# Approximating the Generalized Voronoi Diagram of Closely Spaced Objects

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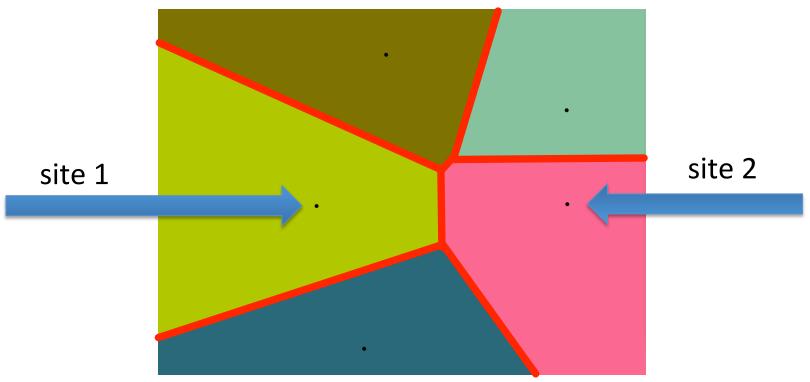






## Voronoi Diagram

#### Sites are points

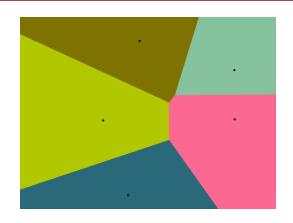


http://alexbeutel.com/webgl/voronoi.html

#### The Voronoi diagram:

- 1. is the locus of points equidistant from at least 2 sites
- 2. is a union of line segments

## Voronoi Diagram



- Applications: GIS, biology, geology, physiology, crystallography...
- Exact computation algorithms are simple and fast. Fortune's algorithm:
  - O(N log N) time
  - O(N) space

## Generalized Voronoi Diagram (GVD)

#### Sites are arbitrary objects

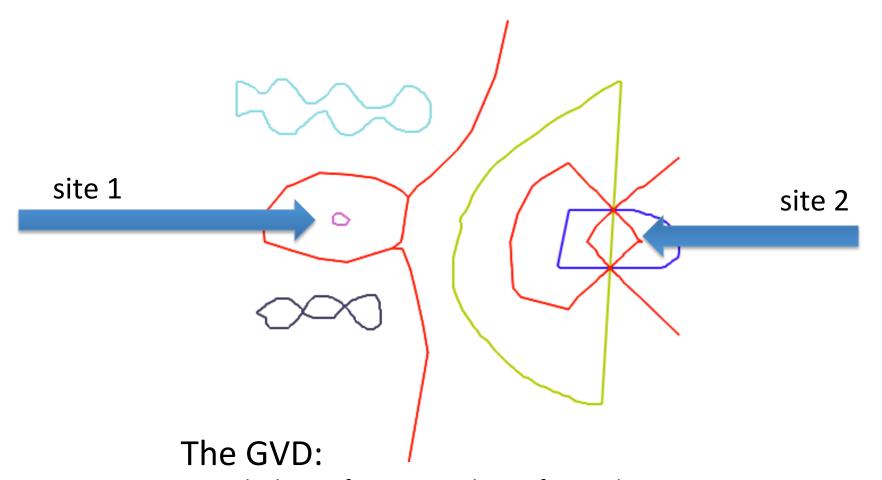


#### The GVD:

- 1. is the locus of points equidistant from at least 2 sites
- 2. is a union of line and (often complex) curve segments

## Generalized Voronoi Diagram (GVD)

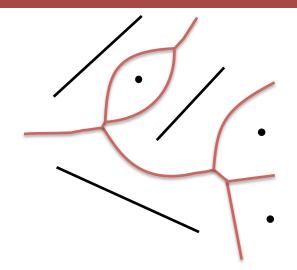
#### Sites are arbitrary objects



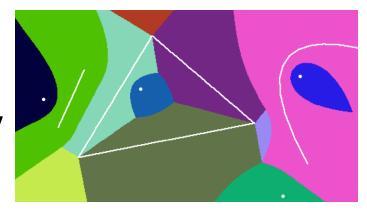
- 1. is the locus of points equidistant from at least 2 sites
- 2. is a union of line and (often complex) curve segments

## Generalized Voronoi Diagram (GVD)

- Exact computation algorithms
  - Line and point sites only
    - (GVD composed of lines and parabolas)
  - Lee 1982, Karavelas 2004



- Approximation algorithms
  - Arbitrary sites; most are uniformly gridded
  - Hoff et al 1999, Cao et al 2010, etc.

