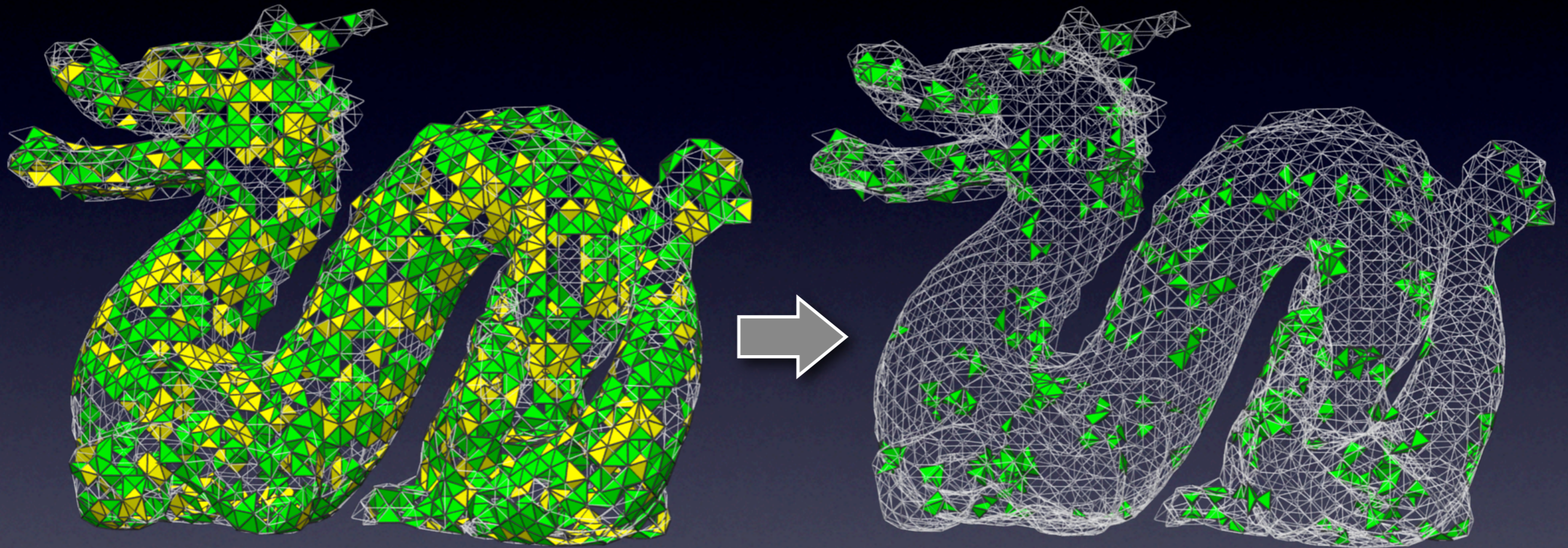


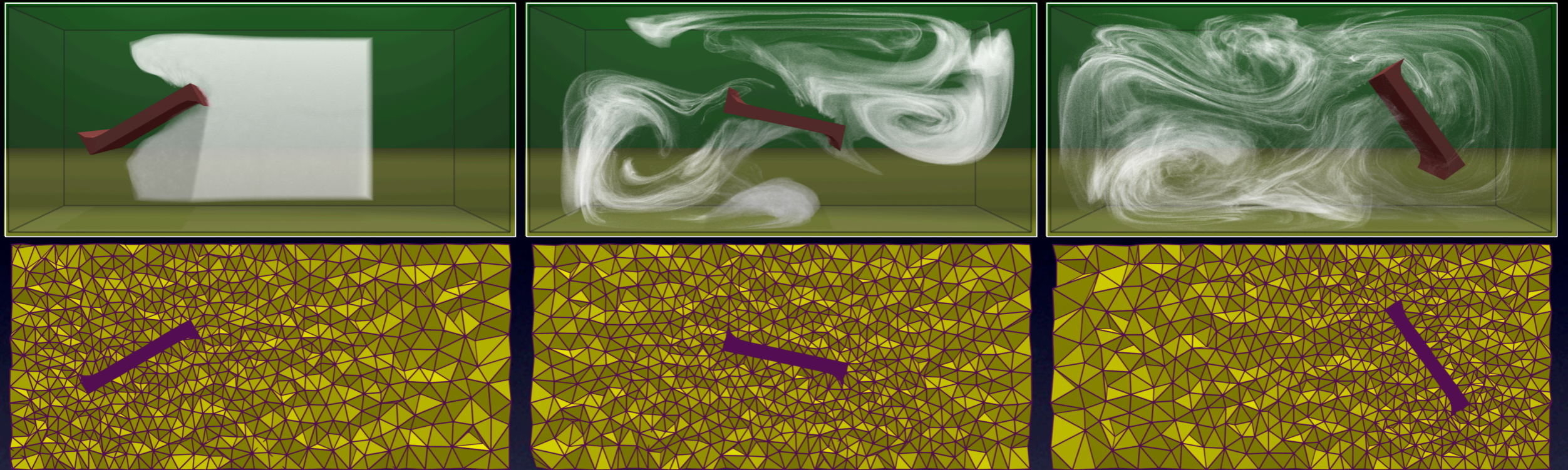
Tetrahedral Mesh Improvement



Bryan Klingner and Jonathan Shewchuk

12 March 2008

The usefulness of a mesh hinges on quality



bad elements



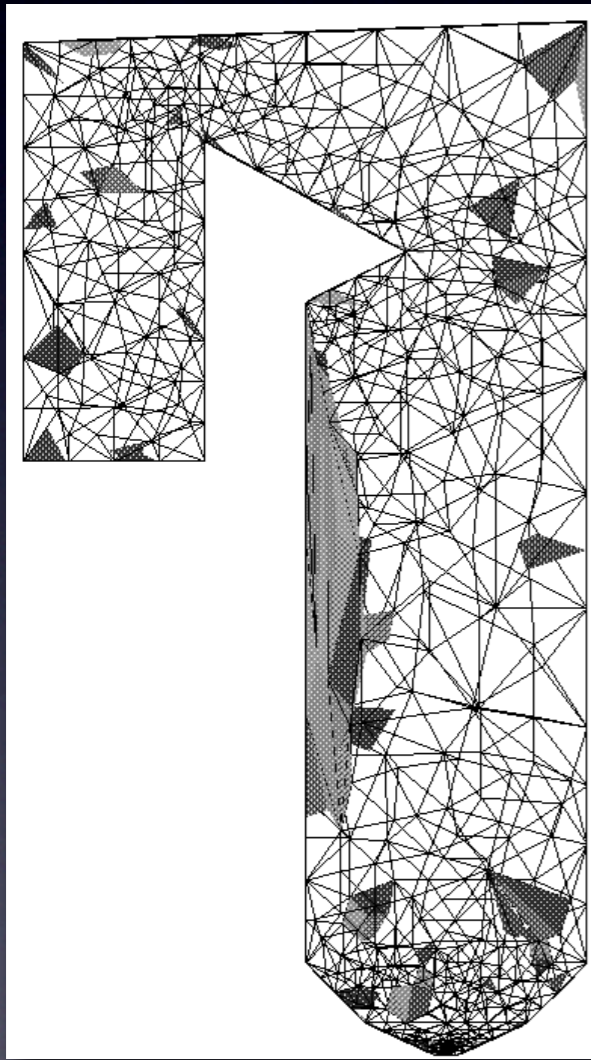
=

long running times

wrong answers

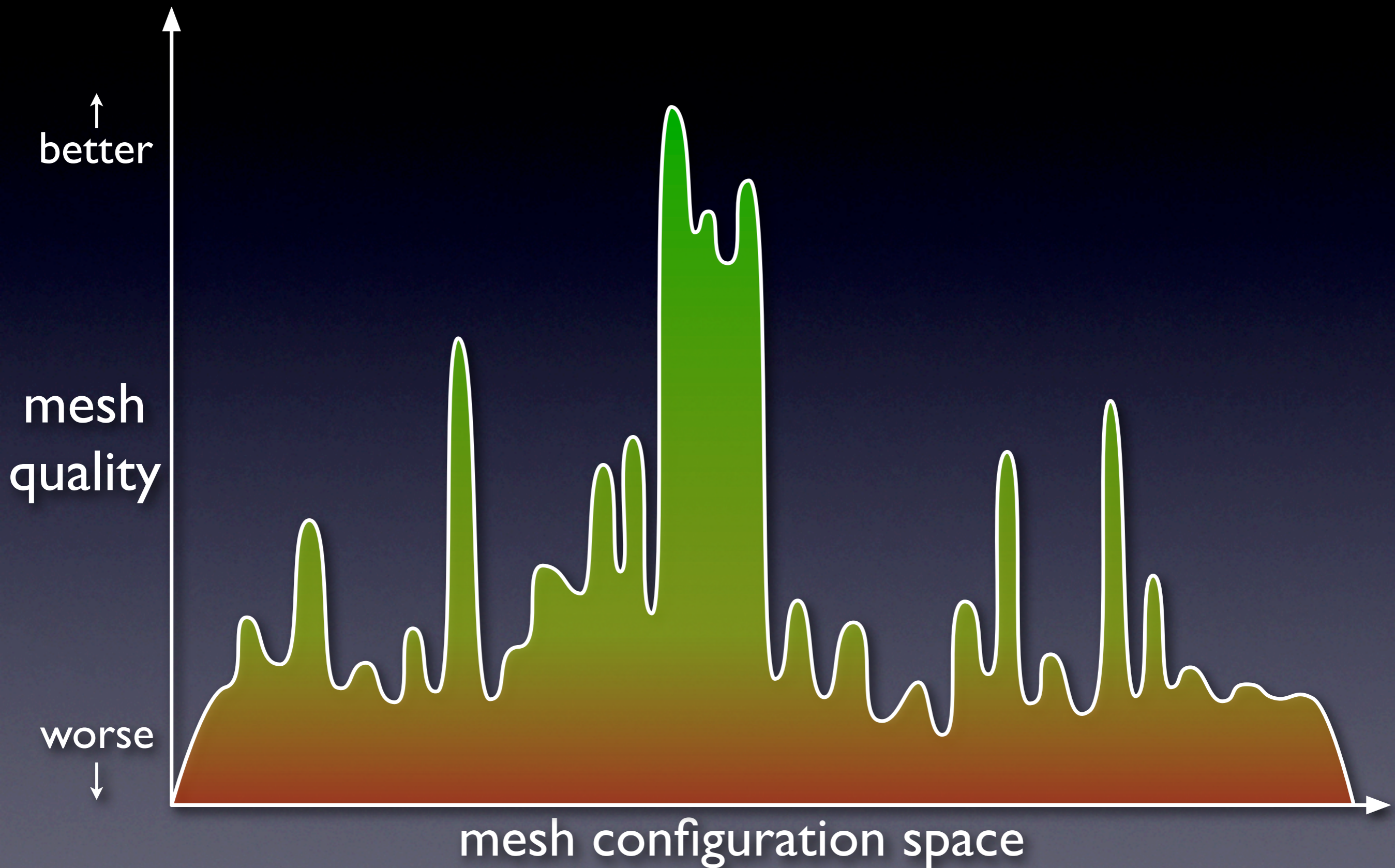
The best work so far:

“Tetrahedral Mesh Improvement Using Swapping and Smoothing”
Freitag and Ollivier-Gooch, 1997

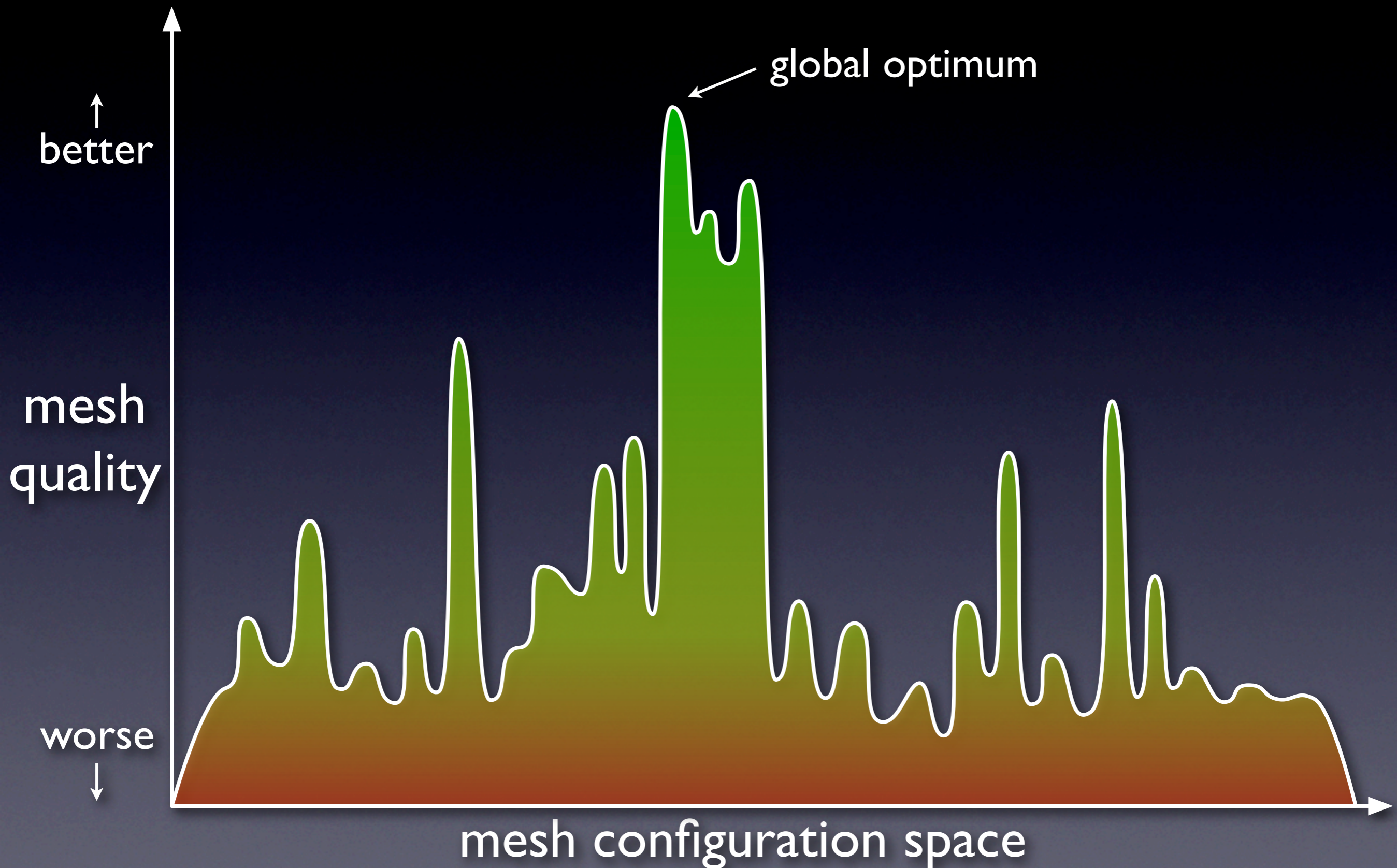


Collection of improvement operations
+
best experimental schedule
=
most bad elements removed

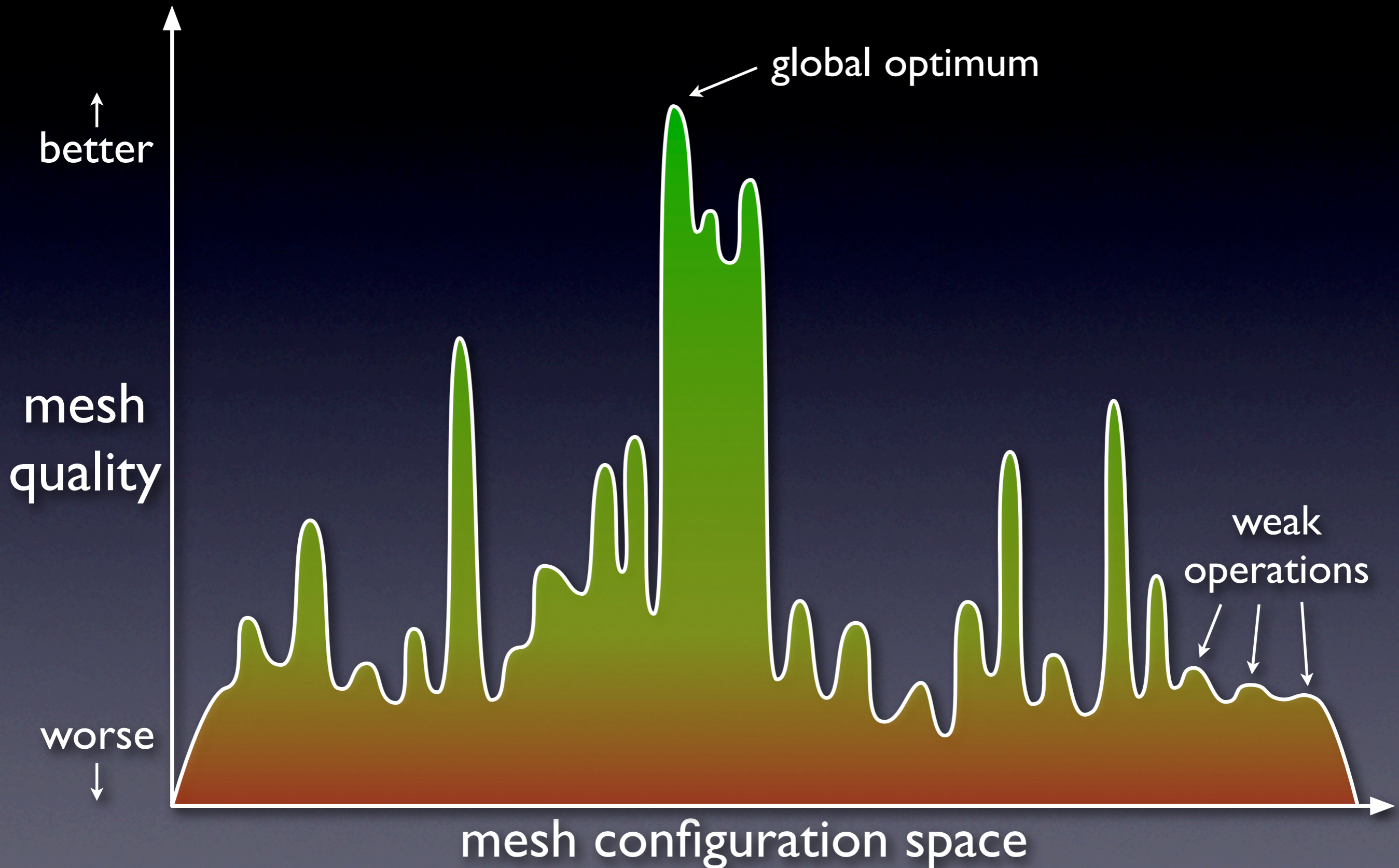
The mesh quality landscape



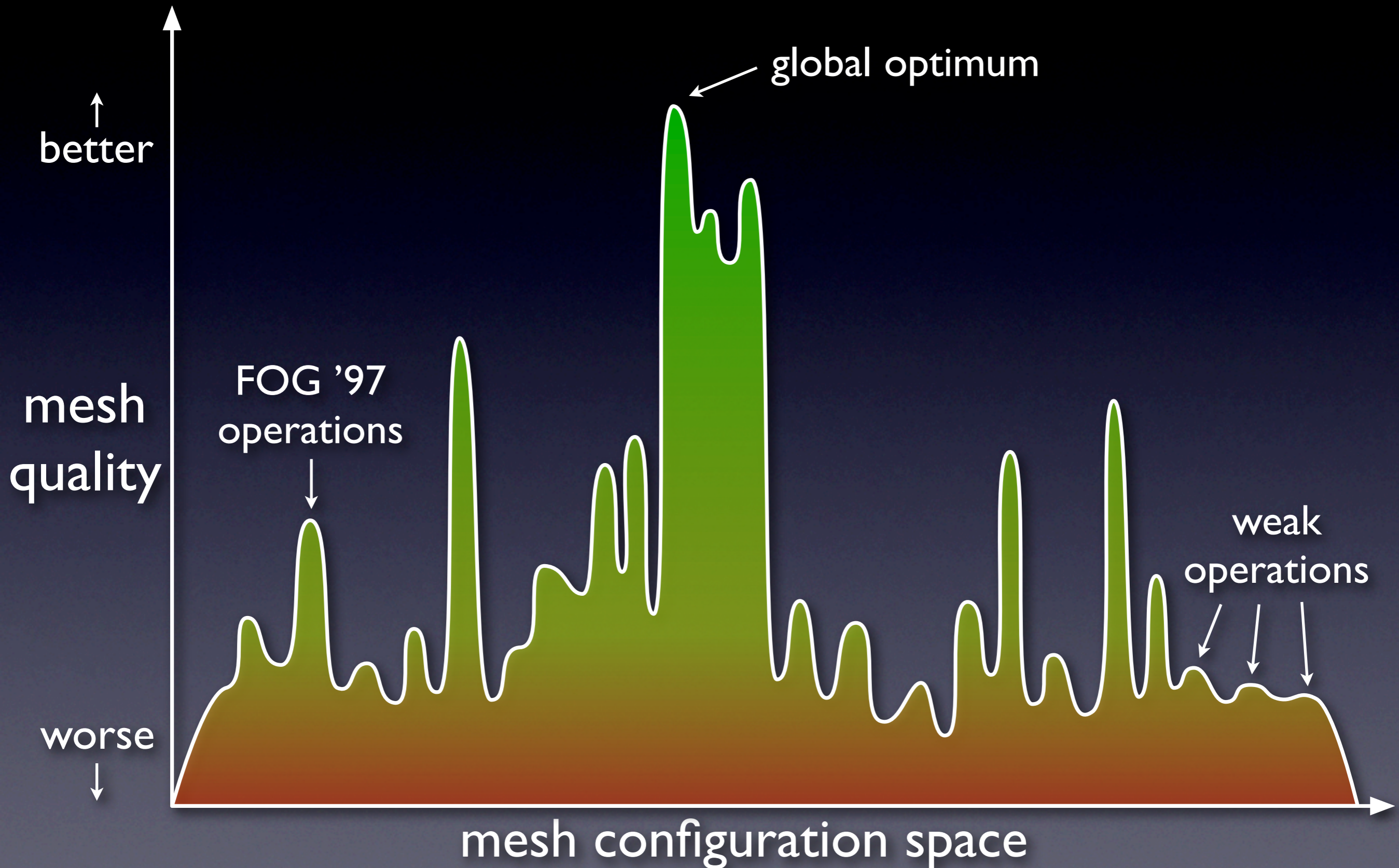
The mesh quality landscape



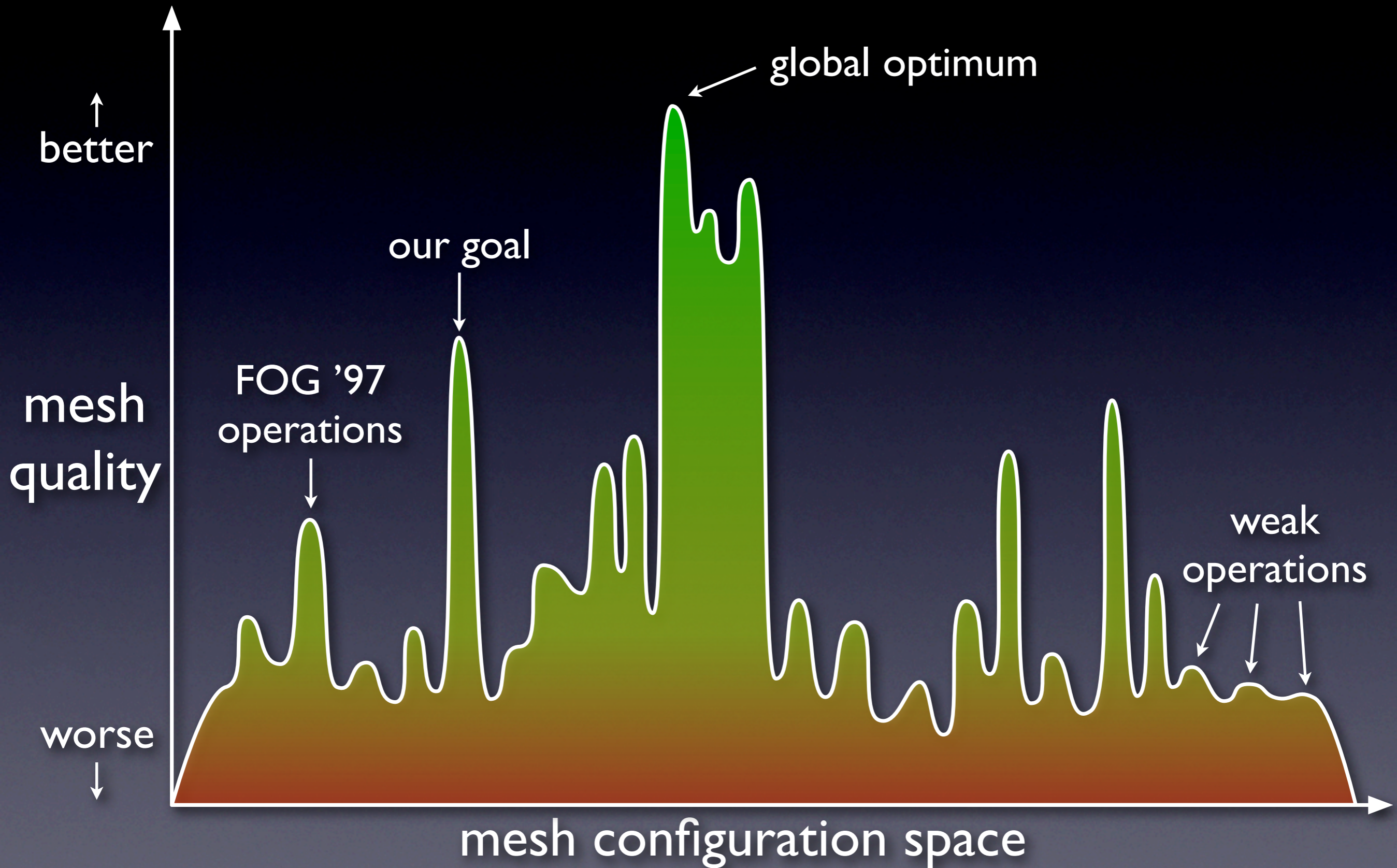
The mesh quality landscape



The mesh quality landscape

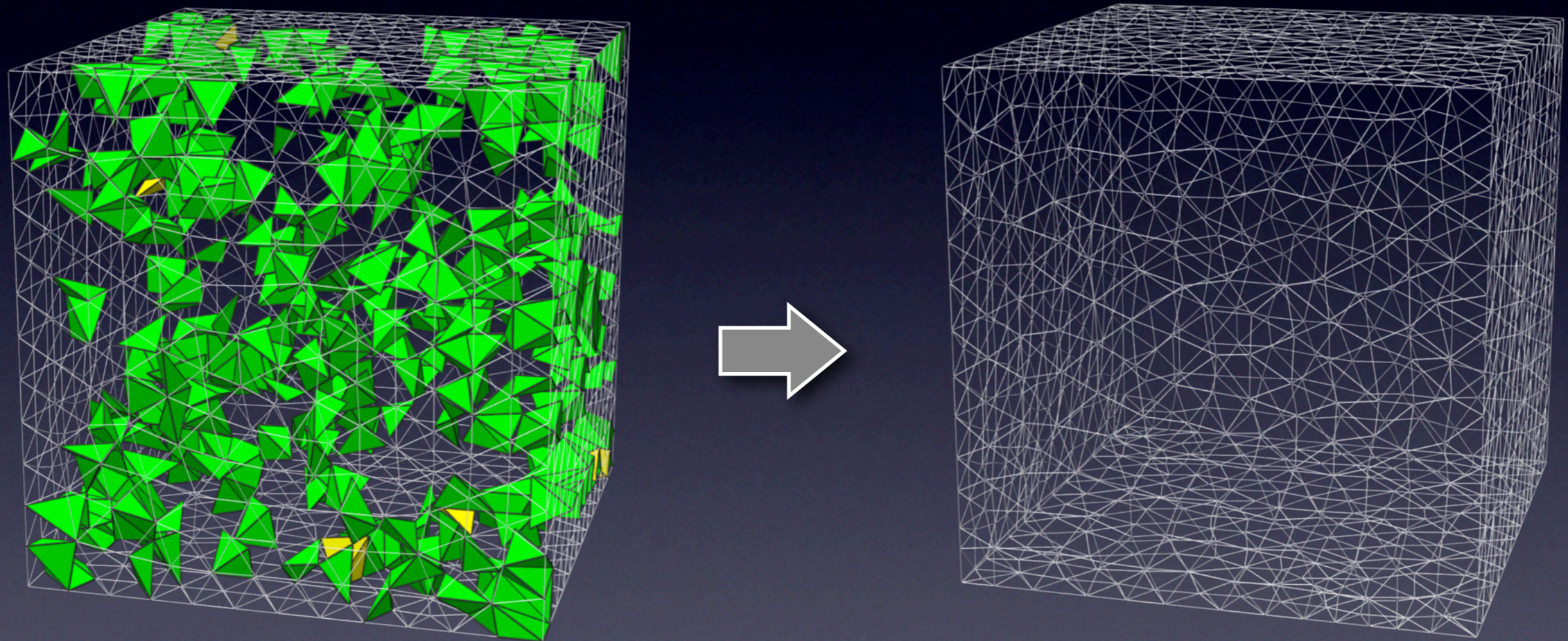


The mesh quality landscape



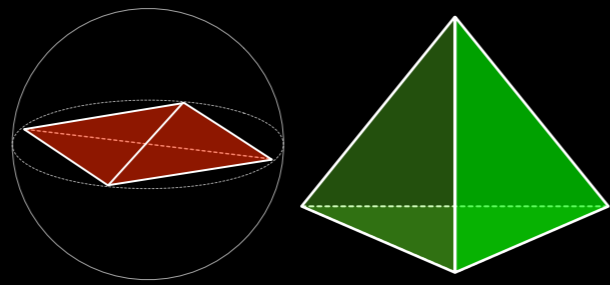
Our strategy:

Use every available tool (and a new one-vertex insertion) and as much time as needed to produce the best mesh we can.

