

# Complexity and Computation of 3D Delaunay Triangulations

Nina Amenta (UC-Davis)

# Large inputs

Input point set, produce  
surface:

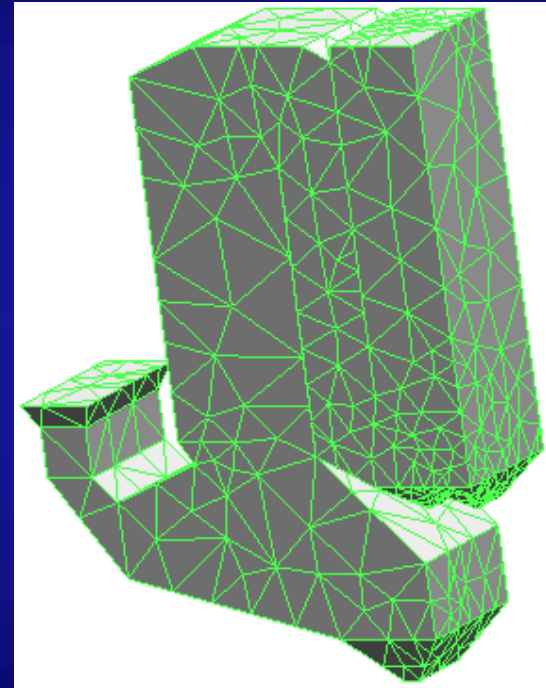
20,000 - 20,000,000



# Large inputs

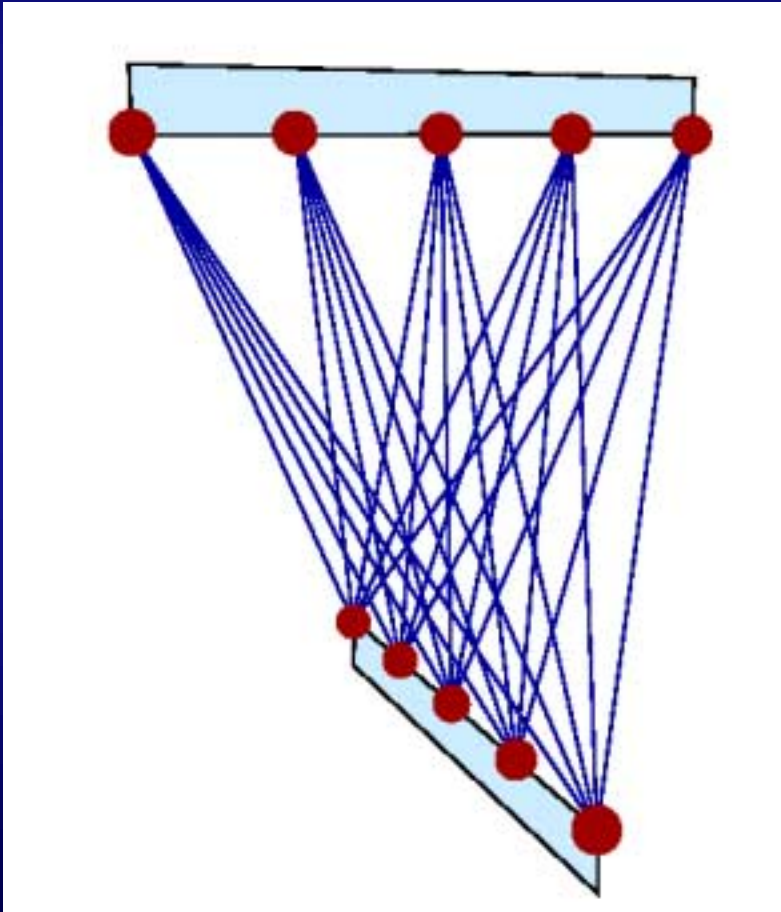
Input surface,  
produce tetrahedral  
mesh for finite  
element simulations;  
also medial axis.

Easily millions.



Shewchuk (98?)

# 3D Delaunay $O(n^2)$ ...

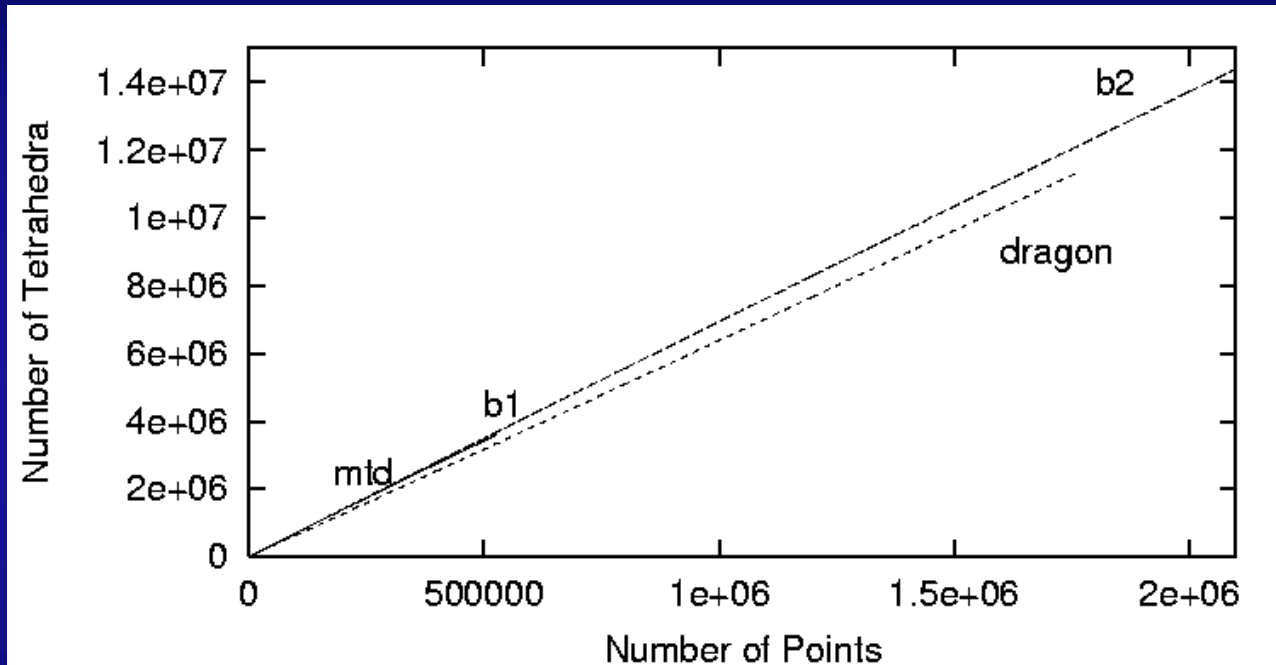


$n/2$  points on each  
of two skew lines.