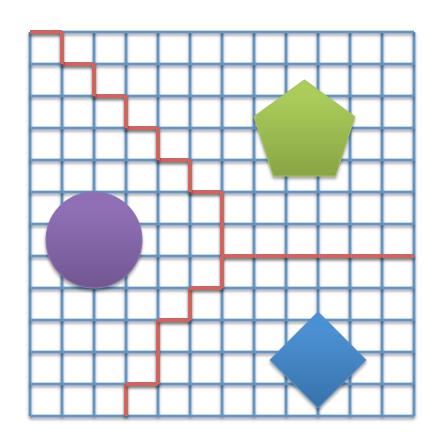


Hoff et al 1999

# GVD – uniform gridding

#### Advantages:

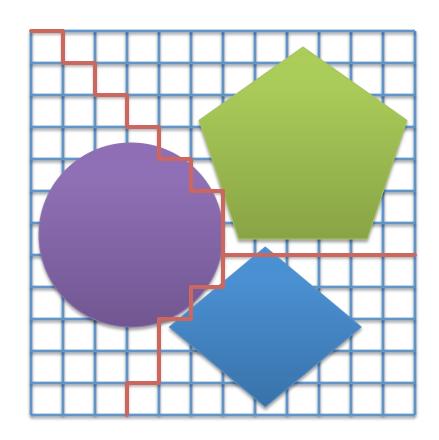
- Simple
- Fast
- Suitable for GPGPU implementations



## GVD – uniform gridding

#### Disadvantages:

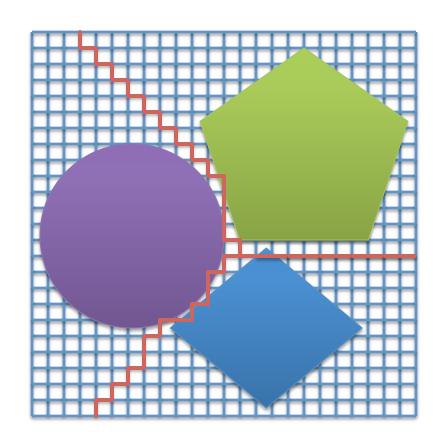
- Object spacings not normally known beforehand
- Resolution may not be high enough



# GVD – uniform gridding

#### Disadvantages:

- Object spacings not normally known beforehand
- Resolution may not be high enough
- Grid may not fit in memory



## Uniform vs. Adaptive

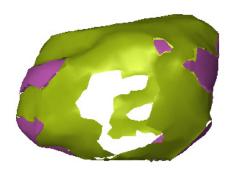
- Uniform gridding:
  - Bunny requires 2<sup>24</sup> cells
- Adaptive gridding:
  - Bunny requires 7K octree cells
  - Previous work
    - Boada et al 2002, 2008 (connected regions only)
    - Teichmann and Teller 1997;
       Vleugels and Overmars 1998 (convex sites only)



## Objective

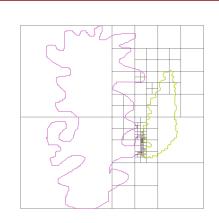
#### Our objective is to compute the GVD on datasets...

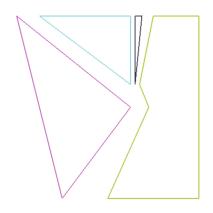
- with closely spaced objects
- with no shape restrictions
  - disconnected
  - non-manifold
  - self-intersections
  - inter-object intersections
- 2D and 3D
- in reasonable time on commodity hardware



## Contributions

Octree models inter-object space using adjacency structure





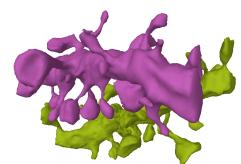
Wavefront distance transform on octree

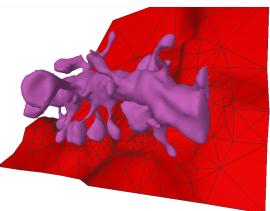
**GVD surfacing** algorithm on labeled octree



## Contributions

- Octree decomposition of space
  - Models inter-object space (rather than object features)
  - Adjacency structure (rather than hierarchical) for fast neighbor queries
- Wavefront distance transform on octree
  - Conjectured to be 3/2-approximation
- GVD surfacing algorithm on labeled octree

