# Fast exact parallel 3D mesh intersection algorithm using only orientation predicates 

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## Mesh intersection

- Polygonal map overlay/intersection: important CAD/GIS problem

- 2 D intersection also extends to 3D.
- Applications: CAD, Additive Manufacturing, GIS, cross-interpolation after remeshing in CFD
- Our focus: 3D triangulated meshes



## EPUG-Overlay: 2D planar graph overlay

## Previous step, presented at 2015 ACM BIGSPATIAL

 Biggest example:- USWaterBodies: 21,652,410 vertices, 219,831 faces, with
- USBlockBoundaries: 32,762,740 vertices, 518,837 faces.
- (Images are of simpler similar datasets):


Time (w/o I/O):

- 1342 secs (1 thread)
- 149 secs ( 16 cores, 32 threads). 9X parallel speedup


## PINMESH: 3D point location

- Previous step, presented at 2016 Berlin Geometry Summit
- Uses rational numbers, Simulation of Simplicity, uniform grid, parallelism, simple data structures
- Biggest example: sample dataset with 50 million triangles.
- Preprocessing: 14 elapsed seconds on 16-core Xeon processor.
- Query time: $0.6 \mu \mathrm{~s}$ per point.
- Some test datasets:



## Roundoff Challenge

- Finite precision of floating point $\rightarrow$ roundoff errors.
- Common techniques (snap rounding, epsilon tweaking, etc): no guarantee.


Source: Kettner et al., Classroom examples of robustness problems in geometric computations

## - Big amount of data \& 3D $\rightarrow$ increase problem.

## - Exactness and performance: very important (e.g. guaranteed subroutine)

## Examples from CGAL mailing list (there are several other similar threads): People want exactness and performance!

I have implemented boolean operation using nef polyhedra. The performance however leaves something to be desired. A simple union between two spheres constructed from roughly 400 triangles each, take almost 8 seconds to solve(in release mode). Is this expected or might i be doing something to inhibit the performance. I am using an epec kernel which i know might impact performance. I have however been unable to get it working with other kernels. Even so, 8 seconds seems excessive for a simple union.


## Key techniques

- We've been using a combination of 5 techniques
- Arbitrary precision rational numbers: for exactness.
- Simulation of Simplicity: for ensuring all the special cases are properly handled.
- Simple data representation and local information: parallelization and correctness.
- Parallel programming: explore better the computing capability of current hardware.
- Two-level uniform grid: accelerate computation; quickly constructed in parallel.


## Rational numbers

- Each component of each coordinate is a ratio of integers
- No rounding or finite precision errors.
- Each integer: array of groups of digits
- Uses GMPXX
- Rationals double in size with each operation: $2 / 3+4 / 5=22 / 15$
- However depth of computation tree is small
- Problem: GMPXX liberally constructs new objects on heap
- Heap is superlinear time in number of objects, and parallel hostile.
- We minimize heap constructions.
- Increased execution time is tolerable.


## Current hardware

Massive shared memory

- is an underappreciated resource.
- External memory algorithms not needed for many problems.
- Virtual memory is obsolete.
- $\$ 40 \mathrm{~K}$ buys a workstation with 80 cores and 1TB of memory. Parallel computing
- Almost all processors, even my smart phone, are parallel.
- Algorithms that don't parallelize are obsolete.
- Nvidia GPUs are almost ubiquitous.
- However, 1 Xeon core is 20x more powerful than 1 CUDA core.


## Component: computing 2D intersections

- "Brute force": $\mathrm{O}(|\mathrm{A}| \mathrm{x}|\mathrm{B}|)$
- Other possible techniques:
- Sweep-line
- Complicated and doesn't parallelize
- Uniform grid
- Theoretical and experimentally: very efficient


## Uniform Grid

- Insert edges in grid cells (edge may be in several cells).
- For each grid cell $c$, compute intersections in $c$.
- 3D version is analogous
- Provably efficient for I.i.d. input
- Experimentally more efficient on irregular data than octrees

$4 \times 7$ uniform grid.
Blue map: 8 edges
Black map: 16 edges


## 3D-EPUG-OVERLAY

- Apply the key techniques mentioned before for 3D mesh intersection
- Rational numbers
- "3D maps" represented by a set of triangles
- Triangles: left/right objects
- 3D uniform grid for intersection and point location
- Simulation of Simplicity
- Algorithm designed to be parallel


