithm A: (very simple, accelerated through image op. in ghw)

- examine each pairs of adjacent cells
- if color different, location between is marked as boundary-point

Algorithm B: continuation method

- choose seed (known point of boundary)
- walk along boundaries until all boundry points are found


## ... Neighbors



Main Question: Which colors touch in the image?

Answer, how to find them:
Same algorithm as used for finding boundaries

## What about 3D?



Slices of the distance
function for a 3D point site


Distance meshes used to approximate slices

## What about 3D?



## Graphics hardware can generate one 2D slice at a time

## Point sites

## 3D Distance Functions

Point Line segment


1 sheet of a


Elliptical cone


Triangle



Plane
hyperboloid

## Sources of Error

- Distance Error
- meshing
- tesselation
- hardware precicision
- Combinatorial Error
- Z-Buffer precision
- distance
- pixel resolution


## Resolution Error

## Adaptive Resolution

zoom in to reduce resolution error


## Error Bounds

Error bound is determined by the pixel resolution
$\varepsilon \leq$ farthest distance a point can be from a pixel sample point

## Error Bounds

## Assume: no Z-Buffer precision error

 we can bound the maximum distance error by $\varepsilon$for a pixel P colored with ID of site (primitive) A and with computed depth buffer of value D , we know:

$$
D-\varepsilon \leq \operatorname{dist}(P, A) \leq D+\varepsilon
$$

further we know, for any other site B

$$
D-\varepsilon \leq \operatorname{dist}(P, B)
$$

With this information we easily determine that

$$
\operatorname{dist}(P, A) \leq \operatorname{dist}(P, B)+2 \varepsilon
$$

## Implementation

- complete interactive system in 2D
- written in C++ using OpenGL and GLUT
- a standard Z-buffered interpolation-based raster graphics system
- some first prototypes in 3D
- runs (without source modification) on:
- MS-Windows-based PC
- high-end SGI Onxy2
- several problem-based modifications to increase performace...


## Applications

Mosaics


Realtime Motion Planning


Demo

VIDEO

## Conclusions

- General:
- Idea is originally not from E. Hoff or one of the other writters => Open GL Programming Guide, 2nd Edition M. Woo et al.
- My opinion:
- Concept very easy to understand...
- ...but the main idea is not immediatly obvious!
- All ideas are implemented, so the reader can easily determine if everything (the notion of distance function etc.) really works


## THE END

## (570) <br> Ques ions?

http://www.cs.unc.edu/~hoff/