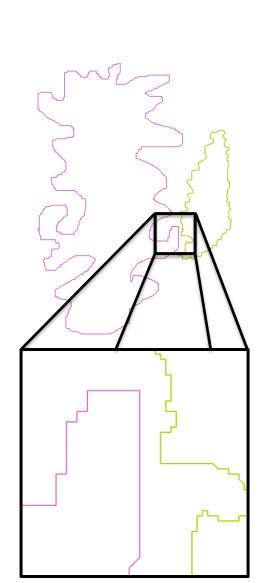




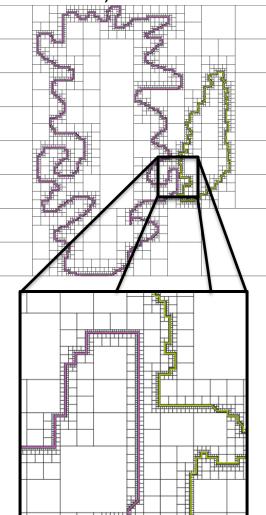
#### Octree

Note: In this talk I will use "octree" to refer to both quadtree and octree

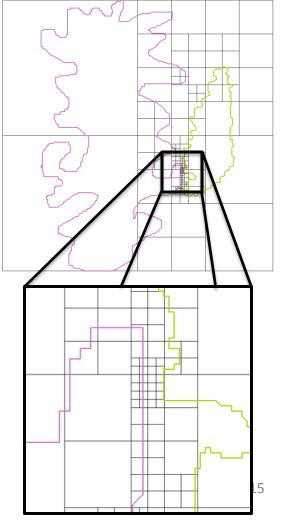
## Octree



Previous approaches: Models objects 95,632 cells



Our approach: Models object spacing 160 cells

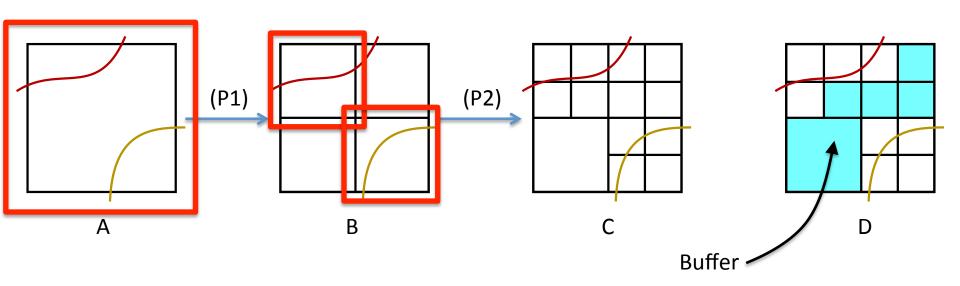


## Octree – subdivision predicate

#### Subdivide cell *c* if

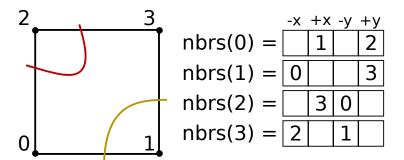
(P1) cell c intersects more than one object

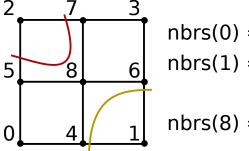
(P2) a neighbor of *c* intersects a different object



## Octree – data structure

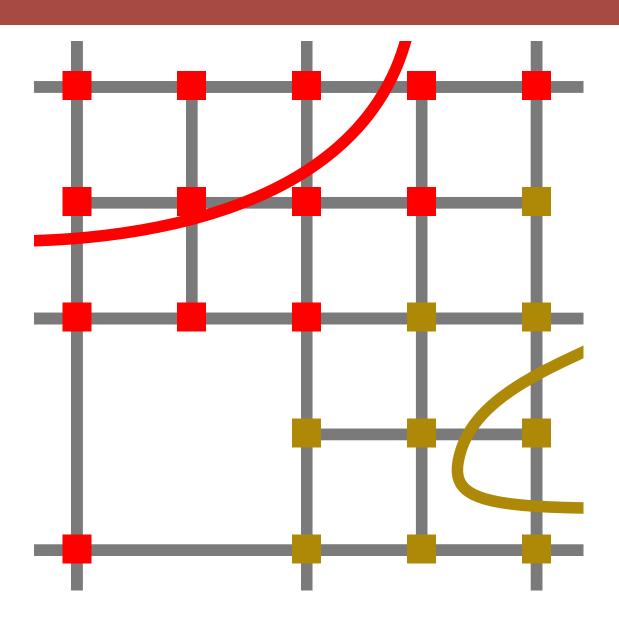
#### Cell vertices store neighbors – no hierarchy