Source: Autodesk


Source: Rockworks


## First step: triangle-triangle intersections

- A 3D uniform grid is created.
- Triangles from both meshes are inserted into the cells an enclosing cube intersects.
- Cells with "too many" pairs of triangles are refined, creating a second level grid (because the enclosing cube above is suboptimal).
- Intersection tests: Moller's algorithm for performance.
- Cells do not influence each other $\rightarrow$ process them in parallel

Red mesh: only one triangle intersects green


## Second step: retesselation

- Triangles are then split at the intersections.
- Intersection on each triangle $\rightarrow$ planar subdivision $\rightarrow$ retriangulation.
- Again, this step can be done in parallel on the triangles.

Red intersecting triangle:
split into 2 polygons $\rightarrow 7$ triangles


## Second step: retesselation

- Retesselated mesh: equivalent to the original
- Union of each split triangle is equal to the original triangle
- Non split triangles will also be in retesselated mesh
- After retesselation: intersections will only happen at common vertices/edges.

Red intersecting triangle: split into 2 polygons $\rightarrow 7$ triangles


## Third step: classification

- Finally, triangles are classified.
- Similar to edge classification in EPUG-OVERLAY.
- Only two basic cases for each triangle t (bounding A,B):
- $t$ outside other mesh $\rightarrow \mathrm{t}$ will not be in the output.
- $t$ inside region $R$ of the other mesh $\rightarrow t$ will bound $R \cap A$ and $R \cap B$.



## Triangles in the output

## Third step: classification

- How to locate a triangle?
- Simple and fast solution: point location (PinMesh)



## Special cases (geometric degeneracies)

- Ad-hoc enumerating special cases is error-prone.
- How many ways can a line intersect a polyhedron?
- Local rules must lead to a globally consistent result.
- Testing a point against a line must give a consistent result when comparing two polylines.
- Existing programs can get complicated cases wrong.
- Need a general solution.


## Simulation of Simplicity

- Edelsbrunner and Mücke:
- Simple and efficient general purpose technique.
- Globally consistent
- Basic idea: if points are perturbed, the degeneracies in geometrical problems will disappear and do not need to be treated.

Global consistency (uw, uv were coincident):

- $w^{\prime}$ is on the positive side of $u v$
$-w^{\prime}$ is closer to $x$ than $v^{\prime}$ is


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## Simulation of Simplicity ctd

- Perturbation
- Points are perturbed using orders of infinitesimals $\varepsilon^{i}$
- Infinitesimal: indeterminate (code simulates the effect of the infinitesimals - we do not actually use specific infinitesimals).


## Simulation of Simplicity - 3

- SoS has been successfully employed in the 2 D version of the problem
- Idea: translate one of the maps by $\left(\varepsilon, \varepsilon^{2}\right) \rightarrow$ no common edges/intersection at endpoints
- Example: two coincident polygons $\rightarrow$ translation $\left(\varepsilon, \varepsilon^{2}\right) \rightarrow$ no coincidence.
- Perturbation is only conceptual $\rightarrow$ resulting rectangle is actually equal to input triangles!



## SoS + 3D

- Mesh 0 is not perturbed, mesh 1 is translated by $\left(\varepsilon, \varepsilon^{2}, \varepsilon^{3}\right)$
- This perturbation presents some properties:
- Examples:
- A vertex from a mesh will never be on a triangle of the other one.
- Two co-planar triangles from distinct meshes never intersect.
- These properties $\rightarrow$ no coincidence between the two meshes.
- Example of consequence: intersection of two triangles (if exist) is always a line segment with non-zero length.


## Implementing SoS

- In a predicate:
- No coincidence $\rightarrow$ unperturbed result $=$ perturbed result $\neq 0$
- Coincidence $\rightarrow$ unperturbed result $=0$, unperturbed result $\neq 0$
- For performance:
- Two versions of each predicate:
- One developed for efficiency (standard algorithms from literature)
- One for simplicity (using as few predicates as possible).
- The simpler version: used when a coincidence is detected.
- Consequence: implement SoS only in few predicates.


