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# Fondamenti di Grafica Tridimensionale

Paolo Cignoni

p.cignoni@isti.cnr.it

<http://vcg.isti.cnr.it/~cignoni>

# Simplification Algorithms

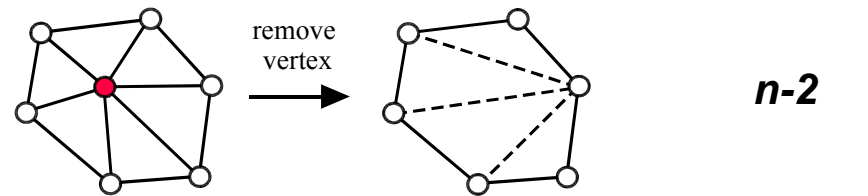
- ❖ Simplification approaches:
  - ❖ incremental methods based on local updates
    - ❖ mesh decimation [Schroeder et al. 92]
    - ❖ energy function optimization [Hoppe et al. 93,96,97]
    - ❖ quadric error metrics [Garland et al. '97]
  - ❖ coplanar facets merging
    - ❖ [Hinker et al. `93, Kalvin et al. `96]
  - ❖ Re-tiling
    - ❖ [Turk `92]
  - ❖ Clustering
    - ❖ [Rossignac et al. `93, ... + others]
  - ❖ Wavelet-based
    - ❖ [Eck et al. `95, + others]

# Incremental methods based on *local updates*

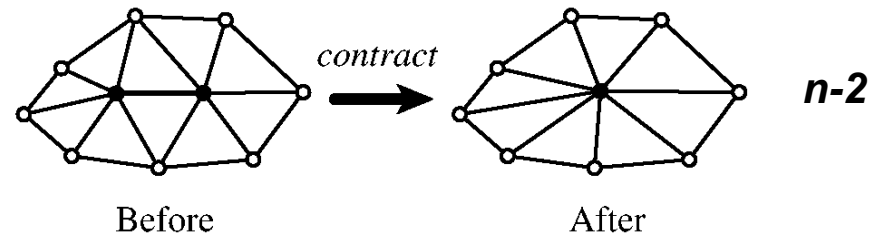
- ❖ All of the methods such that :
  - ❖ simplification proceeds as a sequence of *local updates*
  - ❖ each update *reduces mesh size* and [monotonically] *decreases* the *approximation precision*
- ❖ Different approaches:
  - ❖ **mesh decimation**
  - ❖ **energy function optimization**
  - ❖ **quadric error metrics**

## ❖ Local update actions:

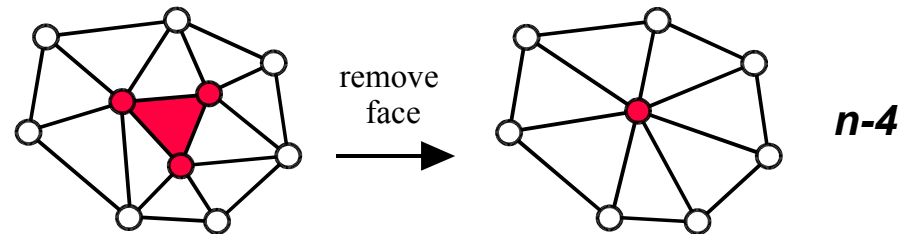
❖ **vertex removal**



❖ **edge collapse**  
❖ **preserve location**  
❖ **new location**



❖ **triangle collapse**  
❖ **preserve location**  
❖ **new location**



## The common framework:

### ❖ **loop**

❖ ***select*** the element to be deleted/collapsed;

❖ ***evaluate approximation*** introduced;

❖ ***update*** the mesh after deletion/collapse;