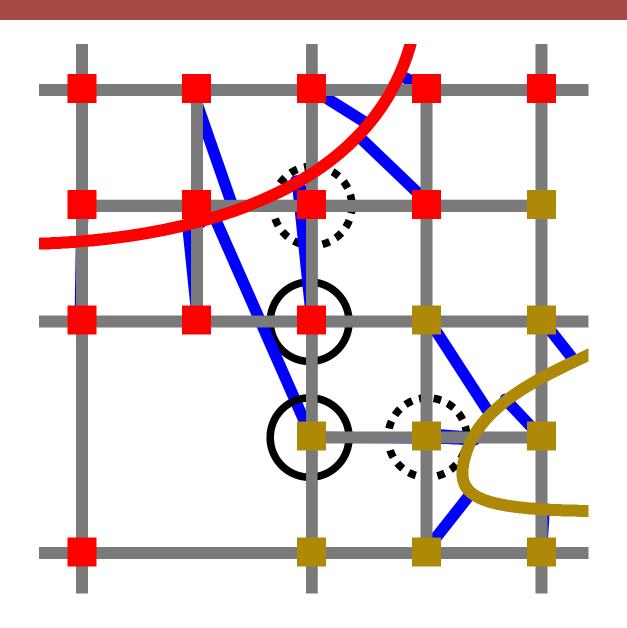


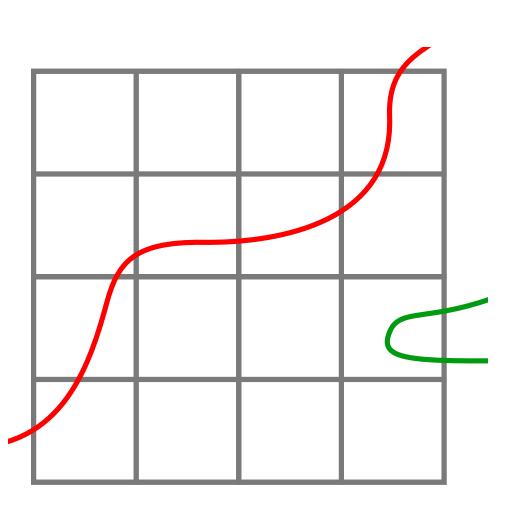


	-X	+x	-у	<b>+</b> y	
nbrs(0) =		4		5	
nbrs(1) =	4			6	
nbrs(8) =	5	6	4	7	

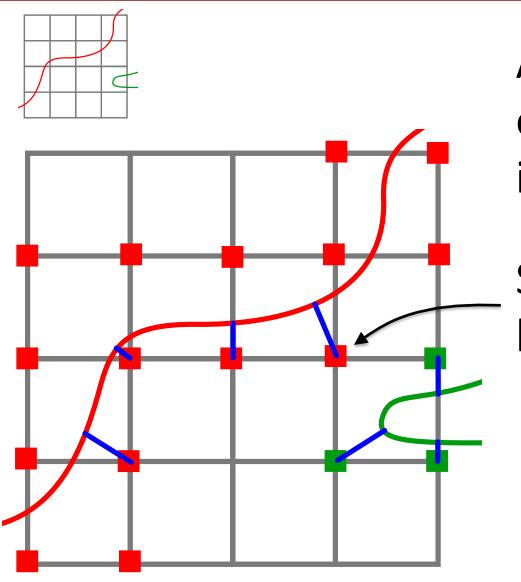
	Neighbor finding	Point location
Hierarchical	O(log N)	O(log N)
Flat (ours)	O(1)	O(N)