## Implementing SoS

- It is possible to implement all the steps of the algorithm employing only orientation (1D, 2D and 3D) predicates.
- Example: intersection of two triangles $\rightarrow$ check if each edge of one triangle intersects the other triangle.
- Intersection of line ED with ABC ?
- orientation(A,B,E,D)=orientation(B,C,E,D)=orientation(C,A,E,D) ?



## Implementing SoS

- Challenge:
- If a vertex of mesh 0 has coordinates ( $x, y, z$ ), what is its perturbed coordinate? Ans: (x,y,z)
- If a vertex of mesh 1 has coordinates ( $x, y, z$ ), what is its perturbed coordinate? Ans: $\left(\mathrm{x}+\varepsilon, \mathrm{y}+\varepsilon^{2}, \mathrm{z}+\varepsilon^{3}\right)$
- If a vertex generated by an intersection of a triangle with an edge has coordinates ( $\mathrm{x}, \mathrm{y}, \mathrm{z}$ ), what is its perturbed coordinate?
- Ans: ???


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## Implementing SoS

- Challenge:
- If a vertex of mesh 0 has coordinates ( $\mathrm{x}, \mathrm{y}, \mathrm{z}$ ), what is its perturbed coordinate? Ans: (x,y,z)
- If a vertex of mesh 1 has coordinates ( $x, y, z$ ), what is its perturbed coordinate? Ans: $\left(\mathrm{x}+\varepsilon, \mathrm{y}+\varepsilon^{2}, \mathrm{z}+\varepsilon^{3}\right)$
- If a vertex generated by an intersection of a triangle with an edge has coordinates ( $\mathrm{x}, \mathrm{y}, \mathrm{z}$ ), what is its perturbed coordinate?
- Ans: ???
$\rightarrow$ store these coordinates implicitly
$\rightarrow$ process implicit coordinates in the predicates



## Experiments

- Algorithm implemented in C++.
- OpenMP (parallel) + GMPXX (exact coordinates)
- Experiments on a workstation
- Dual Intel Xeon E5-2687 processors, 8 cores, 2 threads/core
- 128 GB of RAM.
- Ubuntu Linux 16.04.


## - Comparison with:

- LibiGL: recent, exact, parallel and resolves self-intersections.
- CGAL Nef Polyhedra: exact
- QuickCSG: fast, parallel, but may fail (floating-point errors/do not handle special cases).


## Experiments

- Up to 37x faster than LibiGL
- Up to 281x faster than CGAL (935x including conversion)

| Mesh 0 | Mesh 1 | Triangles (thousands) |  |  |  | Running times (s) |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  |  |  | 3D-EPUG | LibiGL | CGAL |  | QuickCSG |
|  |  | Mesh 0 | Mesh 1 | Out | Inter.tests |  |  | Convert | Intersect |  |
| Casting10kf | Clutch2kf | 10 | 2 | 6 | 8 | 0.1 | 1.4 | 4.5 | 1.1 | 0.1 ${ }^{*}$ |
| Armadillo52kf | Dinausor40kf | 52 | 40 | 25 | 42 | 0.2 | 2.9 | 38.5 | 21.2 | 0.1 |
| Horse40kf | Cow76kf | 40 | 76 | 24 | 50 | 0.2 | 3.1 | 50.6 | 24.1 | 0.1 |
| Camel69kf | Armadillo52kf | 69 | 52 | 16 | 54 | 0.2 | 3.3 | 51.0 | 26.0 | 0.1 |
| Camel | Camel | 69 | 69 | 81 | 1181 | 20.0 | 16.7 | 60.8 | 228.6 | 1.0* |
| Camel | Armadillo | 69 | 331 | 43 | 33 | 0.4 | 14.3 | 189.9 | 80.0 | 0.3 |
| Armadillo | Armadillo | 331 | 331 | 441 | 5351 | 94.2 | 75.8 | 339.7 | 1198.2 | 3.9* |
| 461112 | 461115 | 805 | 822 | 808 | 876 | 2.8 | 64.7 | 753.2 | 473.2 | 1.0 |
| Kitten | RedCircBox | 274 | 1402 | 246 | 27 | 1.2 | 36.3 | 819.8 | 329.6 | 1.0 |
| Bimba | Vase | 150 | 1792 | 724 | 122 | 1.9 | 65.4 | 971.7 | 455.7 | 1.0 |
| 226633 | 461112 | 2452 | 805 | 1437 | 307 | 3.2 | 120.0 | 1723.7 | 905.5 | 2.0 * |
| Ramesses | Ramess.Trans. | 1653 | 1653 | 1571 | 866 | 4.6 | 102.7 | 1558.8 | 946.1 | $2.2 *$ |
| Ramesses | Ramess.Rot. | 1653 | 1653 | 1691 | 2275 | 6.6 | 122.5 | 1577.3 | 989.8 | 2.2 |
| Neptune | Ramesses | 4008 | 1653 | 1112 | 814 | 5.5 | 150.0 | 3535.5 | 1535.6 | 3.5 |
| Neptune | Nept.Transl | 4008 | 4008 | 3303 | 2924 | 10.9 | 247.9 | 5390.7 | 2726.2 | 5.4 |
| ArmadilloTetra | ArmadilloTetraTransl | 1602 | 1602 | 61325 | 259436 | 420.3 | - | - | - | - |
| 518092_tetra | 461112_tetra | 5938 | 8495 | 23181 | 255703 | 333.0 | - | - | - | - |