Points on moment  
curve, etc.

All examples  
distributed on 1D  
curve?

... but linear in practice.



A & Choi, 01

Adding samples from surfaces in random order, #tetrahedra grows linearly.

# Linear special cases

Dwyer 91 - Uniform random in ball (any constant dimension)

Erickson 02 - Nicely sampled solid, "spread"  $O(n^{1/3})$

Golin & Na 00 - Uniform random on surface of convex polyhedron

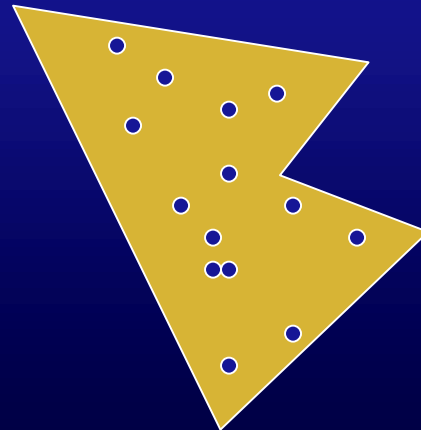
Attali & Boissonnat 02 - Nicely sampled polyhedral surface

# Sampling models

Consider behavior as  $n \rightarrow \infty$ .

Every point has a point within distance  $\varepsilon$  and no point within distance  $\delta$ .

Every point has  
 $1 \leq m \leq k$  samples  
within distance  $\varepsilon$ .



# Almost linear

Golin & Na 02 - Uniform random on polyhedral surface,  $O(n \log^4 n)$

Attali, Boissonnat & Lieuter 03 - Nice sampling, "generic" smooth surface  $S$ : singular points (with osculating maximal tangent balls) form a 1D set with fixed length,  $O(n \lg n)$

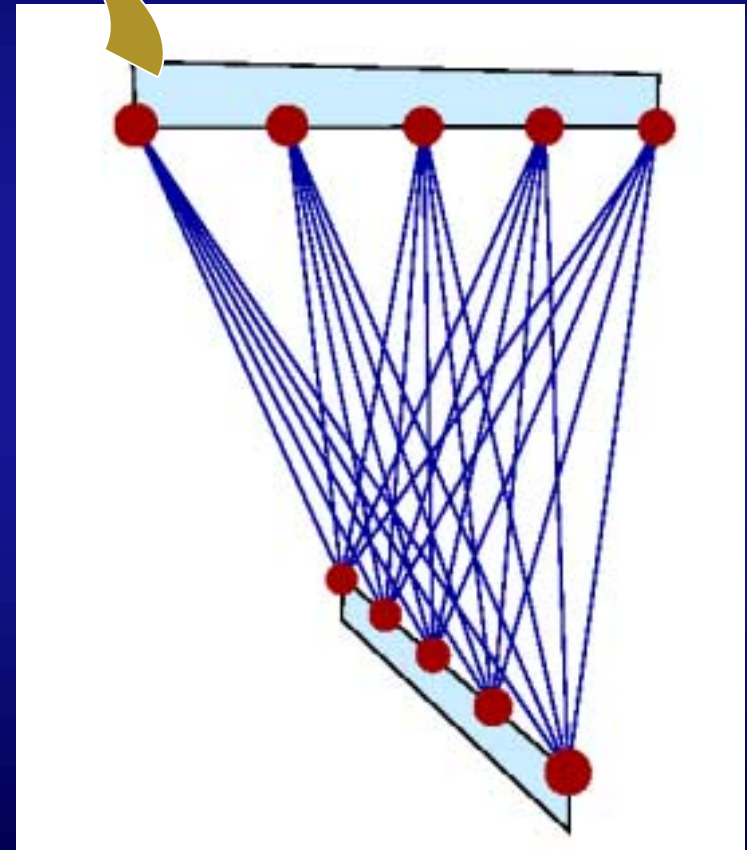
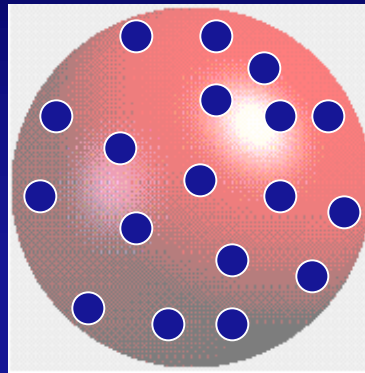


# Lower bounds



Jeff Erickson (by Howard Sun)

# Lower bounds



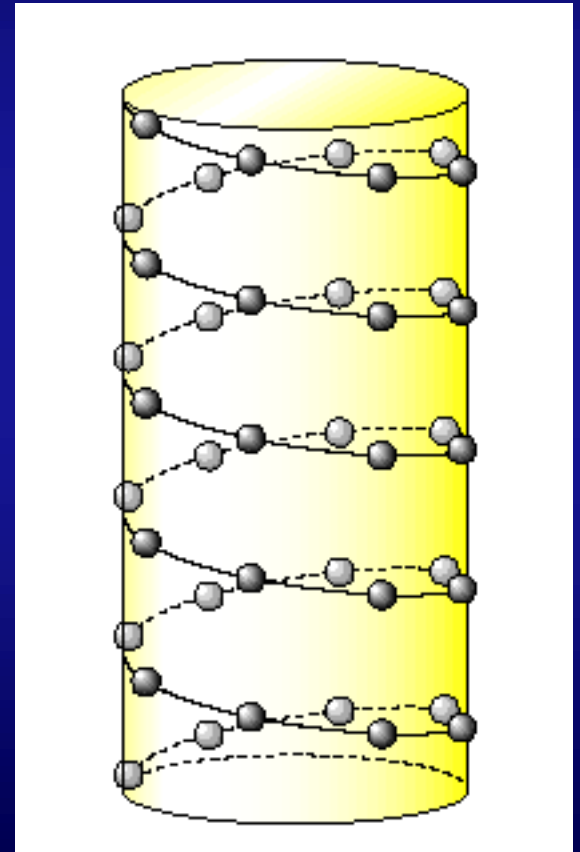
$O(\epsilon n)$  balls

Given  $n, \epsilon$ , can  
construct a surface  
and an  $\epsilon$ -sample with  
 $O(n^2\epsilon^2)$  triangulation.