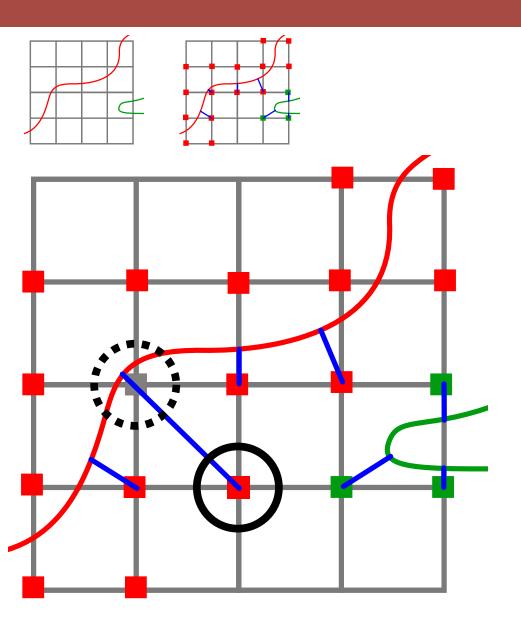


Example: start with two objects

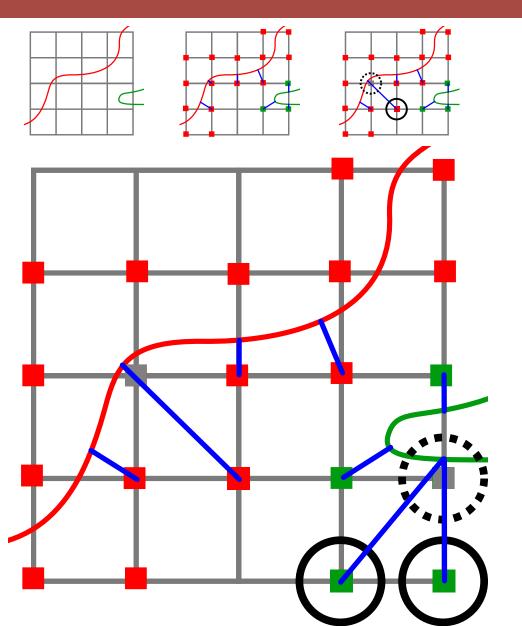


Assign vertices of octree cells that intersect objects

Some vertices belong to two cells

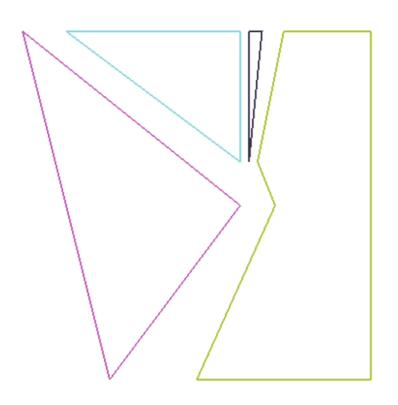


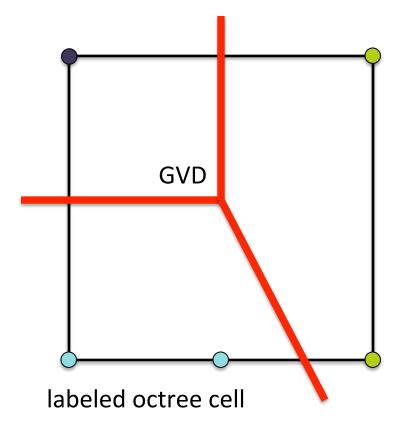
Propagate closest points to neighbor vertices



Propagate closest points to neighbor vertices

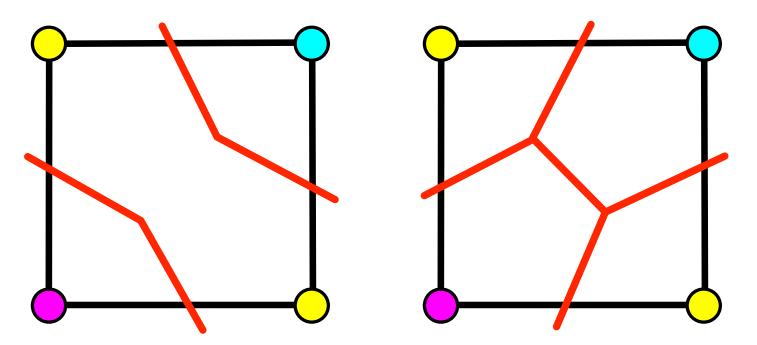
Wavefront propagates until all vertices have been assigned a label



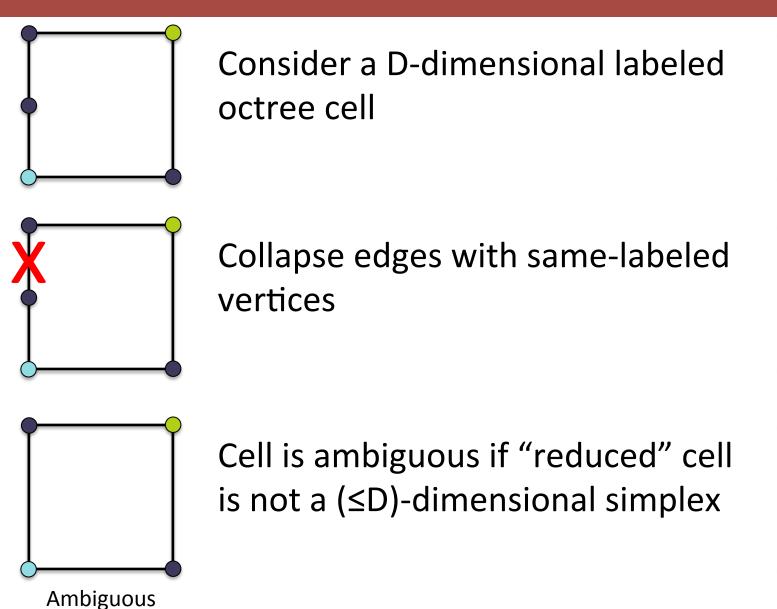


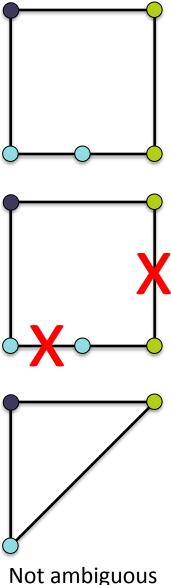
## **Ambiguity**

A cell is ambiguous if there is more than one topology the GVD can take on the interior of the cell