## - Slightly slower than LibiGL when a mesh is intersected with itself: too many SoS calls (non-optimmized, future work)

| Mesh 0 | Mesh 1 | Triangles (thousands) |  |  |  | Running times (s) |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  |  |  | 3D-EPUG | LibiGL | CGAL |  | QuickCSG |
|  |  | Mesh 0 | Mesh 1 | Out | Inter.tests |  |  | Convert | Intersect |  |
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| Horse40kf | Cow76kf | 40 | 76 | 24 | 50 | 0.2 | 3.1 | 50.6 | 24.1 | 0.1 |
| Camel69kf | Armadillo52kf | 69 | 52 | 16 | 54 | 0.2 | 3.3 | 51.0 | 26.0 | 0.1 |
| Camel | Camel | 69 | 69 | 81 | 1181 | 20.0 | 16.7 | 60.8 | 228.6 | 1.0* |
| Camel | Armadillo | 69 | 331 | 43 | 33 | 0.4 | 14.3 | 189.9 | 80.0 | 0.3 |
| Armadillo | Armadillo | 331 | 331 | 441 | 5351 | 94.2 | 75.8 | 339.7 | 1198.2 | $3.9 *$ |
| 461112 | 461115 | 805 | 822 | 808 | 876 | 2.8 | 64.7 | 753.2 | 473.2 | 1.0 |
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| Ramesses | Ramess.Rot. | 1653 | 1653 | 1691 | 2275 | 6.6 | 122.5 | 1577.3 | 989.8 | 2.2 |
| Neptune | Ramesses | 4008 | 1653 | 1112 | 814 | 5.5 | 150.0 | 3535.5 | 1535.6 | 3.5 |
| Neptune | Nept.Transl | 4008 | 4008 | 3303 | 2924 | 10.9 | 247.9 | 5390.7 | 2726.2 | 5.4 |
| ArmadilloTetra | ArmadilloTetraTransl | 1602 | 1602 | 61325 | 259436 | 420.3 | - | - | - | - |
| 518092_tetra | 461112_tetra | 5938 | 8495 | 23181 | 255703 | 333.0 | - | - | - | - |

## Experiments

## - Up to 3x slower than QuickCSG (tests without reported failures), but exact.

| Mesh 0 | Mesh 1 | Triangles (thousands) |  |  |  | Running times (s) |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  |  |  | 3D-EPUG | LibiGL |  | AL |  |
|  |  | Mesh 0 | Mesh 1 | Out | Inter.tests |  |  | Convert | Intersect | QuickCSG |
| Casting10kf | Clutch2kf | 10 | 2 | 6 | 8 | 0.1 | 1.4 | 4.5 | 1.1 | 0.1* |
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| Horse40kf | Cow76kf | 40 | 76 | 24 | 50 | 0.2 | 3.1 | 50.6 | 24.1 | 0.1 |
| Camel69kf | Armadillo52kf | 69 | 52 | 16 | 54 | 0.2 | 3.3 | 51.0 | 26.0 | 0.1 |
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| 518092_tetra | 461112_tetra | 5938 | 8495 | 23181 | 255703 | 333.0 | - | - | - | - |