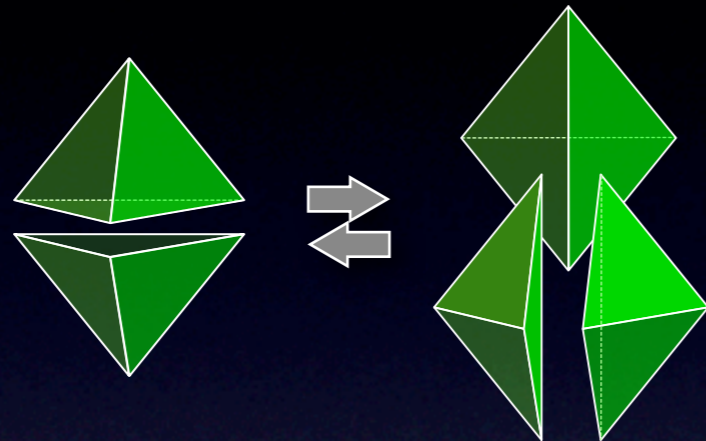


FOG '97: 12 min / 160 max

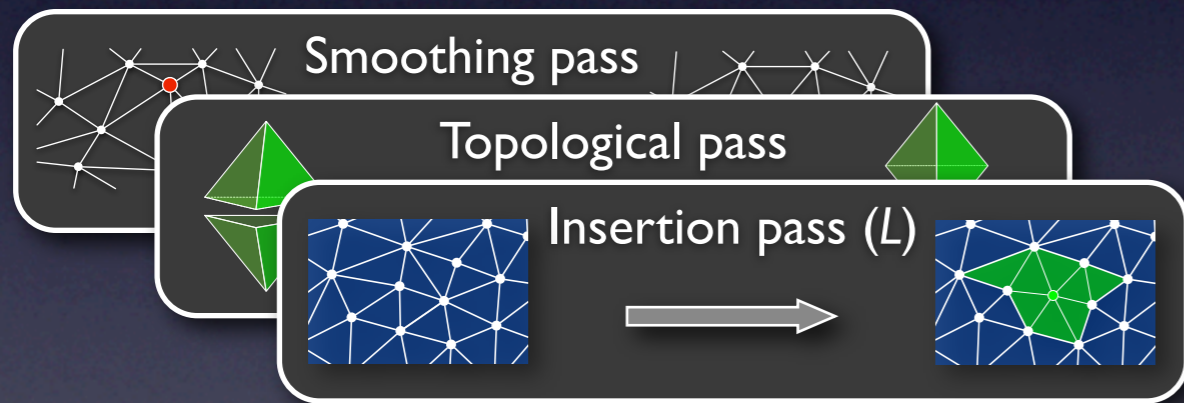
Our strategy: 30 min / 136⁺ max



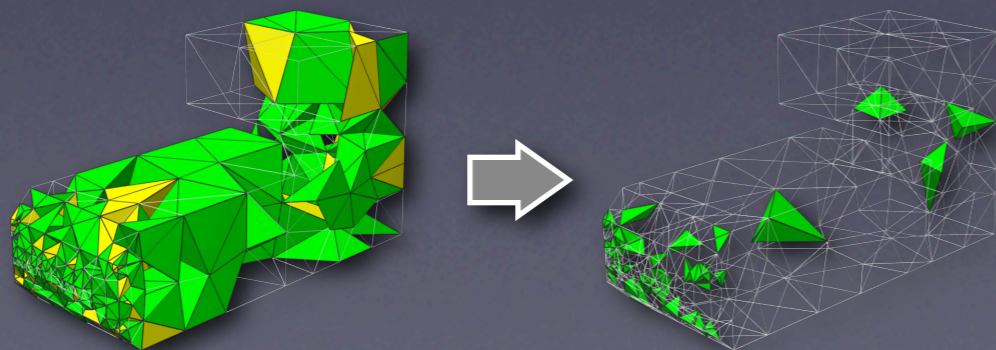
① Mesh quality



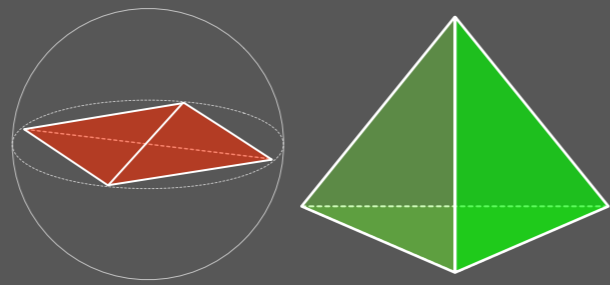
② Improvement operations



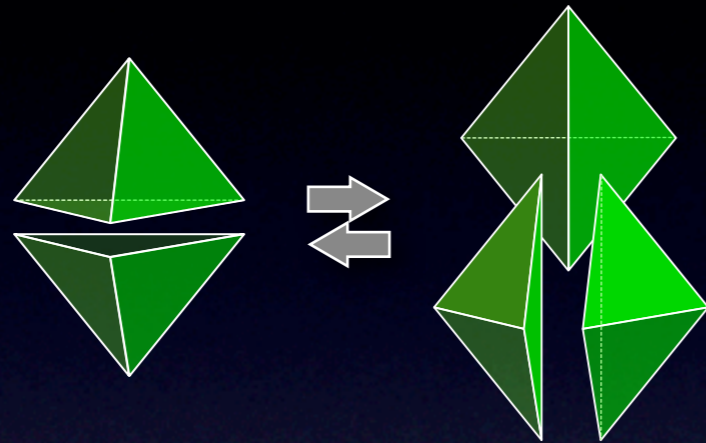
③ Improvement schedule



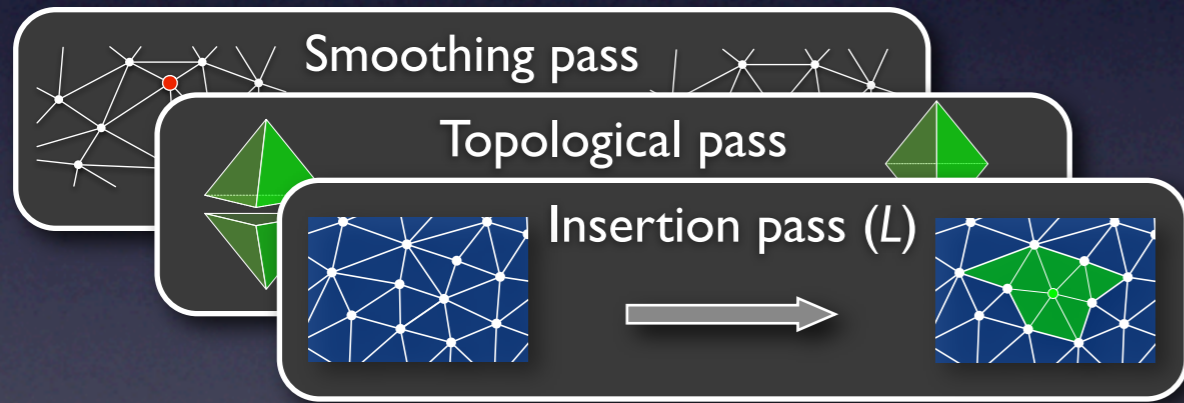
④ Results



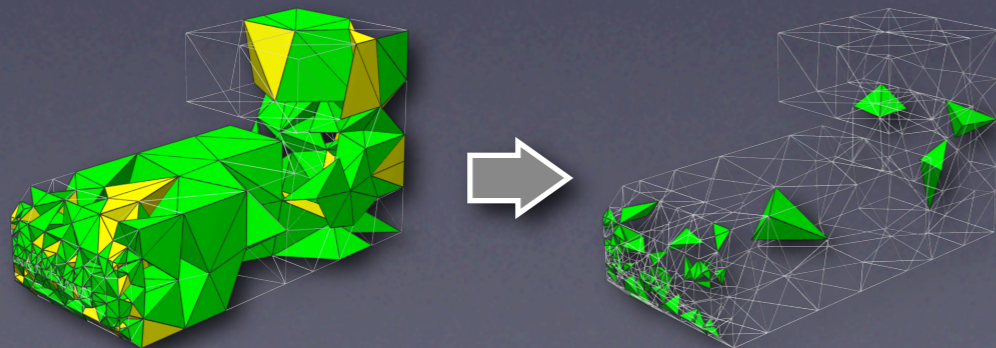
① Mesh quality



② Improvement operations

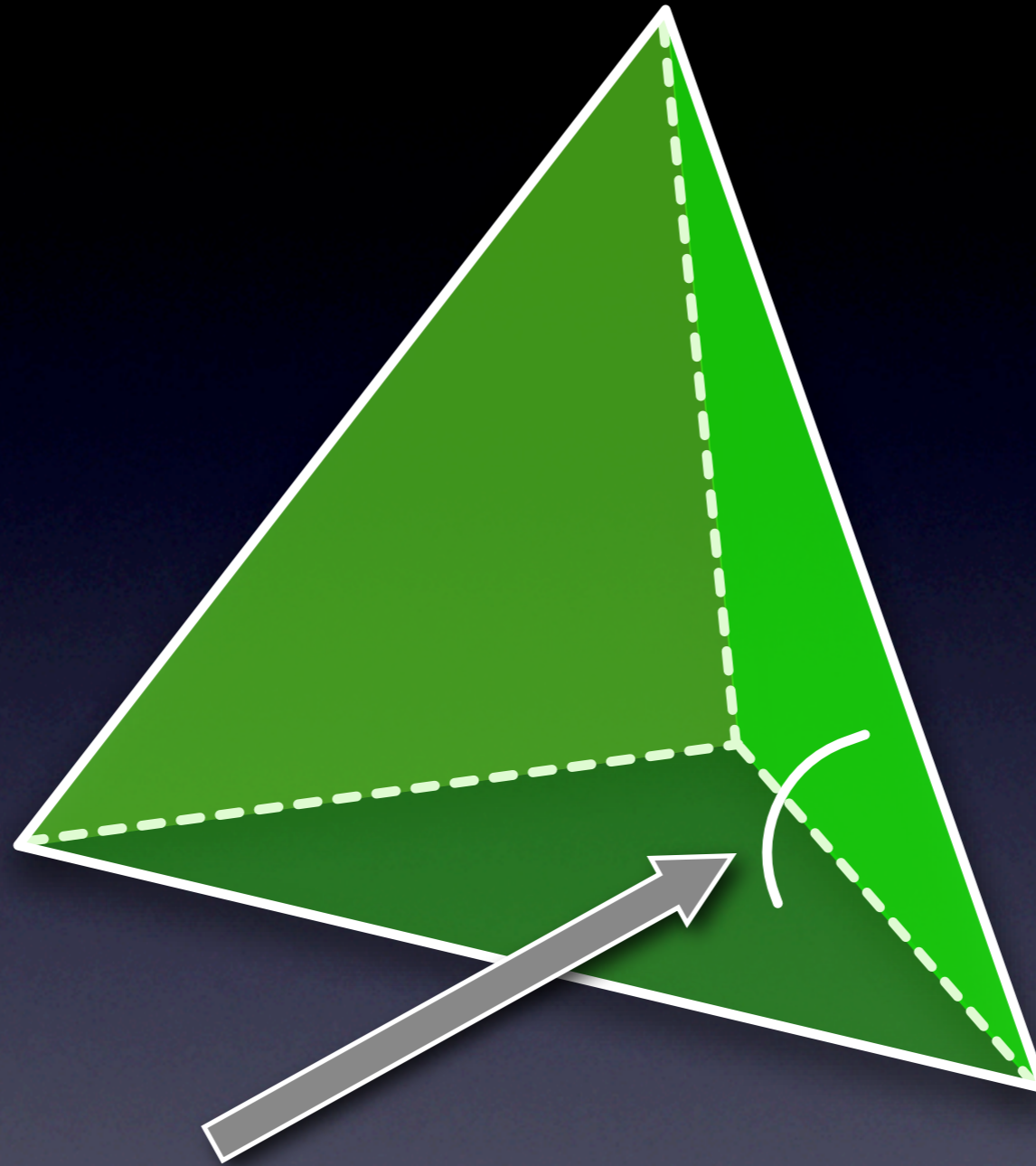


③ Improvement schedule



④ Results


What is a 'bad' element?



dihedral angle, the angle between two faces

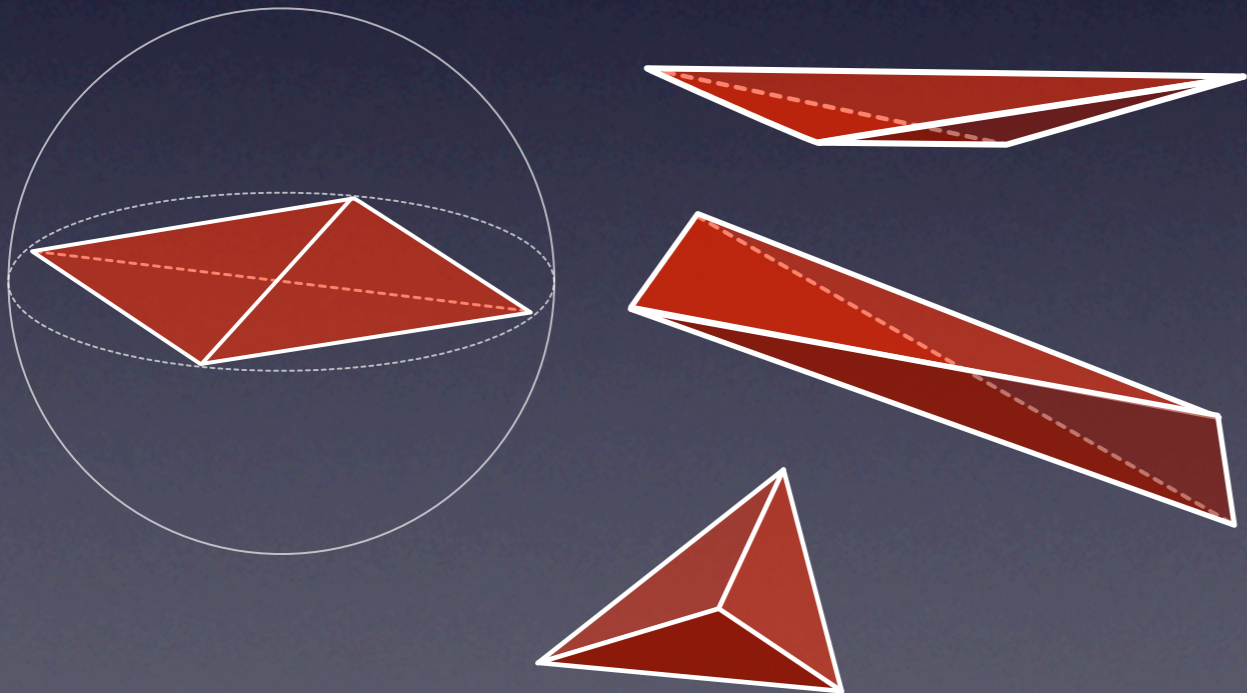
What is a 'bad' element?

Extreme dihedral angles cause problems.

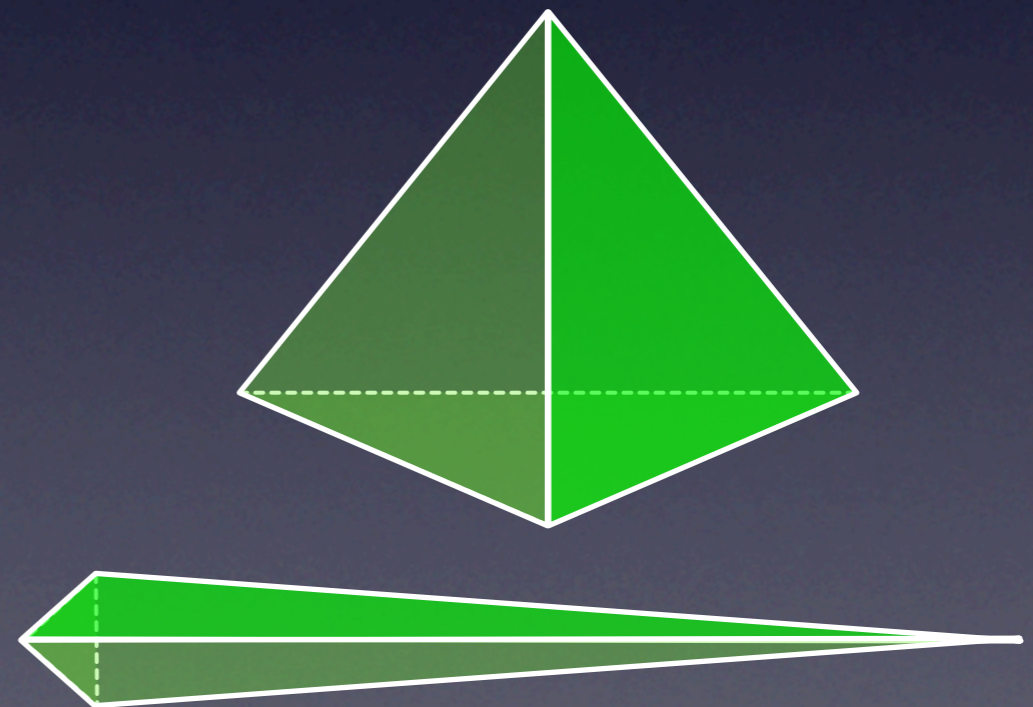
small dihedral angles may lead to poor conditioning, making the problem stiffer and slower to solve 

large dihedral angles lead to errors in discretization and interpolation 

Bad shapes



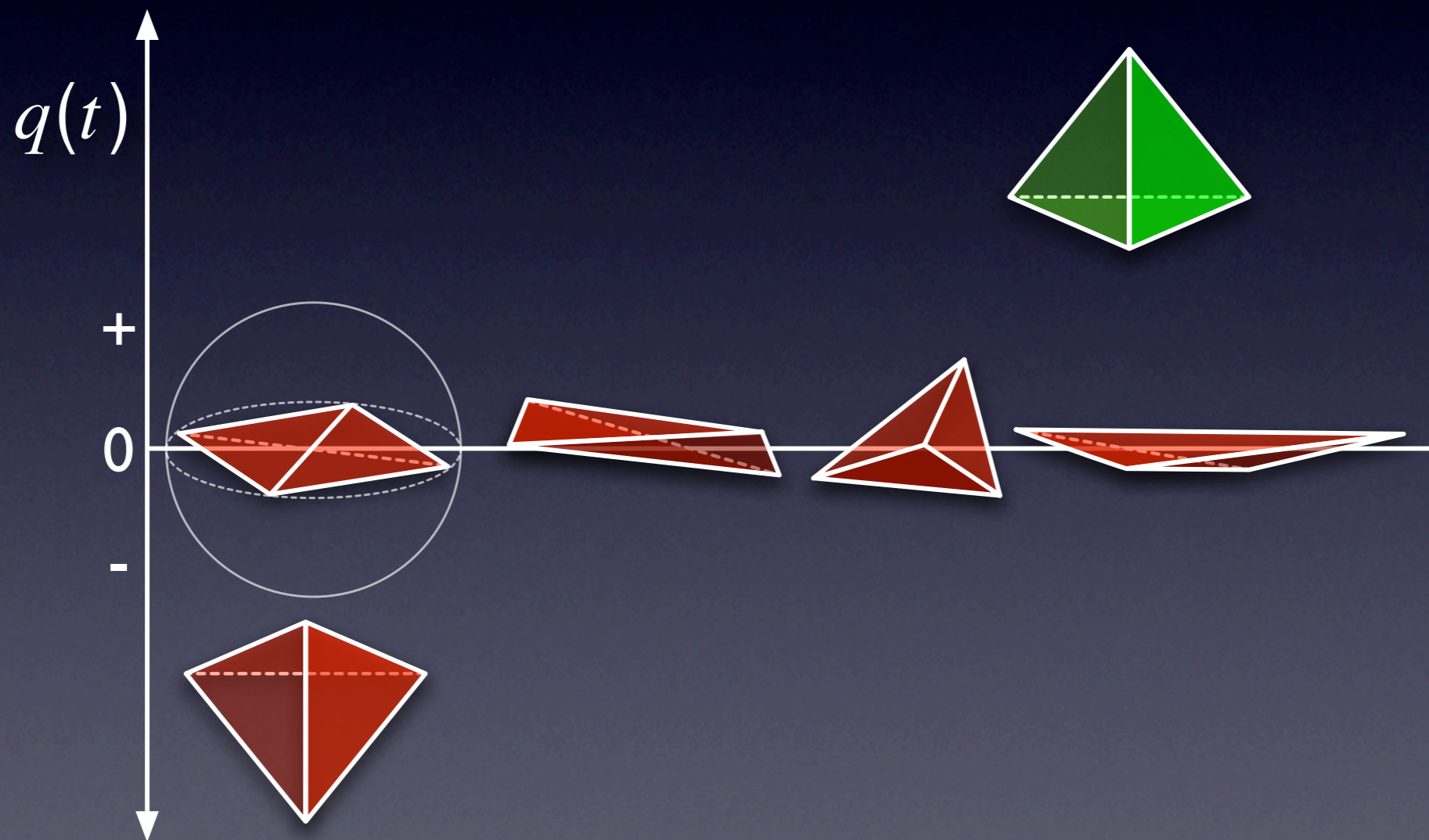
Good shapes



Given a tetrahedron t , let $q(t)$ be its quality.

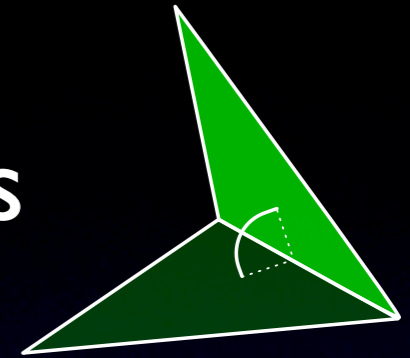
$q(t)$ gets bigger for better elements

$q(t) \leq 0$ for degenerate or inverted elements



Quality measures: turning shape into a number

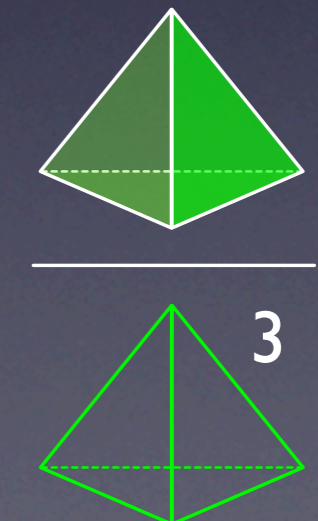
① Minimum sine of the six dihedral angles



② **Biased** minimum sine - exaggerate obtuse



③
$$\frac{\text{Volume}}{\text{Root-mean-squared edge length}^3}$$



What is the quality of the whole mesh M ?

A *quality vector* Q of each tetrahedron quality, sorted from worst to best:

$$Q(M) = \{1, 3, 10, 10, 15, 20, 23 \dots\}$$

Compare quality vectors *lexicographically*: first by the first element, then by the second, and so on.

$$\{1, 100, 100, 100\} < \{2, 2, 2, 2\}$$

Improving the quality vector

$\{2, \boxed{5}, 5, 7, 9, 12, 15, \boxed{22}, 22, 34, 67, \boxed{104}\}$

$\{5, 22, 104\}$

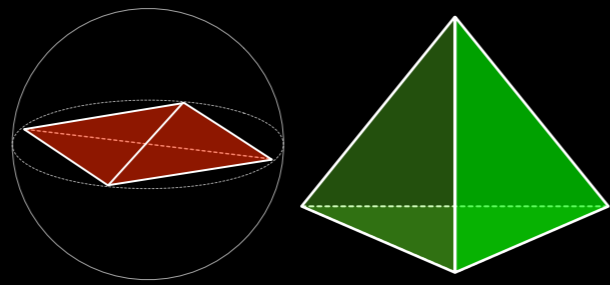


Mesh Improvement
Operation(s)

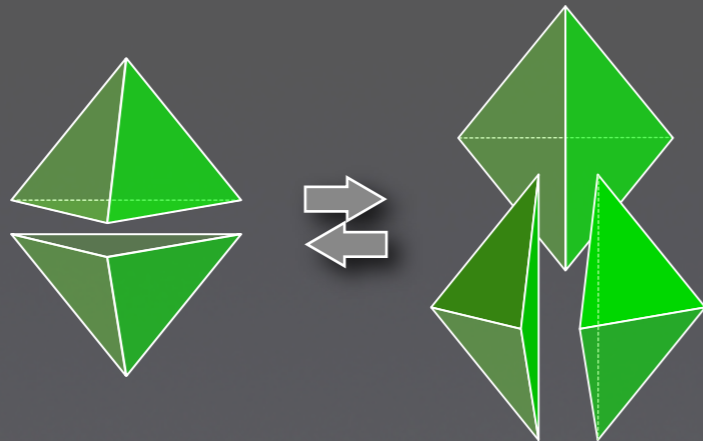


$\{8, 10, 18\}$

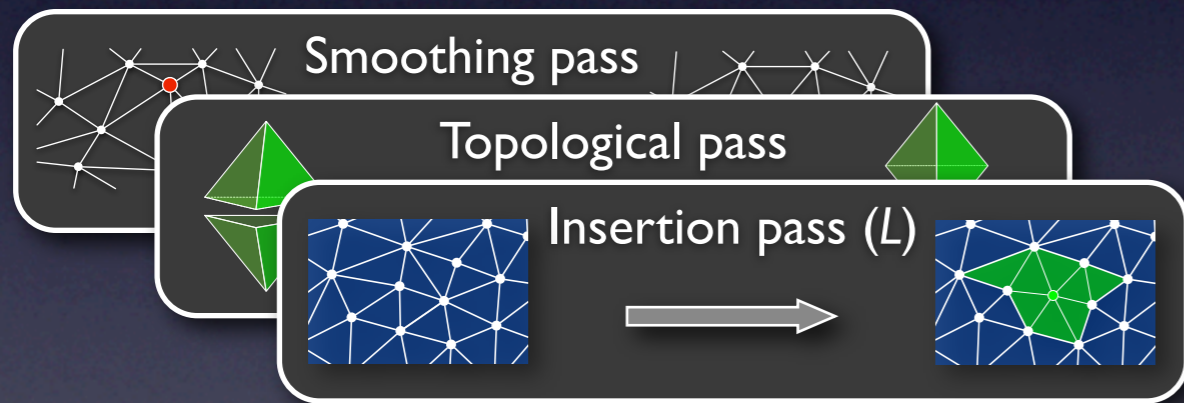
$\{2, 5, 7, \boxed{8}, 9, \boxed{10}, 12, 15, \boxed{18}, 22, 34, 67\}$



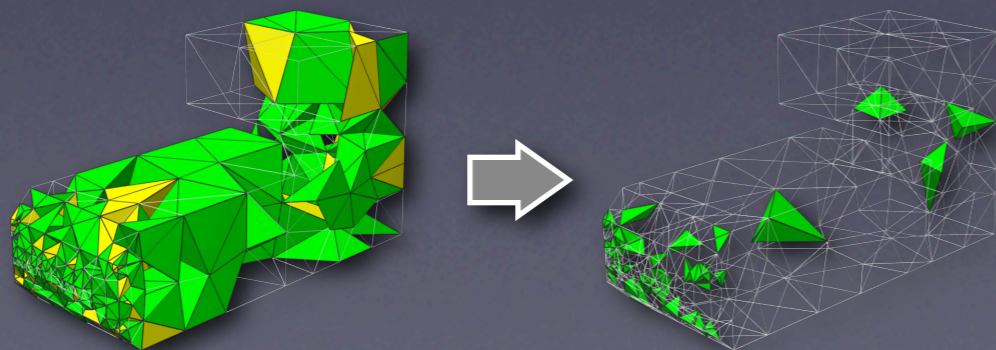
① Mesh quality



② Improvement operations

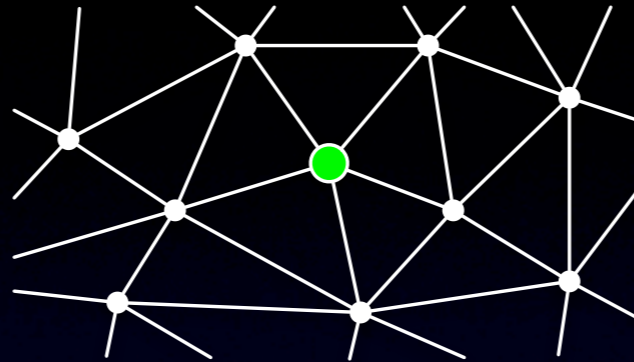
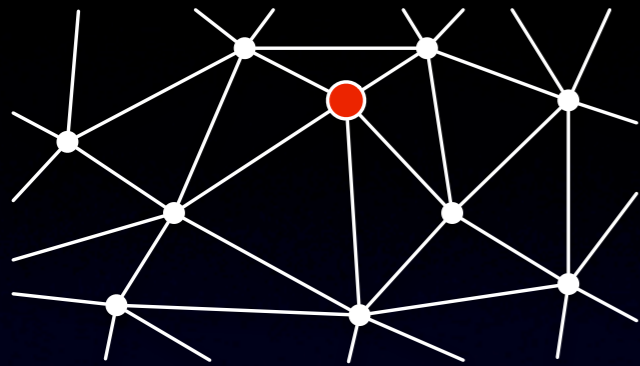


③ Improvement schedule

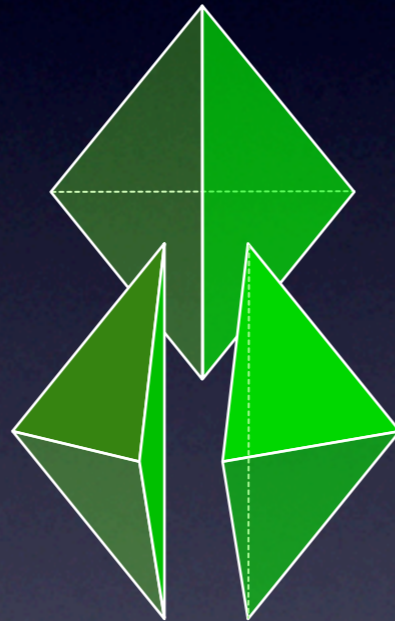
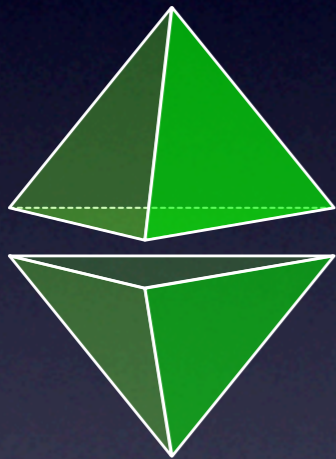


④ Results

Mesh improvement operations



Vertex smoothing



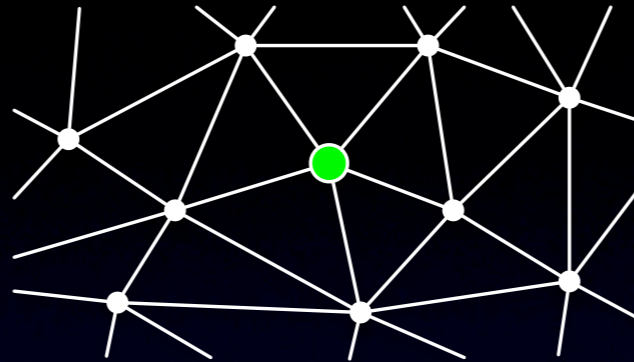
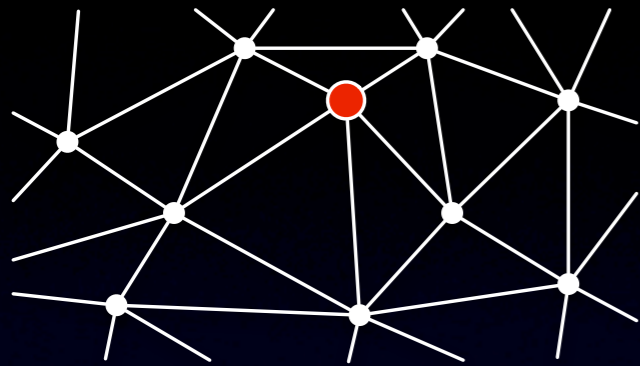
Topological improvement



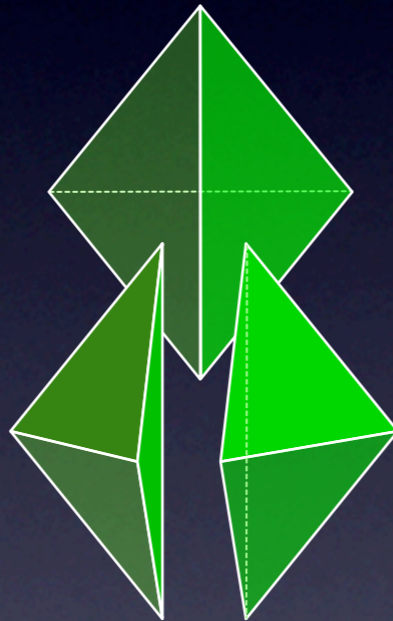
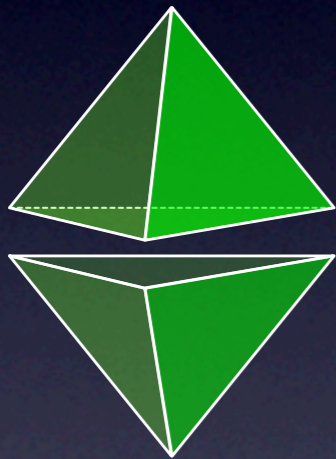
Vertex insertion

new

Mesh improvement operations



Vertex smoothing



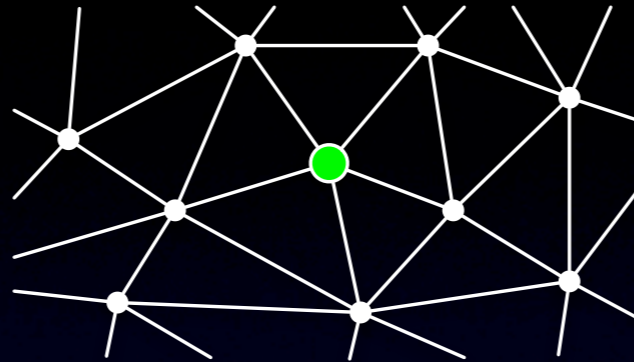
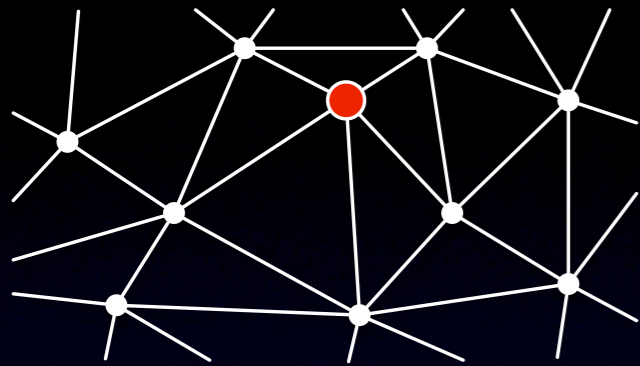
Topological improvement



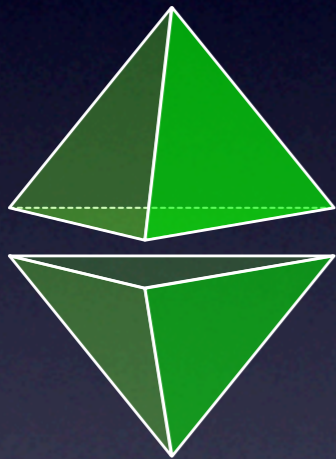
Vertex insertion

new

Mesh improvement operations



Vertex smoothing



Topological improvement



Vertex insertion

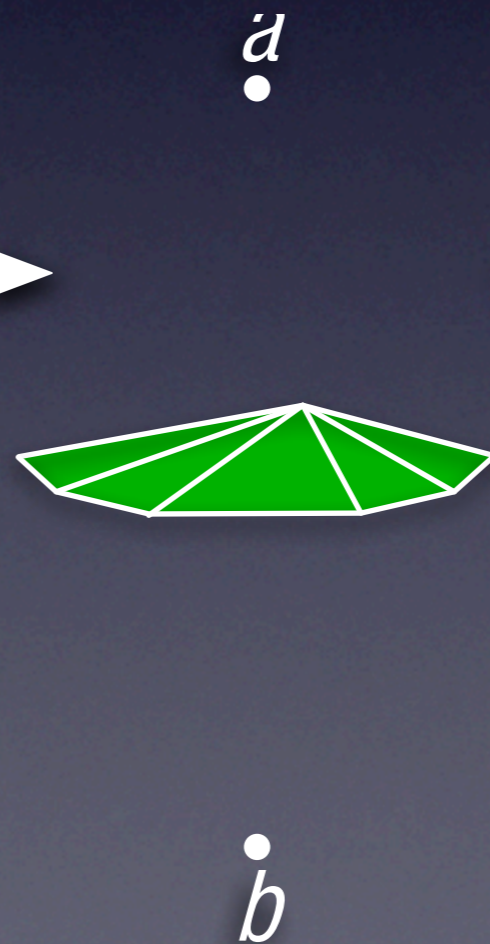
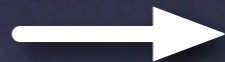
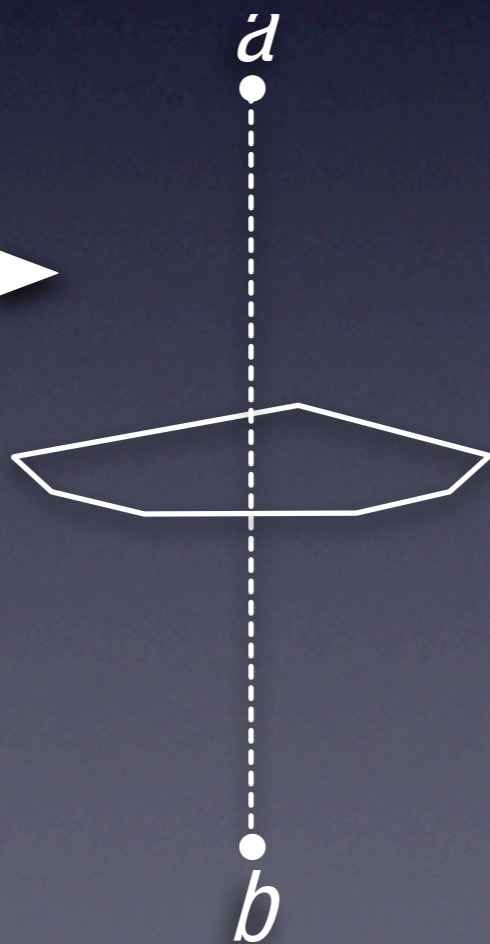
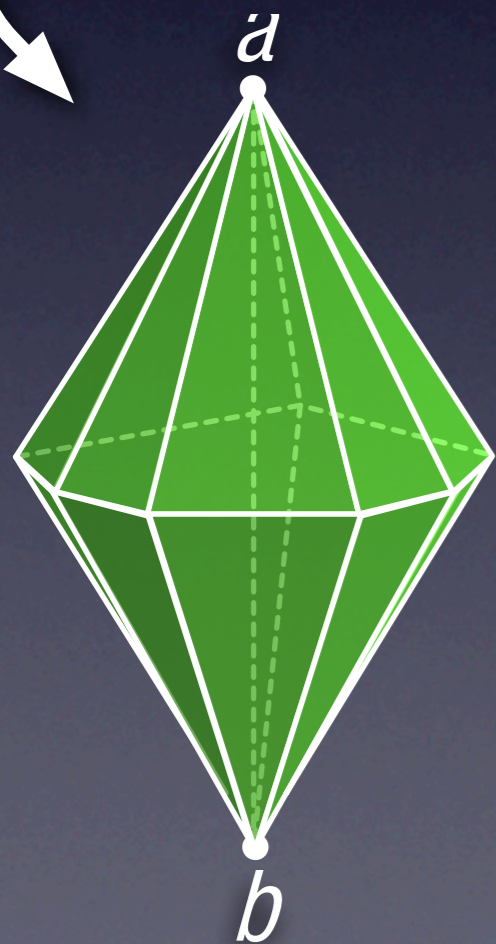
new

Topological operations

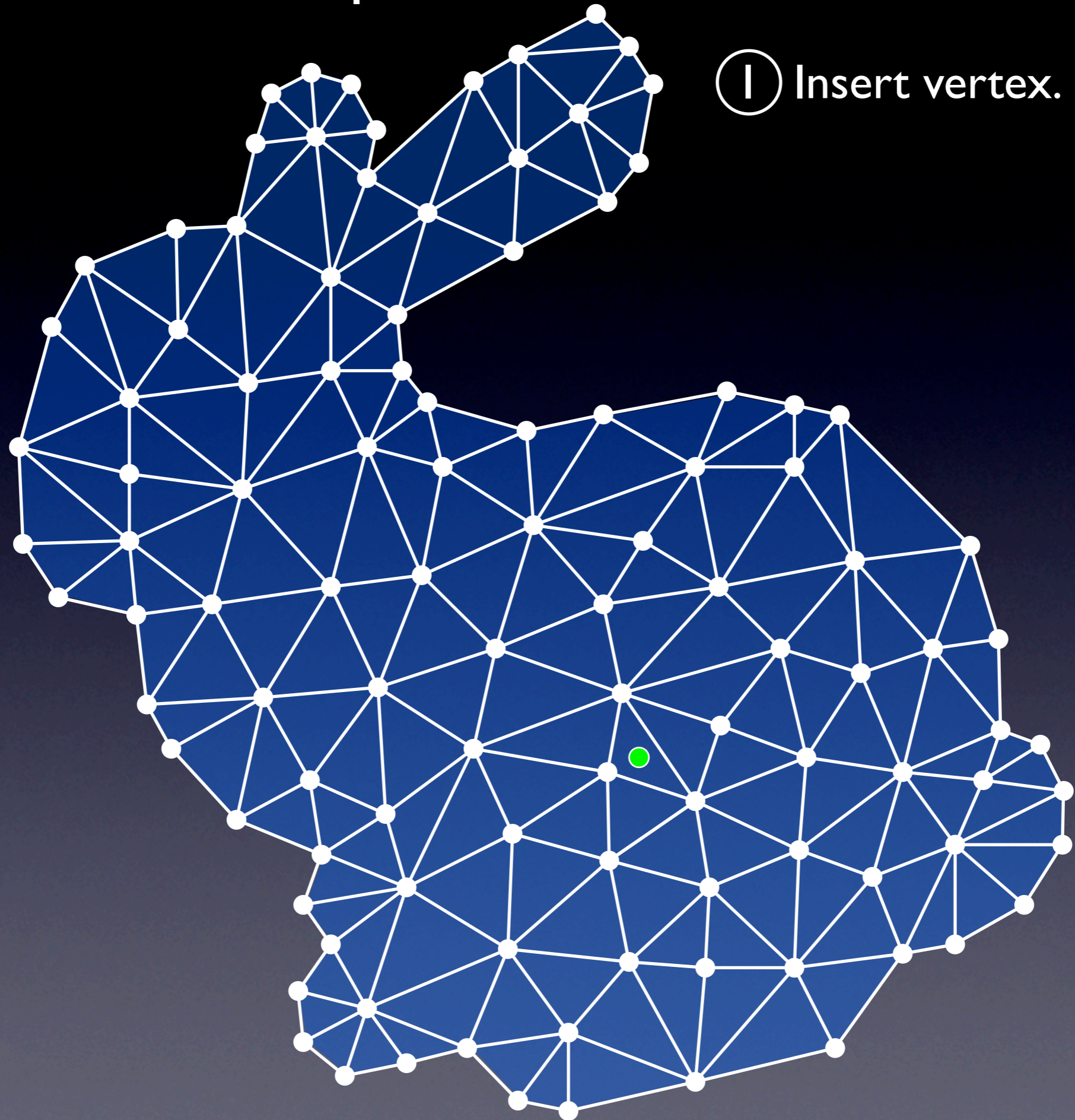
edge removal
(de l'Isle and George, 1995)