# Lower bounds

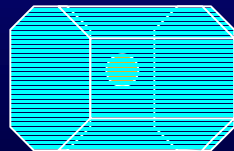
Helix with  $\sqrt{n}$  turns,  
 $\sqrt{n}$  samples per turn.

Fact (Erickson, Bochis &  
Santos): ball tangent to  
cylinder at 2 samples in  
same turn contains no  
other samples  $\rightarrow O(n^{3/2})$   
Delaunay edges.



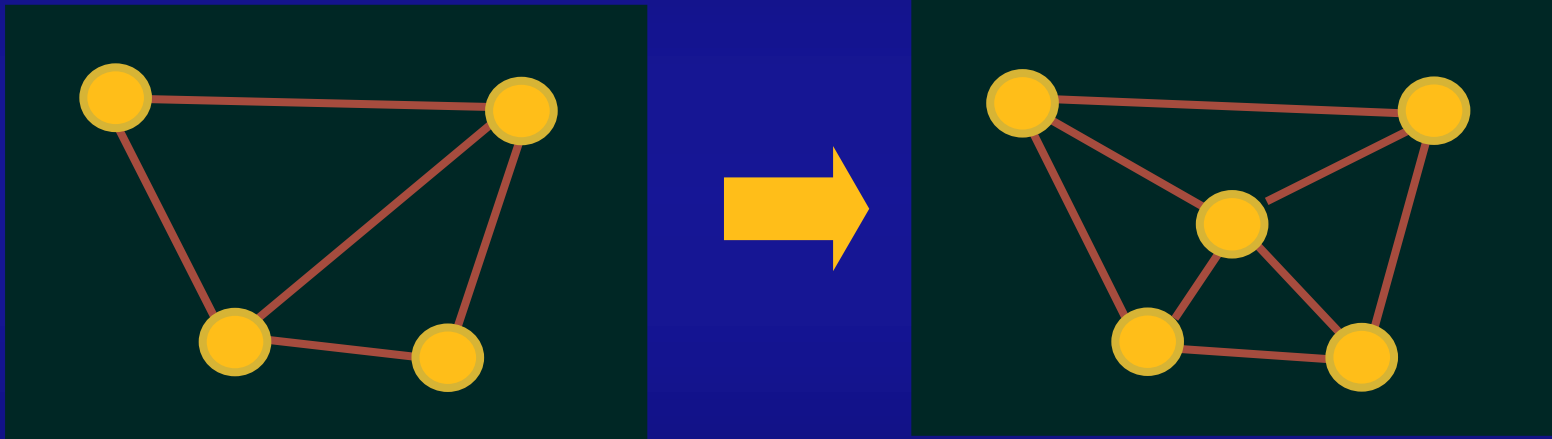
# Higher dimensions?

Conjecture: Nice distribution of samples from surface of co-dimension  $c$  has Delaunay triangulation of complexity  $O(n^{\lfloor c/2 \rfloor + 1})$  ?



Compute only  
“in-manifold”  
linear part?

# Randomized incremental algorithm



Add points one by one in random order, update triangulation with flips. Simple, optimal (worst-case expected time).

# Implementations

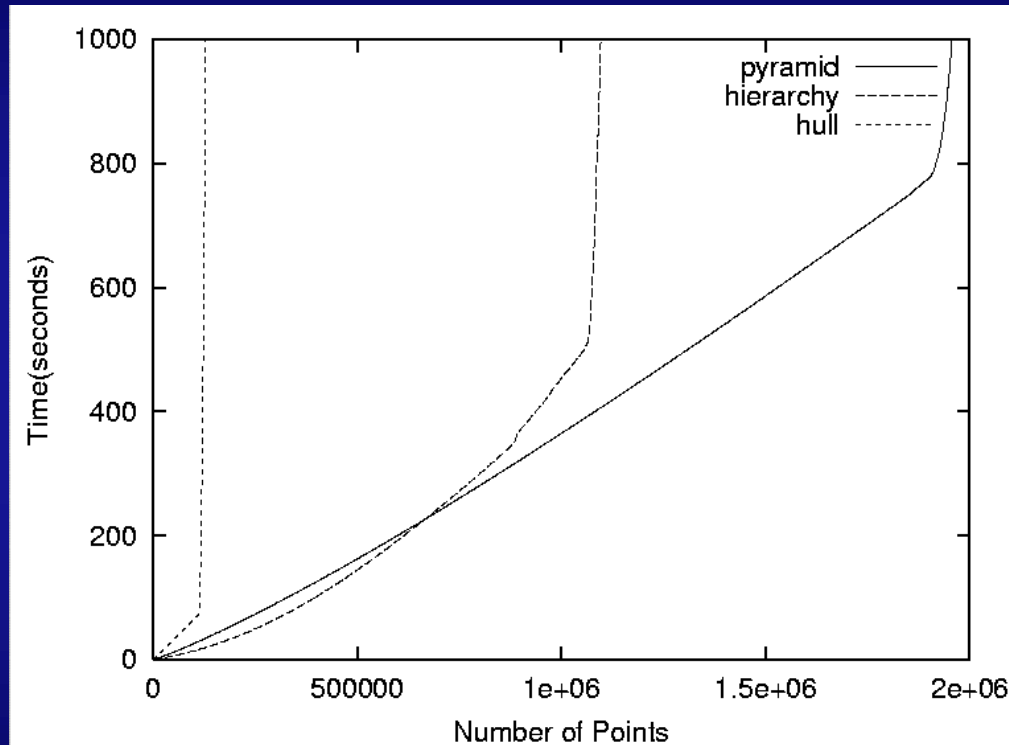
**delcx** - Edelsbrunner, Muecke, Facello  
92,96

**hull** - Clarkson 96

**CGAL Delaunay hierarchy** - Devillers,  
Teillaud, Pion 01

**pyramid** - Shewchuk, unreleased

# Memory usage



Performs great...until !