- Up to 3x slower than QuickCSG (tests without reported failures), but exact.
-     * $\rightarrow$ QuickCSG failed and reported failure
- If a failure is not reported $\rightarrow$ result may still have errors

| Mesh 0 | Mesh 1 | Triangles (thousands) |  |  |  | Running times (s) |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  |  |  | 3D-EPUG | LibiGL | CGAL |  | QuickCSG |
|  |  | Mesh 0 | Mesh 1 | Out | Inter.tests |  |  | Convert | Intersect |  |
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| Horse40kf | Cow76kf | 40 | 76 | 24 | 50 | 0.2 | 3.1 | 50.6 | 24.1 | 0.1 |
| Camel69kf | Armadillo52kf | 69 | 52 | 16 | 54 | 0.2 | 3.3 | 51.0 | 26.0 | 0.1 |
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| 518092_tetra | 461112_tetra | 5938 | 8495 | 23181 | 255703 | 333.0 | - | - | - | - |

## Experiments

- Can process meshes with millions of triangles in few seconds.
- Can handle tetra-meshes (461112_tetra: 8 M triangles, 4 M tetrahedra).

| Mesh 0 | Mesh 1 | Triangles (thousands) |  |  |  | Running times (s) |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  |  |  | 3D-EPUG | LibiGL | CGAL |  | QuickCSG |
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| Camel69kf | Armadillo52kf | 69 | 52 | 16 | 54 | 0.2 | 3.3 | 51.0 | 26.0 | 0.1 |
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| 226633 | 461112 | 2452 | 805 | 1437 | 307 | 3.2 | 120.0 | 1723.7 | 905.5 | 2.0 * |
| Ramesses | Ramess.Trans. | 1653 | 1653 | 1571 | 866 | 4.6 | 102.7 | 1558.8 | 946.1 | 2.2 * |
| Ramesses | Ramess.Rot. | 1653 | 1653 | 1691 | 2275 | 6.6 | 122.5 | 1577.3 | 989.8 | 2.2 |
| Neptune | Ramesses | 4008 | 1653 | 1112 | 814 | 5.5 | 150.0 | 3535.5 | 1535.6 | 3.5 |
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| ArmadilloTetra | ArmadilloTetraTransl | 1602 | 1602 | 61325 | 259436 | 420.3 | - | - | - | - |
| 518092_tetra | 461112_tetra | 5938 | 8495 | 23181 | 255703 | 333.0 | - | - | - | - |

## Experiments

- Memory efficient:
- Neptune vs Neptune translated: 3D-EPUG: 5GB of RAM, LibiGL: $22.5 \mathrm{~GB}, \mathrm{CGAL}: 110 \mathrm{~GB}$, QuickCSG: 4.5 GB

| Mesh 0 | Mesh 1 | Triangles (thousands) |  |  |  | Running times (s) |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  |  |  | 3D-EPUG | LibiGL | CGAL |  | QuickCSG |
|  |  | Mesh 0 | Mesh 1 | Out | Inter.tests |  |  | Convert | Intersect |  |
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| Horse40kf | Cow76kf | 40 | 76 | 24 | 50 | 0.2 | 3.1 | 50.6 | 24.1 | 0.1 |
| Camel69kf | Armadillo52kf | 69 | 52 | 16 | 54 | 0.2 | 3.3 | 51.0 | 26.0 | 0.1 |
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| Bimba | Vase | 150 | 1792 | 724 | 122 | 1.9 | 65.4 | 971.7 | 455.7 | 1.0 |
| 226633 | 461112 | 2452 | 805 | 1437 | 307 | 3.2 | 120.0 | 1723.7 | 905.5 | 2.0* |
| Ramesses | Ramess.Trans. | 1653 | 1653 | 1571 | 866 | 4.6 | 102.7 | 1558.8 | 946.1 | 2.2* |
| Ramesses | Ramess.Rot. | 1653 | 1653 | 1691 | 2275 | 6.6 | 122.5 | 1577.3 | 989.8 | 2.2 |
| Neptune | Ramesses | 4008 | 1653 | 1112 | 814 | 5.5 | 150.0 | 3535.5 | 1535.6 | 3.5 |
| Neptune | Nept.Transl | 4008 | 4008 | 3303 | 2924 | 10.9 | 247.9 | 5390.7 | 2726.2 | 5.4 |
| ArmadilloTetra | ArmadilloTetraTransl | 1602 | 1602 | 61325 | 259436 | 420.3 | - | - | - | - |
| 518092_tetra | 461112_tetra | 5938 | 8495 | 23181 | 255703 | 333.0 | - | - | - | - |