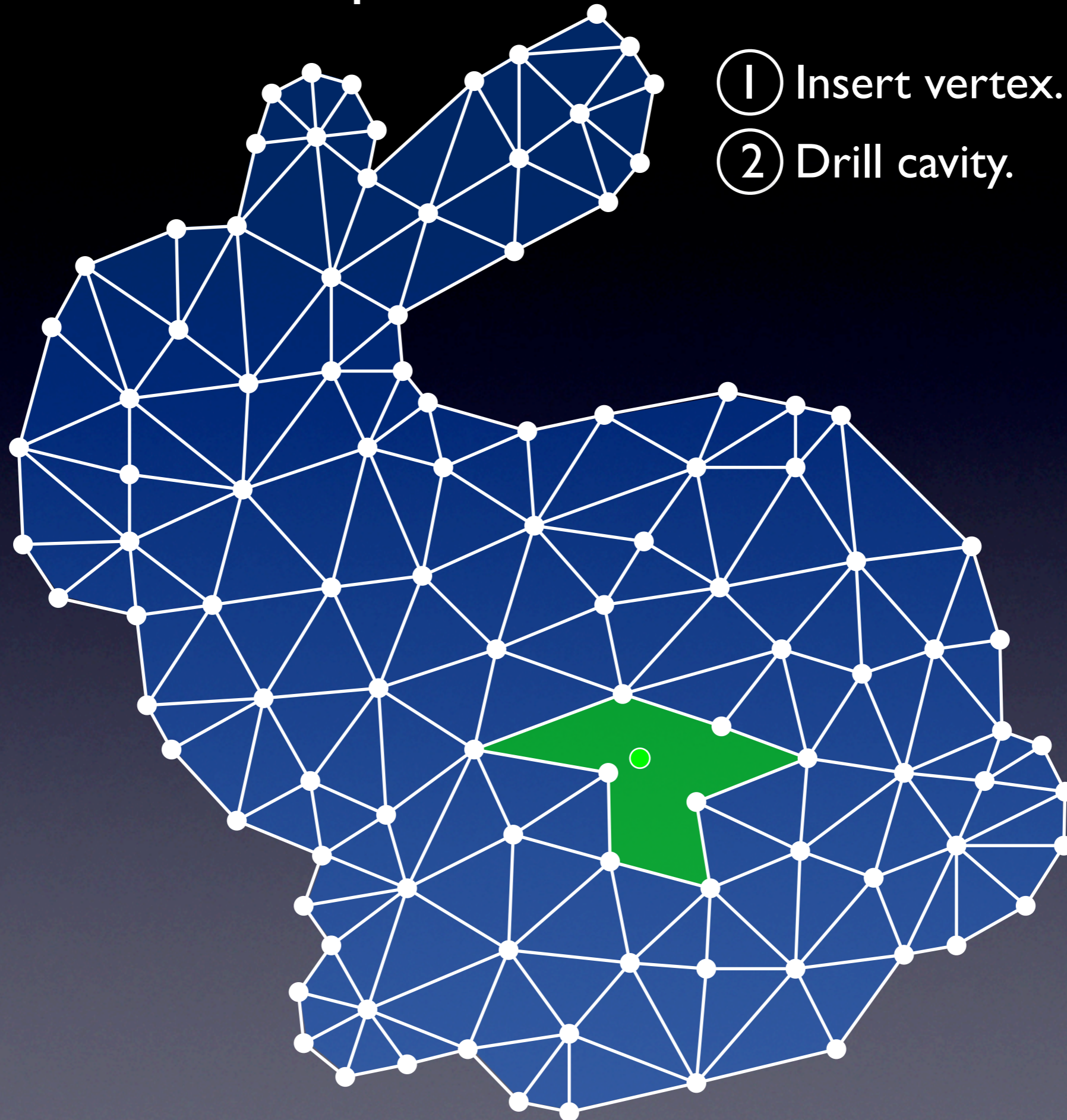
multi-face removal
(de Coughy and Shephard, 1995)



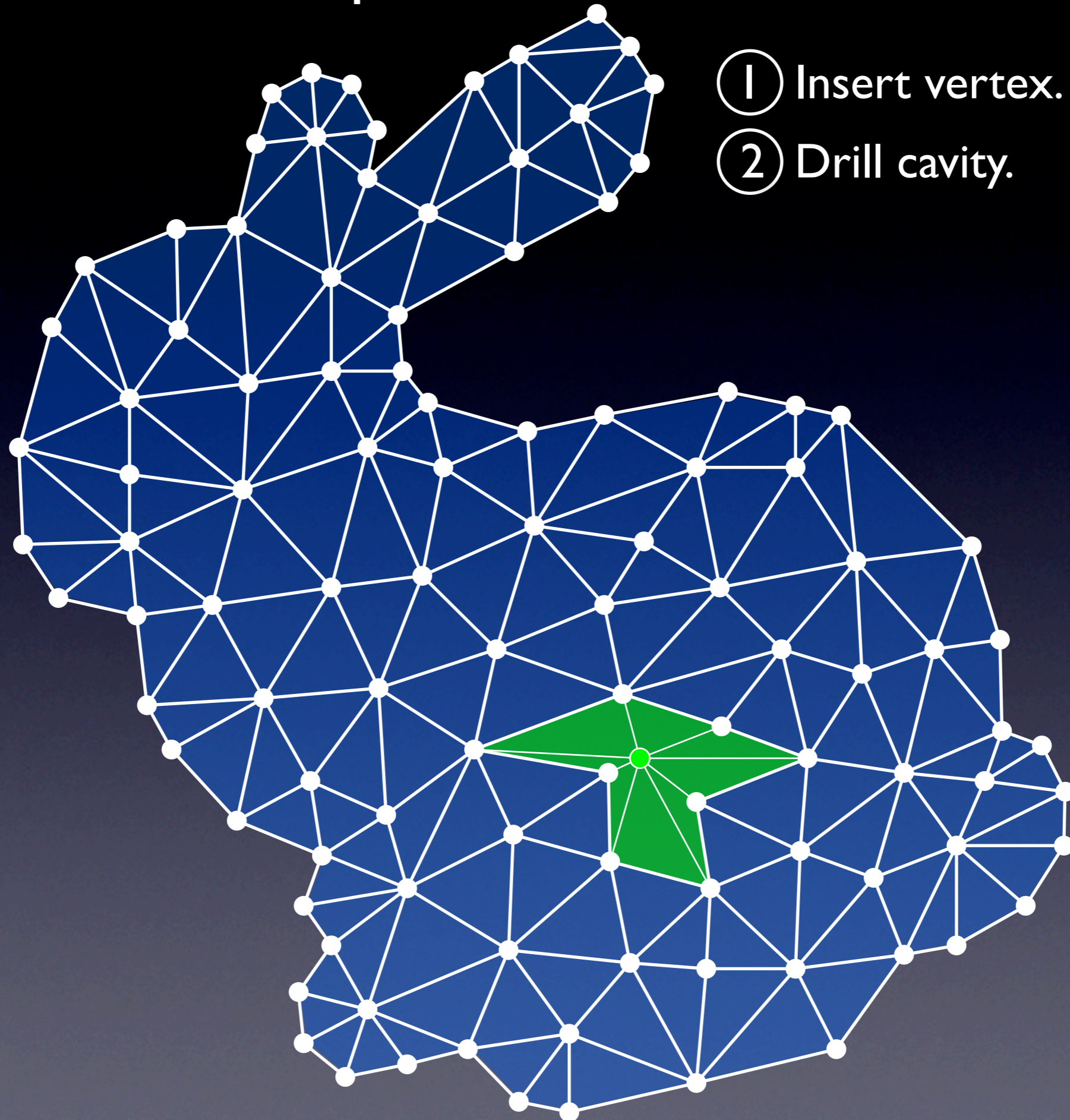
Our new operation: vertex insertion



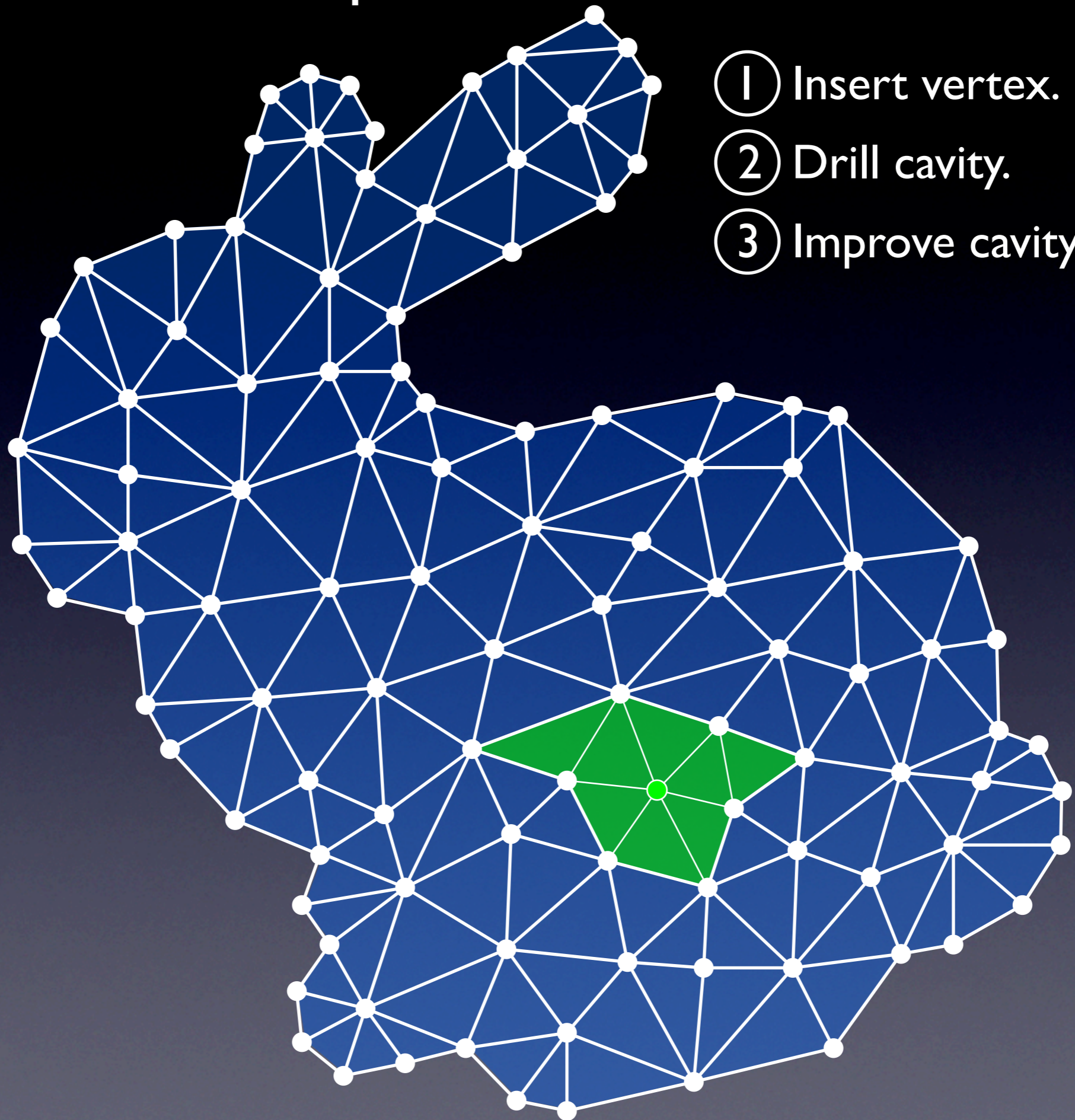
Our new operation: vertex insertion



Our new operation: vertex insertion

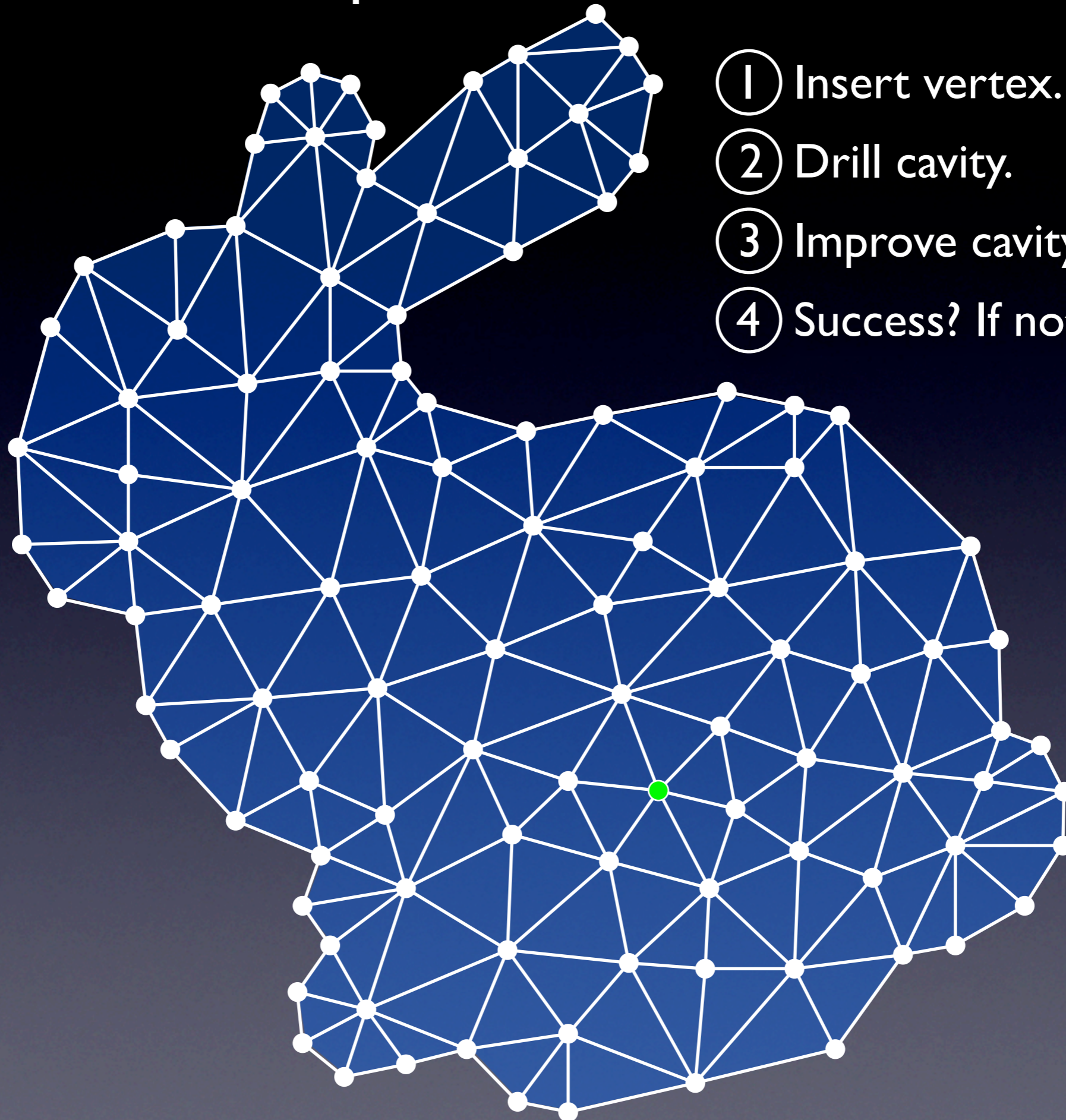


Our new operation: vertex insertion



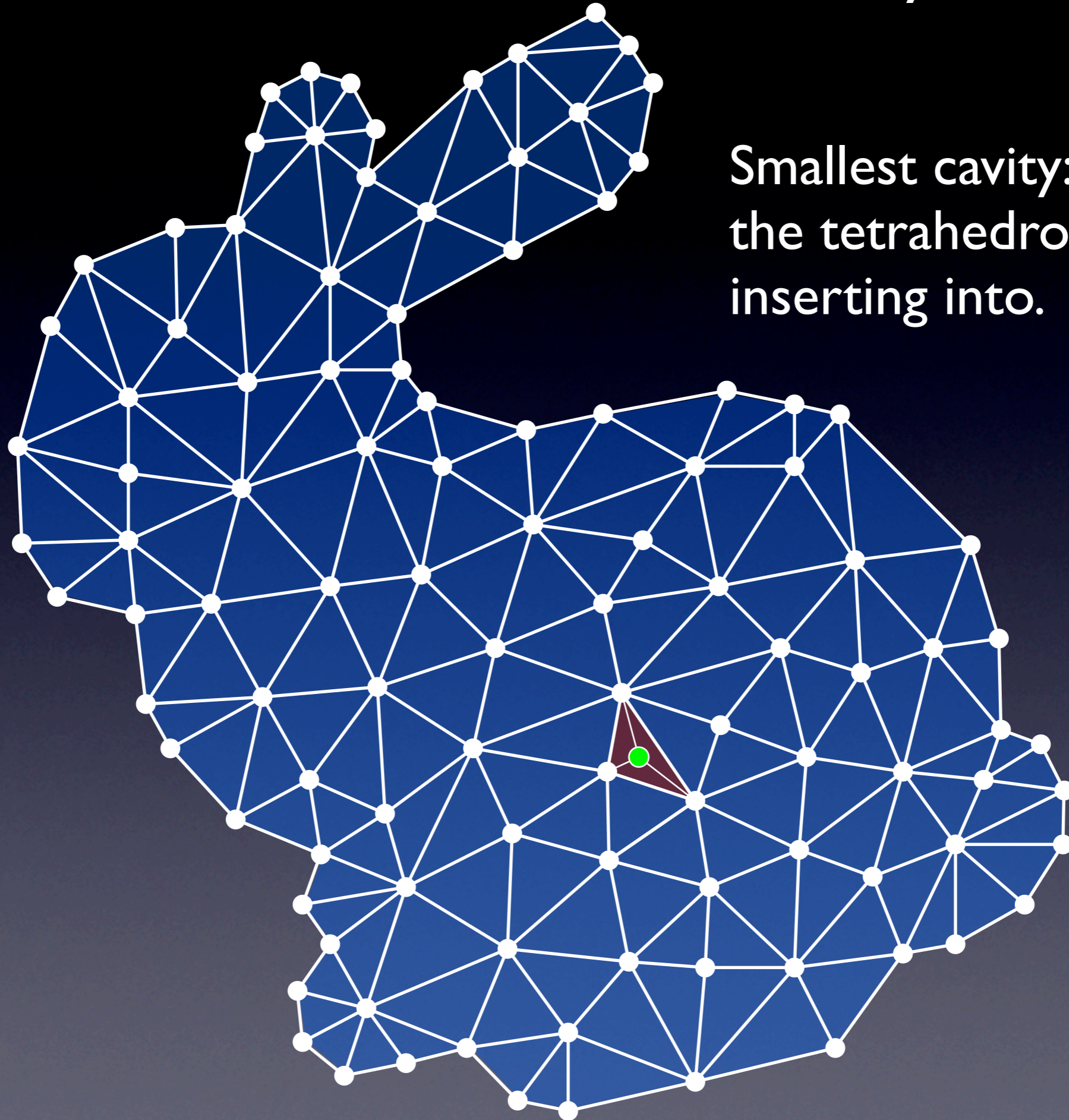
- ① Insert vertex.
- ② Drill cavity.
- ③ Improve cavity.

Our new operation: vertex insertion



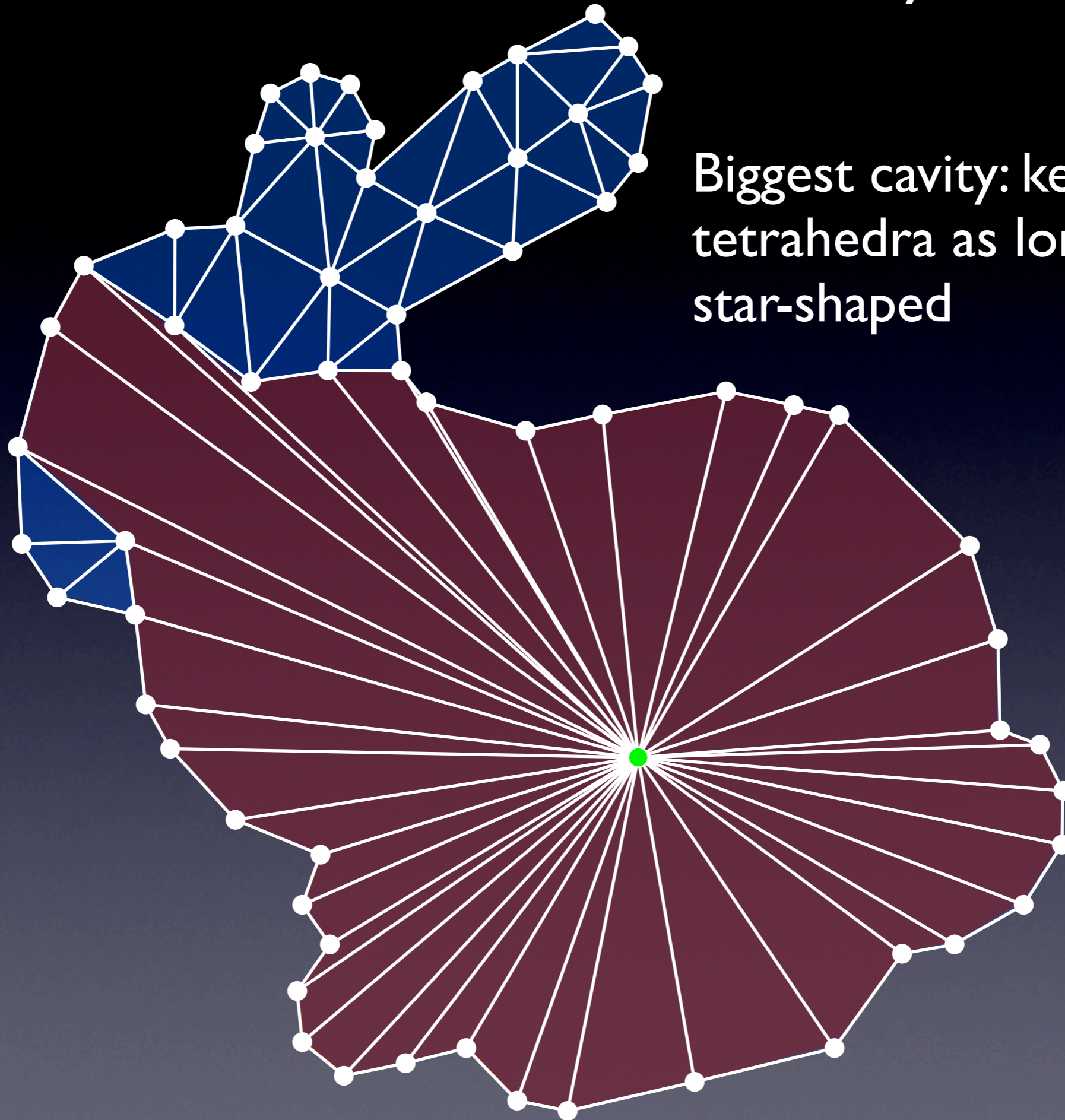
- ① Insert vertex.
- ② Drill cavity.
- ③ Improve cavity.
- ④ Success? If not, roll back.

How do we choose the cavity?



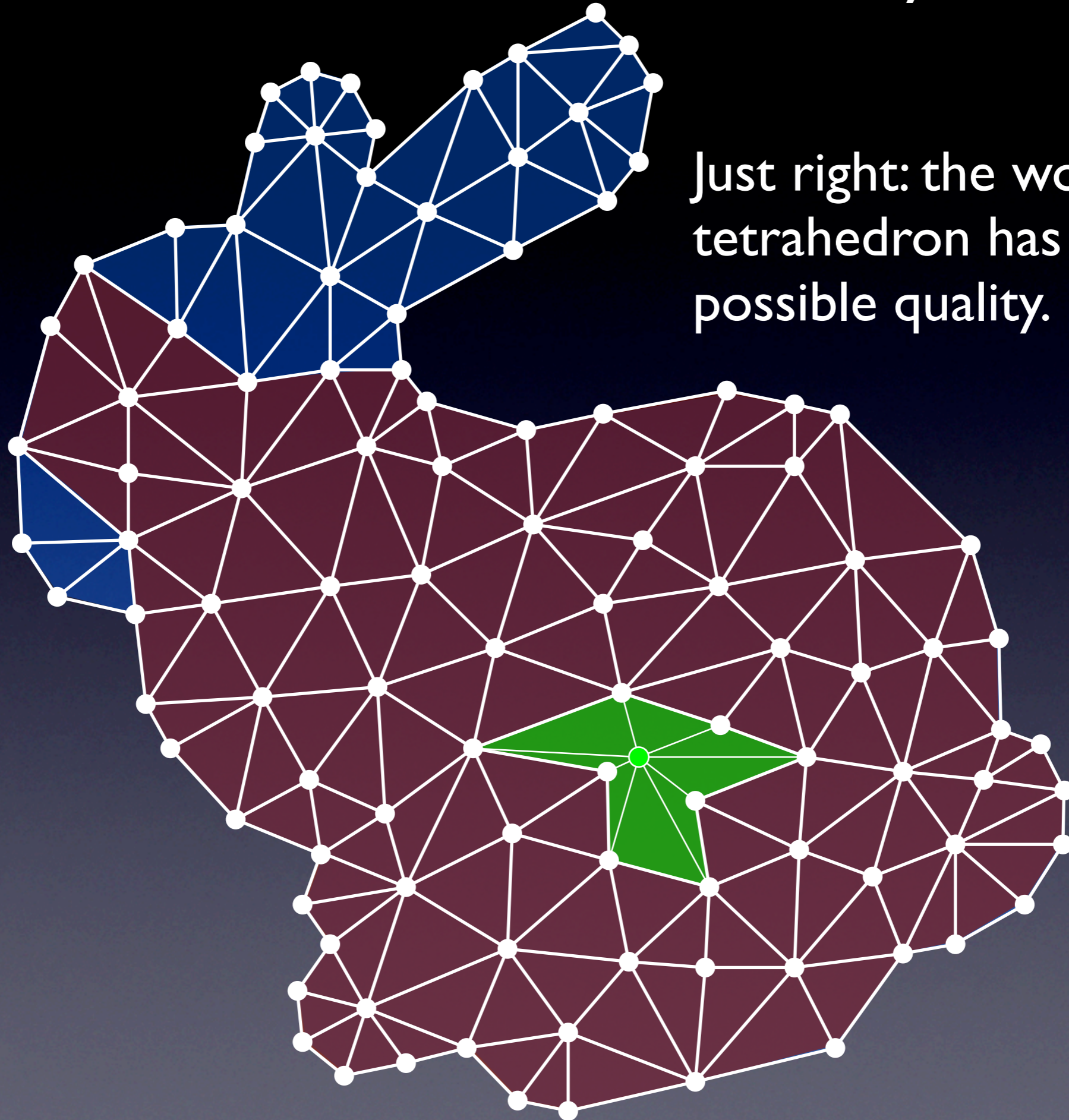
Smallest cavity: just split the tetrahedron we're inserting into.

How do we choose the cavity?



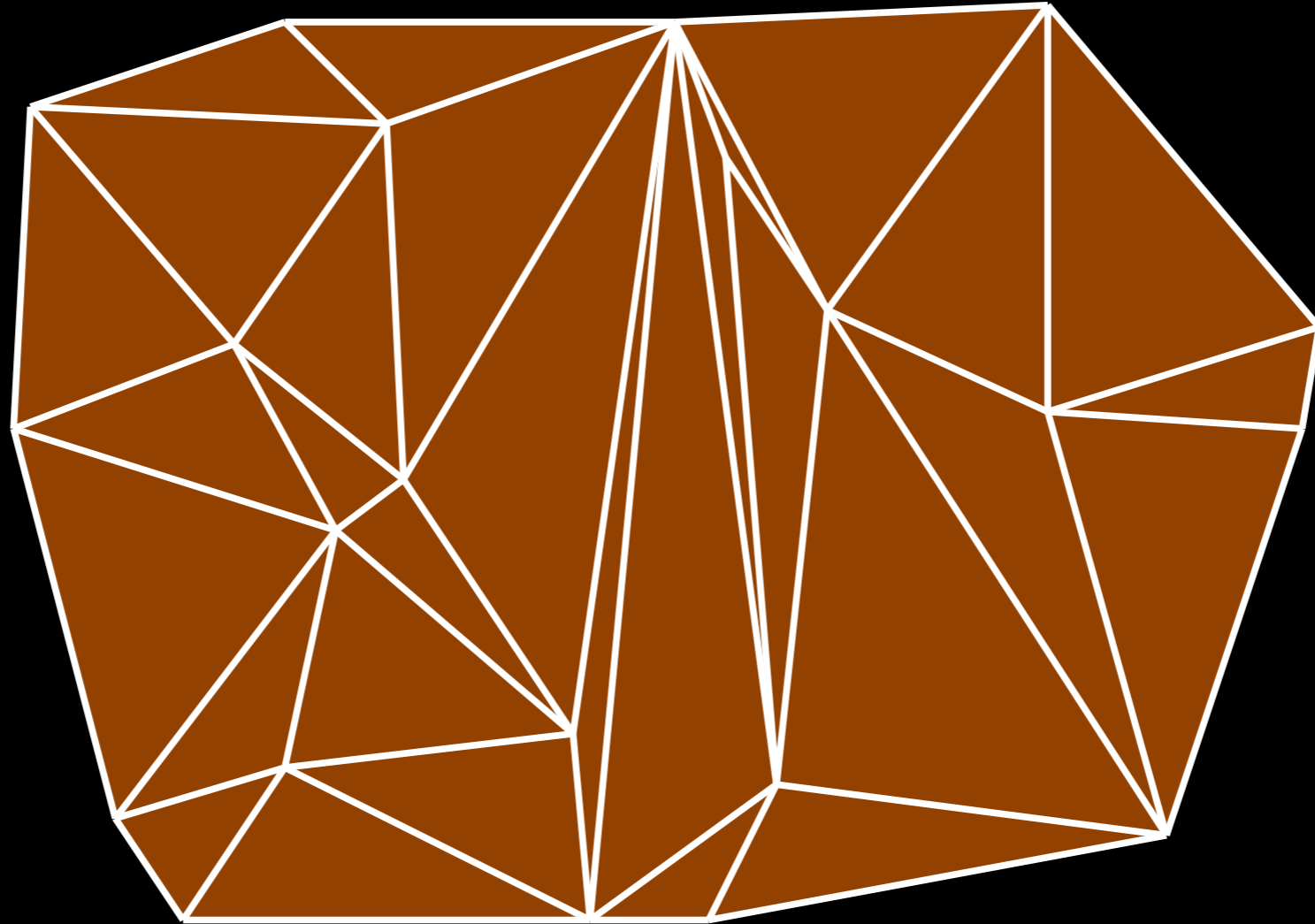
Biggest cavity: keep adding tetrahedra as long as it's star-shaped

How do we choose the cavity?

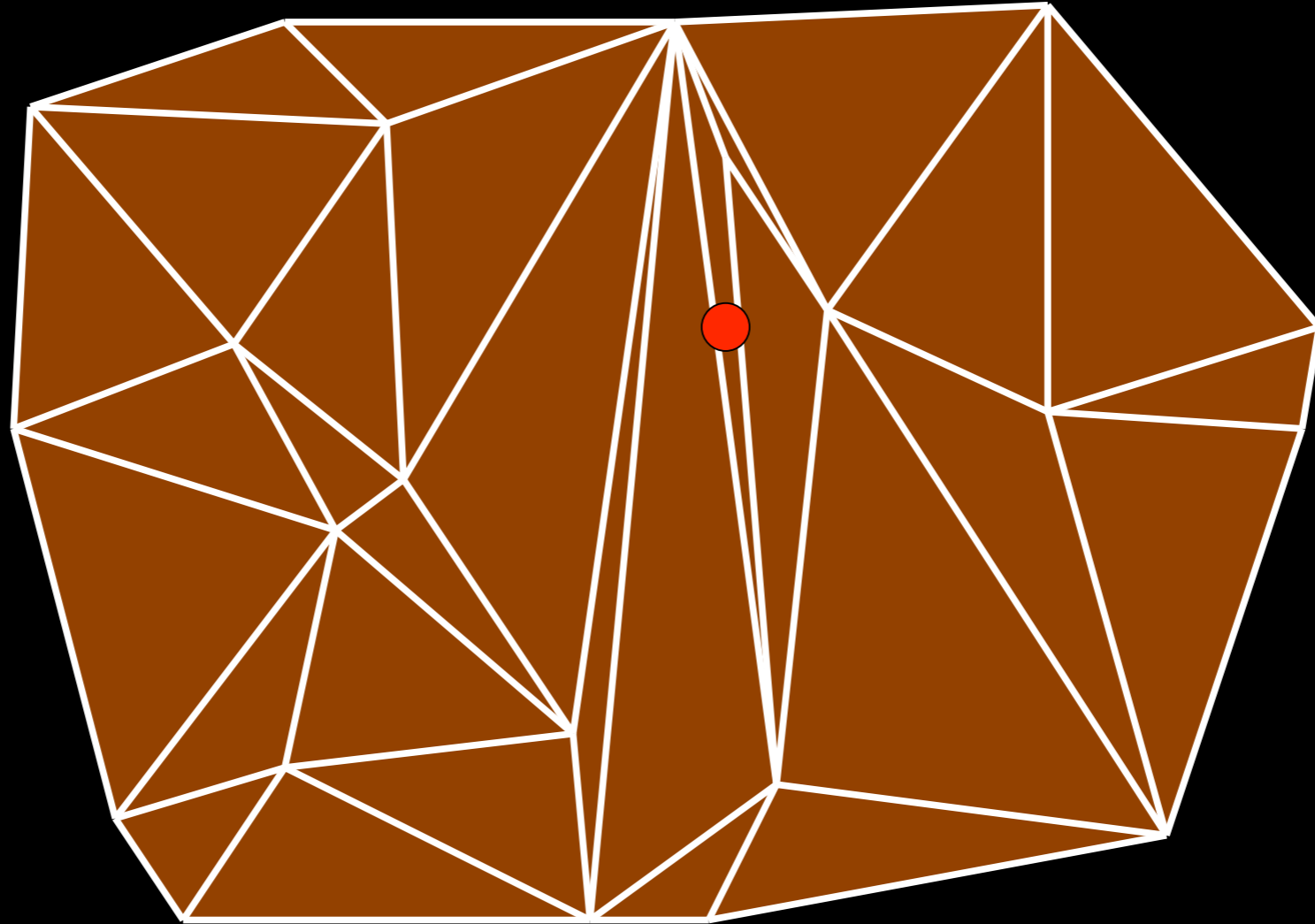


Just right: the worst new tetrahedron has the best possible quality.