# Point location strategies

Theoretical bottleneck.

$O(\log n)$  per location possible with search data structure, but is it worth the effort in practice?

CGAL, hull - data structures

delcX, pyramid - no data structures

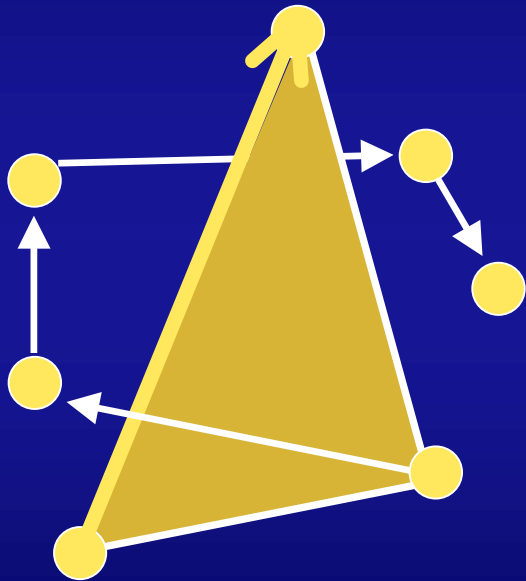


# Idea

Blelloch, Blandford, Cardoze, Kadow 03

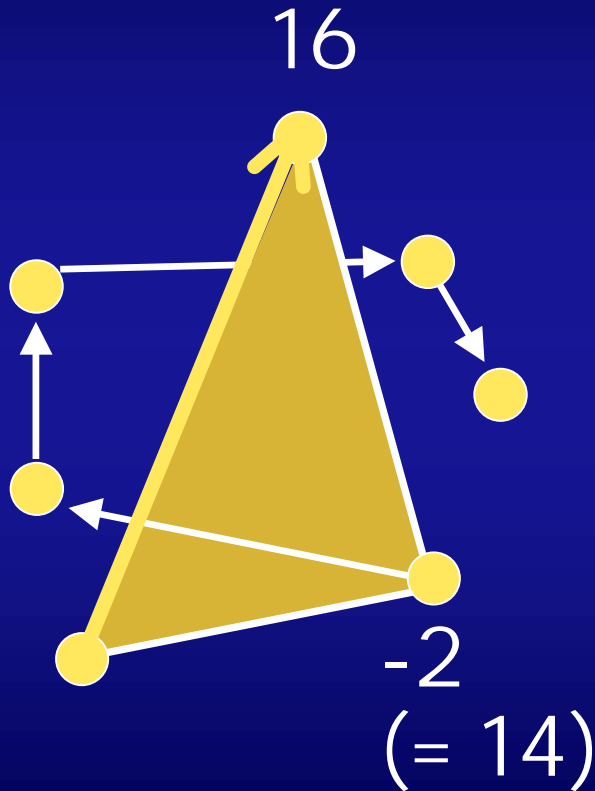
Compress representation of DT, while allowing updates.

# Representation



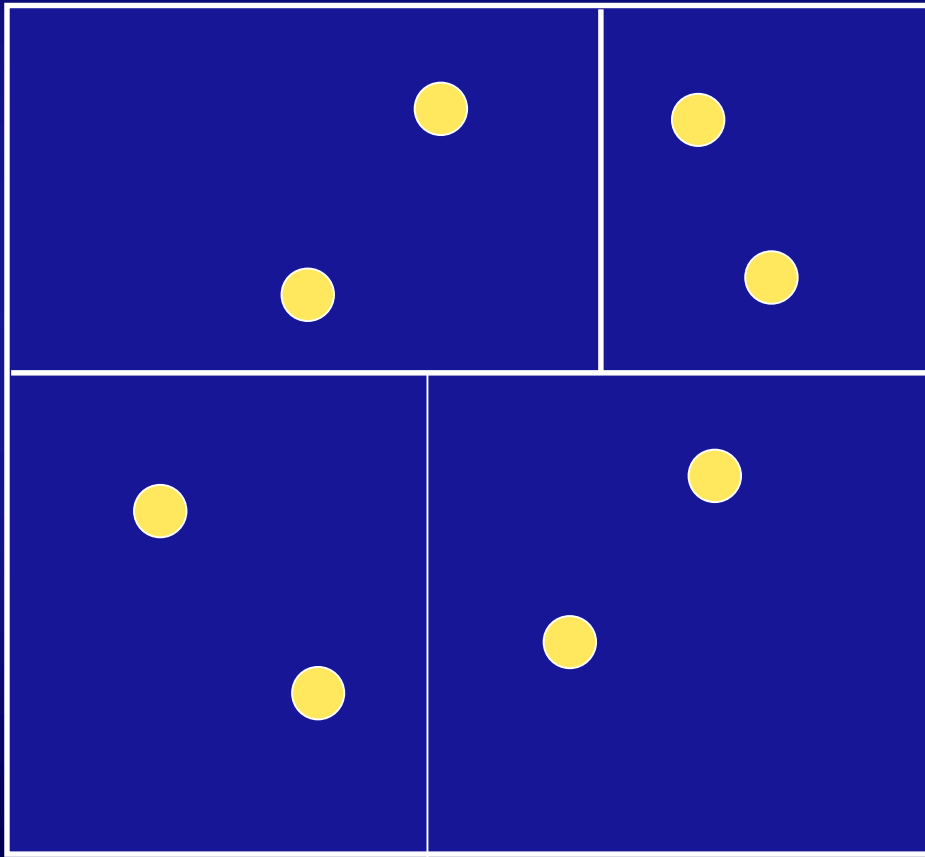
List vertex indices around each edge (with tricks to reduce redundancy).