## Example of result

- Intersection of two big meshes from AIM@SHAPE:
- Ramesses: 1.7 million triangles
- Neptune: 4 million triangles



## Example of result

- Hard to process triangles $\rightarrow$ roundoff errors


Example of result

- Hard to process triangles $\rightarrow$ roundoff errors



## Example of result

- QuickCSG: Ramesses vs Ramesses translated.
- No error reported
- Several failures



## Example of result

- QuickCSG: Ramesses vs Ramesses translated.
- To mitigate: numerical perturbation
- Does not work always (figure: max perturbation $=10^{-1}$ )


## Example of result

- QuickCSG: Ramesses vs Ramesses translated.
- To mitigate: numerical perturbation
- Does not work always (figure: max perturbation $=10^{-3}$ )



## Example of result

- QuickCSG: Ramesses vs Ramesses translated.
- To mitigate: numerical perturbation
- Does not work always (figure: max perturbation $=10^{-12}$ )


## The perturbed result

- Result with SoS.
- Result is valid considering the perturbed data.
- If perturbation is removed $\rightarrow$ possible topological errors, triangles with area 0 , polyhedra with volume 0 , etc.
- Solution:
- Do not remove the perturbation (i.e., other algorithms should know how the dataset was perturbed).
- Use regularization and other techniques to clean the results.


Self intersection, 2 regions/mesh
SIAM GD 2017

## Conclusions

- 3D-EPUG-OVERLAY
- Exact
- Parallel
- Uniform grid
- Part of a bigger project
- Exact and parallel geometric algorithms
- Applications in GIS, CAD and AM
- Fast and exact
- Future work:
- Improve performance (mainly of SoS calls)
- Use similar ideas for other problems


## Thank you!



Acknowledgement:

## Simulation of Simplicity

- Example: how to check if a point $q$ is directly "below" the interior of a triangle $t$ ?
- Project $q$ and $t$ to $\mathrm{z}=0$, check if $q^{\prime}$ is inside $t^{\prime}$ (also check $q_{z}$ ).
- Is $q^{\prime}$ inside $t^{\prime} ? \rightarrow$ barycentric coordinates $\rightarrow 0<\lambda_{\mathrm{i}}<1$ for $\mathrm{i}=1,2$ and 3 ?

$$
\begin{aligned}
& \lambda_{0}=\frac{\left(t_{1 y}^{\prime}-t_{2 y}^{\prime}\right) \times\left(q_{x}^{\prime}-t_{2 x}^{\prime}\right)+\left(t_{2 x}^{\prime}-t_{1 x}^{\prime}\right) \times\left(q_{y}^{\prime}-t_{2 y}^{\prime}\right)}{\operatorname{det}} \\
& \lambda_{1}=\frac{\left(t_{2 y}^{\prime}-t_{0 y}^{\prime}\right) \times\left(q_{x}^{\prime}-t_{2 x}^{\prime}\right)+\left(t_{0 x}^{\prime}-t_{2 x}^{\prime}\right) \times\left(q_{y}^{\prime}-t_{2 y}^{\prime}\right)}{\operatorname{det}} \\
& \lambda_{2}=1-\lambda_{0}-\lambda_{1} \\
& \operatorname{det}=\left(t_{1 y}^{\prime}-t_{2 y}^{\prime}\right) \times\left(t_{0 x}^{\prime}-t_{2 x}^{\prime}\right)+\left(t_{2 x}^{\prime}-t_{1 x}^{\prime}\right) \times\left(t_{0 y}^{\prime}-t_{2 y}^{\prime}\right)
\end{aligned}
$$