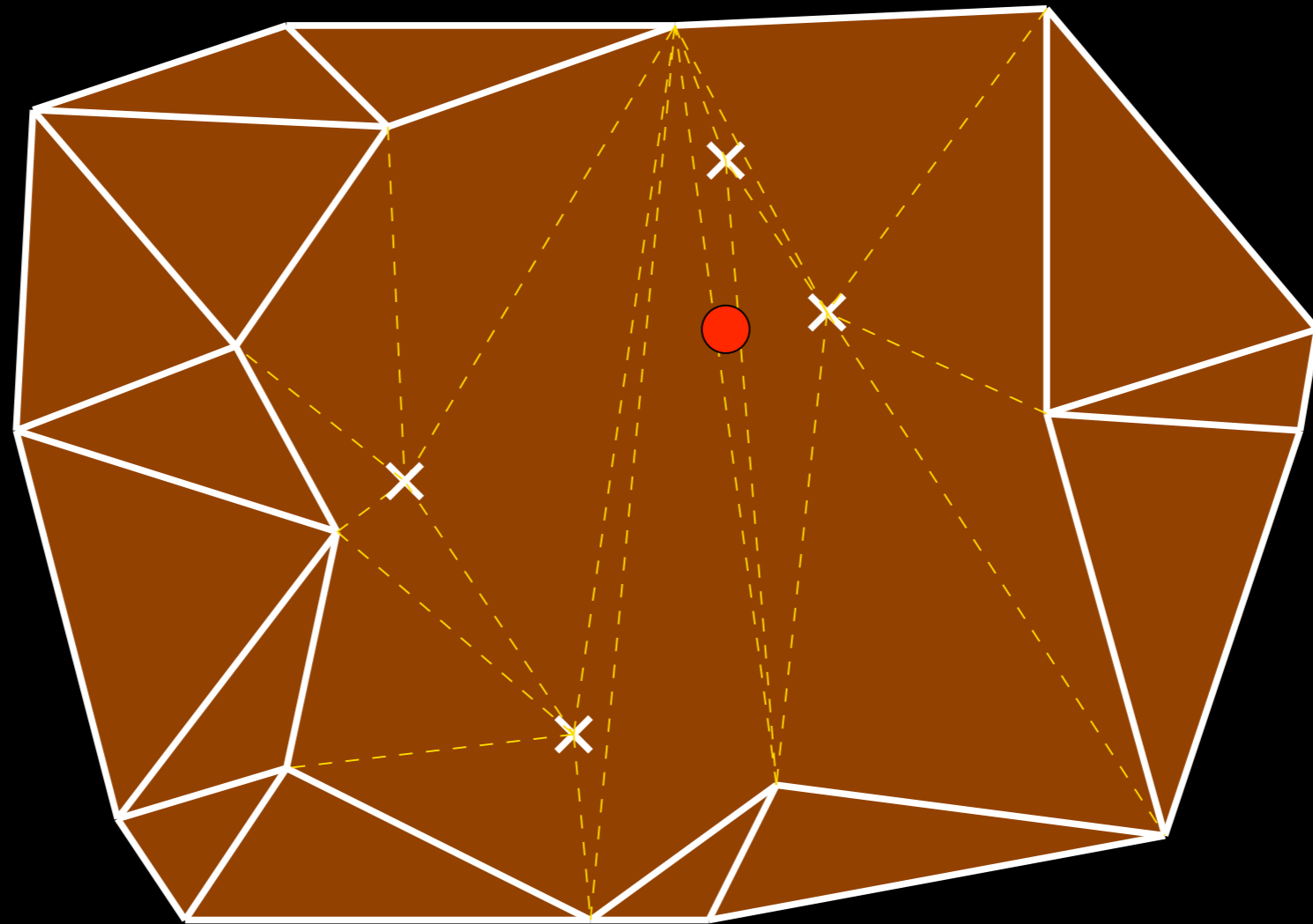
Finding the optimal cavity



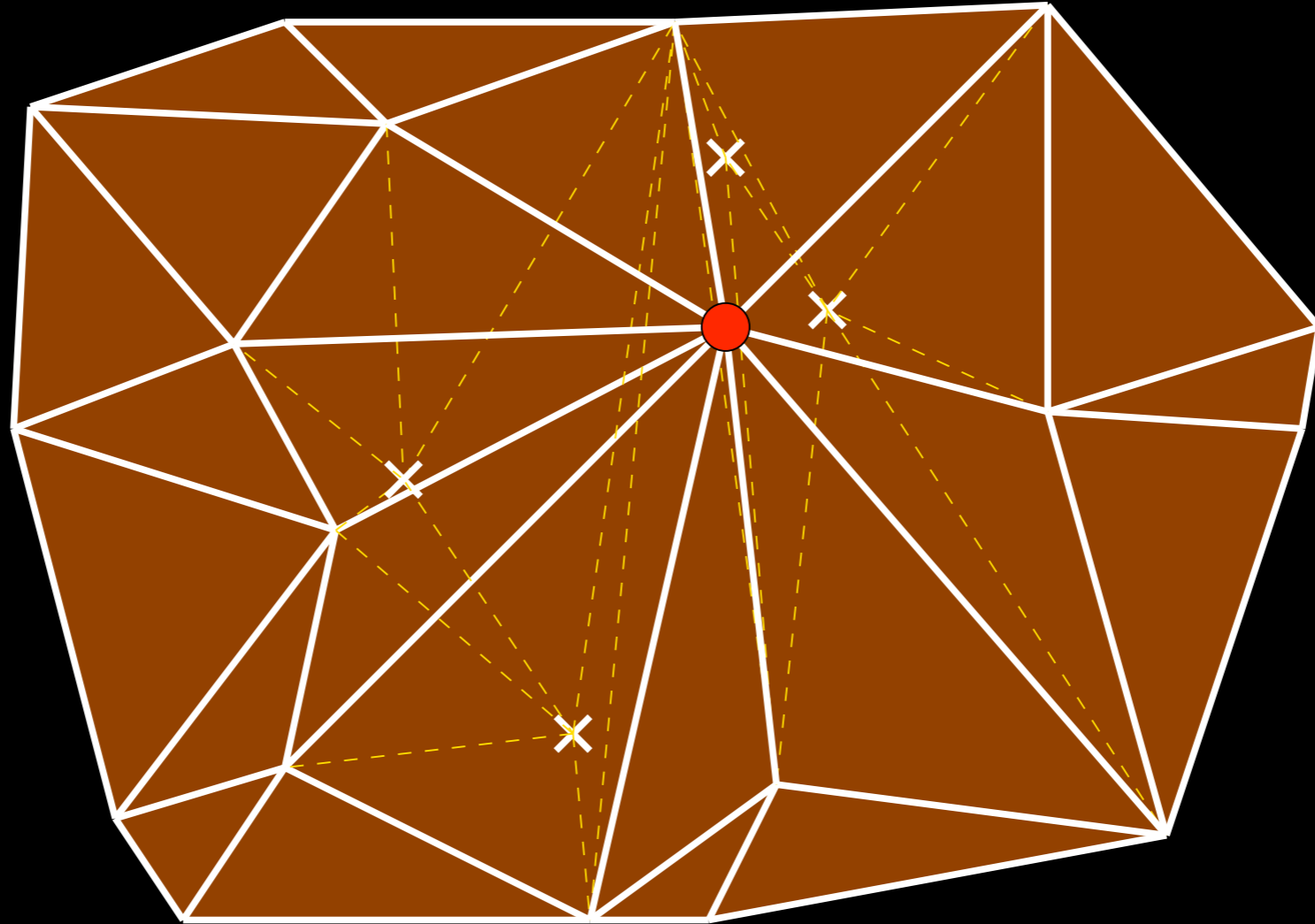
Finding the optimal cavity



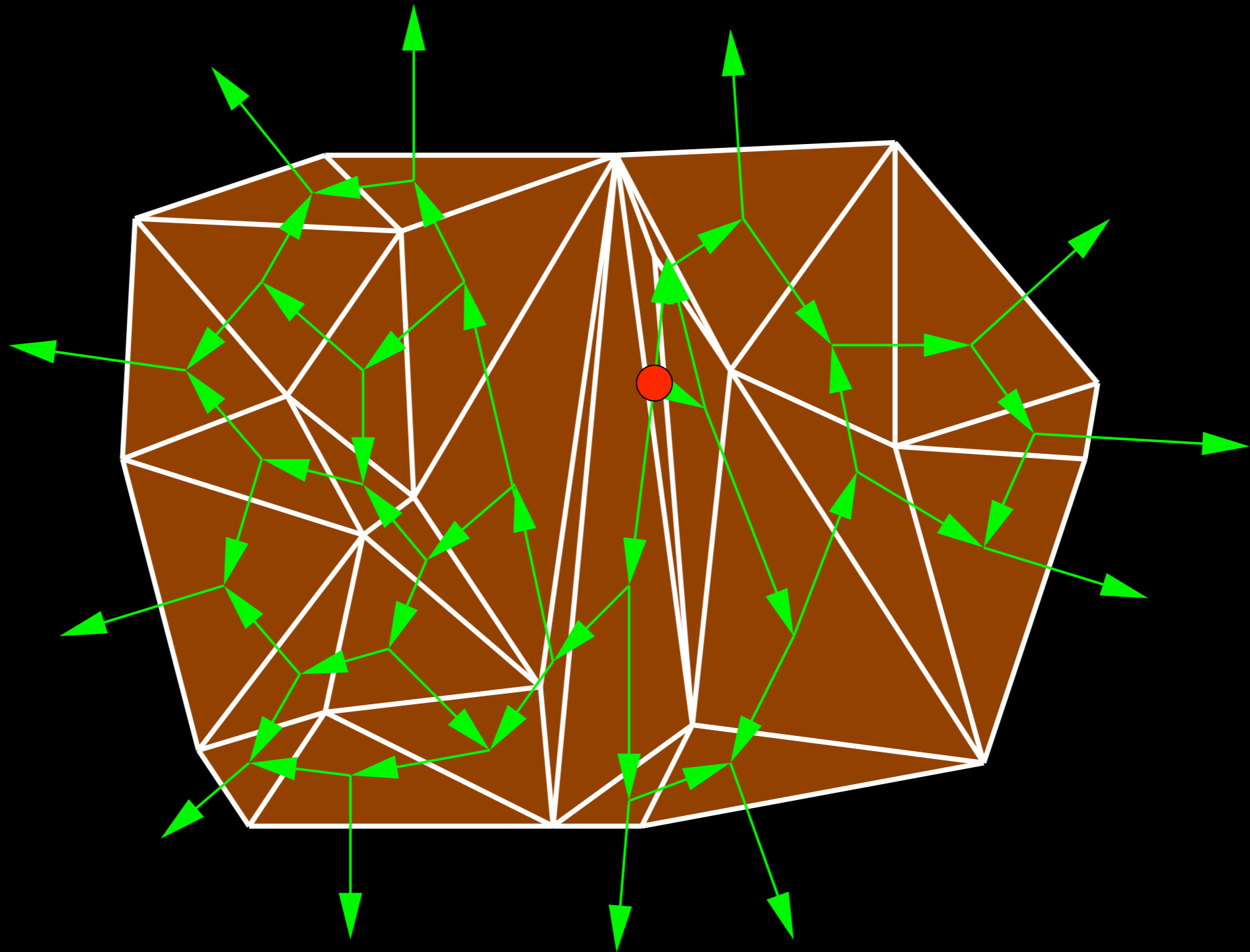
Finding the optimal cavity



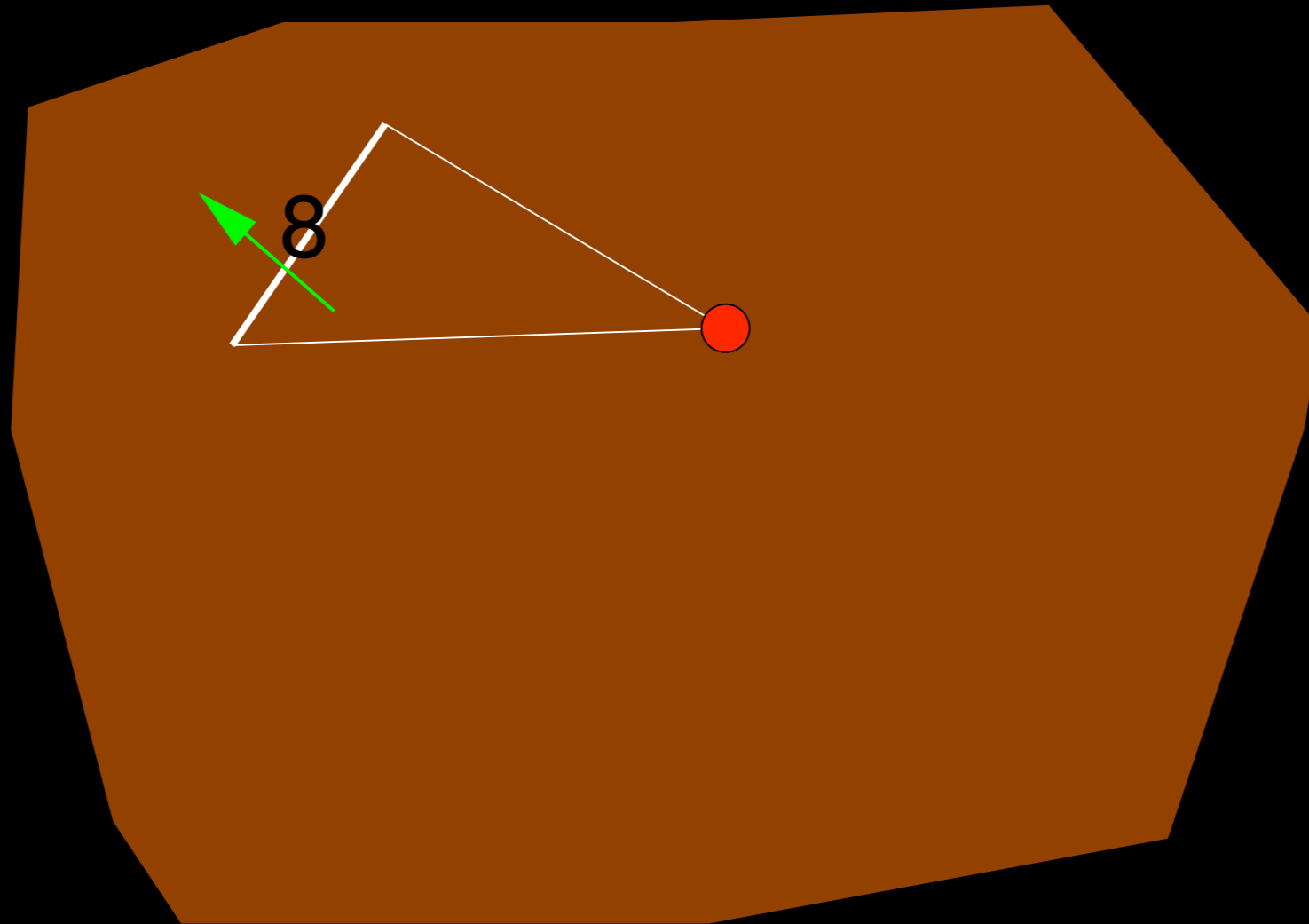
Finding the optimal cavity



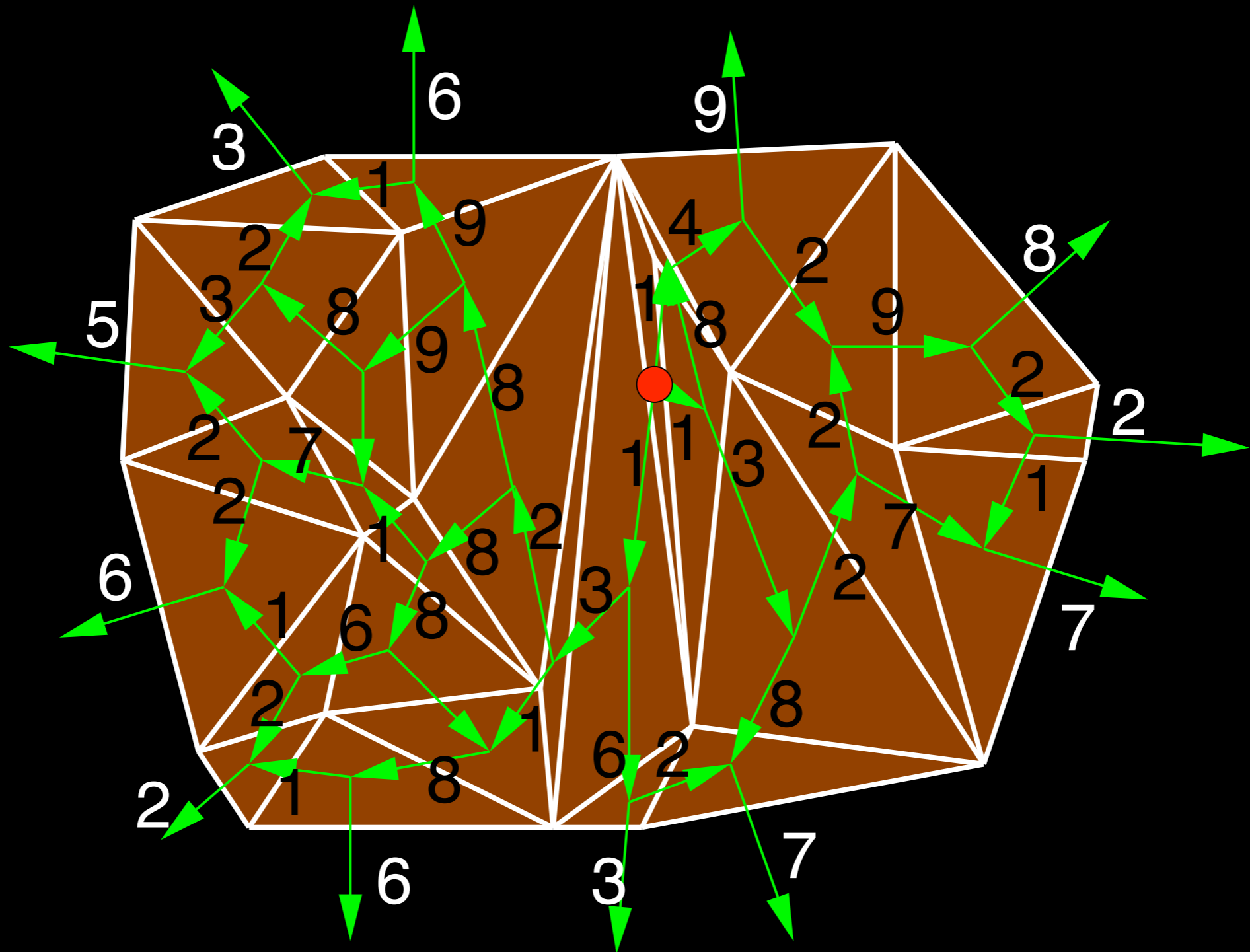
Finding the optimal cavity



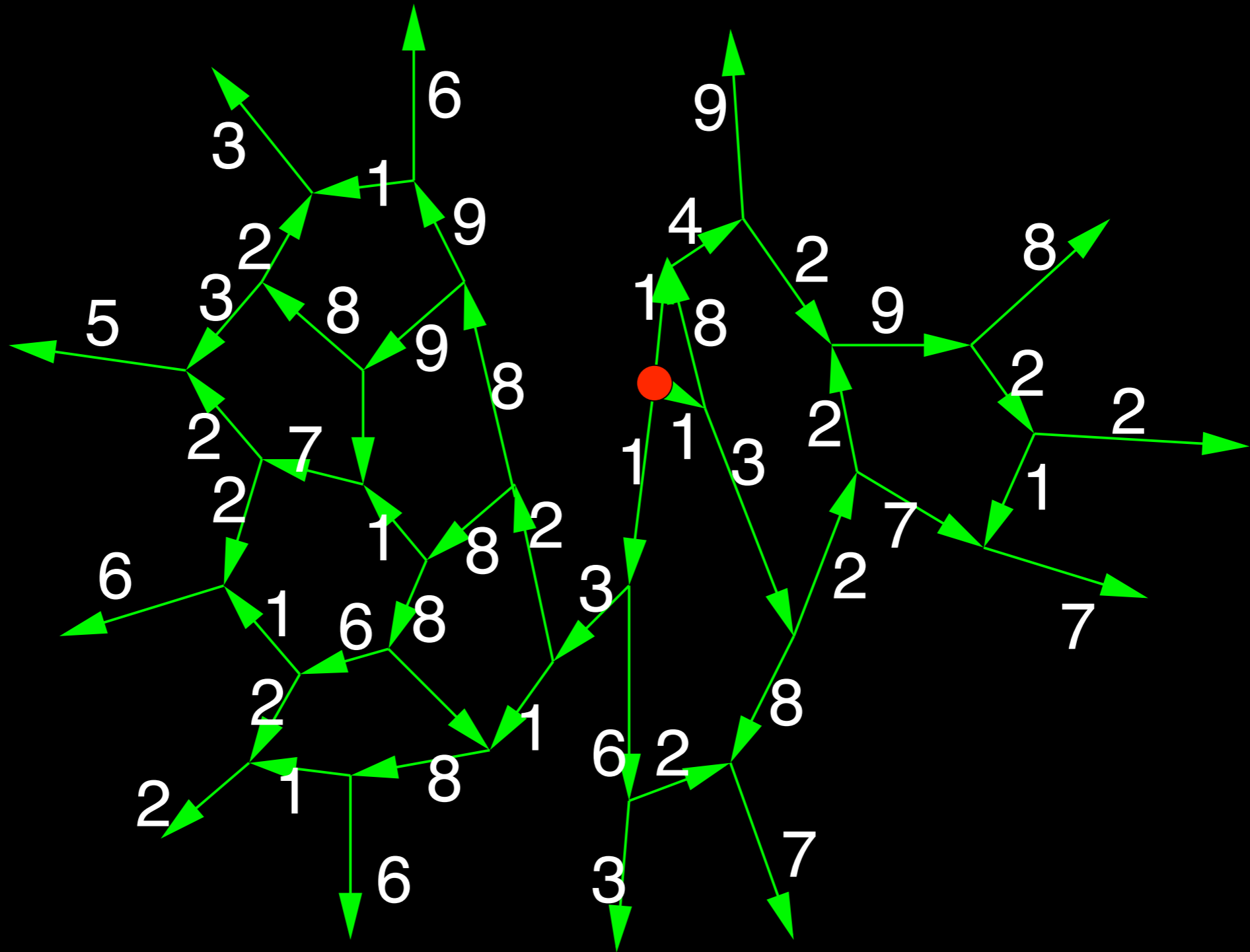
Finding the optimal cavity



Finding the optimal cavity

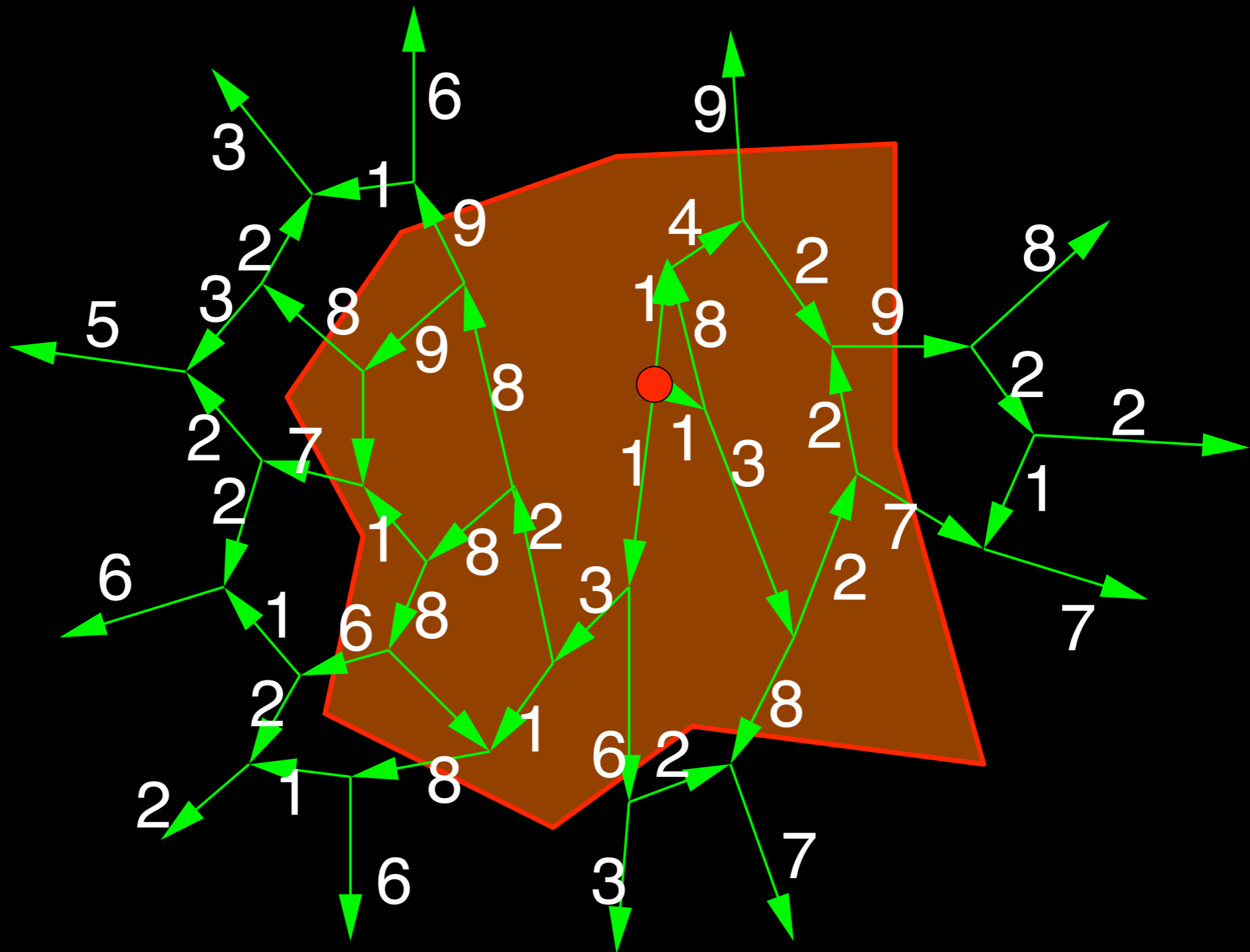


Finding the optimal cavity

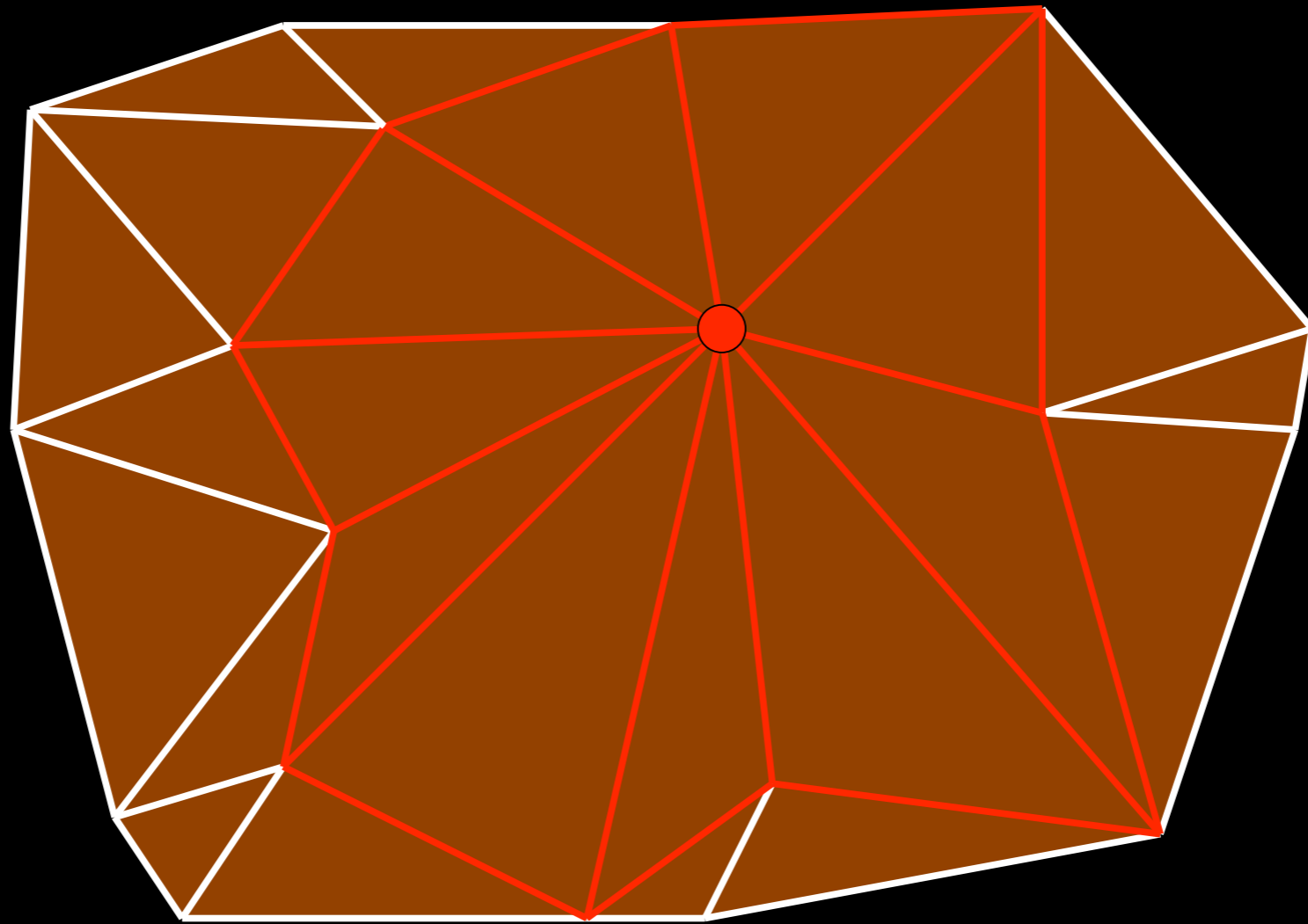


Find the cut between root and leaves that maximizes the smallest edge.

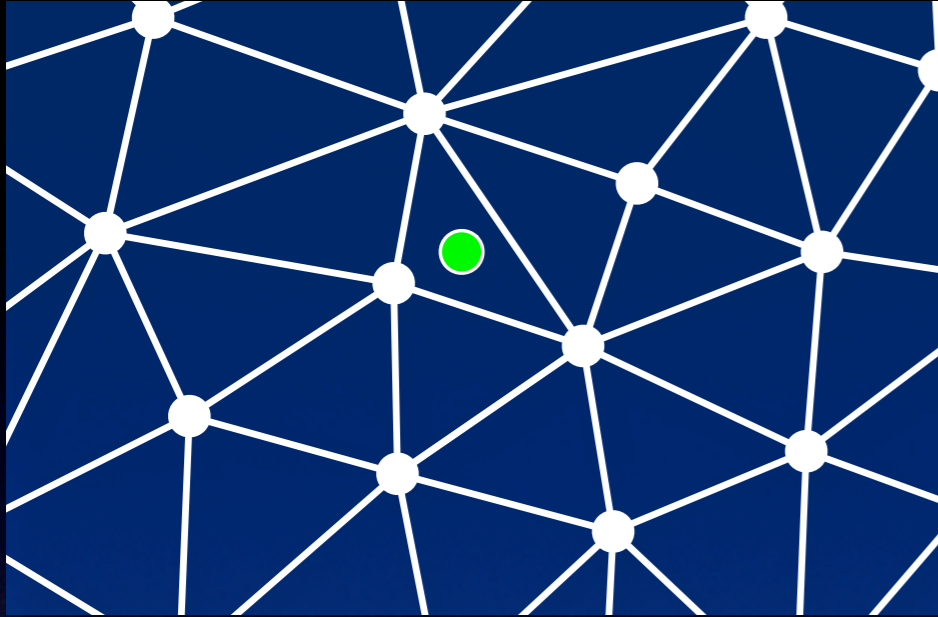
Finding the optimal cavity



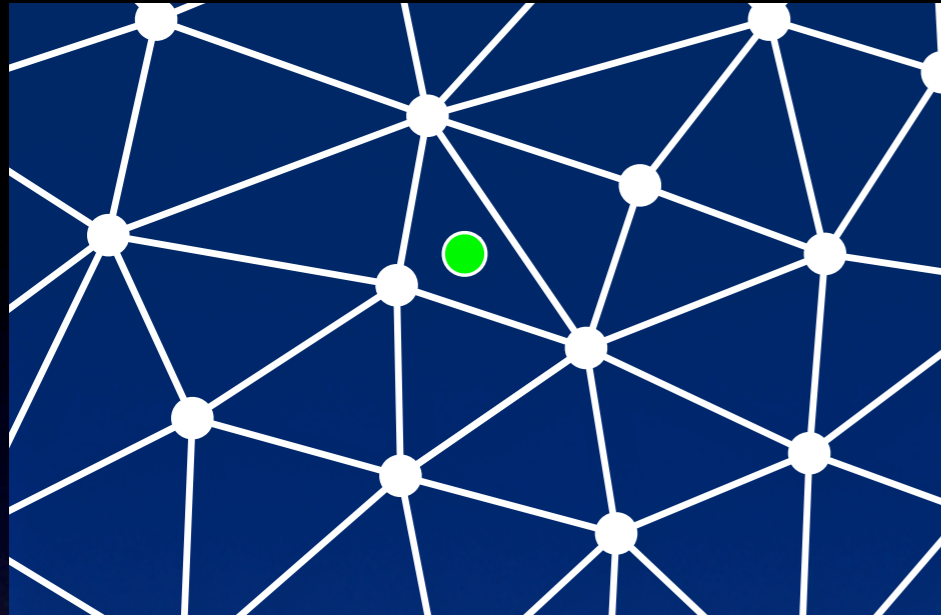
Finding the optimal cavity



Cavity improvement



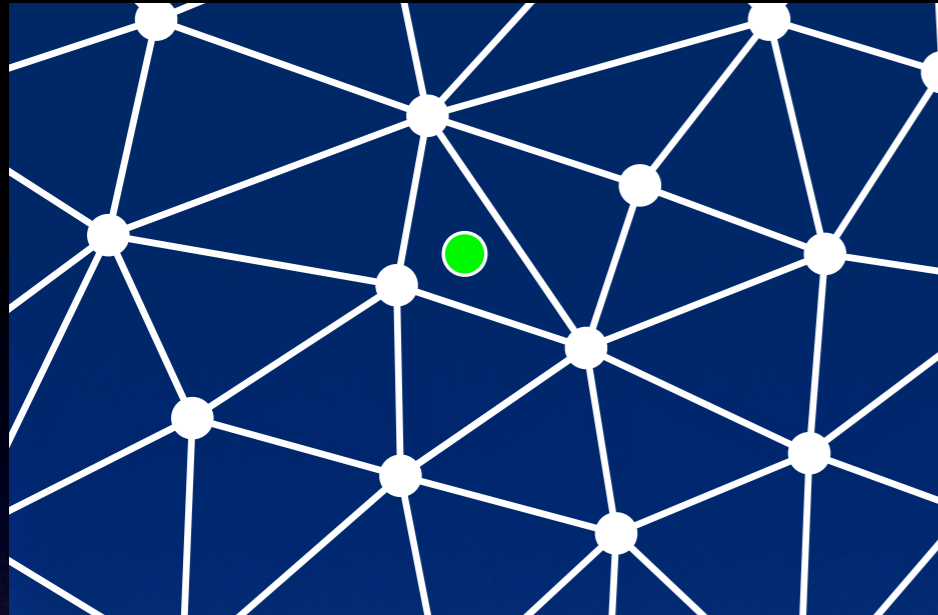
Cavity improvement



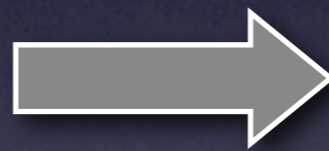
drill
optimal
cavity



Cavity improvement



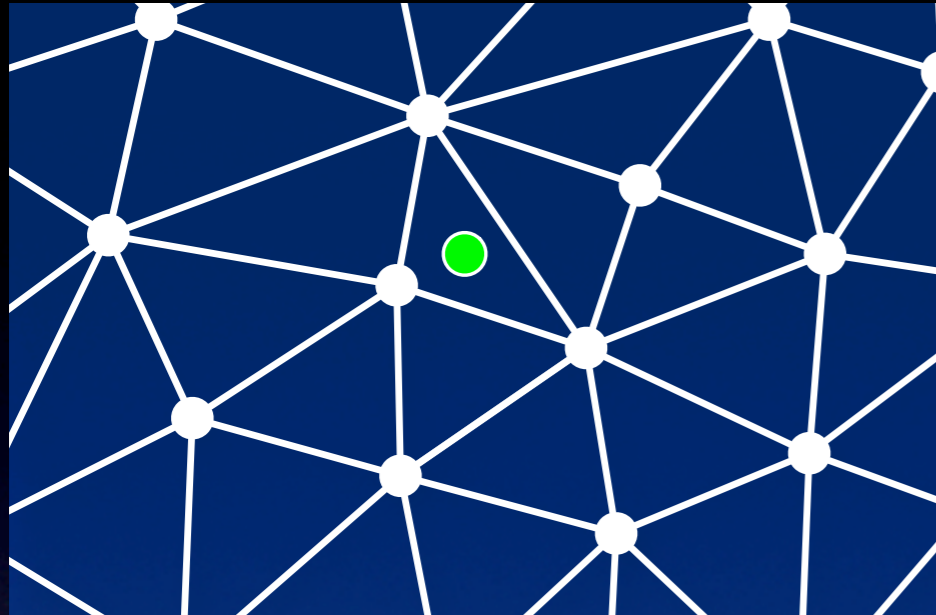
drill
optimal
cavity



Local smoothing
and topological
improvement
passes



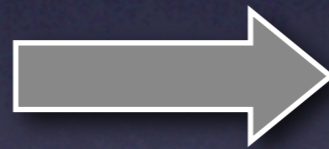
Cavity improvement



drill
optimal
cavity



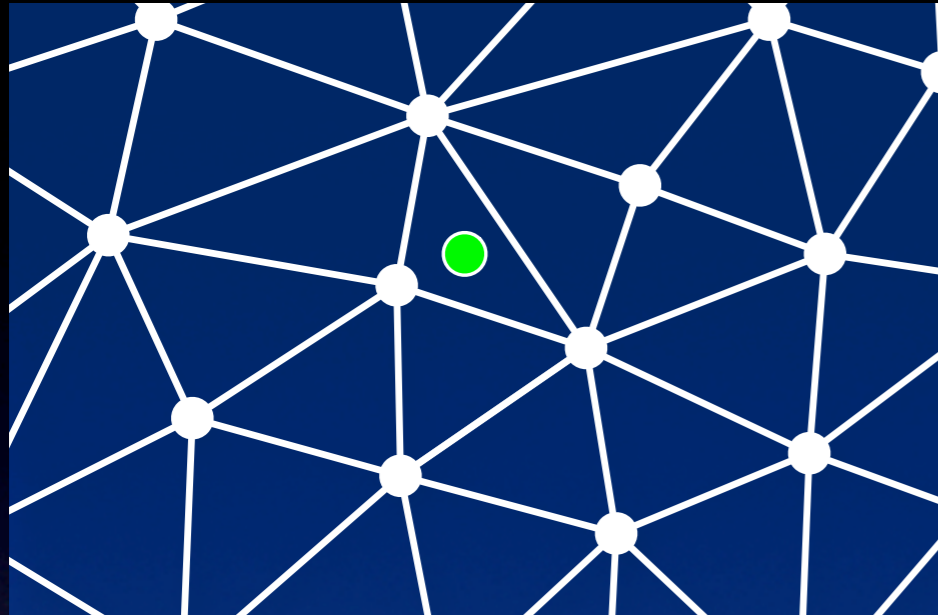
Local smoothing
and topological
improvement
passes