# Representation



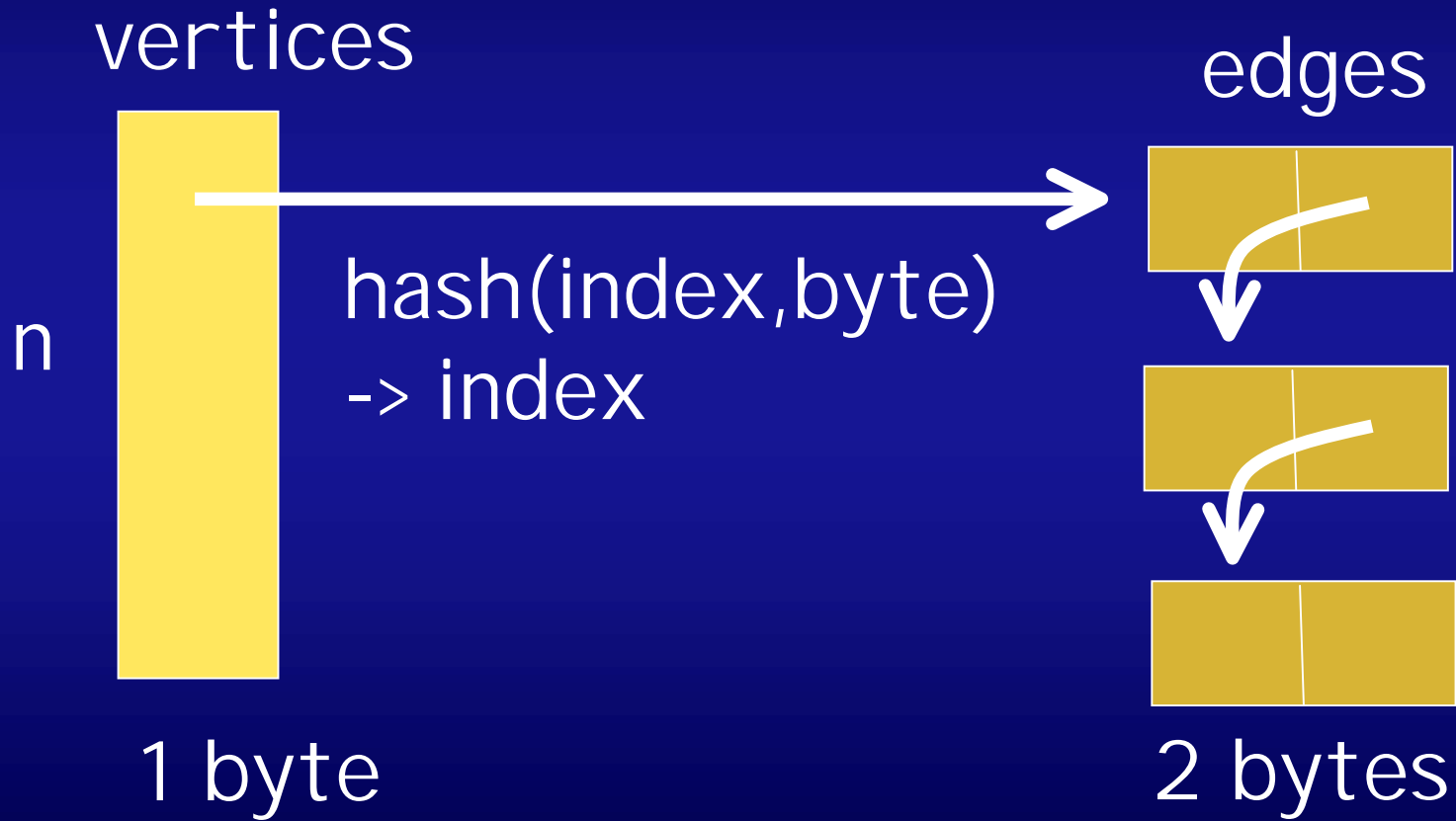
Use difference coding so each index is just a few bits.

# Assigning indices



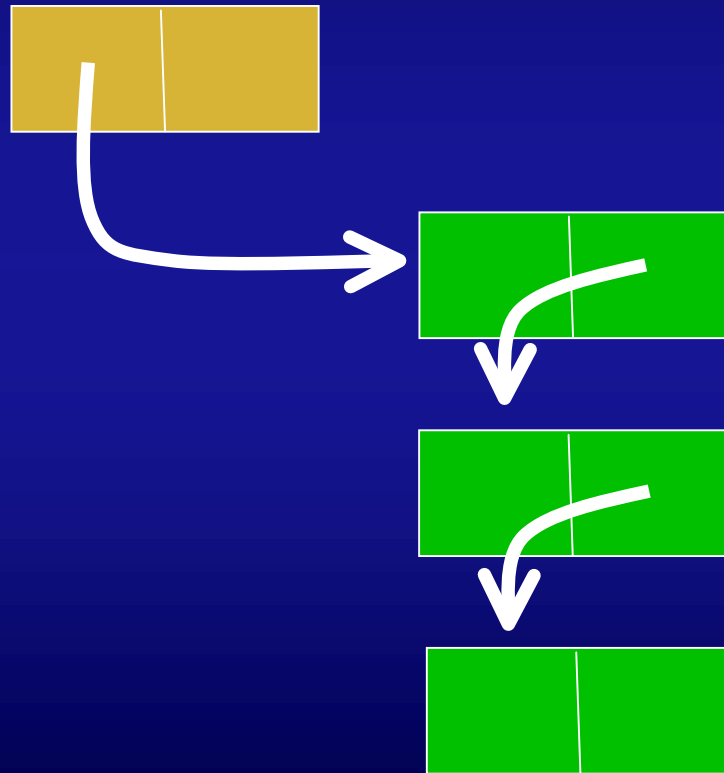
Use kd-tree to assign similar indices to points (hopefully) near each other in Delaunay triangulation.