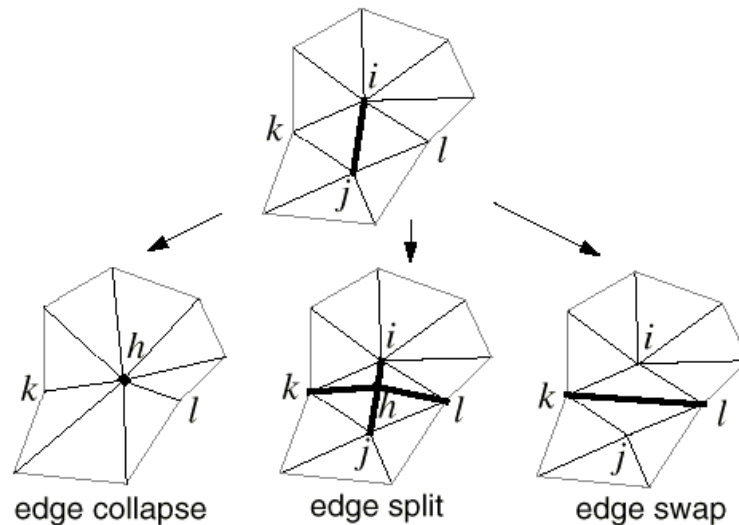
**until** mesh **size/precision** is satisfactory;

# Energy function optimization

## ***Mesh Optimization***

[Hoppe et al. '93]

- ❖ Simplification based on the iterative execution of :
  - ❖ edge collapsing
  - ❖ edge split
  - ❖ edge swap



## ... Energy function optimization: Mesh Optimization ...

- ❖ approximation quality evaluated with an **energy function** :

$$E(M) = E_{\text{dist}}(M) + E_{\text{rep}}(M) + E_{\text{spring}}(M)$$

which evaluates geometric **fitness** and repr. **compactness**

**E<sub>dist</sub>** : sum of squared distances of the original points from M

**E<sub>rep</sub>** : factor proportional to the no. of vertex in M

**E<sub>spring</sub>** : sum of the edge lengths

## Algorithm structure

- ❖ outer minimization cycle (**discrete** optimiz. probl.)
  - ❖ choose a legal action (edge collapse, swap, split) which reduces the energy function
  - ❖ perform the action and update the mesh ( $M_i \rightarrow M_{i+1}$ )
- ❖ inner minimization cycle (**continuous** optimiz. probl.)
  - ❖ optimize the vertex positions of  $M_{i+1}$  with respect to the initial mesh  $M_0$

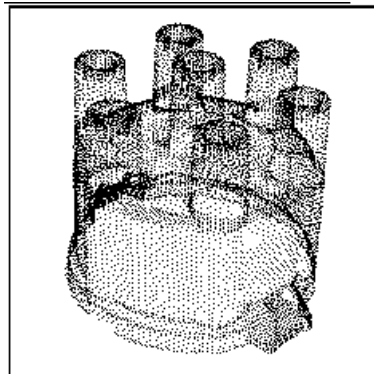
*but (to reduce complexity)*

- ❖ legal action selection is random
- ❖ inner minimization is solved in a fixed number of iterations

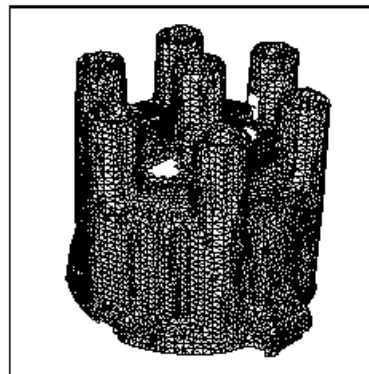


# ... Energy function optimization: Mesh Optimization ...

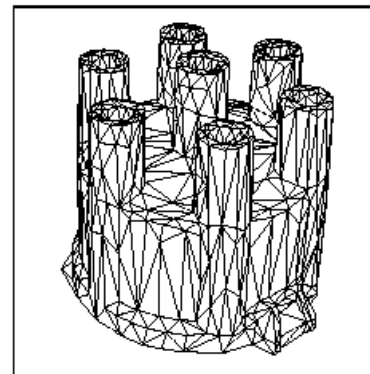
## Mesh Optimization - *Examples*



(j) Laser range data ( $n = 12,745$ )



(k) Output of phase one



(l) Output of phase two

[Image by Hoppe et al.]