If quality worsens,
roll back insertion



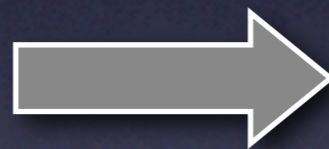
Insertion timing



drill
optimal
cavity



22% time finding biggest,
<1% time finding optimal



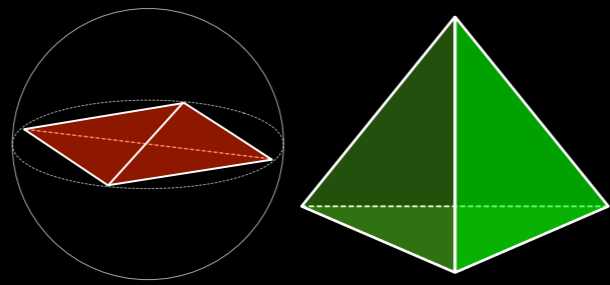
Local smoothing
and topological
improvement
passes

77% time

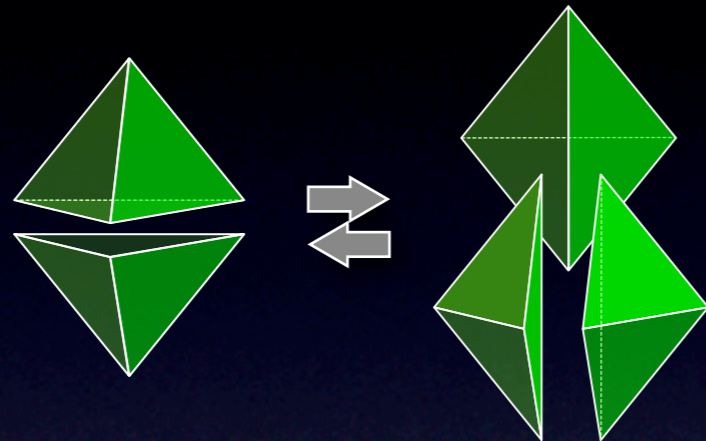


If quality worsens,
roll back insertion

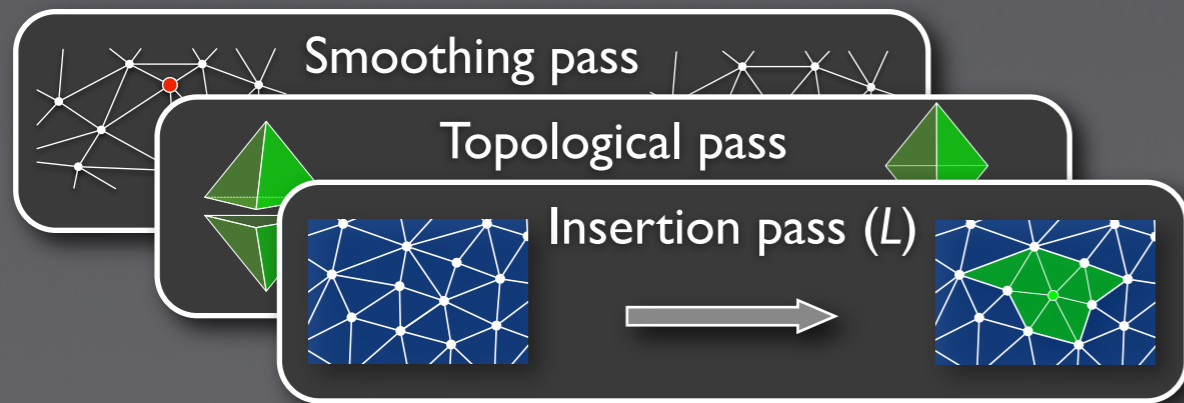




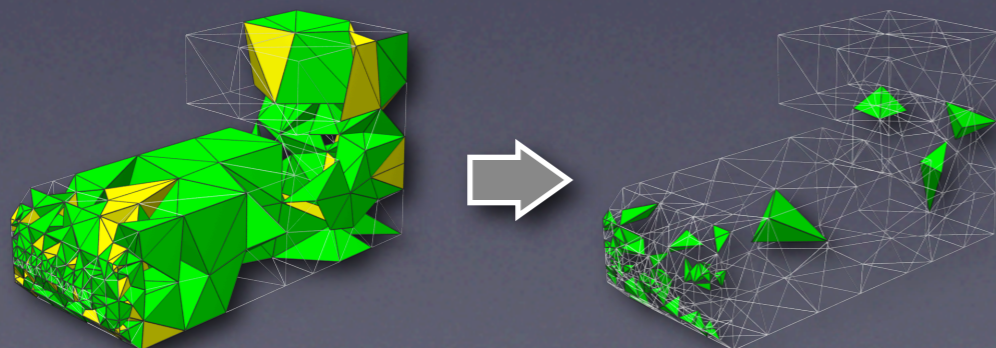
① Mesh quality



② Improvement operations



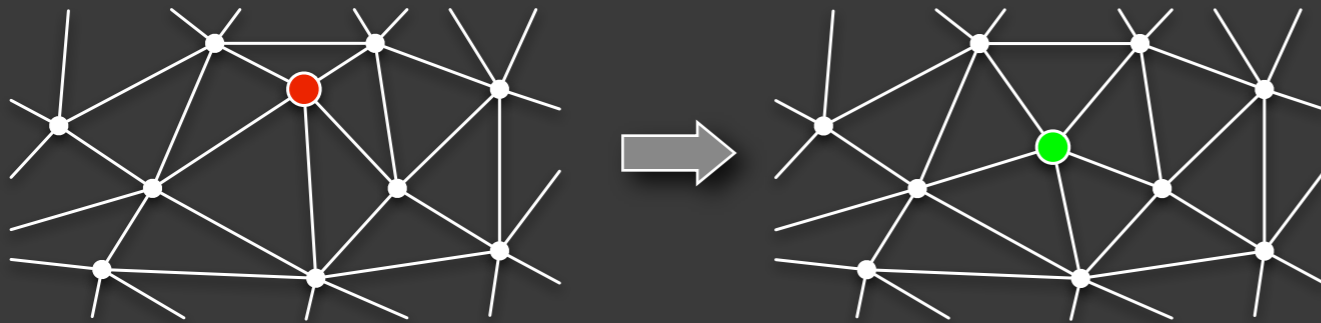
③ Improvement schedule



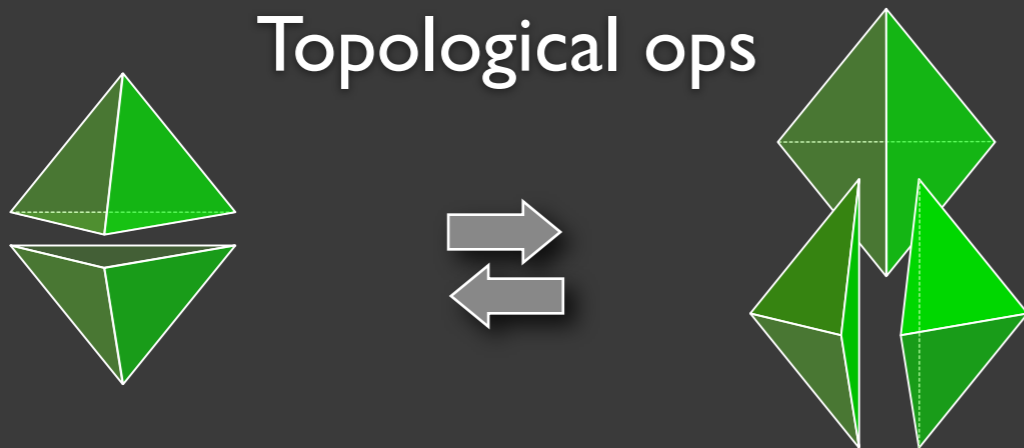
④ Results

Building a schedule

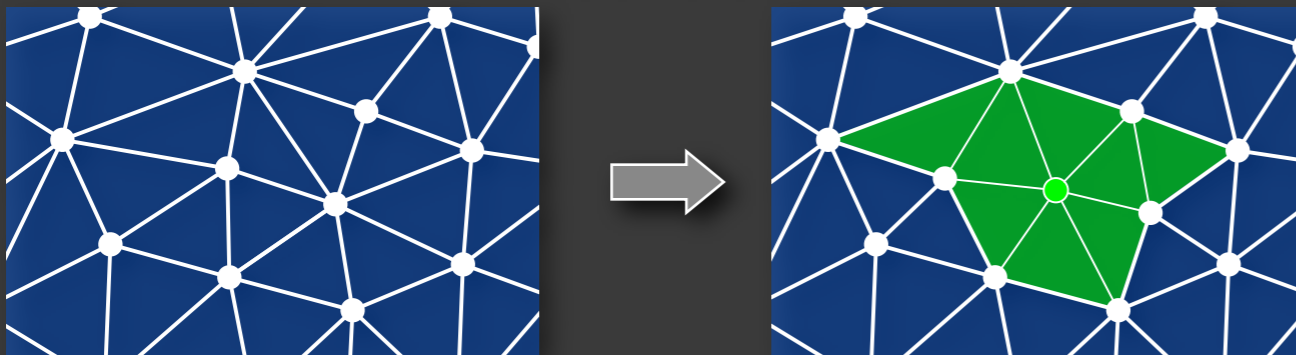
Smoothing



Topological ops



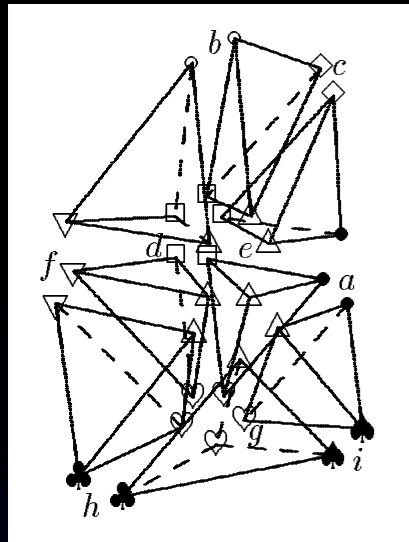
Insertion



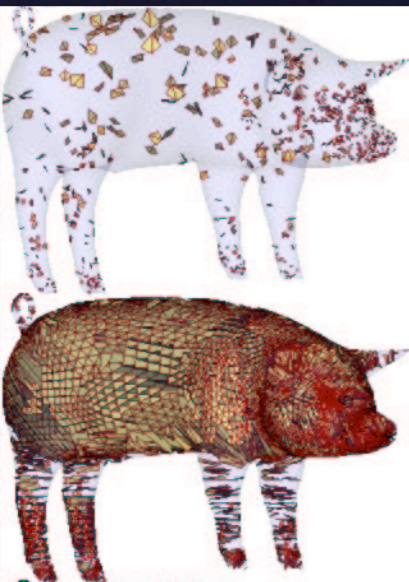
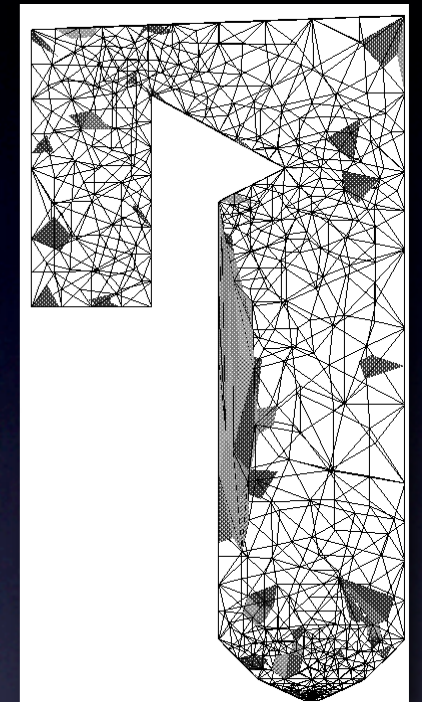
How do we turn these tools into a working improvement procedure?

Previous schedules

Joe, 1995. Repeatedly check every face to see if local topological improvements will help. Hard to gauge success.

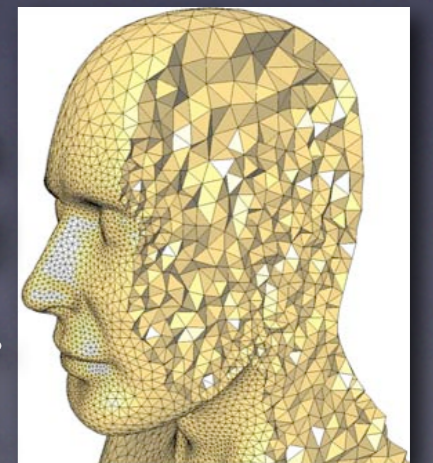


Freitag and Ollivier-Gooch, 1997. A fixed schedule of 2-3 flips, edge removal, and then optimization based smoothing. Most dihedral angles between 12 and 160 degrees.

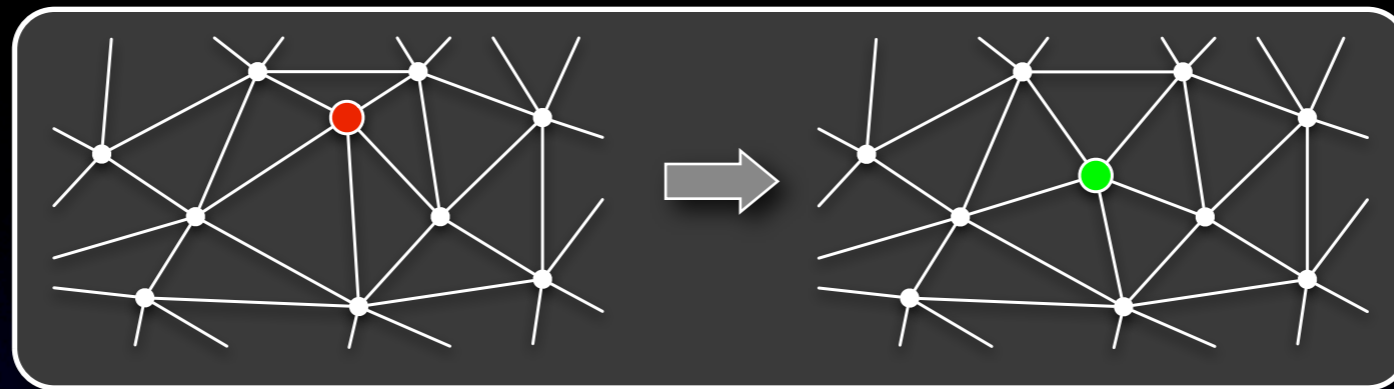


Edelsbrunner and Guoy, 2001. Sequences of 2-3 and 3-2 flips. Most dihedral angles greater than 5 degrees.

Alliez, Cohen-Steiner, Yvinec, and Desbrun, 2005. Alternates between global passes of smooth optimization-based smoothing and Delaunay retriangulation. No bounds given. In our experience, bad tetrahedra remain.

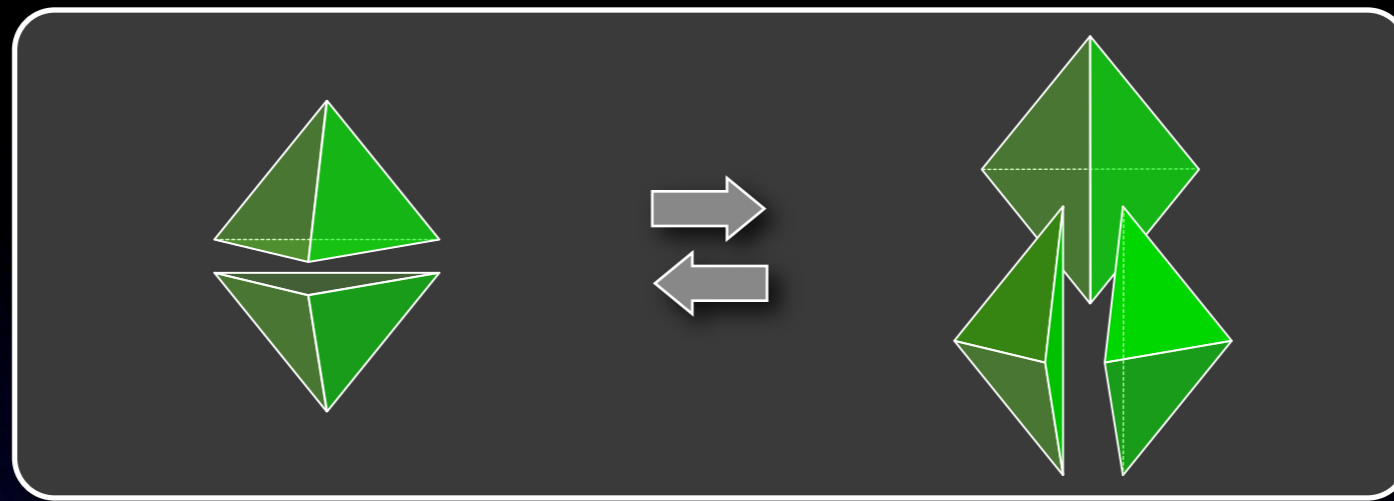


Smoothing Pass



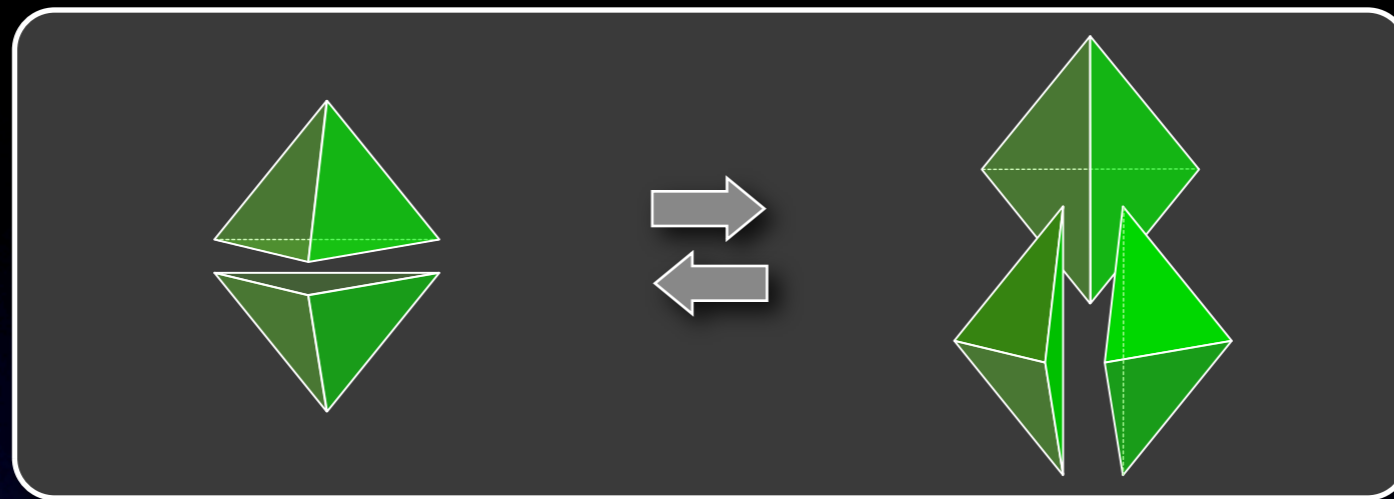
Perform optimization-based smoothing on each vertex in the mesh.

Topological Pass



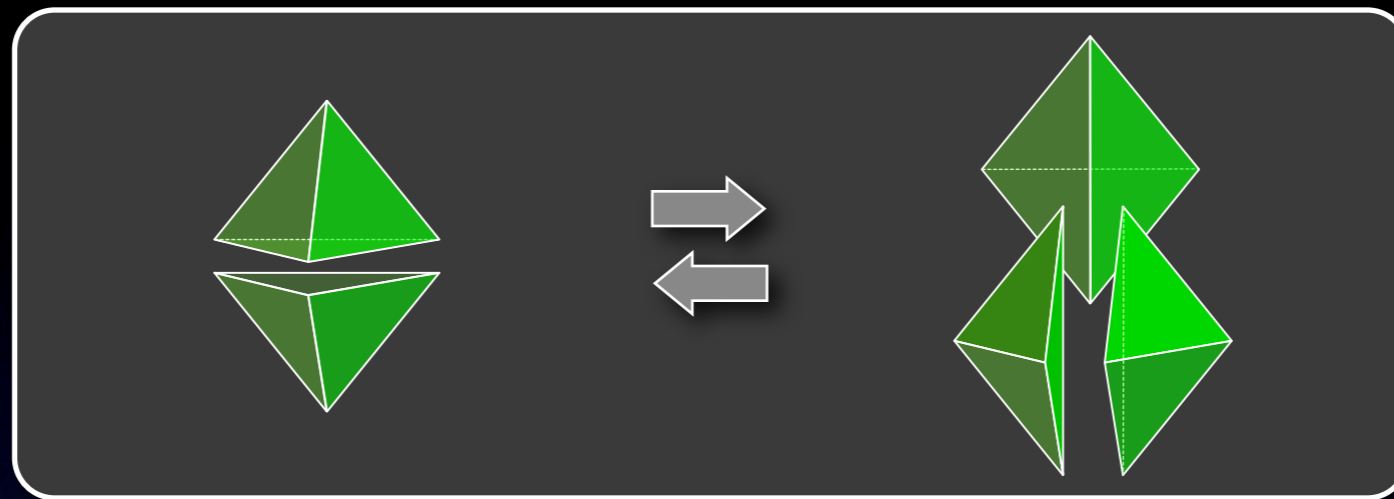
for each tetrahedron t in the mesh

Topological Pass



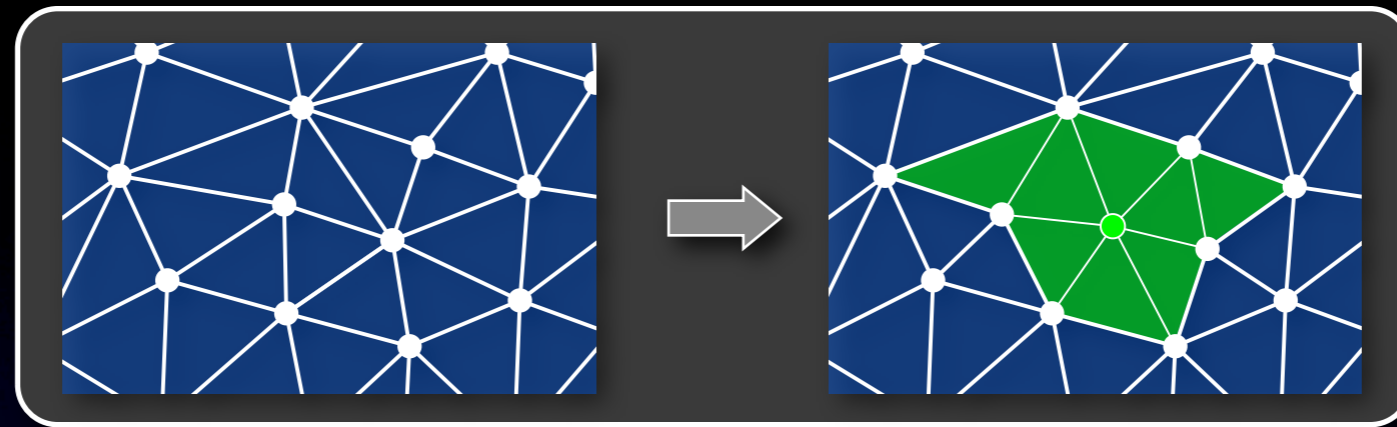
for each tetrahedron t in the mesh
 for each edge e of t (if t still exists)
 Attempt to remove edge e .

Topological Pass



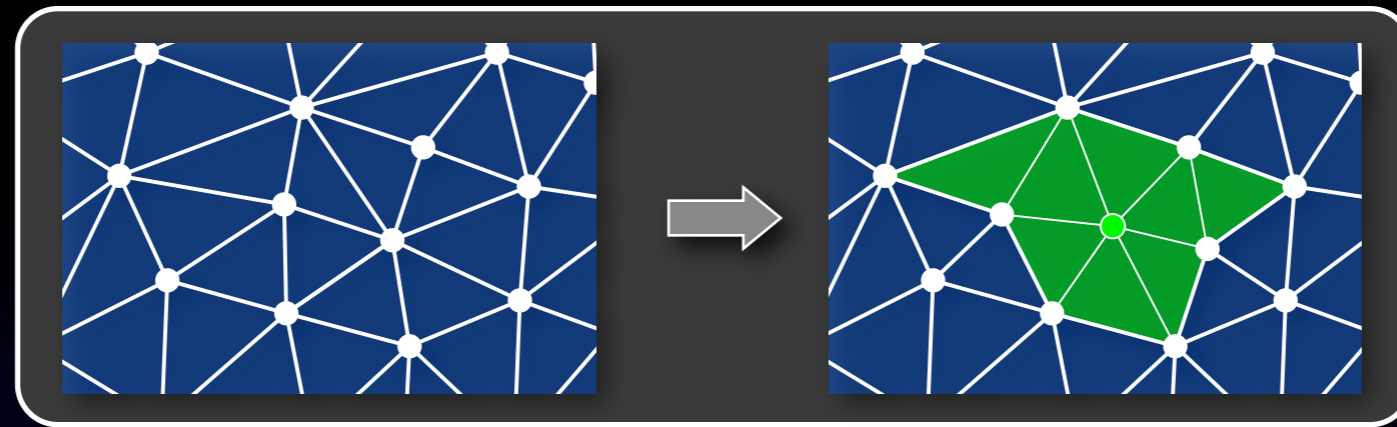
for each tetrahedron t in the mesh
 for each edge e of t (if t still exists)
 Attempt to remove edge e .
 for each face f of t (if t still exists)
 Attempt to remove face f .

Insertion Pass

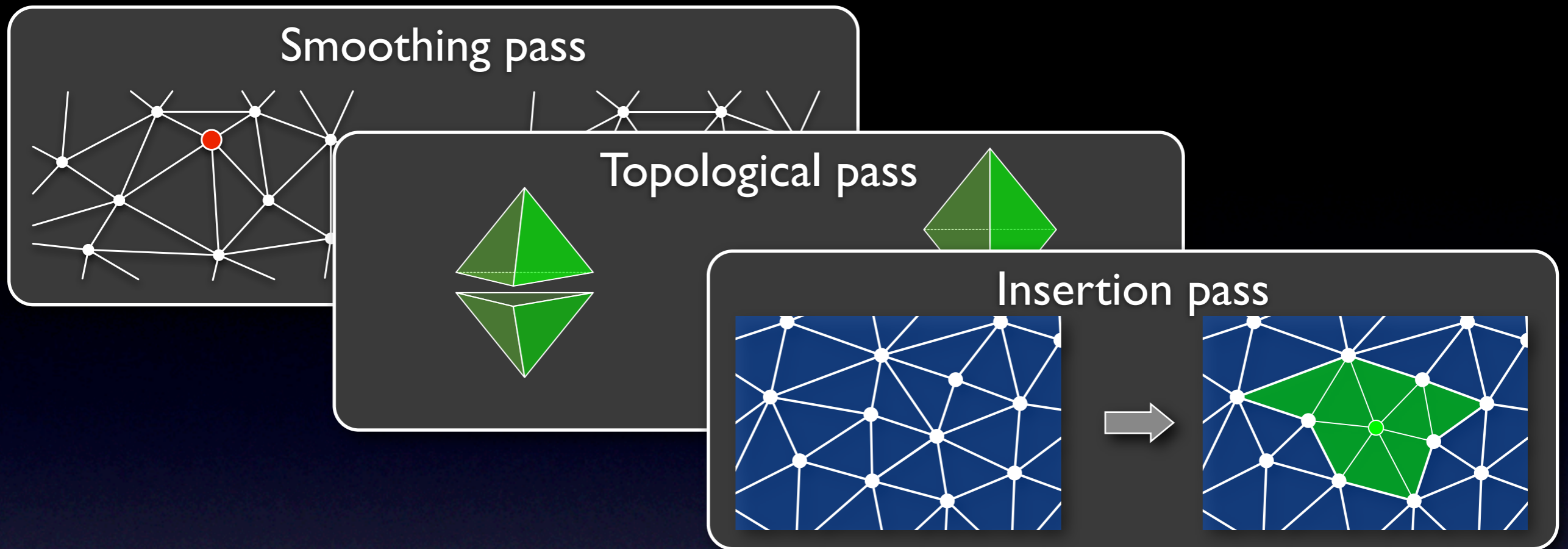


for each tetrahedron t in L that still exists

Insertion Pass



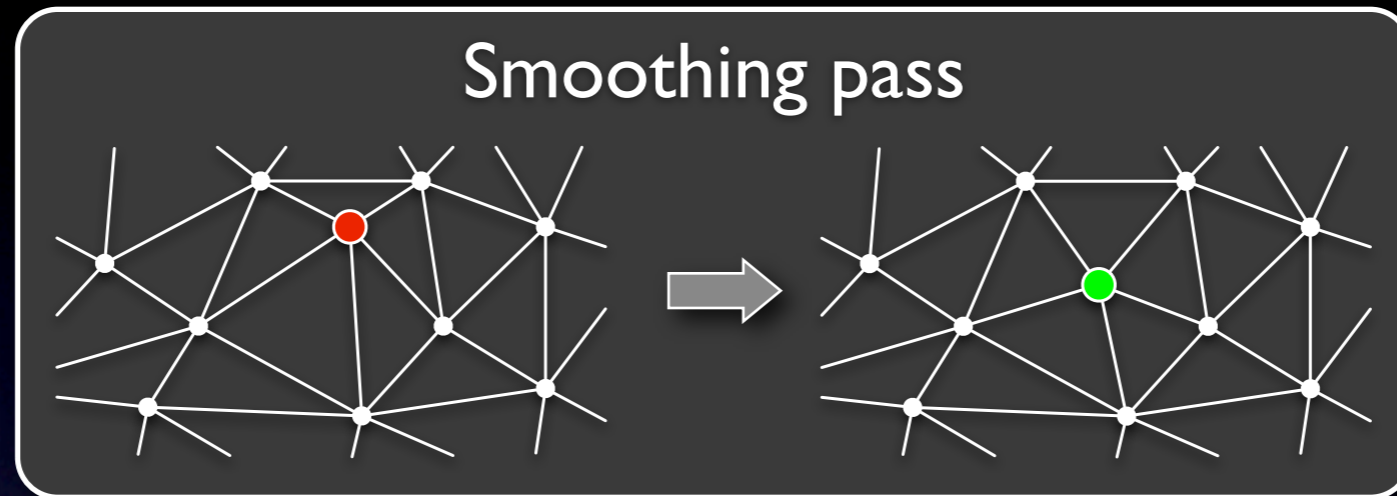
for each tetrahedron t in L that still exists
Attempt insertion to split t .