# Data structures



# Data structures

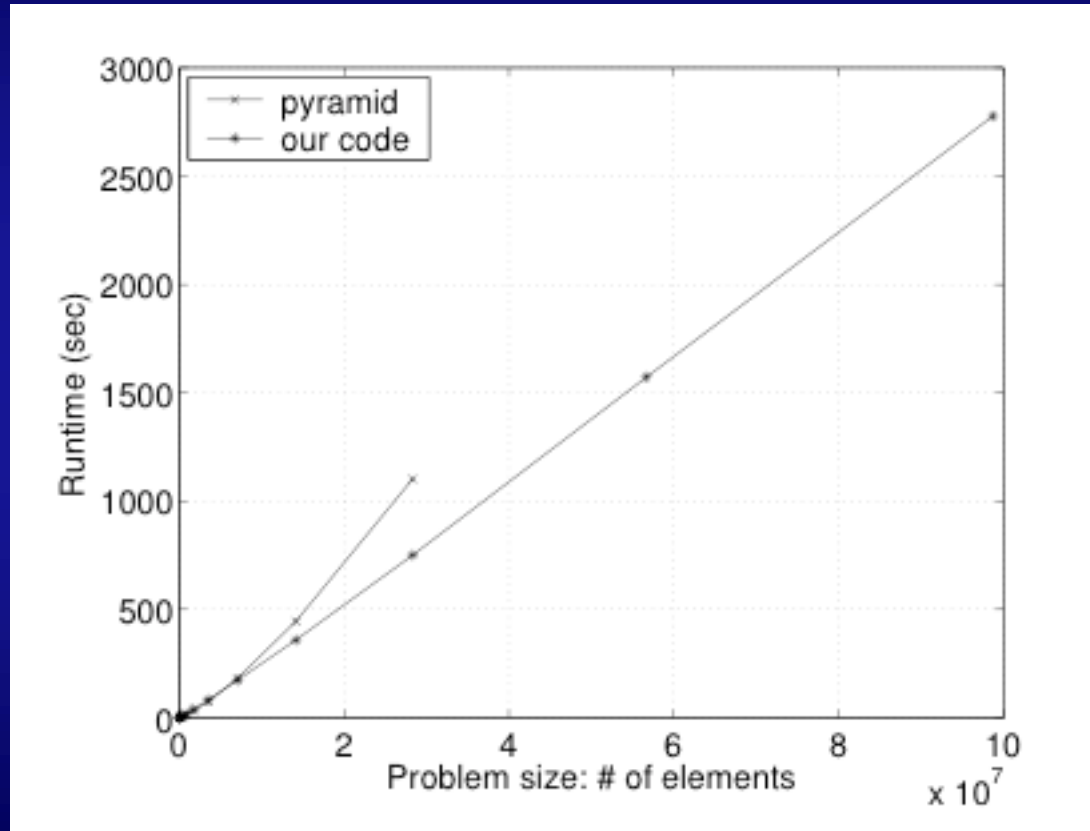
edge



offsets to  
surrounding  
vertices

# Compression results

50min



2 Gig, 2.4 GHz

100M tets = 10M pts

# Idea

**Partially** randomized insertion order

- increase locality of reference, especially as data structure gets large
- retain enough randomness to guarantee optimality



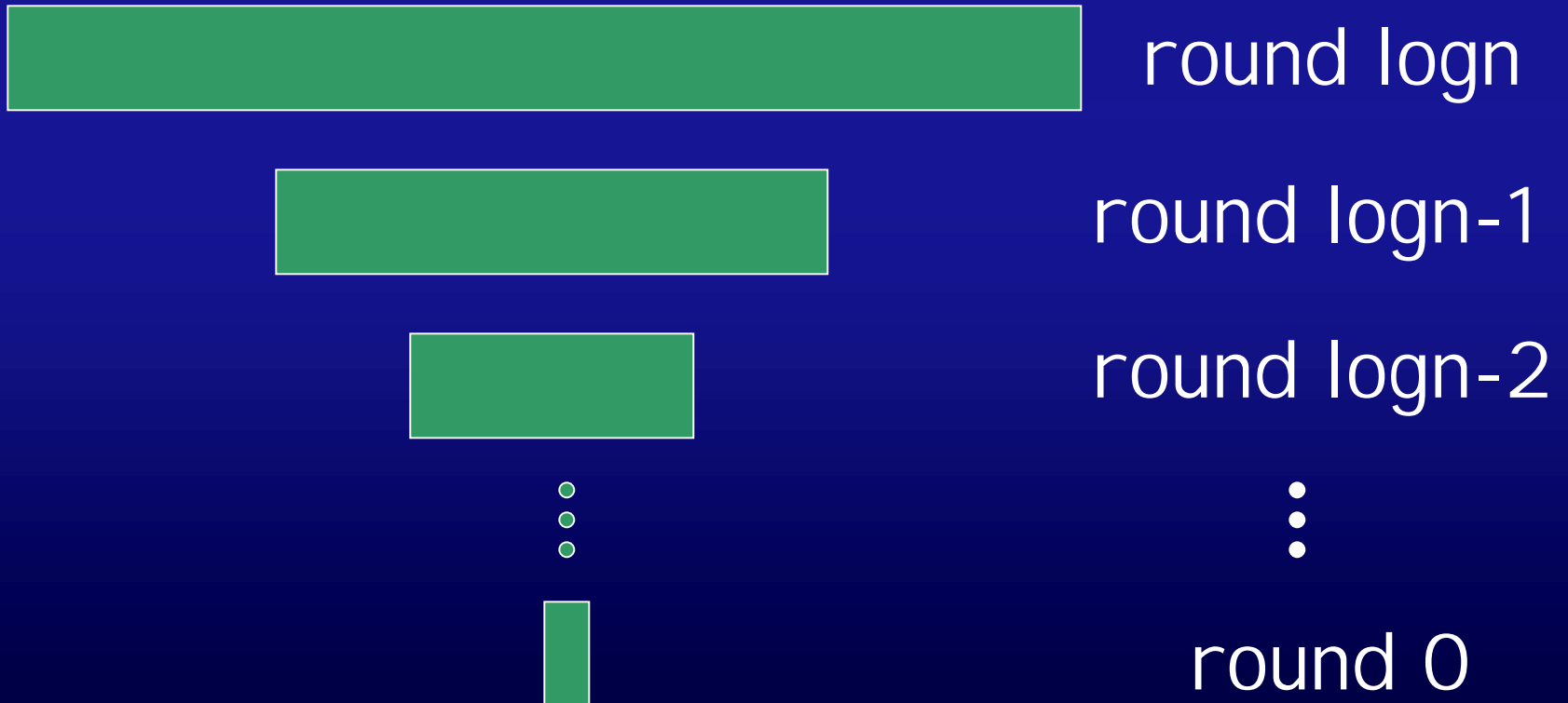
# Biased Randomized Insertion Order (BRI O)

(A, Choi, Rote, 03)

- Choose each point with prob =  $1/2$ .
- Insert chosen points recursively con BRI O.
- Insert the remaining points in arbitrary order.