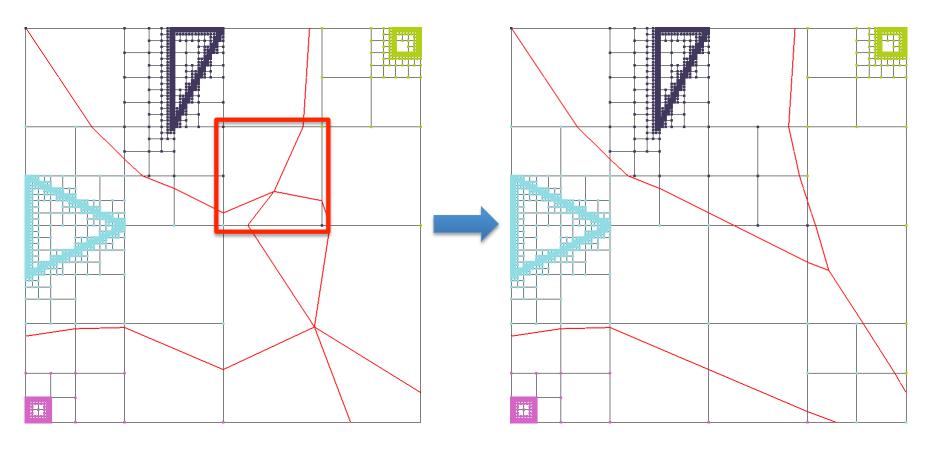
## Definition of ambiguity





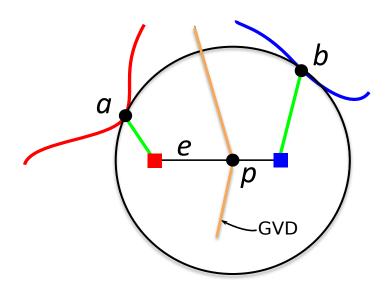
# Ambiguity resolution

#### Resolve ambiguities through subdivision



## GVD edge intersections

Where on an edge does the GVD reside? We seek point p = (x,y,z) on edge e.

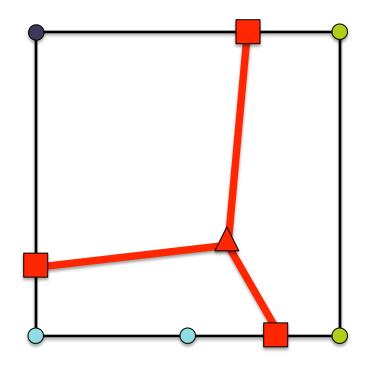


$$x = \frac{2y(a_y - b_y) + 2z(a_z - b_z) + b^T b - a^T a}{2(b_x - a_x)}$$

### 2D GVD construction

#### Given a 2D cell with labeled vertices:

- 1. Compute GVD-edge intersections
- 2. Compute GVD center point
  - Center point = center of mass of edge intersections
- 3. Connect edge intersections with center point



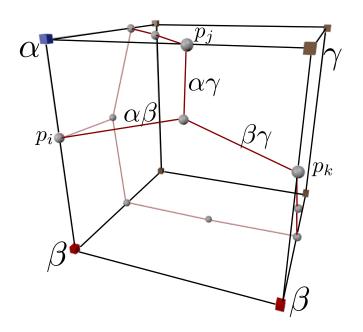
= GVD edge intersection= GVD center point

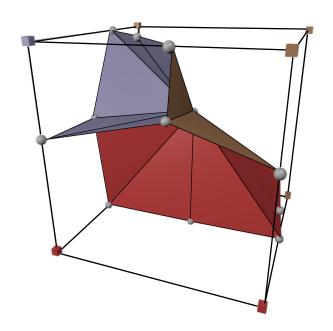
**=** GVD

## 3D GVD construction

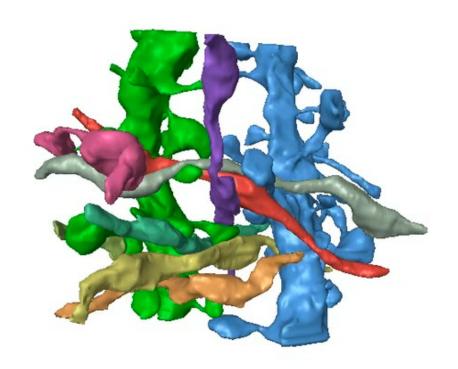
#### Given a 3D cell with labeled vertices:

- 1. Compute 2D GVD for each face
- 2. Triangulate 2D GVDs with cell center

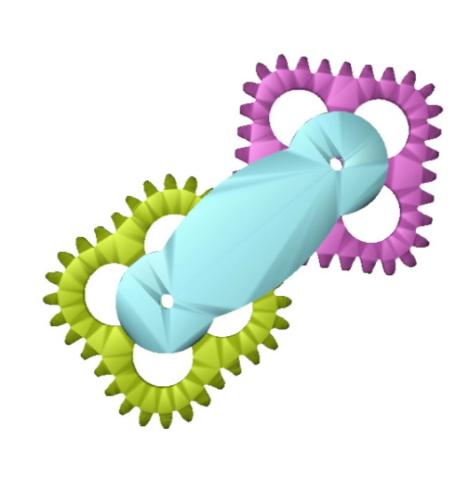




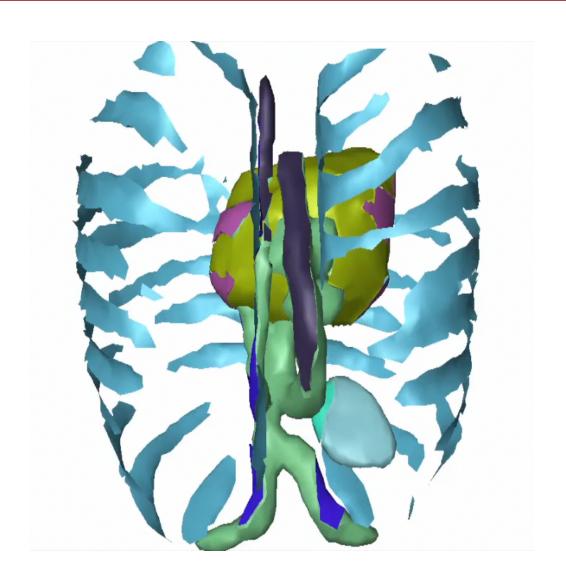
# Results



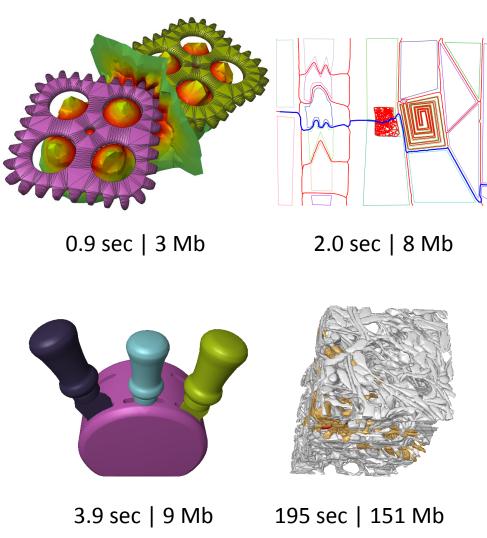
# Results

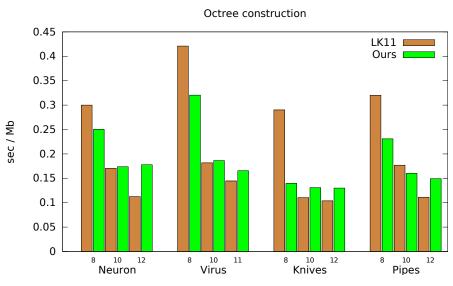


# Results



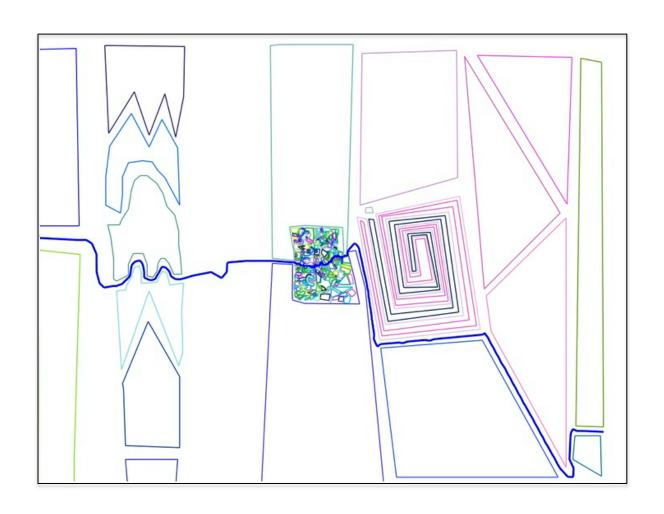
## Performance



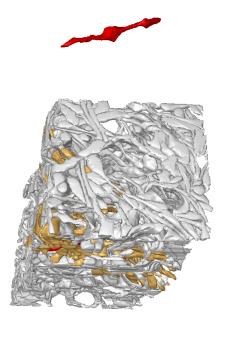


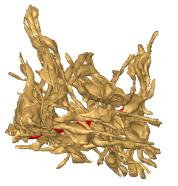
Comparison with Laine and Karras (LK11), which computes an octree that models objects