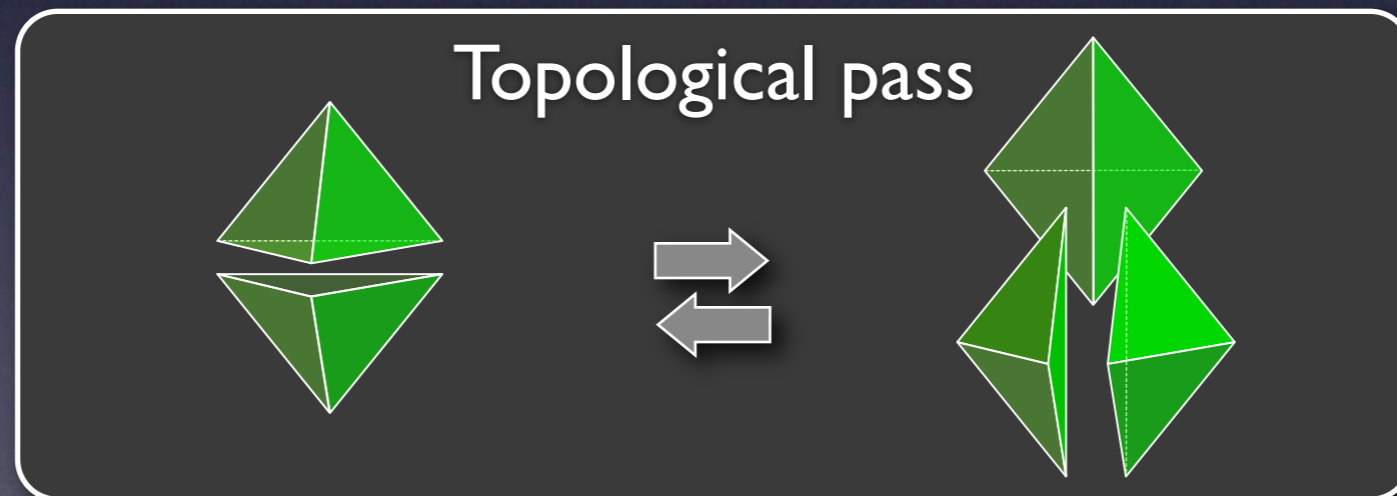
A pass **succeeds** if the overall mesh quality vector improves “enough.”

$$Q(M) = \{1, 3, 10, 10, 15, 20, 23 \dots\}$$

To get started,



then



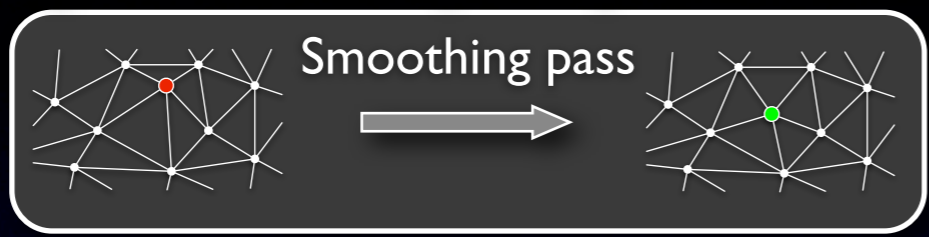
then...


```

failed    0
while failed < 3

```

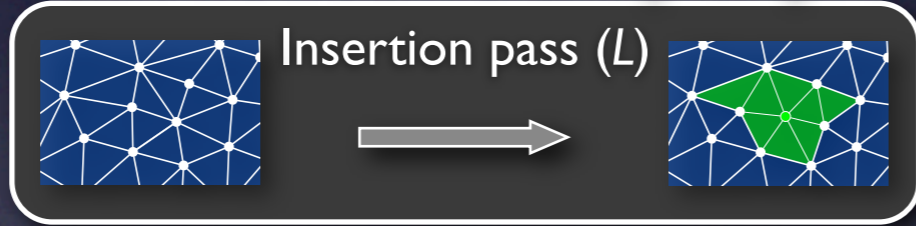
Q list of quality indicators for the mesh



if mesh **not** sufficiently improved over Q



if mesh **not** sufficiently improved over Q



if mesh **not** sufficiently improved over Q

```

    failed    failed + 1
else failed    0 {insertion pass succeeded}
else failed    0 {topological pass succeeded}
else failed    0 {smoothing pass succeeded}

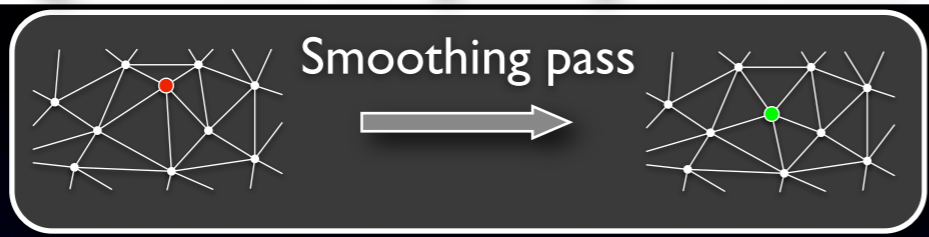
```

```

failed    0
while failed < 3

```

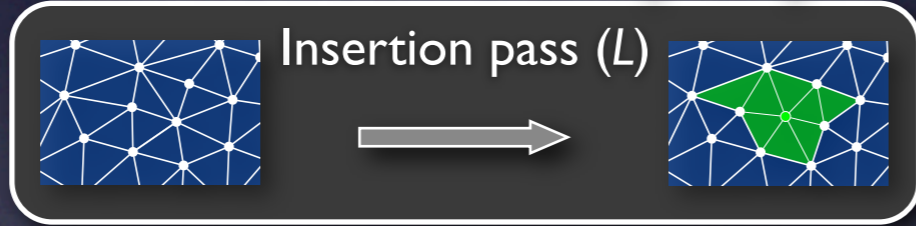
Q list of quality indicators for the mesh



if mesh **not** sufficiently improved over Q



if mesh **not** sufficiently improved over Q



if mesh **not** sufficiently improved over Q

```

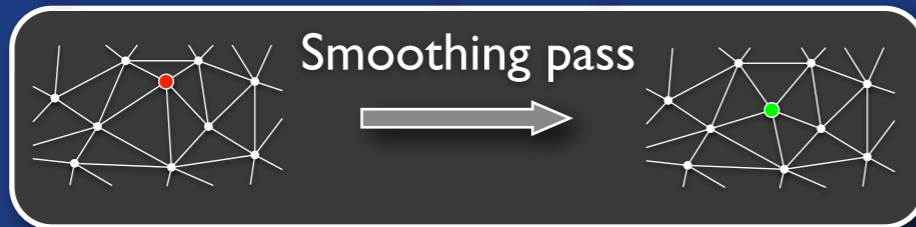
    failed    failed + 1
else failed    0 {insertion pass succeeded}
else failed    0 {topological pass succeeded}
else failed    0 {smoothing pass succeeded}

```

failed 0

while *failed* < 3

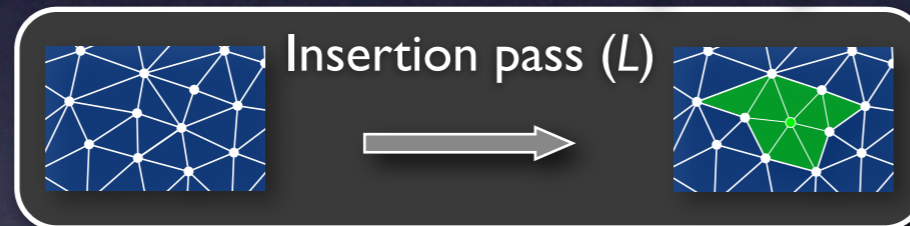
Q list of quality indicators for the mesh



if mesh **not** sufficiently improved over *Q*



if mesh **not** sufficiently improved over *Q*



if mesh **not** sufficiently improved over *Q*

failed *failed* + 1

else *failed* 0 {insertion pass **succeeded**}

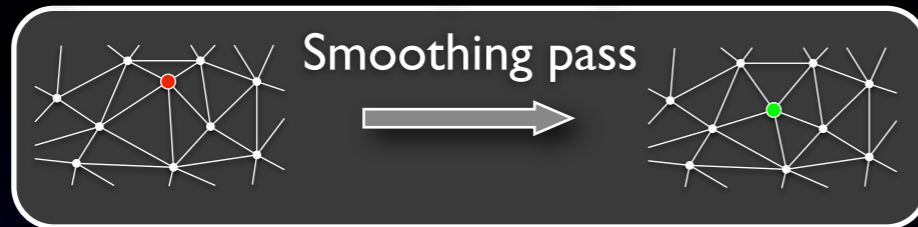
else *failed* 0 {topological pass **succeeded**}

else *failed* 0 {smoothing pass **succeeded**}

failed 0

while *failed* < 3

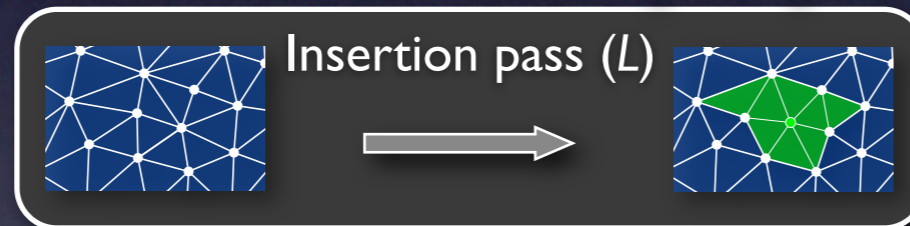
Q list of quality indicators for the mesh



if mesh **not** sufficiently improved over *Q*



if mesh **not** sufficiently improved over *Q*



if mesh **not** sufficiently improved over *Q*

failed *failed* + 1

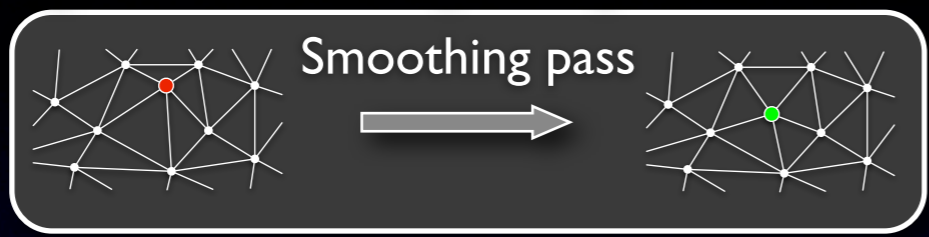
else *failed* 0 {insertion pass **succeeded**}

else *failed* 0 {topological pass **succeeded**}

else *failed* 0 {smoothing pass **succeeded**}

failed 0
while *failed* < 3

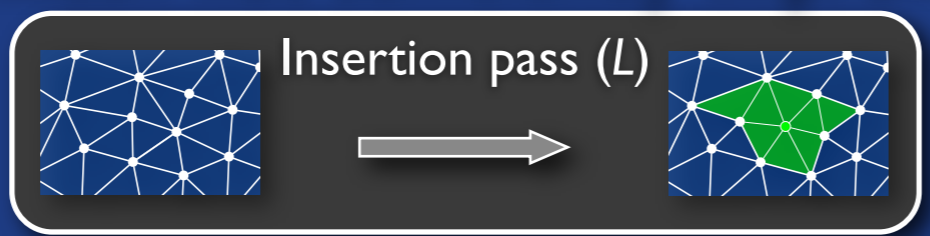
Q list of quality indicators for the mesh



if mesh **not** sufficiently improved over *Q*



if mesh **not** sufficiently improved over *Q*



if mesh **not** sufficiently improved over *Q*

failed *failed* + 1

else *failed* 0 {insertion pass **succeeded**}

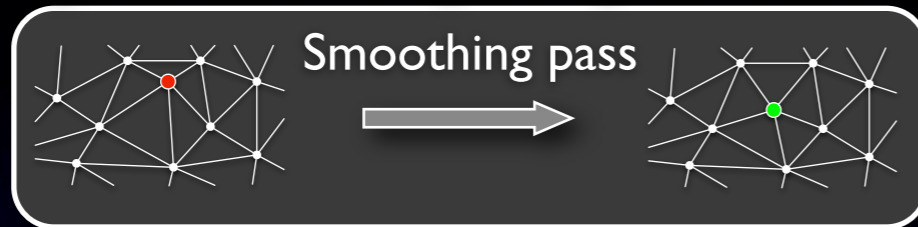
else *failed* 0 {topological pass **succeeded**}

else *failed* 0 {smoothing pass **succeeded**}

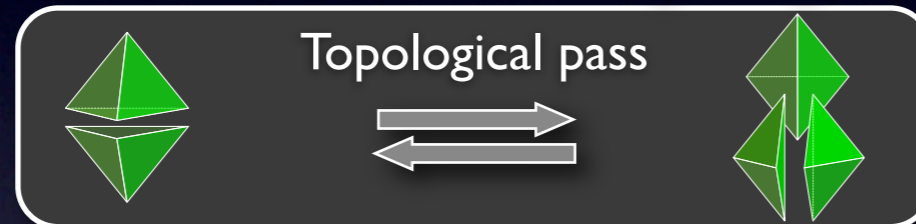
failed 0

while *failed* < 3

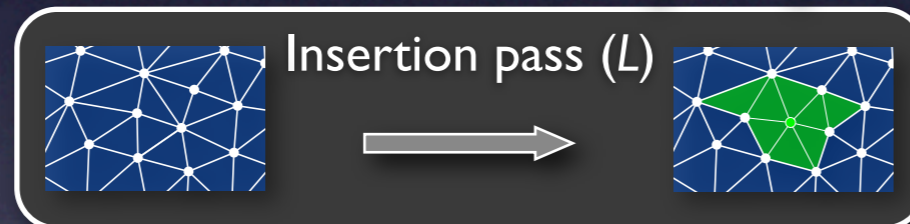
Q list of quality indicators for the mesh



if mesh **not** sufficiently improved over *Q*



if mesh **not** sufficiently improved over *Q*



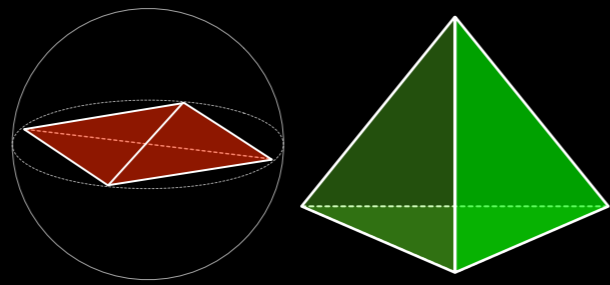
if mesh **not** sufficiently improved over *Q*

failed *failed* + 1

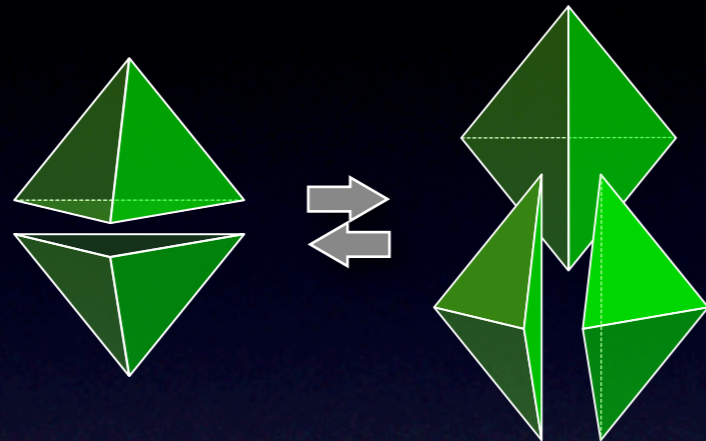
else *failed* 0 {insertion pass **succeeded**}

else *failed* 0 {topological pass **succeeded**}

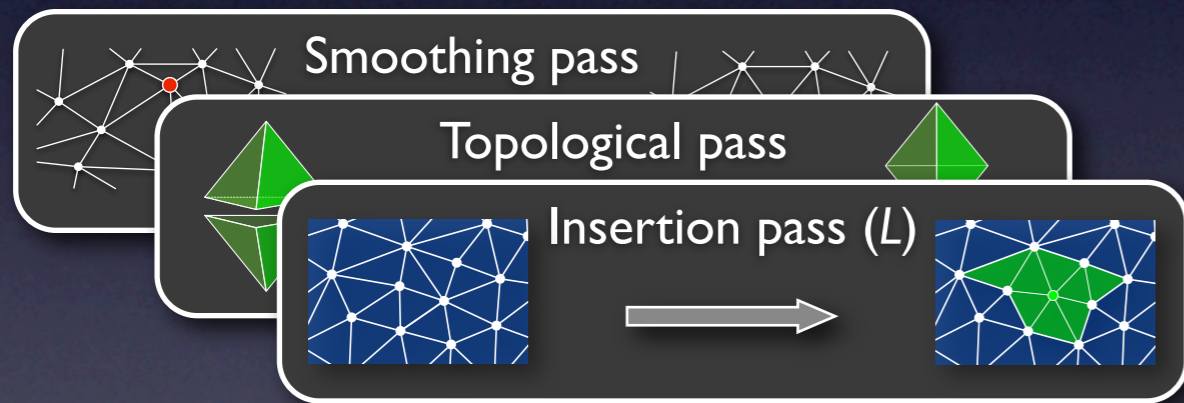
else *failed* 0 {smoothing pass **succeeded**}



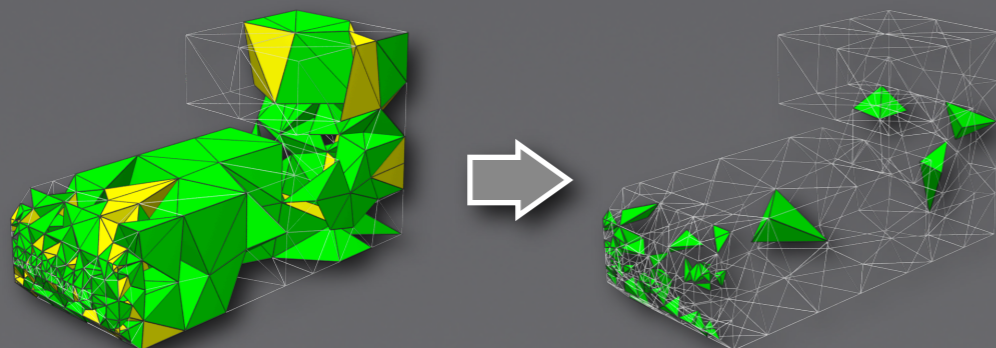
① Mesh quality



② Improvement operations

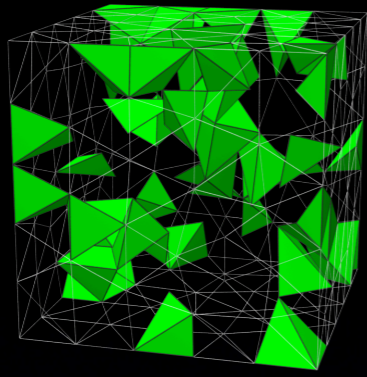


③ Improvement schedule

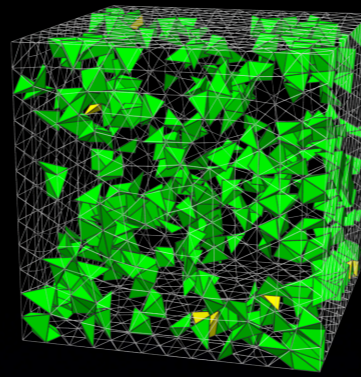


④ Results

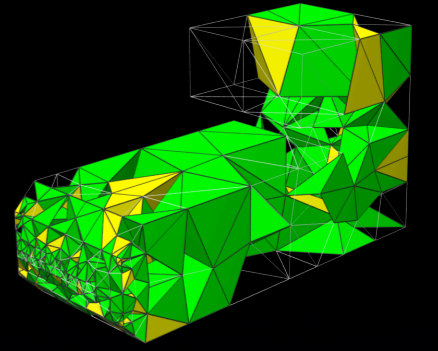
CUBE1K



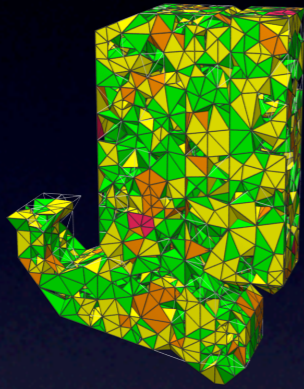
CUBE10K



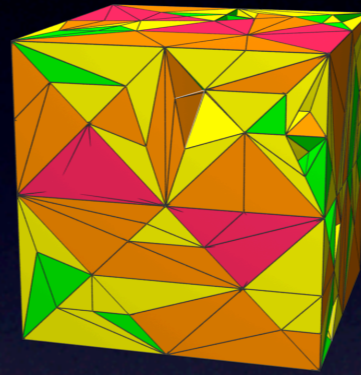
TFIRE



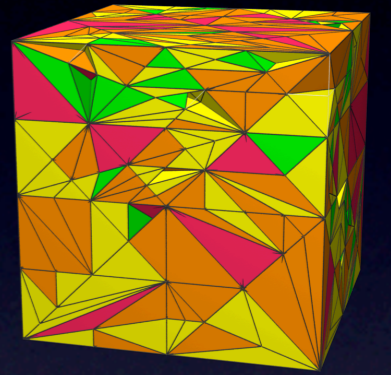
TIRE



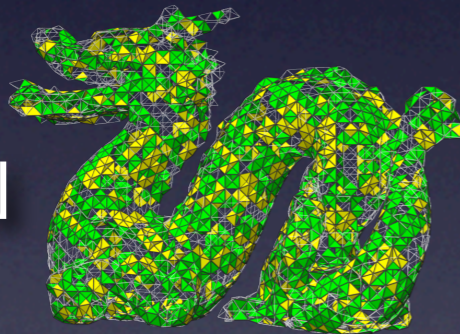
RAND1



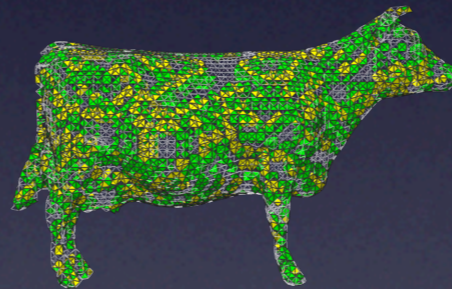
RAND2



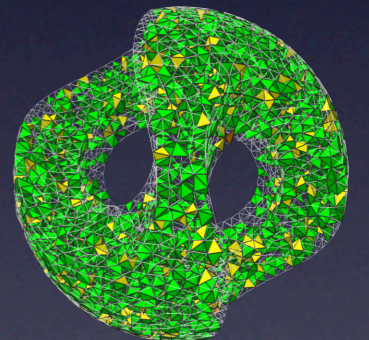
DRAGON



COW



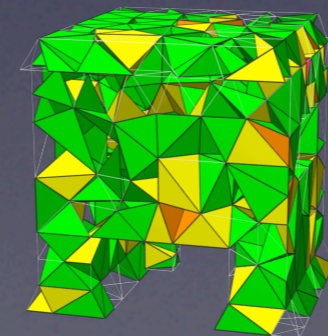
SCULPT



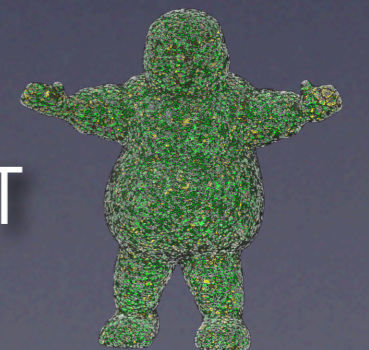
P

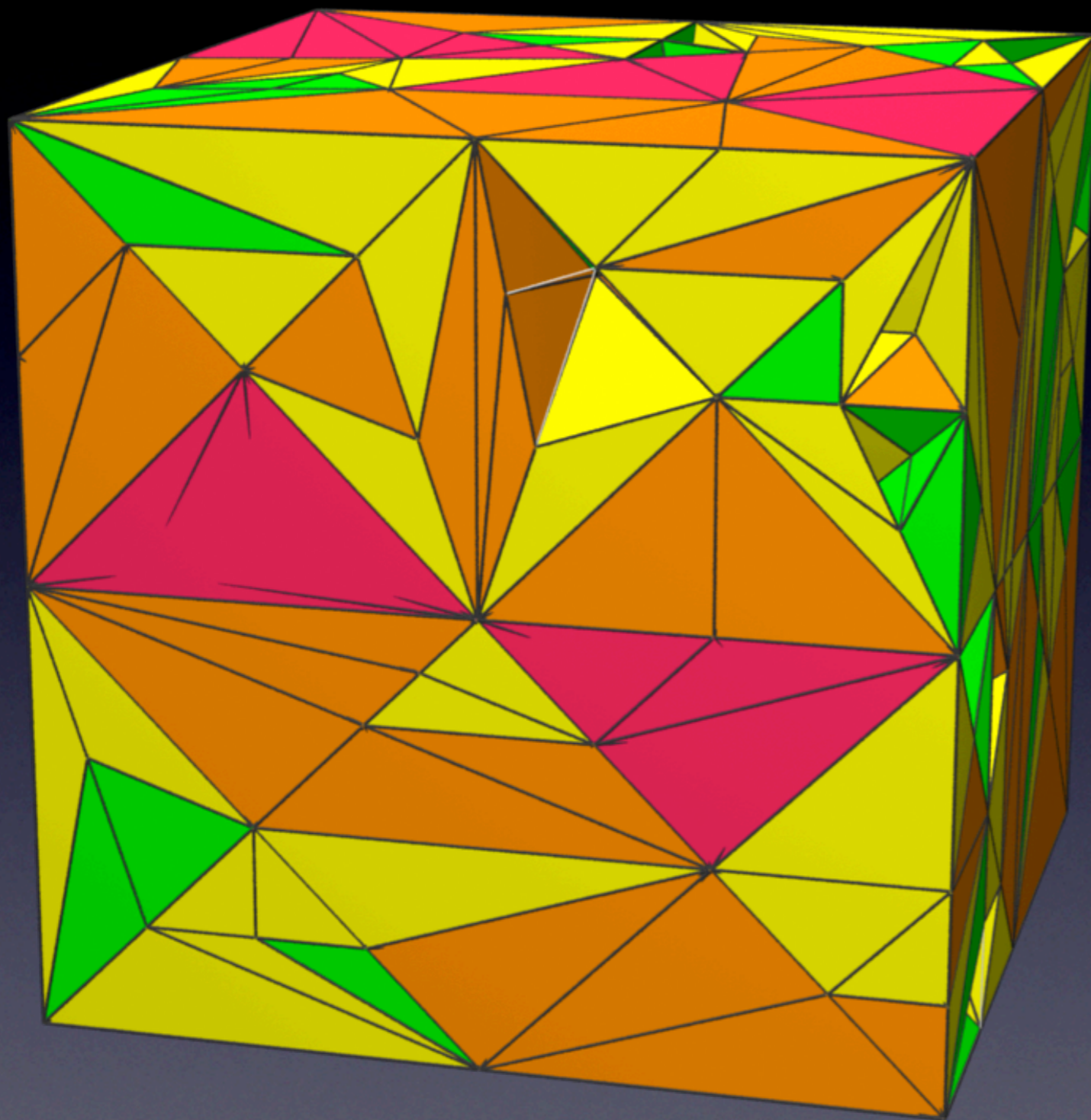


HOUSE



STAYPUFT





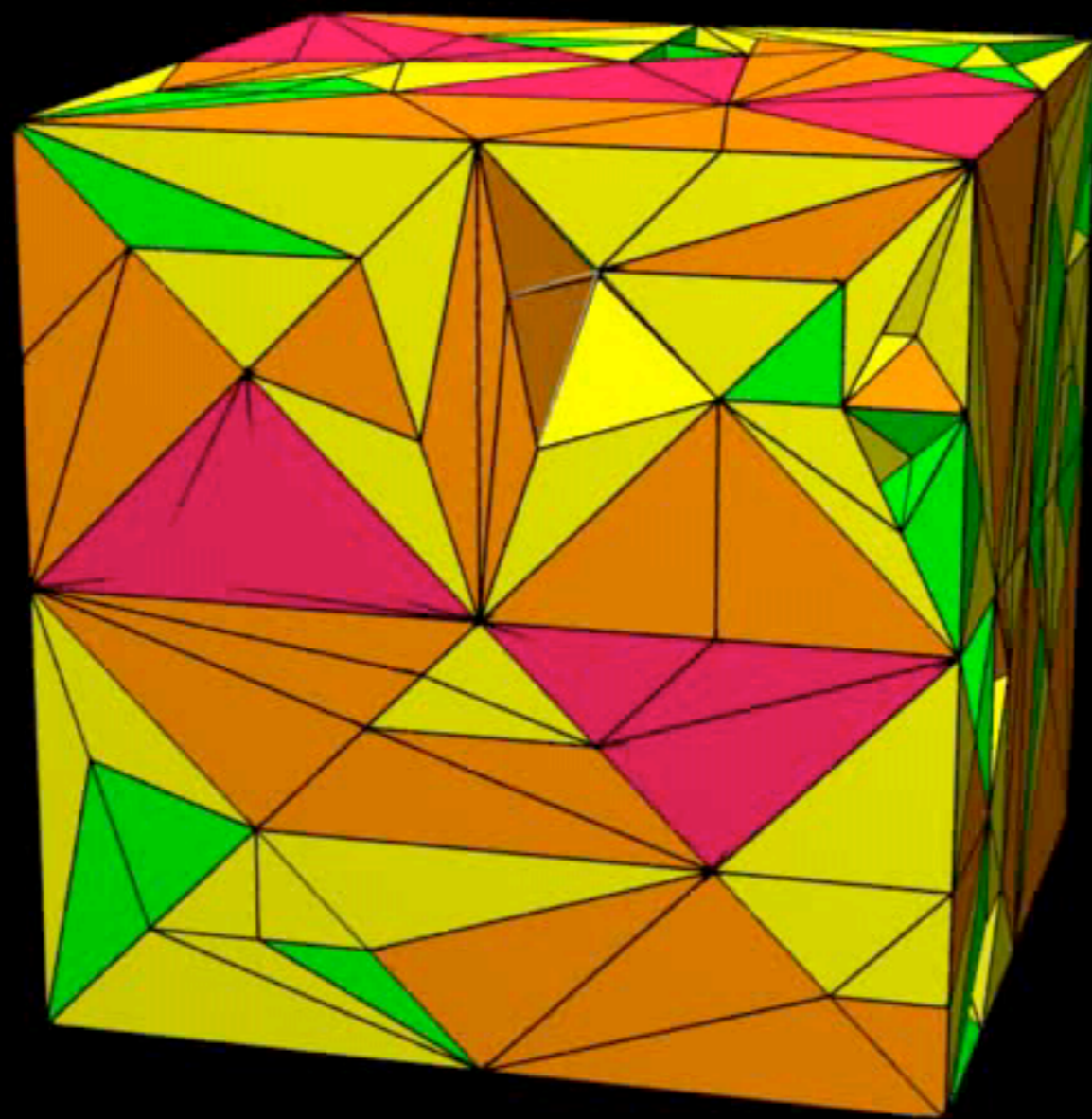
< 5 or > 175

< 15 or > 165

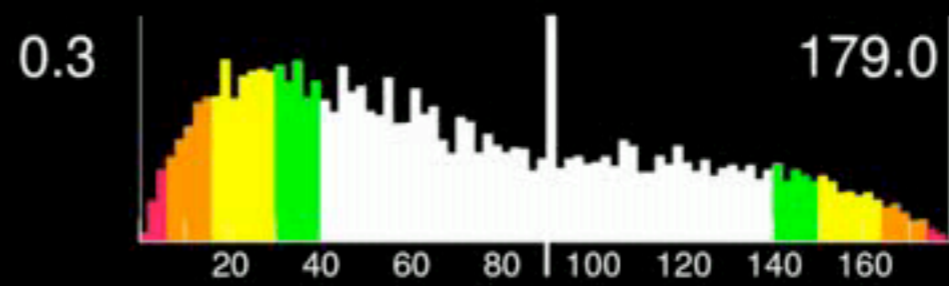
< 30 or > 150

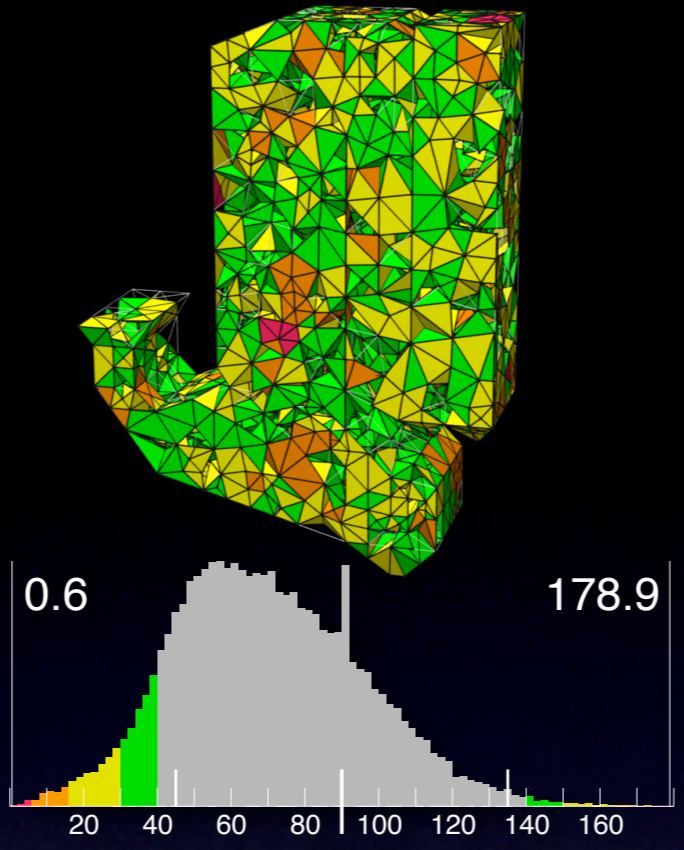
< 40 or > 140

better



smoothing

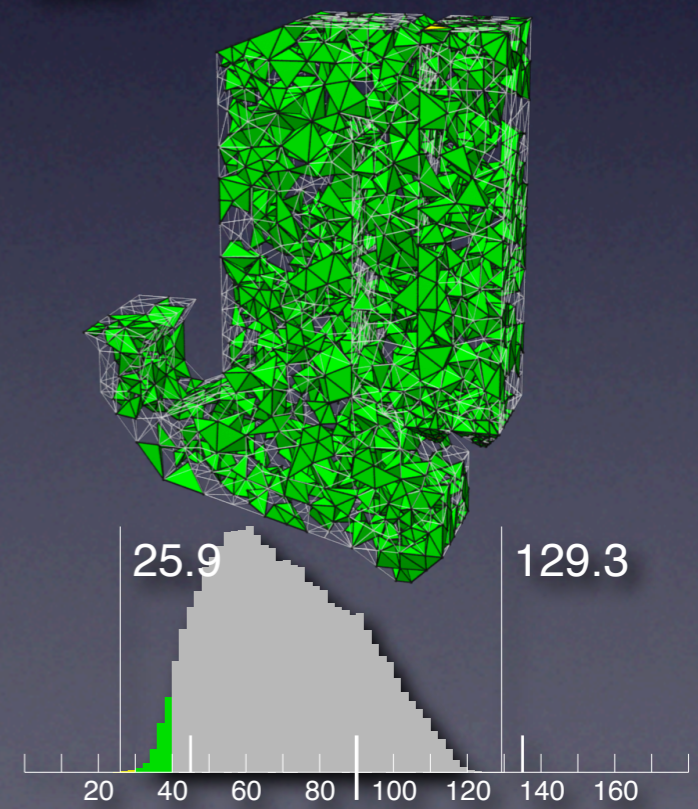
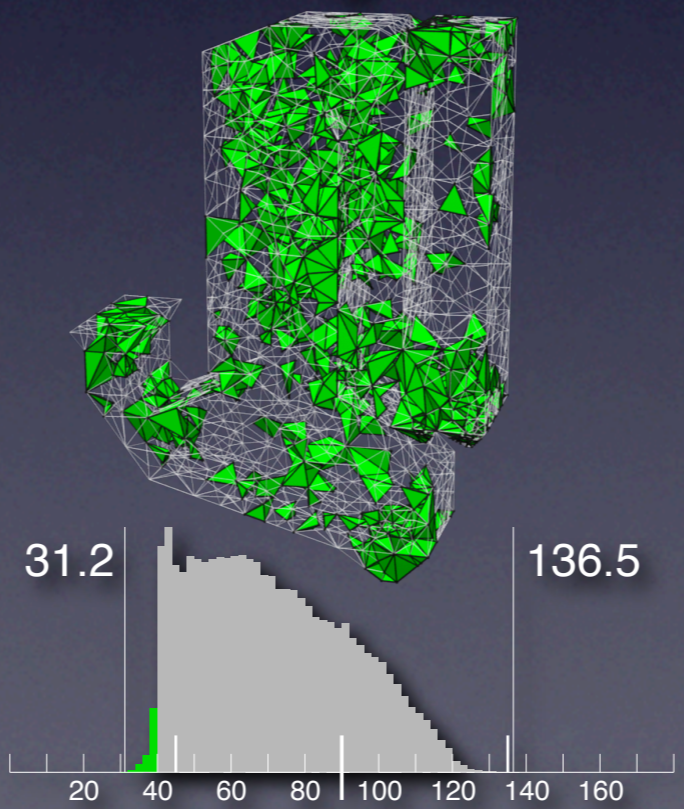
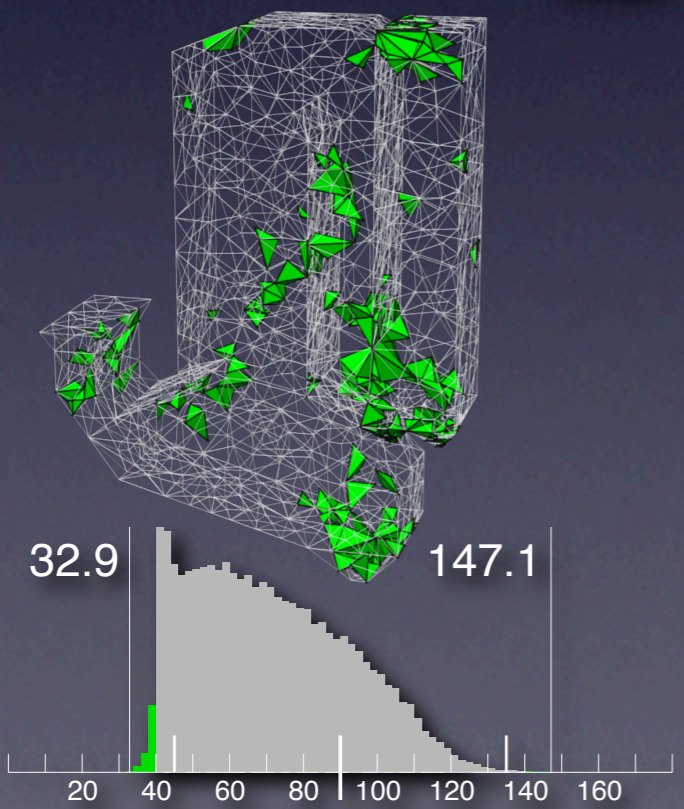