# BRI O

log n rounds of insertion



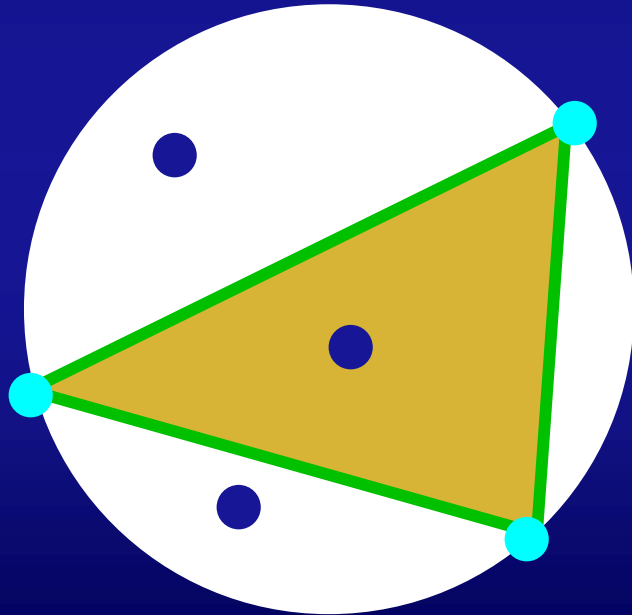
# Analysis

Randomness has two benefits:

- Bound total number of tetrahedra
- Bound time required for locating new points in triangulation

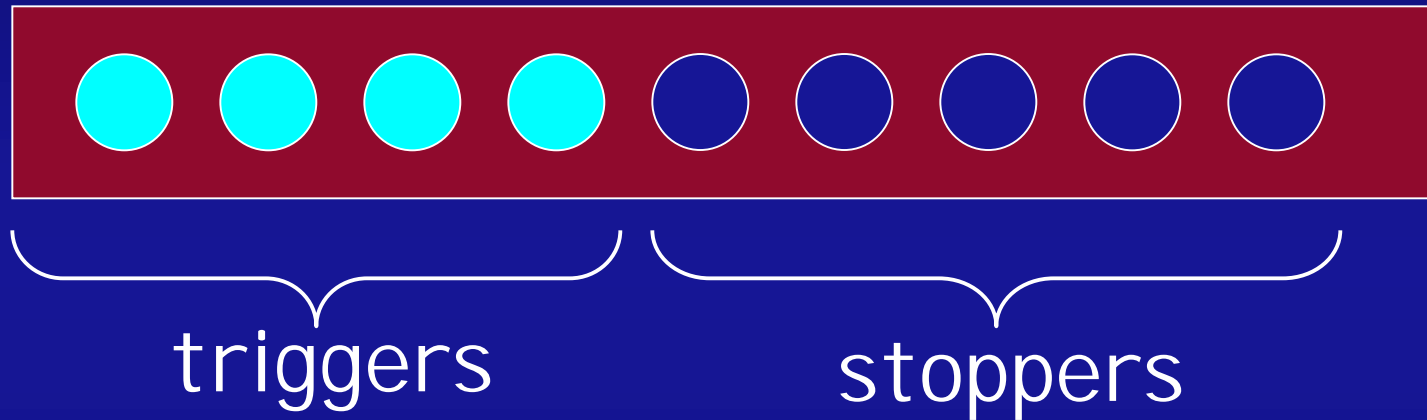
# Analysis

Adapted from Clarkson and Shor, Mulmuley



- triggers
- stoppers

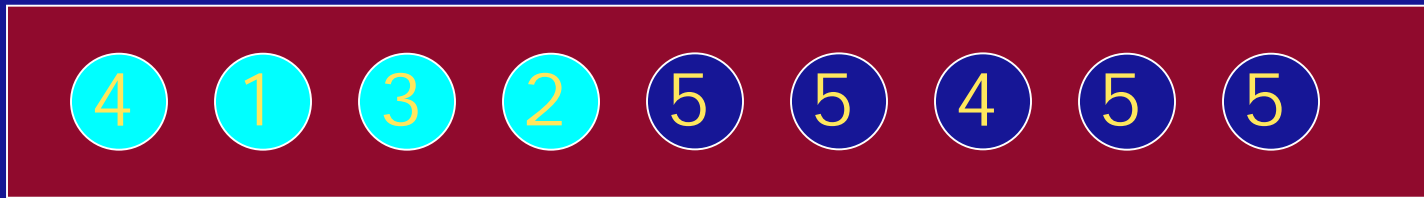
# Triggers and stoppers



A tetrahedron appears during construction if all its triggers are inserted before any of its stoppers.

# Probability tet appears

$\leq$  P[the round where all triggers are chosen is  
 $\leq$  the first round where any stopper is chosen]



= P [s+4 random numbers, the first 4  $\leq$  others]  
=  $O(1/s^4)$

Analysis of optimality goes through directly.