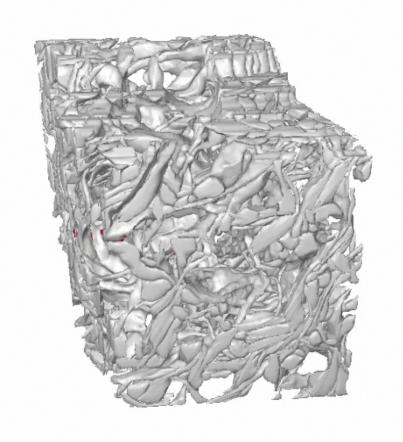
# Applications – path finding



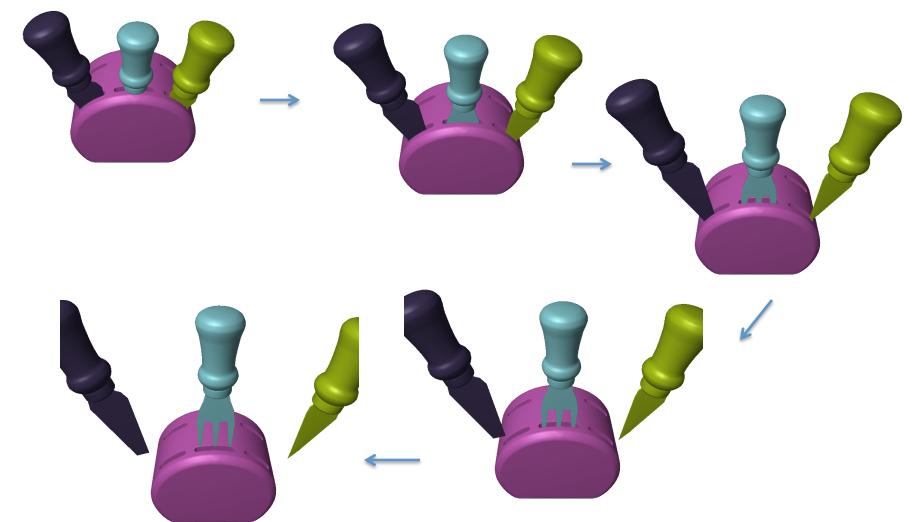
## Applications – proximity query



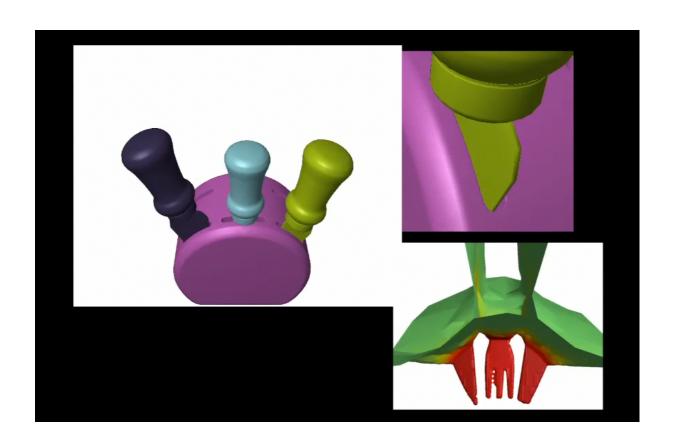




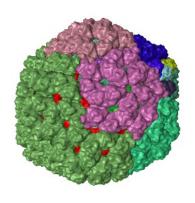
## Applications – intersection-free motion



# Applications – intersection-free motion



# Applications – exploded diagrams





Centroid-based

**GVD-based** 

## Conclusion

#### Before:

fun CanComputeGVD(dataset)
if (grid fits in memory)
return TRUE
if (dataset is well-behaved)
return PROBABLY
return FALSE

#### Now:

fun CanComputeGVD(dataset) return TRUE

## Summary

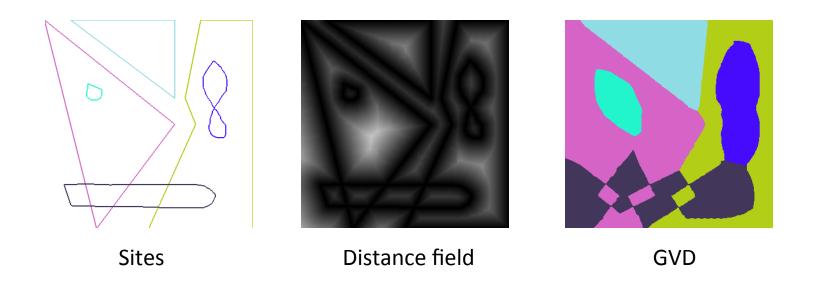
- GVD can now be computed on arbitrary datasets
- Applications involving difficult datasets are unlocked
- Further work needs to be done for
  - Improved error bound on distance transform
  - Parallelization and other optimizations

# Thank you



Code and datasets available at cedmav.org

## Relationship to medial axis



- Medial axis is the locus of critical points of the distance field
- GVD is a subset of the medial axis