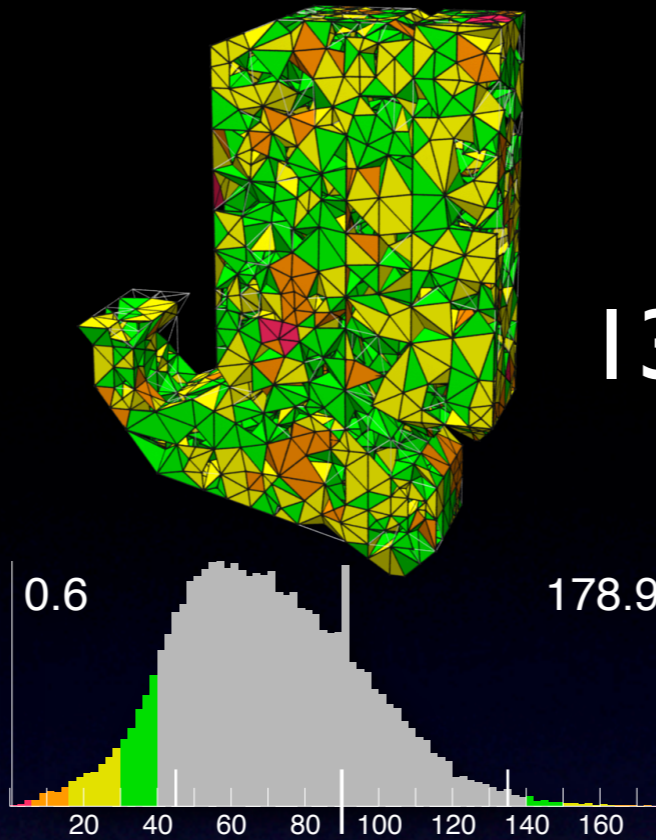
minsine

biased minsine

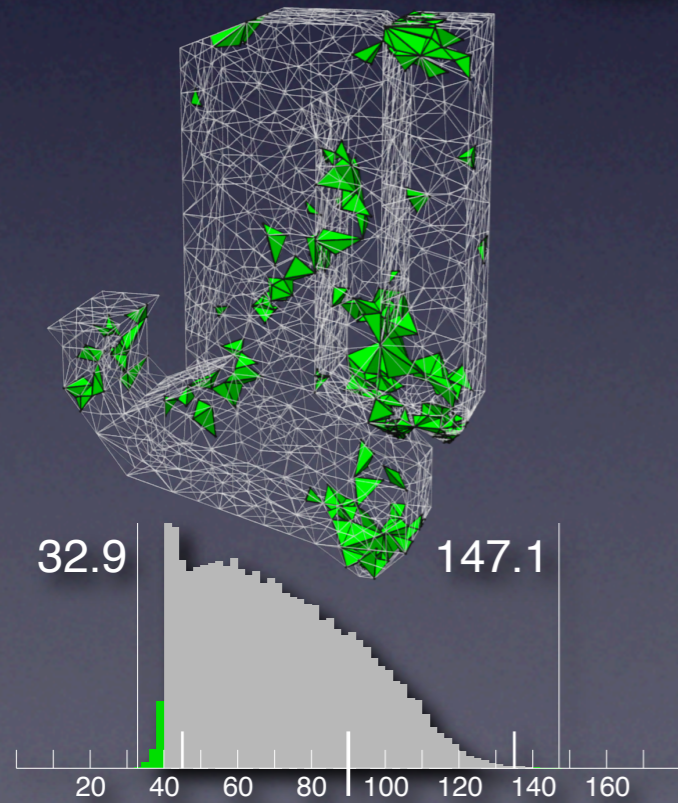
$$\frac{V}{3 rms}$$



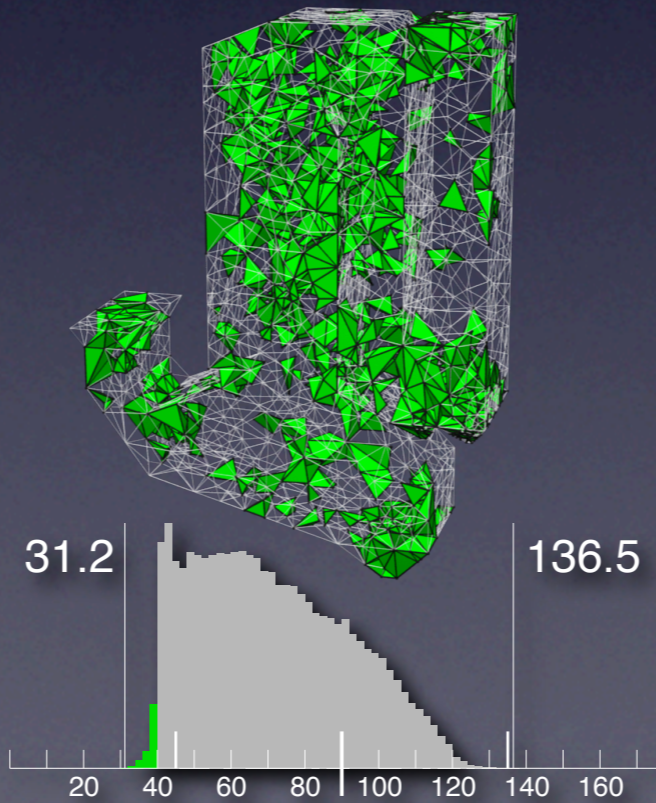
FOG '97:
13.67 min / 156.14 max



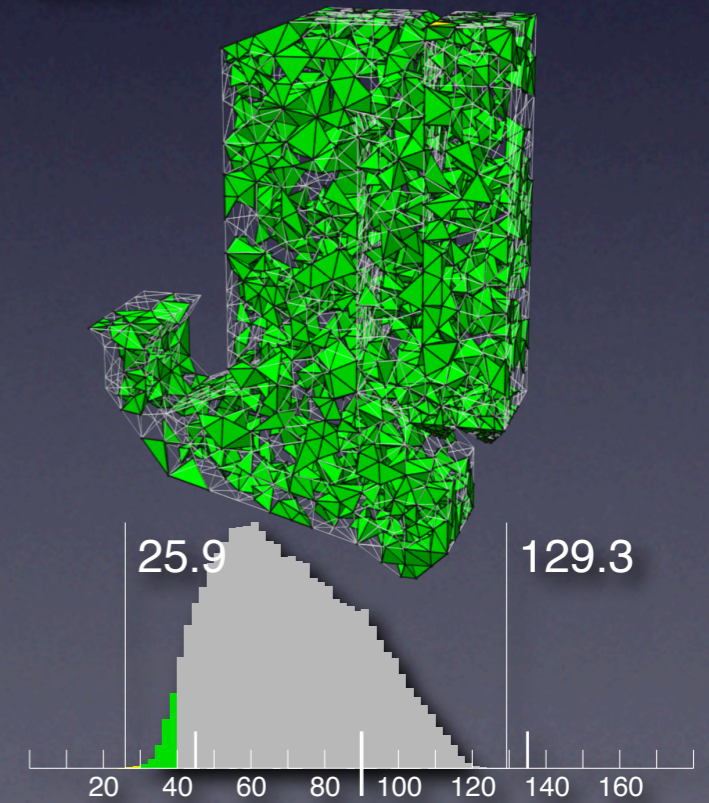
minsine



biased
minsine

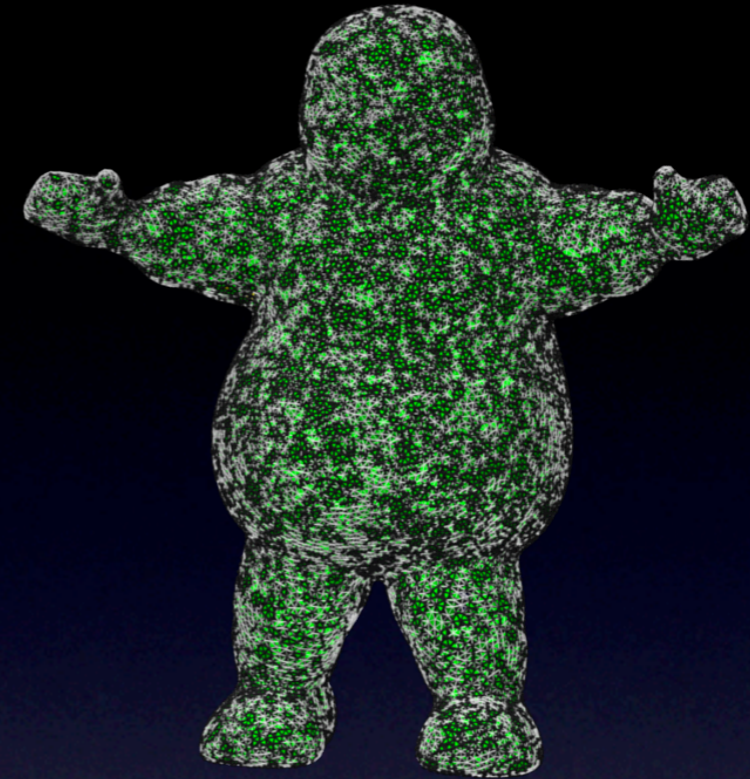
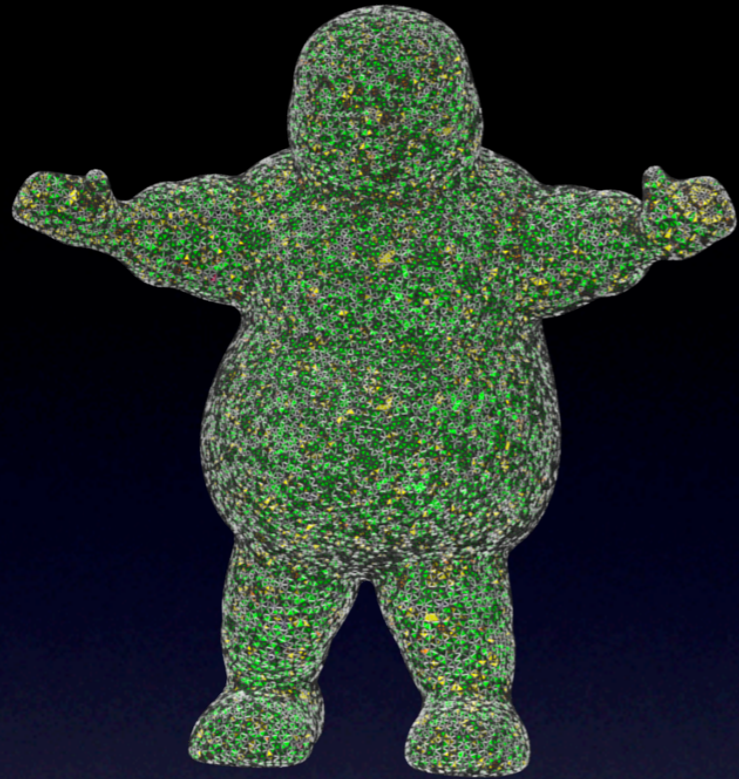


$\frac{V}{3 rms}$



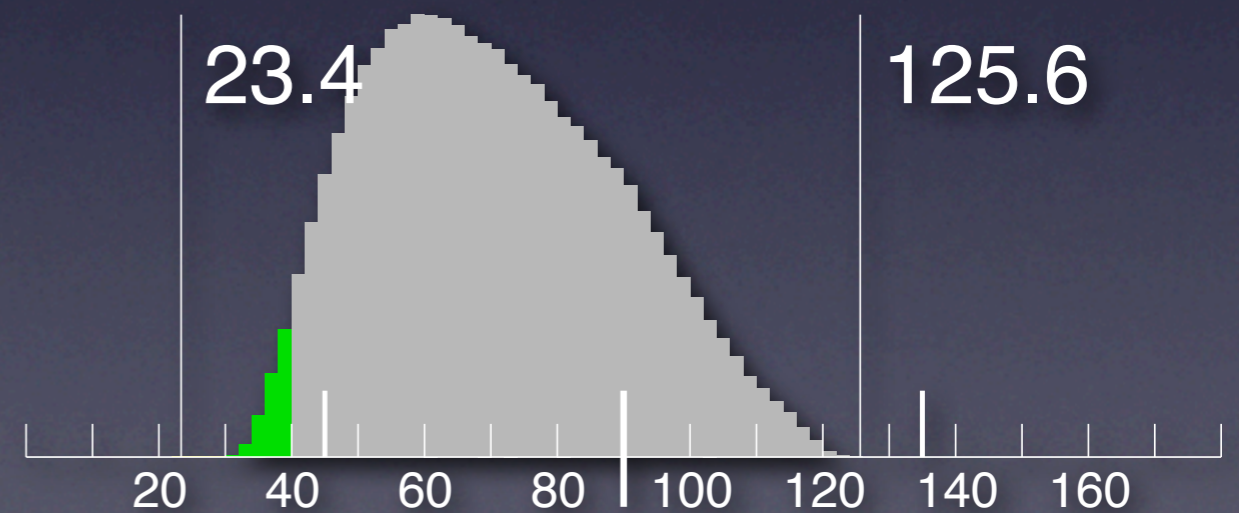
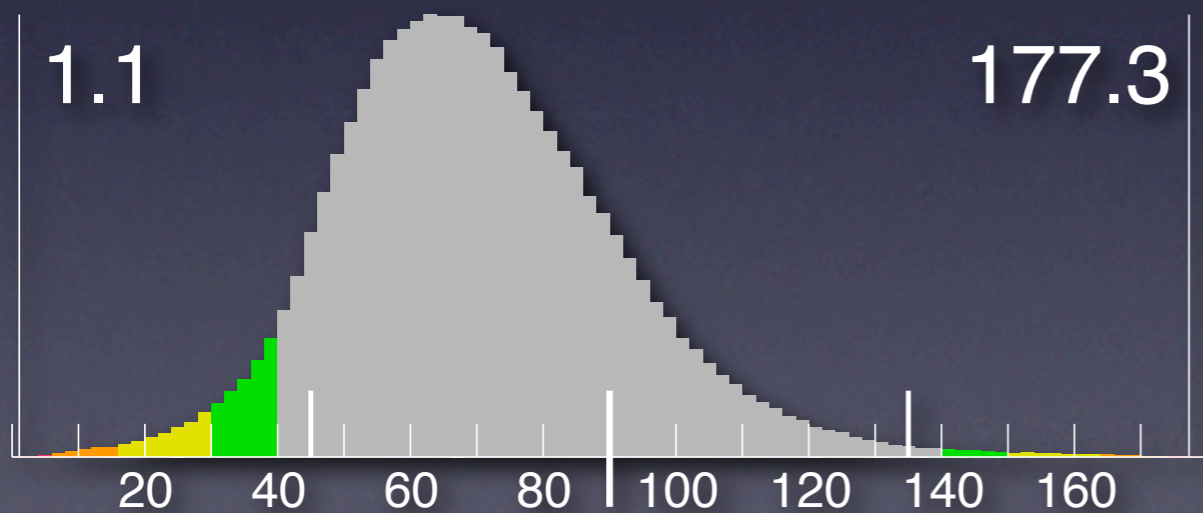
STAYPUFT

14,214 sec



102,393 tetrahedra

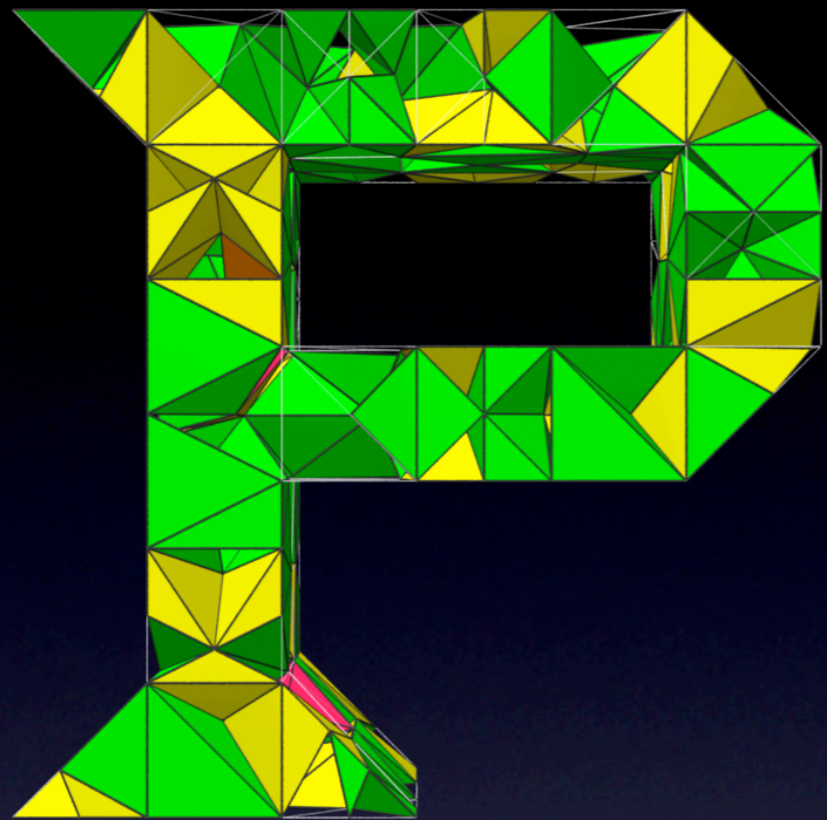
130,736 tetrahedra



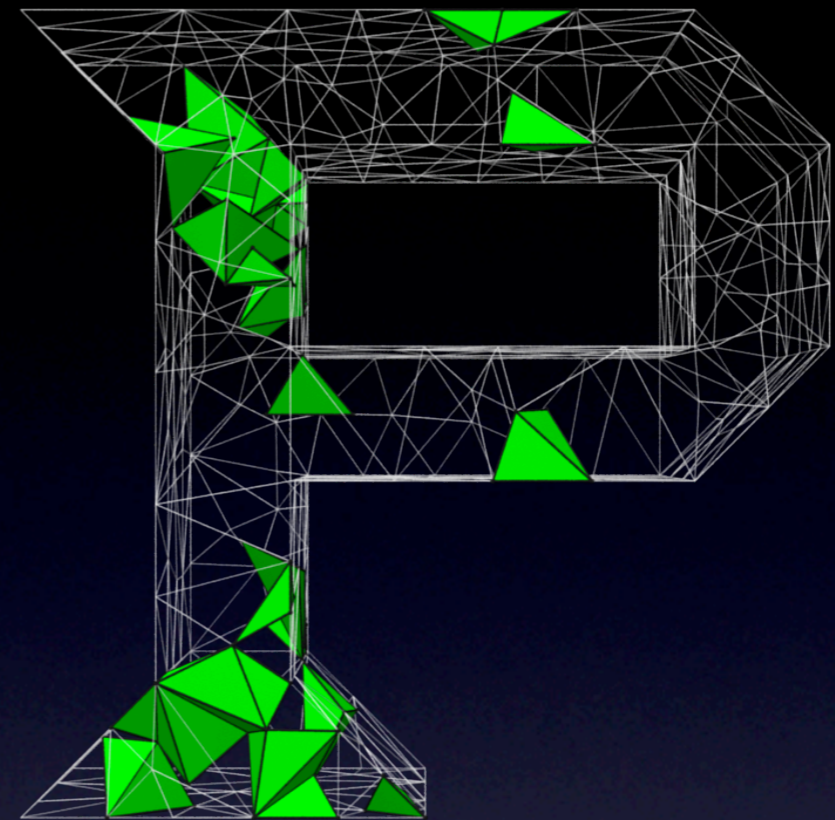
Insertion is **slow**: 90% of running time

P

24 sec

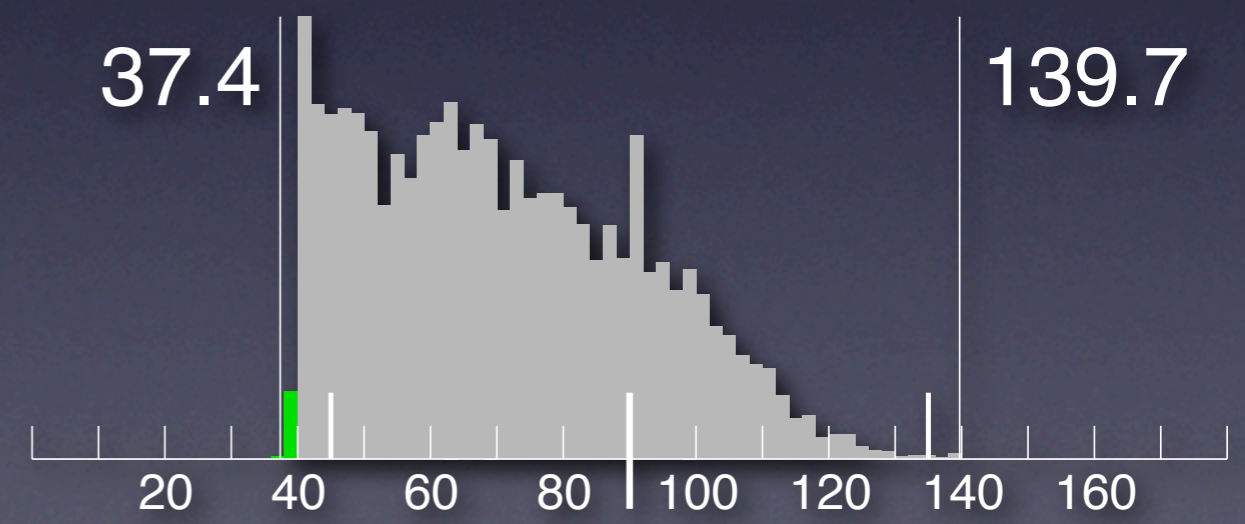
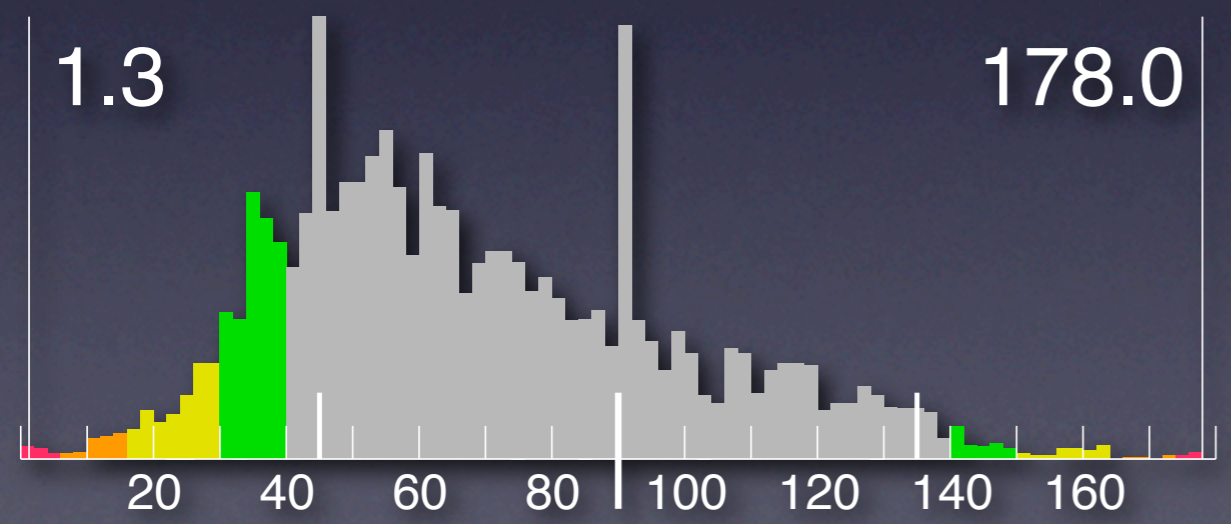


→
minsine



927 tetrahedra

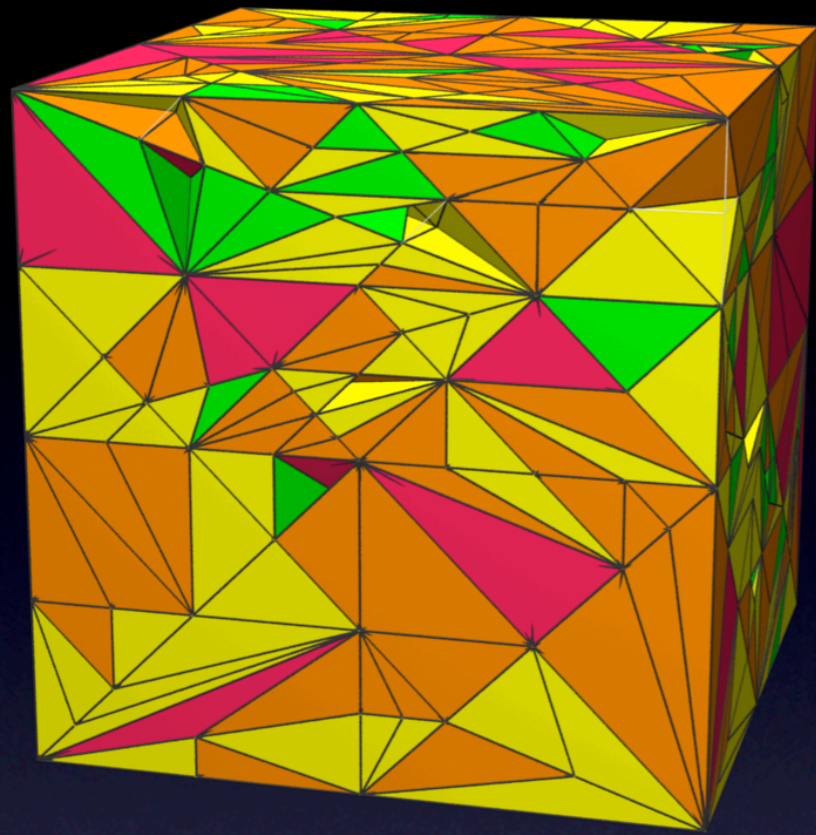
1,261 tetrahedra



Insertion **can make meshes bigger.**

RAND2

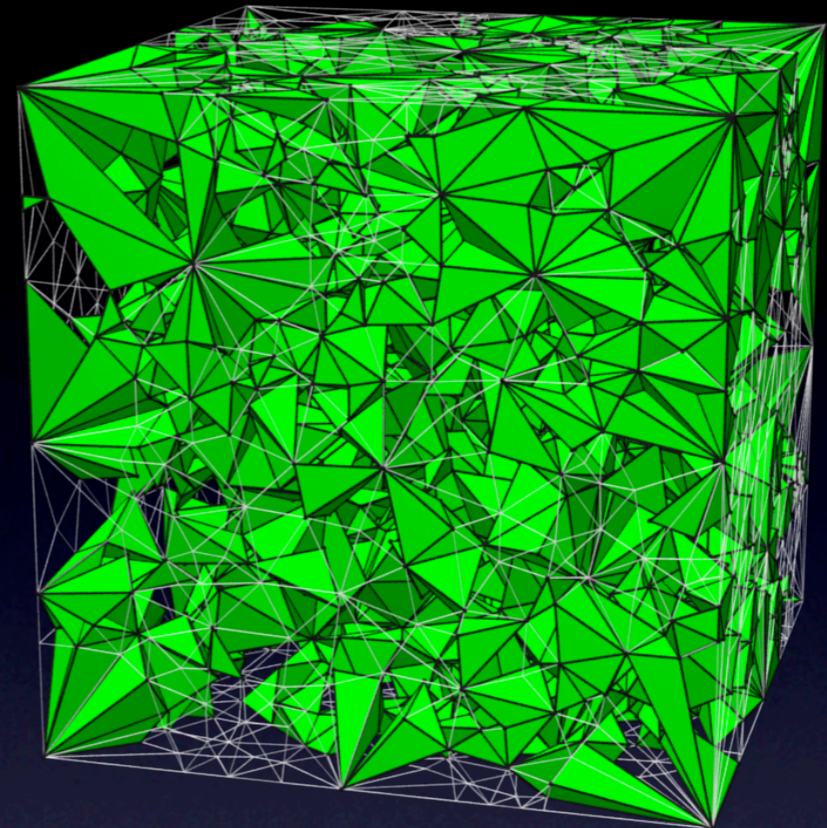
4,658 sec



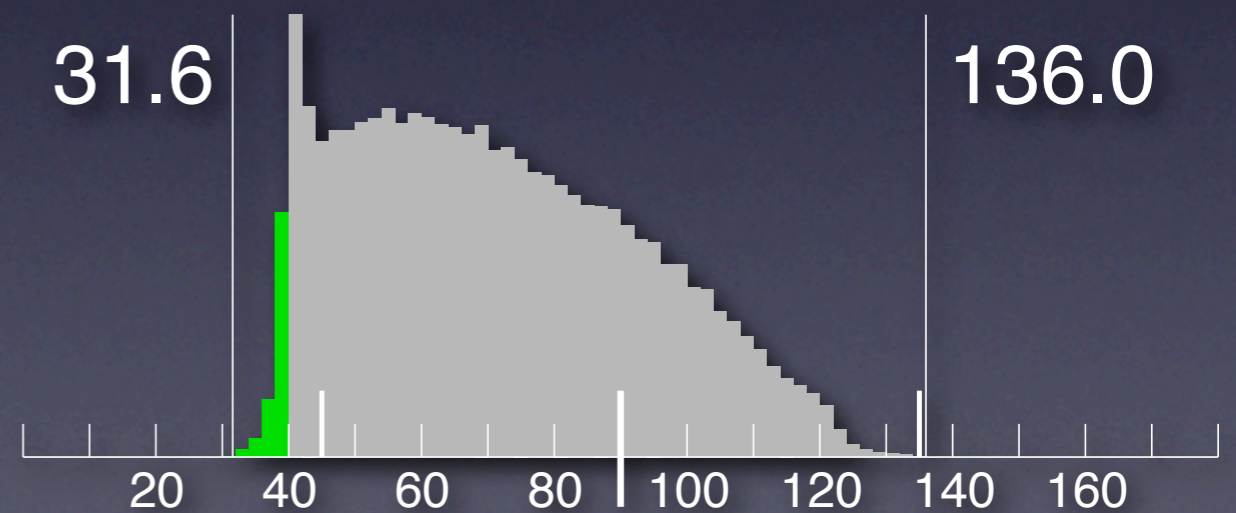
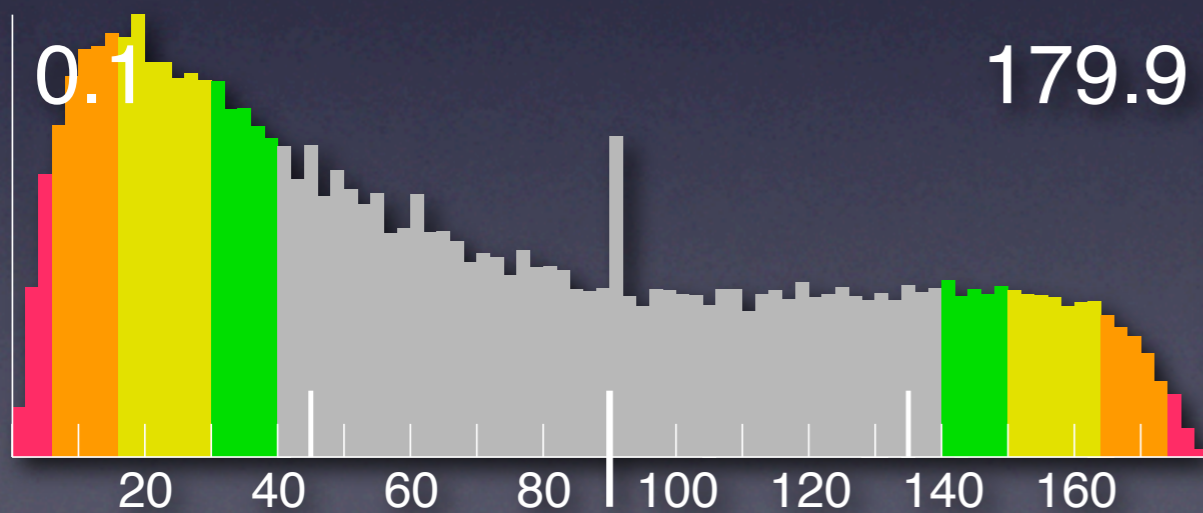
25,705 tetrahedra



biased
minsine



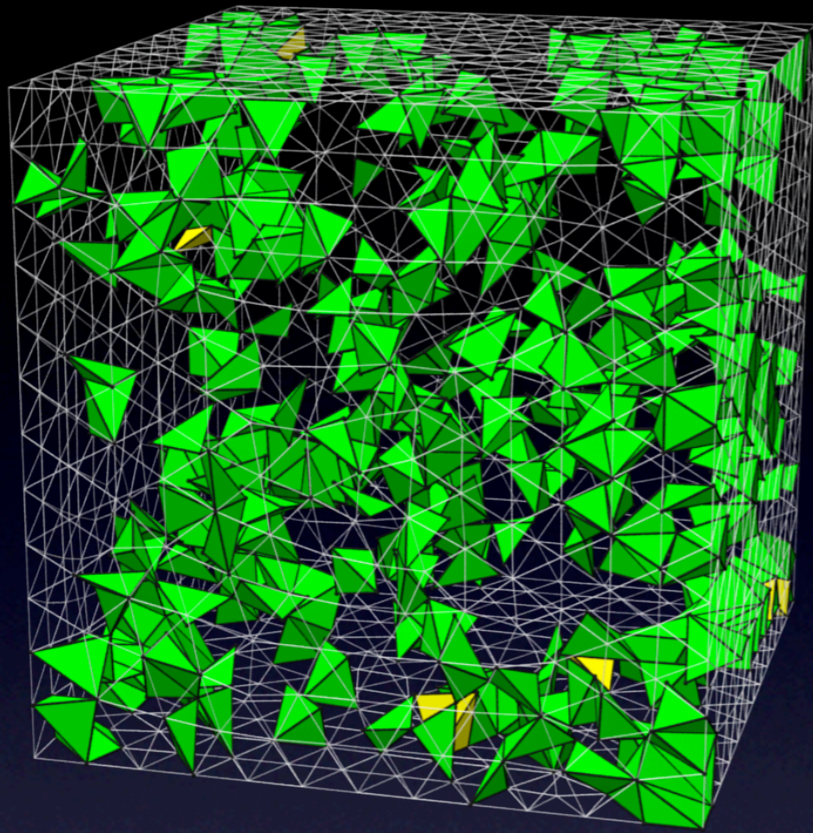
17,527 tetrahedra



Insertion can also make meshes smaller.