## Mesh Optimization - *Evaluation*

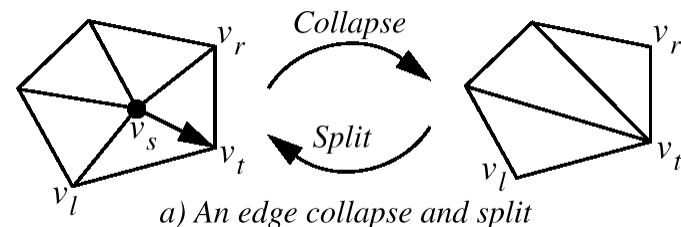
- ❖ high quality of the results
- ❖ preserves topology, re-sample vertices
- ❖ high processing times
- ❖ not easy to implement
- ❖ not easy to use (selection of tuning parameters)
- ❖ adopts a global error evaluation, but the resulting approximation is not bounded

## Meshes ...

### **Progressive Meshes**

[Hoppe `96]

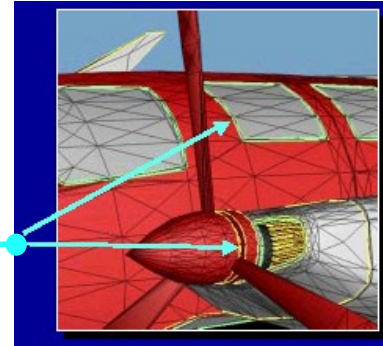
- ❖ execute **edge collapsing** *only* to reduce the *energy function*
- ❖ *edge collapsing* can be easily inverted ==> store sequence of inverse *vertex split* transformations to support:
  - ❖ multiresolution
  - ❖ progressive transmission
  - ❖ selective refinements
  - ❖ geomorphs
- ❖ *faster* than MeshOptim.



# ... Energy function optimization: **Progressive Meshes** ...

## Preserving mesh ***appearance***

- ❖ shape and crease edges
- ❖ scalar fields discontinuities (e.g. color, normals)
- ❖ discontinuity curves



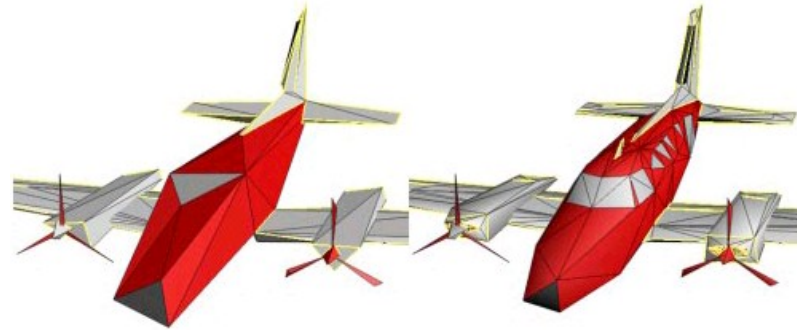
[image by H. Hoppe]

Managed by inserting two new components in the *energy function*:

- ❖  $E_{\text{scalar}}$ : measures the accuracy of scalar attributes
- ❖  $E_{\text{disc}}$ : measure the geometric accuracy of discontinuity curves

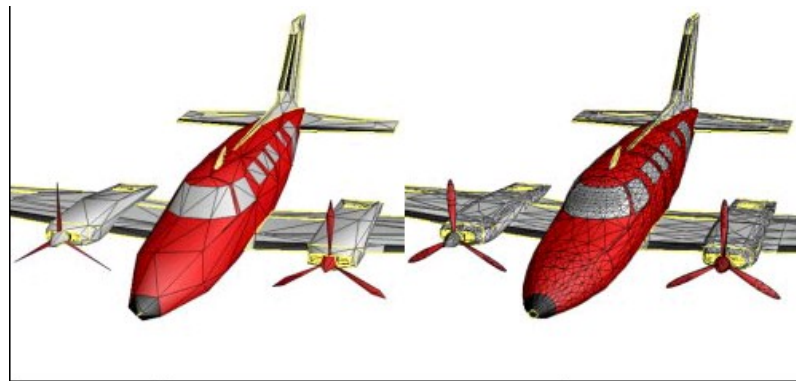
# ... Energy function optimization: **Progressive Meshes** ...

## Progressive Meshes *Examples*



(a) Base mesh  $M^0$  (150 faces)

(b) Mesh  $M^{175}$  (500 faces)



(c) Mesh  $M^{425}$  (1,000 faces)

(d) Original  $\hat{M} = M^n$  (13,546 faces)

## ... Energy function optimization: Progressive Meshes...

### Progressive Meshes - *Evaluation*

- ❖ high quality of the results
- ❖ preserves topology, re-sample vertices
- ❖ not easy to implement
- ❖ not easy to use (selection of tuning parameters)
- ❖ adopts a global error evaluation, not-bounded approximation
- ❖ preserves vect/scalar attributes (e.g. color)  
**discontinuities**
- ❖ supports **multiresolution** output, geometric morphing,  
**progressive transmission, selective** refinements
- ❖ much **faster** than MeshOpt.