## Simulation of Simplicity

- Degeneracies: det $=0 \rightarrow$ vertical triangle
- Point on boundary of $t^{\prime}\left(\lambda_{i}=0\right.$ or 1$)$.
- $\operatorname{SoS} \rightarrow q(x, y, z) \rightarrow q_{\varepsilon}\left(x+\varepsilon, y+\varepsilon^{2}, z+\varepsilon^{3}\right), q^{\prime}(x, y) \rightarrow q_{\varepsilon}^{\prime}\left(x+\varepsilon, y+\varepsilon^{2}\right)$
- $\mathrm{q}_{\varepsilon}^{\prime}$ will never be on a vertex or edge of $\mathrm{t}^{\prime}$.
- $q^{\prime}$ is not on vertex/edge $\rightarrow q_{\varepsilon}^{\prime}$ is also not on vertex/edge (infinitesimal).
- $q^{\prime}$ is on vertex/edge $\rightarrow q_{\varepsilon}^{\prime}$ is not on vertex/edge (infinitesimal/slope).
- Ex: $q^{\prime}$ is on an edge $\rightarrow q_{\varepsilon}^{\prime}$ cannot be on the same edge (slope would be infinitesimal)


## Simulation of Simplicity

- SoS implementation:
- $q_{\varepsilon}^{\prime}$ will never be on a vertex or edge of $t^{\prime} \rightarrow$ if det $=0 \rightarrow$ false
- Replace $q^{\prime}$ with $q_{\varepsilon}^{\prime}$

$$
\begin{aligned}
& \lambda_{0}=\frac{\left(t_{1 y}^{\prime}-t_{2 y}^{\prime}\right) \times\left(q_{x}^{\prime}-t_{2 x}^{\prime}\right)+\left(t_{2 x}^{\prime}-t_{1 x}^{\prime}\right) \times\left(q_{y}^{\prime}-t_{2 y}^{\prime}\right)}{\operatorname{det}} \\
& \lambda_{1}=\frac{\left(t_{2 y}^{\prime}-t_{0 y}^{\prime}\right) \times\left(q_{x}^{\prime}-t_{2 x}^{\prime}\right)+\left(t_{0 x}^{\prime}-t_{2 x}^{\prime}\right) \times\left(q_{y}^{\prime}-t_{2 y}^{\prime}\right)}{\operatorname{det}} \\
& \lambda_{2}=1-\lambda_{0}-\lambda_{1} \\
& \operatorname{det}=\left(t_{1 y}^{\prime}-t_{2 y}^{\prime}\right) \times\left(t_{0 x}^{\prime}-t_{2 x}^{\prime}\right)+\left(t_{2 x}^{\prime}-t_{1 x}^{\prime}\right) \times\left(t_{0 y}^{\prime}-t_{2 y}^{\prime}\right)
\end{aligned}
$$

- SoS implementation:
- $\mathrm{q}_{\varepsilon}^{\prime}$ will never be on a vertex or edge of $\mathrm{t}^{\prime} \rightarrow \mathrm{if} \mathrm{det}=0 \rightarrow$ false
- Replace $q^{\prime}$ with $q_{\varepsilon}^{\prime} \rightarrow \lambda_{\mathrm{i}}$ with $\lambda_{\varepsilon i}$
- E.g.: is $0<\lambda_{\varepsilon \theta}$ ?
- $\lambda_{0} \neq 0 \rightarrow$ check $\lambda_{0}$
- $\lambda_{0}=0 \rightarrow$ check $t^{\prime}{ }_{l y}-t^{\prime}{ }_{2 y}$
- $t_{{ }_{l y}^{\prime}}-t_{2 y}^{\prime}=0 \rightarrow$ check $t_{2 x}^{\prime}-t^{\prime}{ }_{1 x}$
- Both can't be 0 .

$$
\begin{aligned}
& \lambda_{\epsilon_{0}}=\lambda_{0}+\frac{\left(t_{1 y}^{\prime}-t_{2 y}^{\prime}\right) \times \epsilon+\left(t_{2 x}^{\prime}-t_{1 x}^{\prime}\right) \times \epsilon^{2}}{\operatorname{det}} \\
& \lambda_{\epsilon_{1}}=\lambda_{1}+\frac{\left(t_{2 y}^{\prime}-t_{0 y}^{\prime}\right) \times \epsilon+\left(t_{0 x}^{\prime}-t_{2 x}^{\prime}\right) \times \epsilon^{2}}{\operatorname{det}} \\
& \lambda_{\epsilon_{2}}=1-\lambda_{\epsilon_{0}}-\lambda_{\epsilon_{1}}
\end{aligned}
$$