CUBE10K

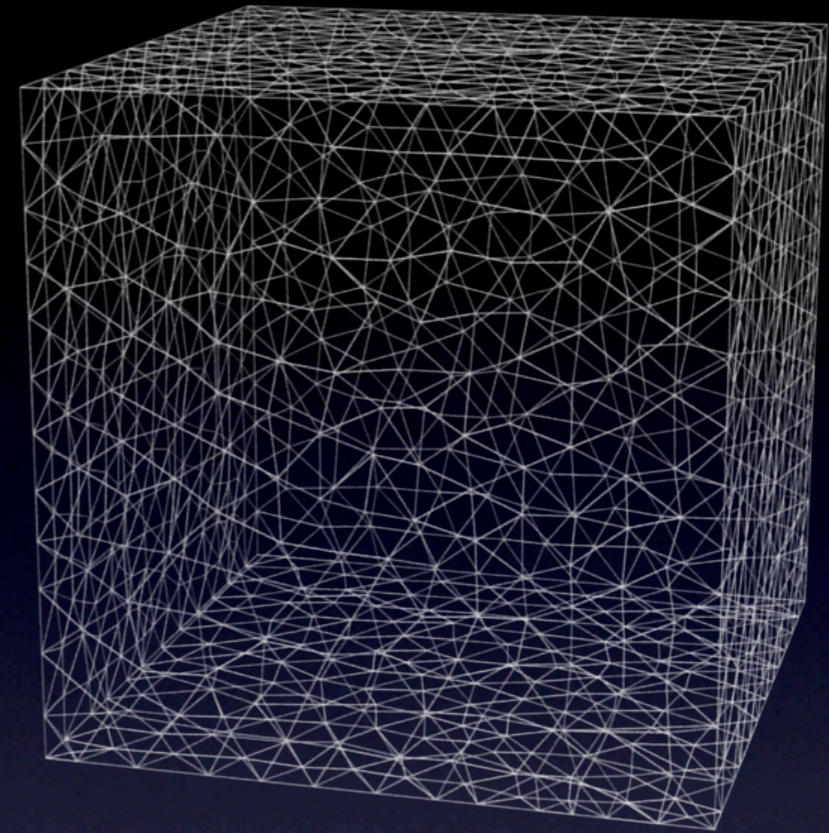
121 sec



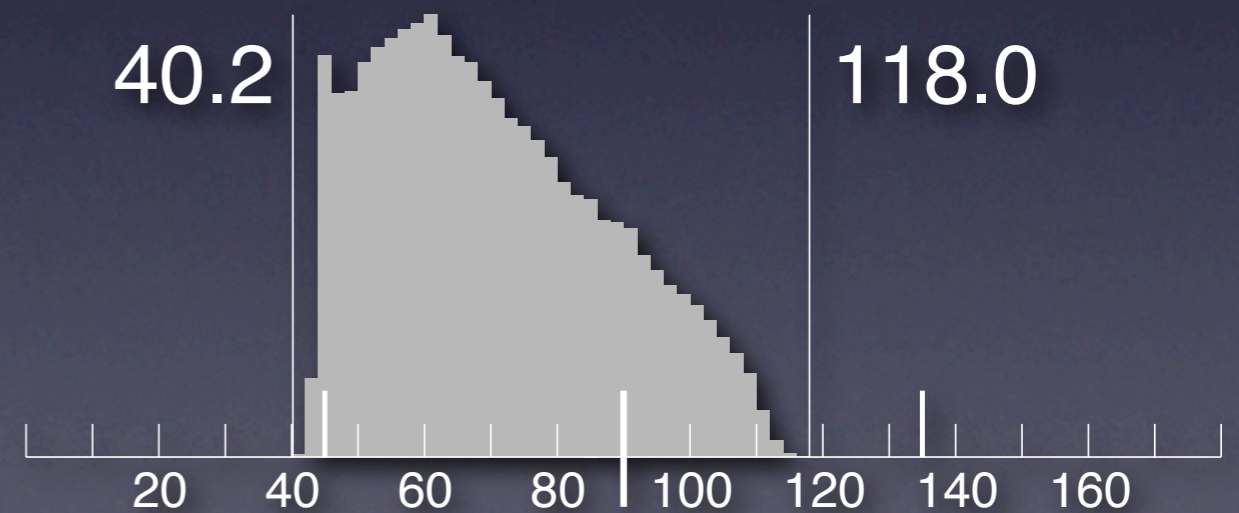
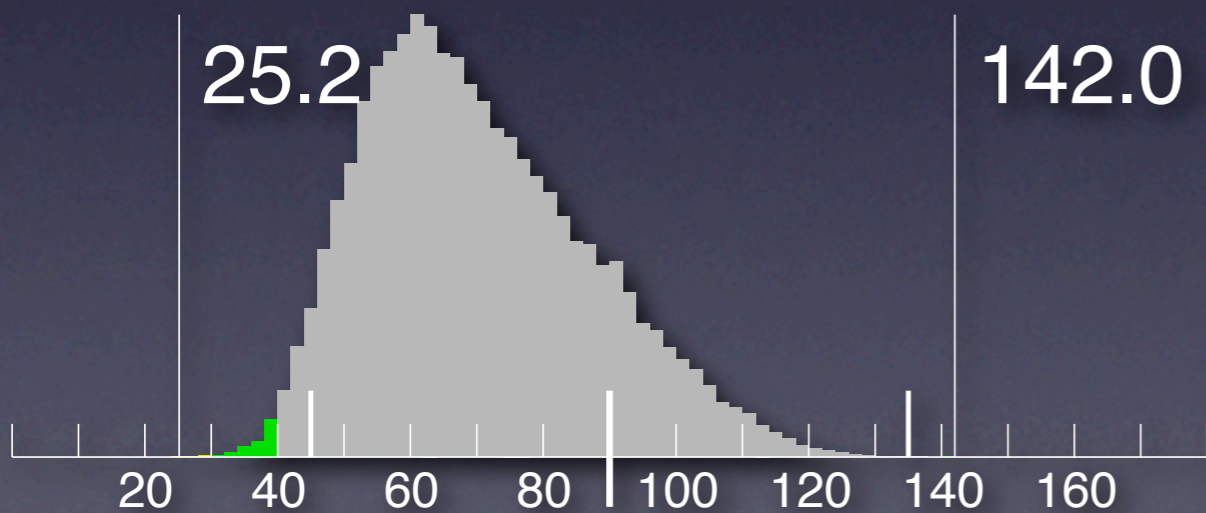
11,661 tetrahedra



biased
minsine



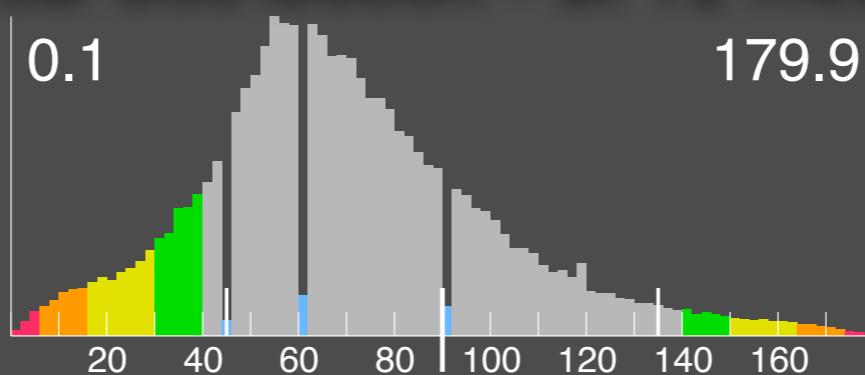
11,700 tetrahedra



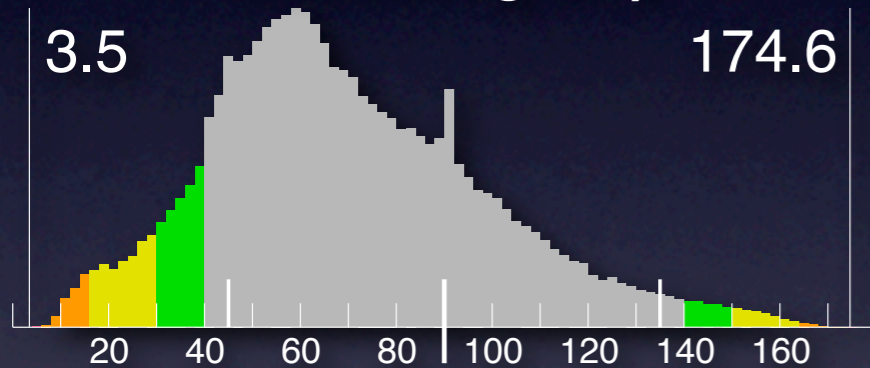
Meshes that start out good **run fast** and **end great**.

Adding features

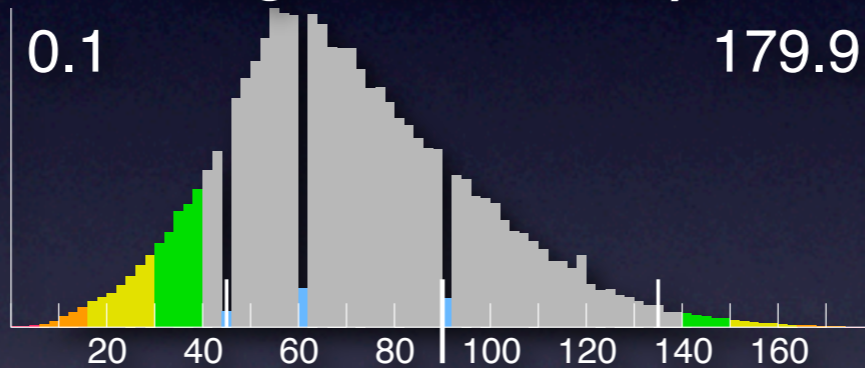
Initial distribution - all 12 meshes



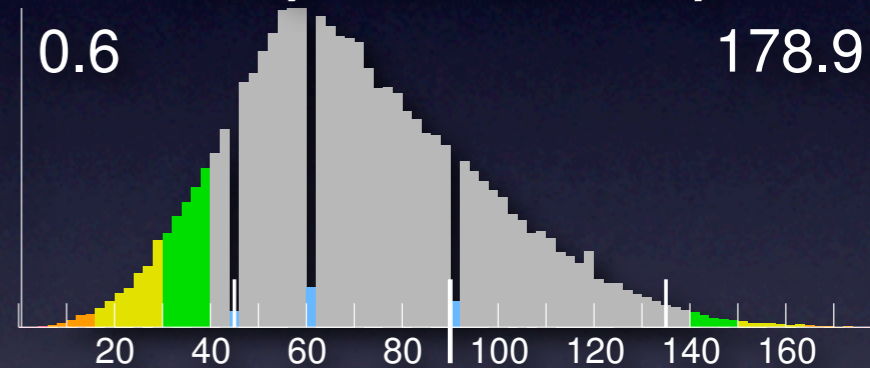
smoothing only



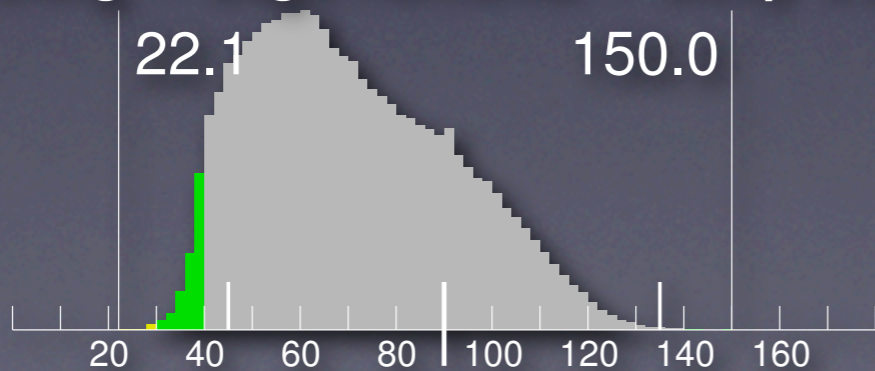
edge removal only



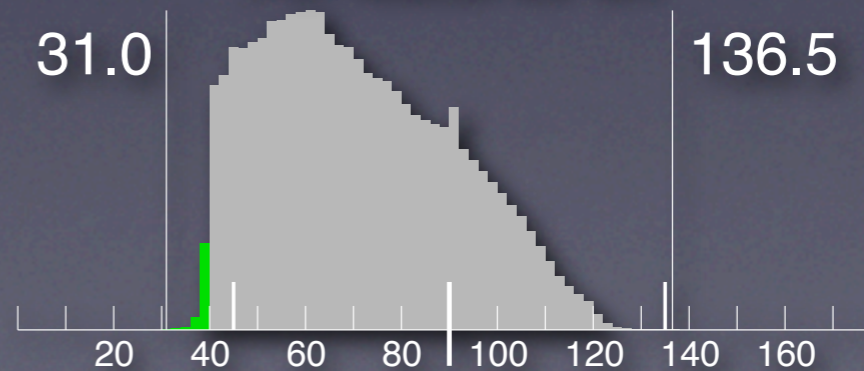
body insertion only



smoothing + edge removal + body insertion

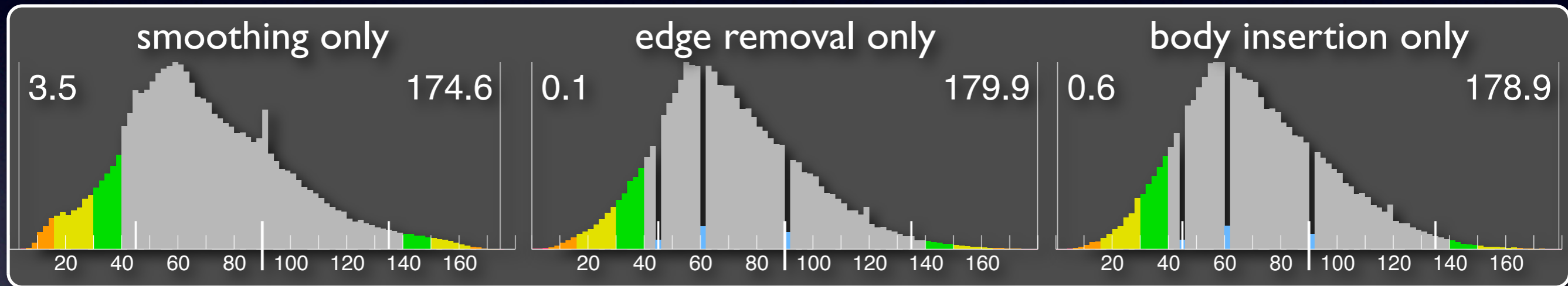
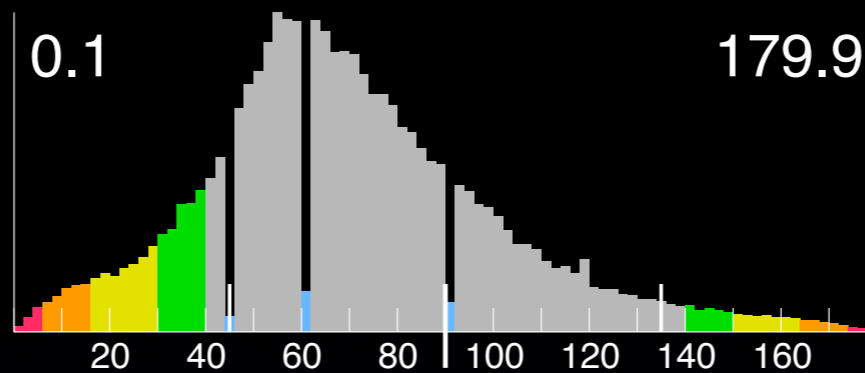


All features on

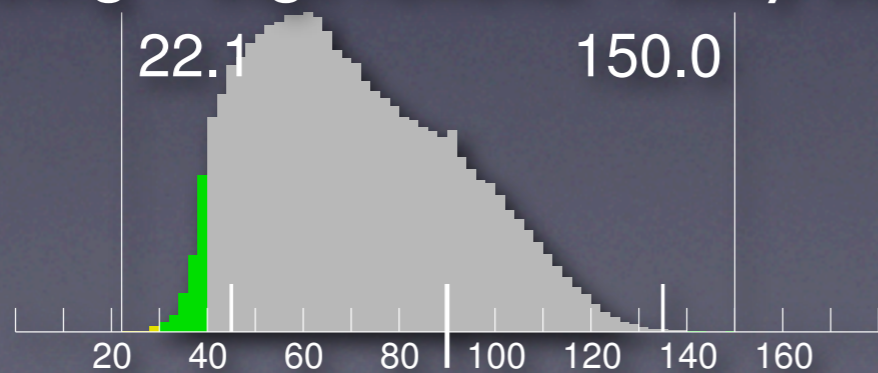


Initial distribution - all 12 meshes

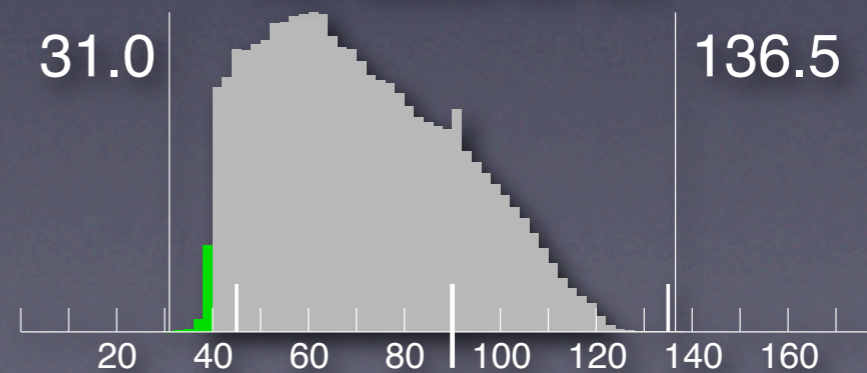
Adding features



smoothing + edge removal + body insertion

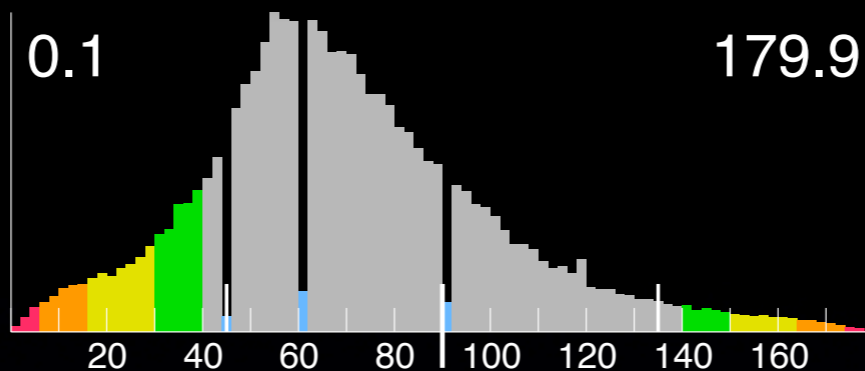


All features on

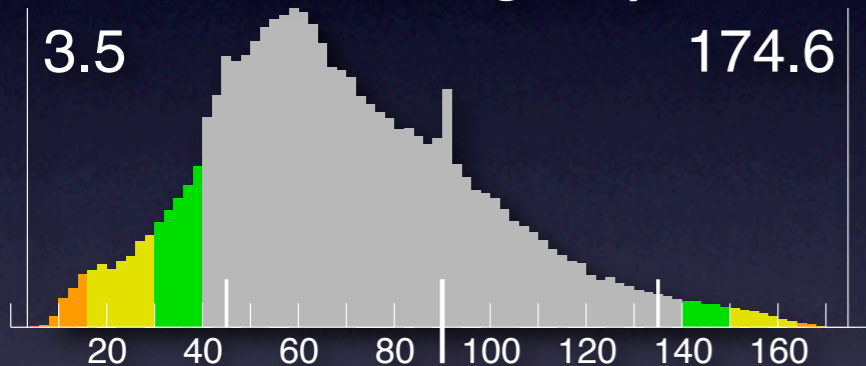


Initial distribution - all 12 meshes

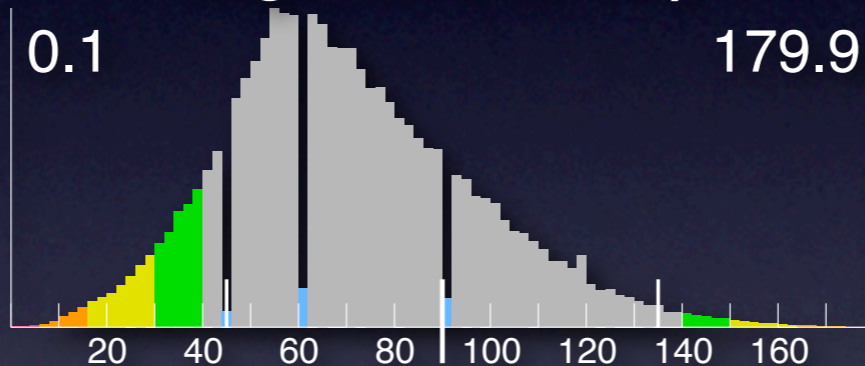
Adding features



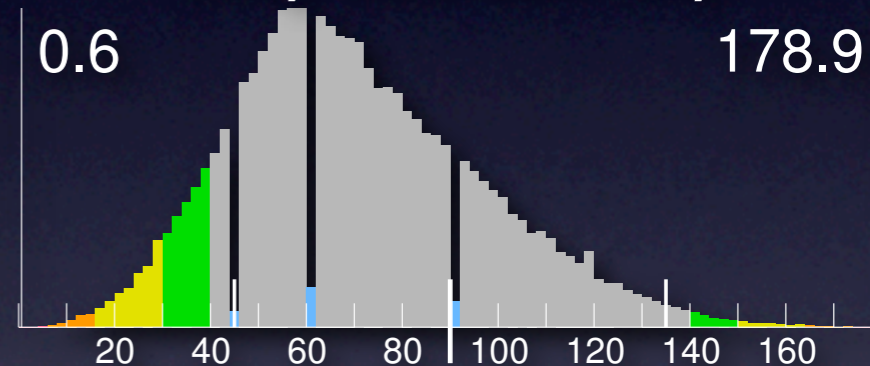
smoothing only



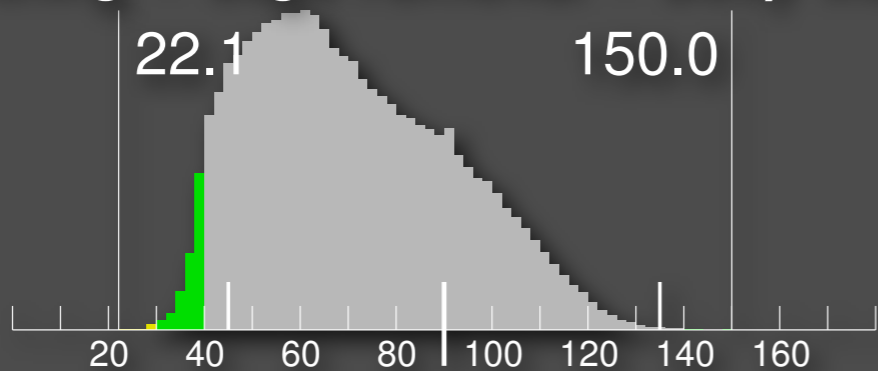
edge removal only



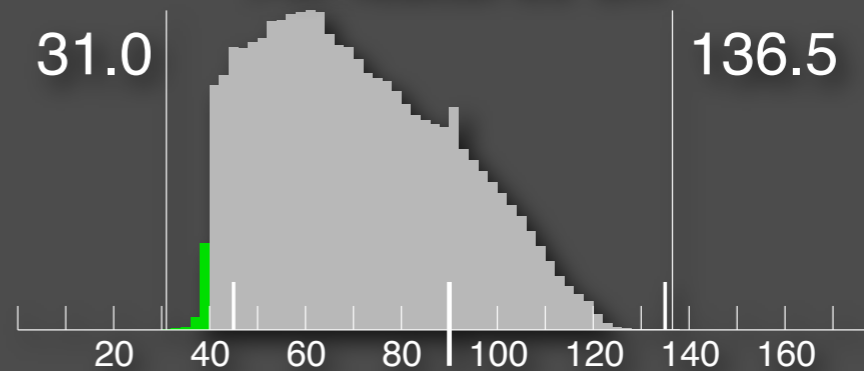
body insertion only



smoothing + edge removal + body insertion

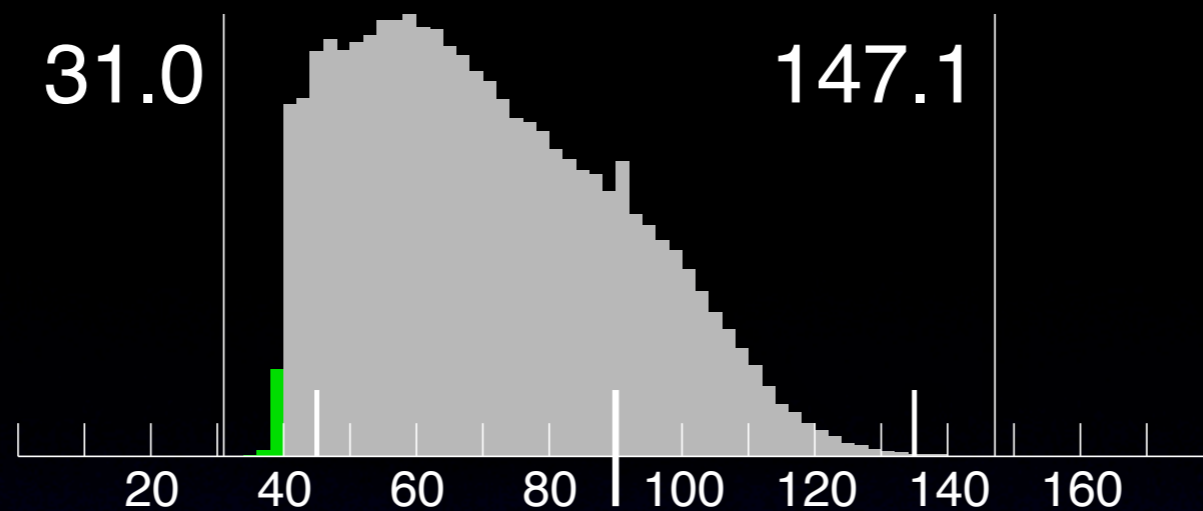


All features on

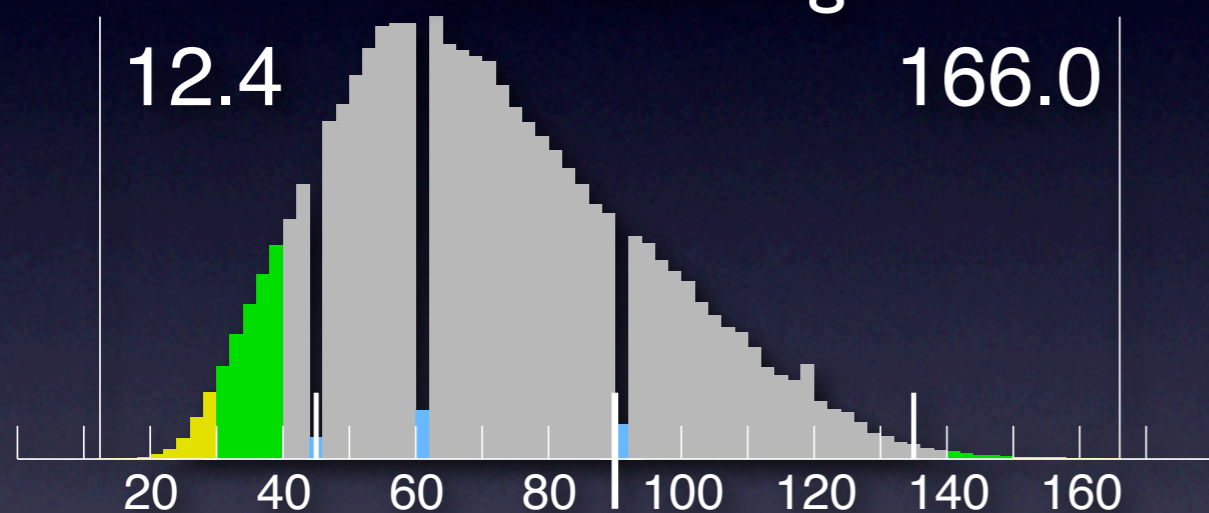


All features on - all 12 meshes

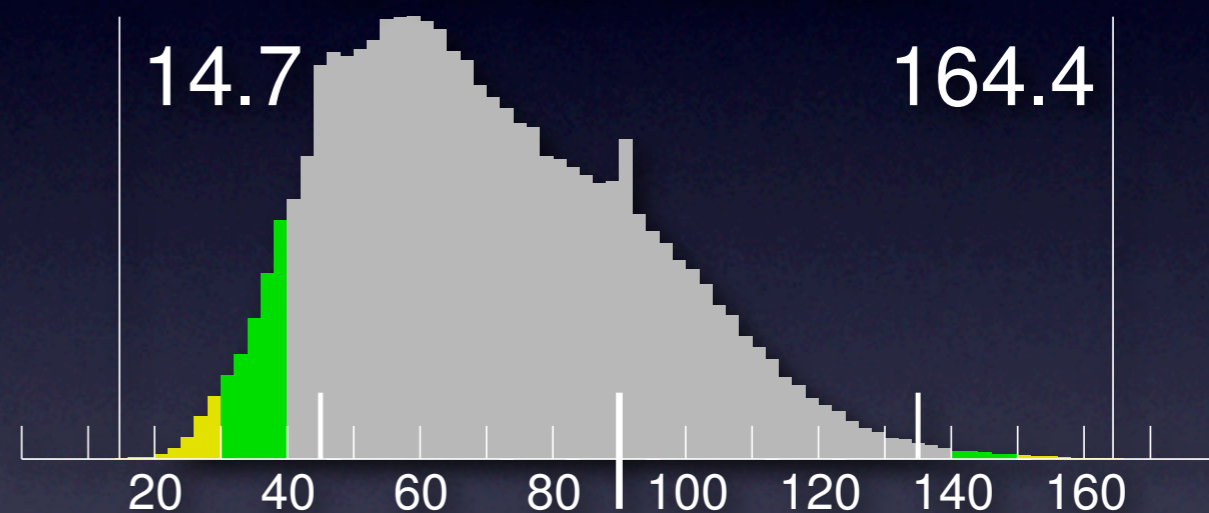
Removing features



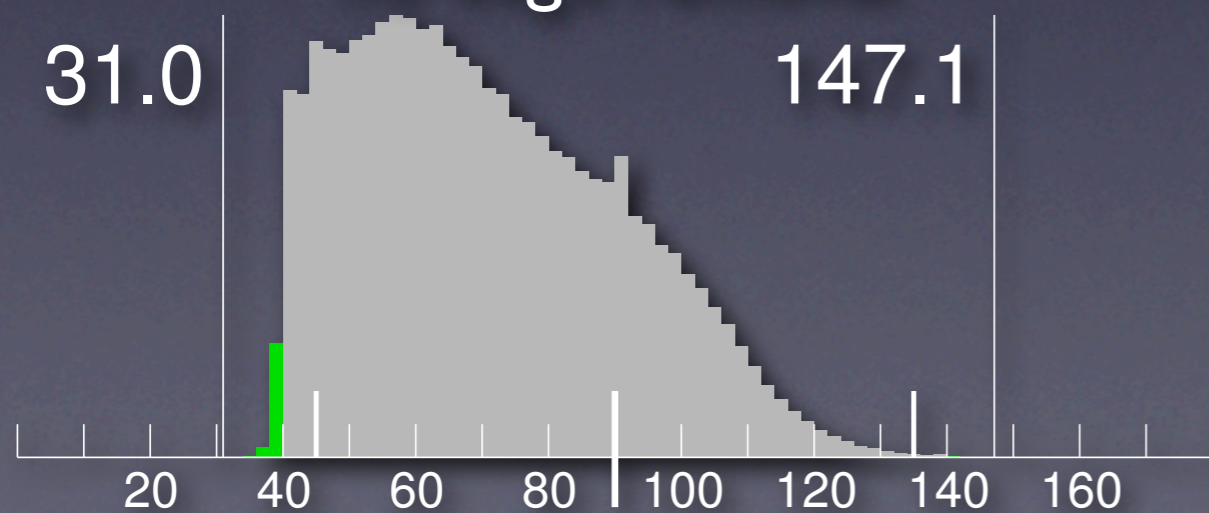
no smoothing



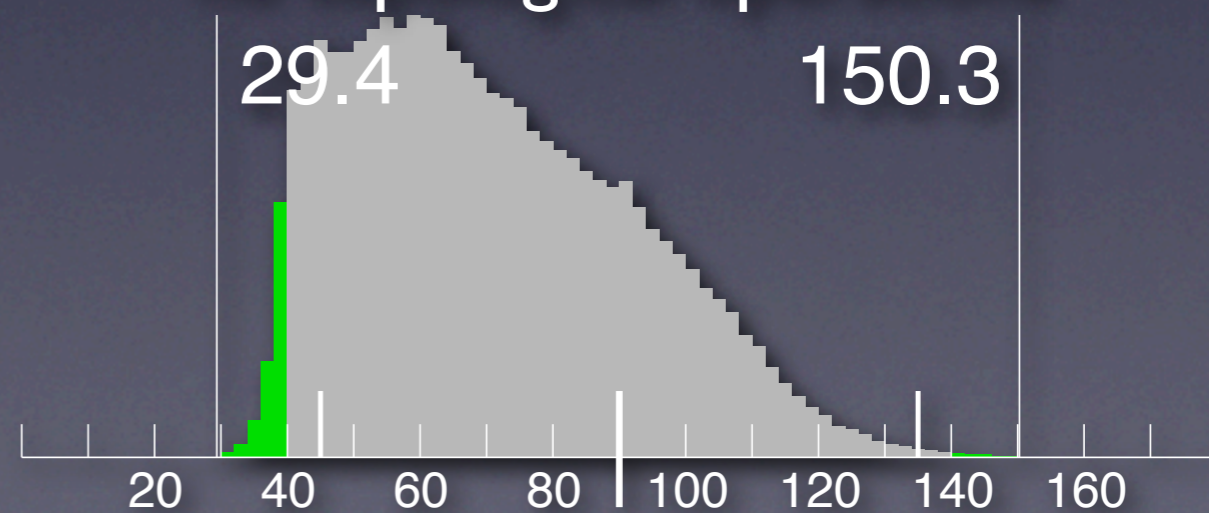
no vertex insertion



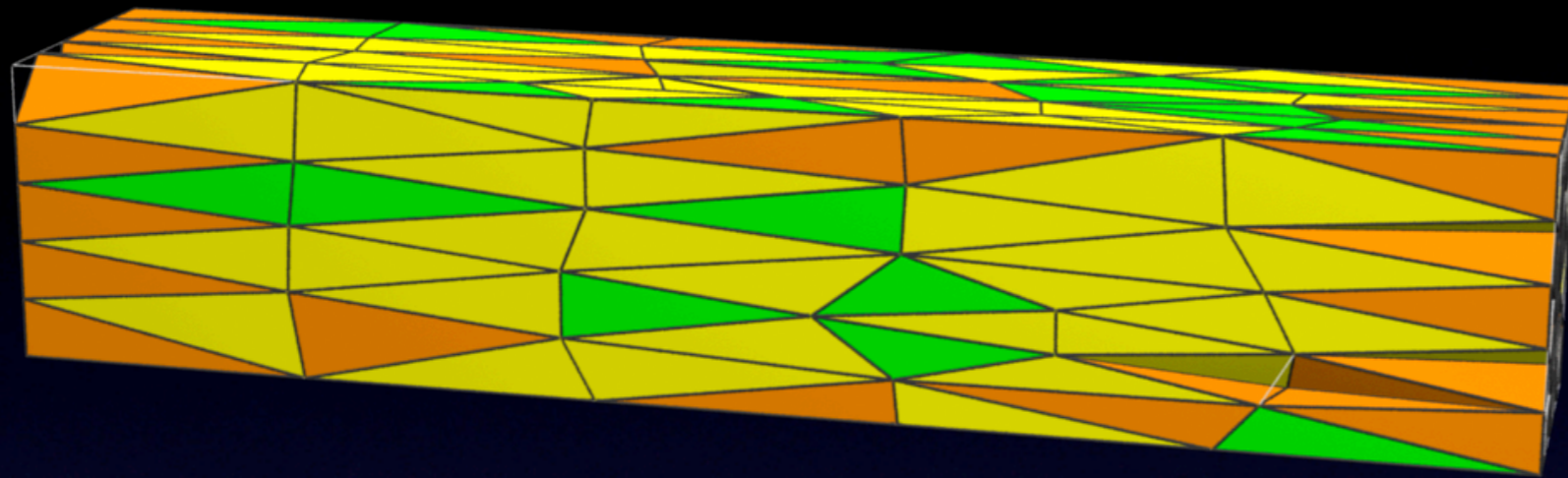
no edge removal



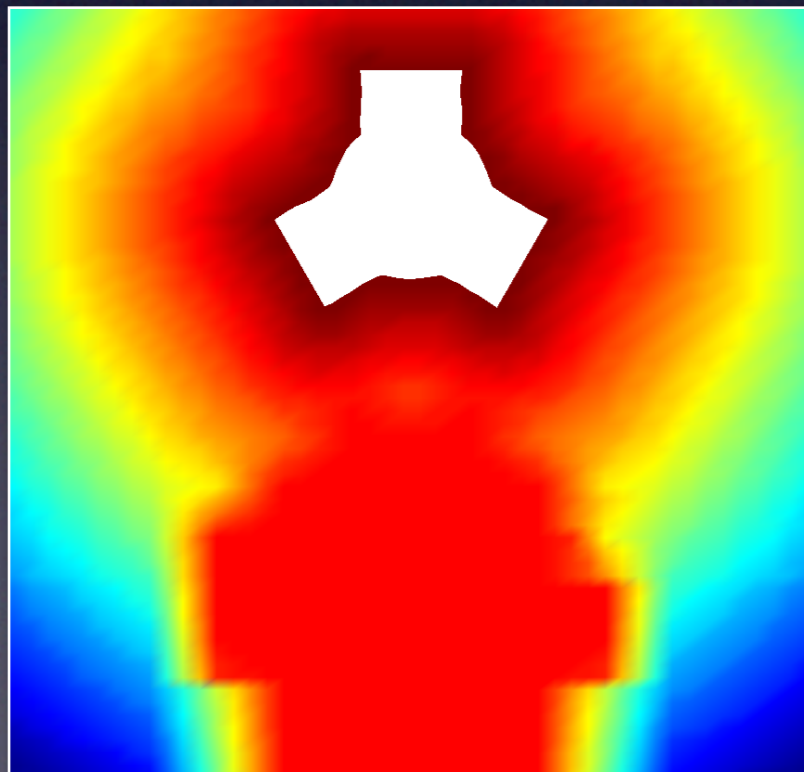
no topological operations



The next steps



anisotropy



adaptivity