*An implementation is present as part of DirectX 6.0 tools*

## ***Mesh Decimation***

[Schroeder et al'92]

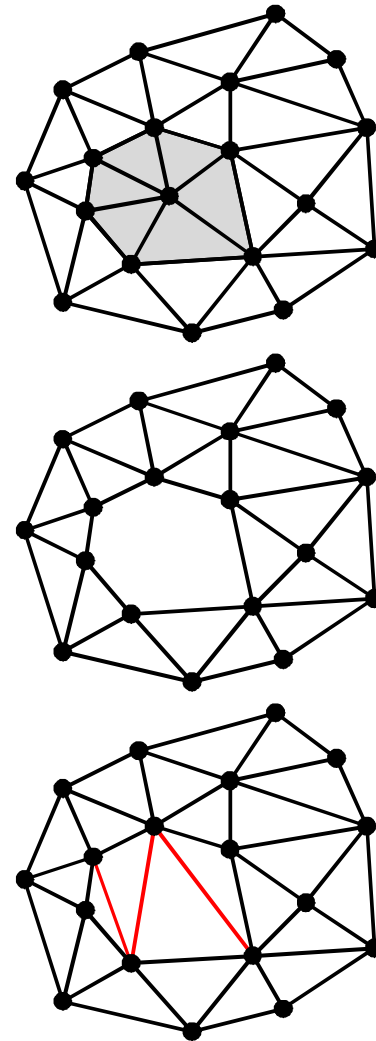
- ❖ Based on controlled removal of ***vertices***
- ❖ Classify vertices as ***removable*** or ***not*** (based on local topology / geometry and required precision)

### **Loop**

- ❖ choose a *removable* vertex  $\mathbf{v}_i$
- ❖ delete  $\mathbf{v}_i$  and the incident faces
- ❖ re-triangulate the hole

### **until**

no more removable vertex **or**  
reduction rate fulfilled

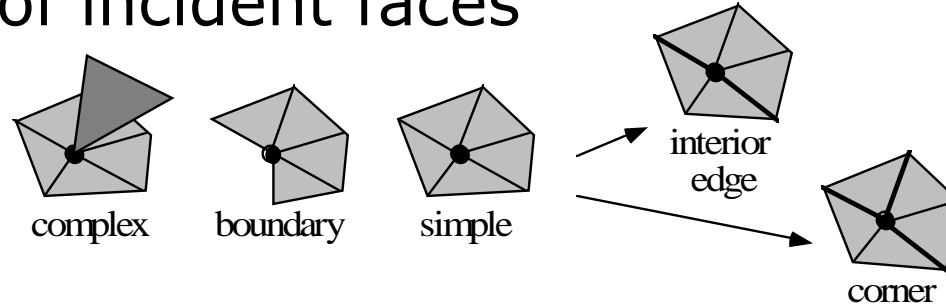


- ❖ General method (manifold/non-manifold *input*)
- ❖ Algorithm phases:
  - ❖ topologic classification of vertices
  - ❖ evaluation of the decimation criterion (error evaluation)
  - ❖ re-triangulation of the removed triangles patch



## Topologic classification of vertices

- ▶ for each vertex: find and characterize the loop of incident faces

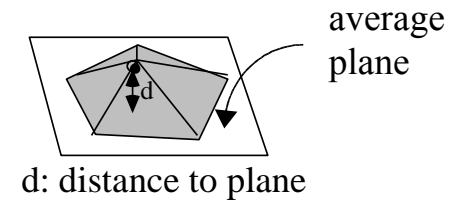


- ▶ *interior edge*: if dihedral angle between faces  $< k_{\text{angle}}$   
( $k_{\text{angle}}$  : user driven parameter)
- ▶ *not-removable vertices*: complex, [ corner ]