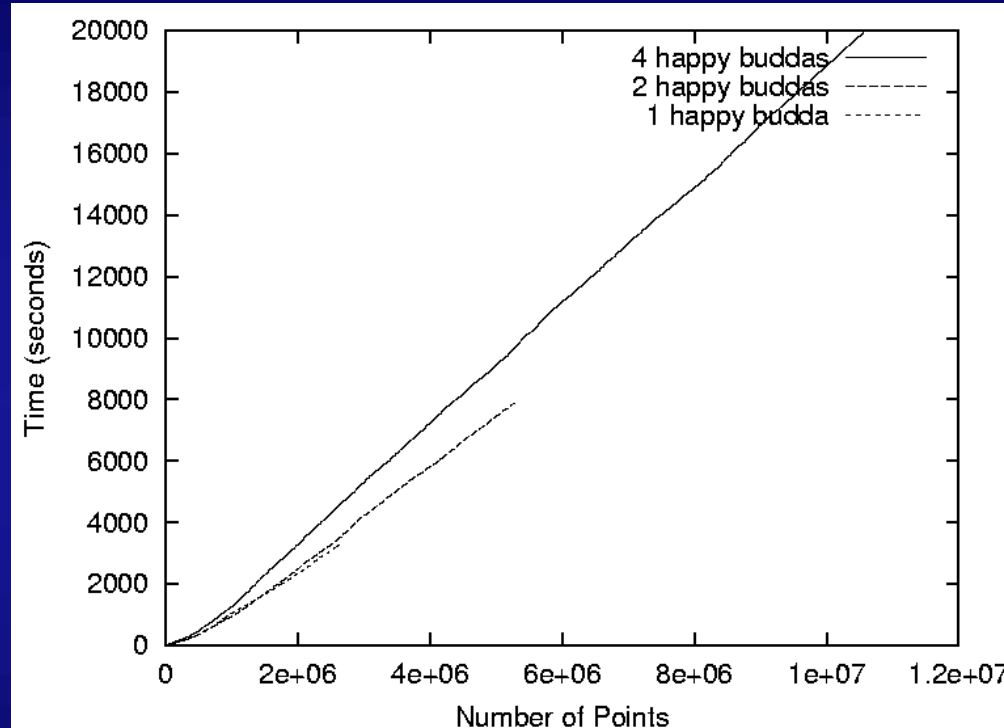
# Experiments - pyramid

Point location: "walk" from last inserted point.

Multiple "Happy buddha". 4096 kd-cells.

360 MHz, 128 M RAM, 4 GB Virtual memory

# Pyramid

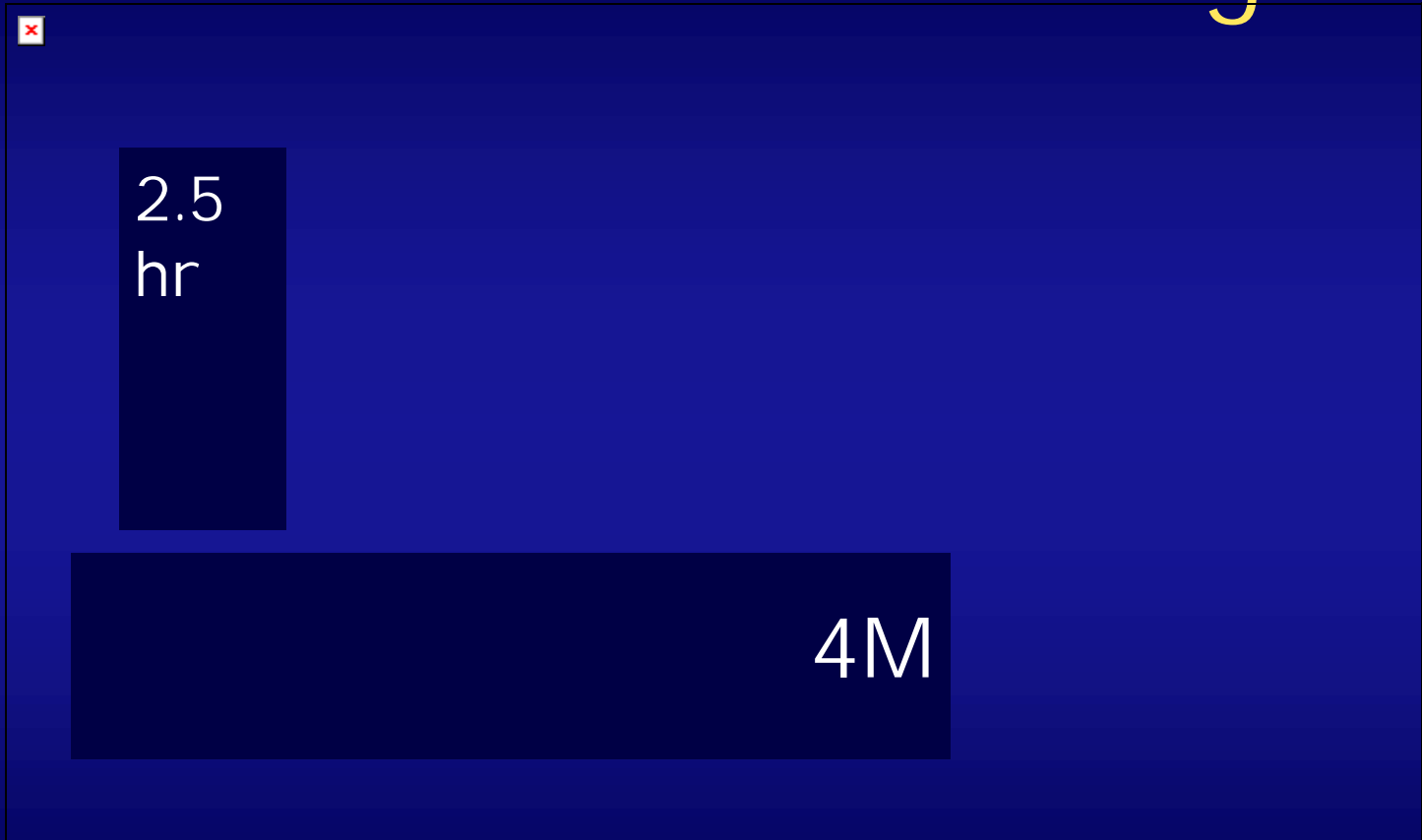


10 million points on tiny machine

1/2 hour on reasonable machine



# CGAL insertion strategies



Thanks to Monique Teillaud and Ian Bowman.

# Conclusion

Think of 3D Delaunay triangulation as essentially linear time, fairly efficient.

Really independent subproblems would help.