# Decimation criterion -- a vertex ... Decimation ... is *removable* if:

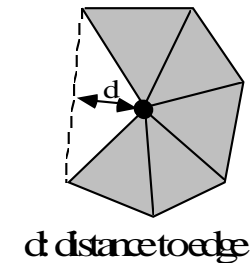
## ❖ **simple** vertex:

if distance **vertex - face loop average plane** is lower than  $\epsilon_{\max}$



## ❖ **boundary / interior / corner** vertices:

if distance **vertex - new boundary/interior edge** is lower than  $\epsilon_{\max}$

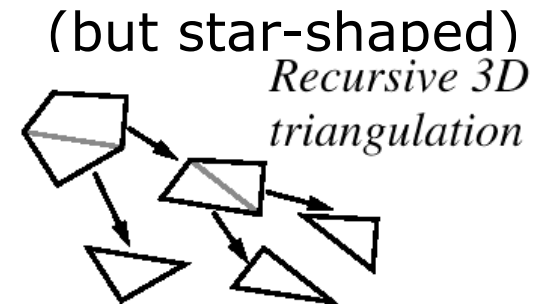


❖ adopts *local evaluation* of the approximation!!

❖  $\epsilon_{\max}$  : value selected by the user

## Re-triangulation

- ❖ face loops in general non planar !
- ❖ adopts ***recursive loop splitting*** re-triangulation



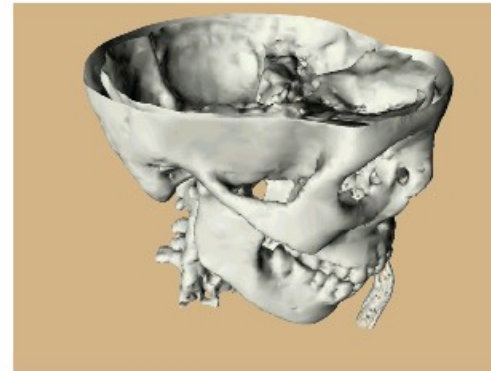
control *aspect ratio* to ensure simplified mesh quality

- ❖ for each vertex removed:
  - ❖ *if* simple or boundary vertex  $\implies$  1 loop
  - ❖ *if* interior edge vertex  $\implies$  2 loops
  - ❖ *if* boundary vertex  $\implies$  - 1 face
  - ❖ *otherwise*  $\implies$  - 2 faces

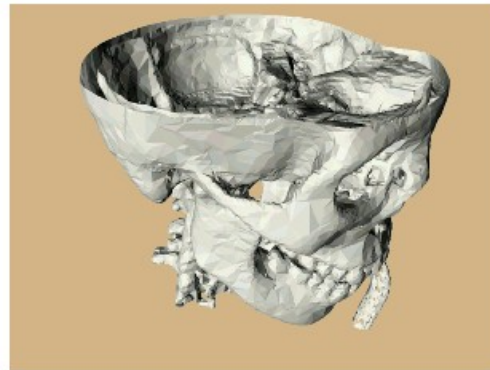
## Decimation - *Examples*



Full Resolution  
(569K Gouraud shaded triangles)



75% decimated  
(142K Gouraud shaded triangles)



75% decimated  
(142K flat shaded triangles)



90% decimated  
(57K flat shaded triangles)

(images by W. Lorensen)

## Original Mesh Decimation - *Evaluation*

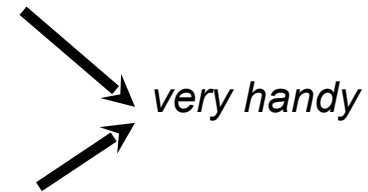
- ❖ good efficiency (speed & reduction rate)
- ❖ simple implementation and use
- ❖ good approximation
- ❖ preserves topology; vertices are a subset of the original ones
- ❖ error is **not** bounded (local evaluation ==> accumulation of error!!)

# Approximation Error Evaluation

Classification of simplification methods based on **approximation error** evaluation heuristics:

- ❖ **locally-bounded** error, based on mesh distances  
[ex. standard Mesh Decimation]
- ❖ **globally bounded** error, based on mesh distances  
[ex. Envelopes + enhanced Decimation + others]
- ❖ control based on **mesh characteristics**  
[ex. vertex proximity, mesh curvature]
- ❖ **energy function** evaluation  
[ex. Mesh Optim. , Progr. Meshes]

*User' viewpoint:*  
- simple to grasp  
- simple to drive



→ *may be misleading*

→ *not easy, many parameters to be selected*

Heuristics proposed for **global error evaluation**:

❖ **accumulation of local errors**

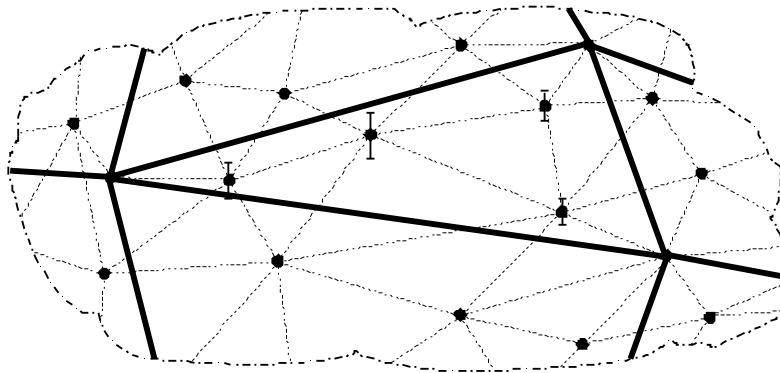
[Ciampalini97]

fast, **but** approximate

❖ **vertex--to--simplified mesh distance**

[Soucy96]

requires storing which of the original vertices maps to each simplified face;  
very near to exact value (but large under-estimation in the first steps)



- edge of initial mesh  $M_i$
- edge of simplified mesh  $M_s$
- ⊥ error magnitude,  $\text{dist}(v, M_s)$

... Heuristics proposed for ***global error evaluation***:

❖ ***input mesh -- to -- simplified mesh edges distance***

[Ciampalini97]

❖ for each internal edge:

❖ select sampling points  $\mathbf{p}_i$  (regularly/random)

❖ evaluate distance  $d(M_0, \mathbf{p}_i)$

sufficiently precise and efficient in time

❖ ***input mesh -- to -- simplified mesh distance***

[Klein96]

precise, **but** more complex in time

❖ ***use envelopes***

[Cohen et al.'96]

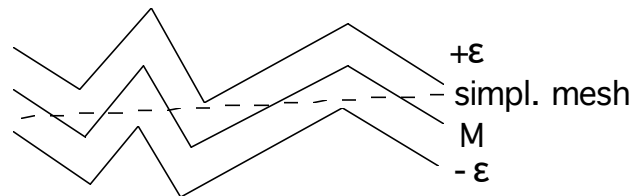
precise, no self-intersections **but** complex in time and to be implemented



## Simplification Envelopes

[Cohen et al.'96]

- ❖ given the input mesh  $M$ 
  - ❖ build two envelope meshes  $M_-$  and  $M_+$  at distance  $-\zeta$  and  $+\zeta$  from  $M$  ;
  - ❖ simplify  $M$  (following a decimation approach) by enforcing the decimation criterion:  
a candidate vertex may be removed **only if** the new triangle patch does not intersect neither  $M_-$  or  $M_+$

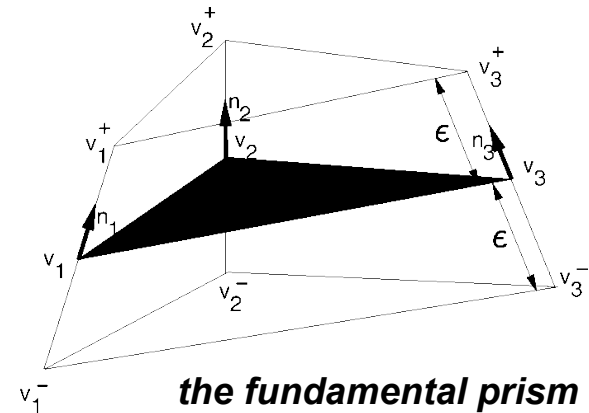


## ... Enhancing Decimation - **Simplification Envelopes** ...

- ❖ by construction, envelopes do not self-intersect  
==> simplified mesh is **not self-intersecting** !!

- ❖ distance between envelopes becomes smaller near the bending sections, and simplification harder

- ❖ **border tubes** are used to manage open boundaries



(drawing by A. Varshney)

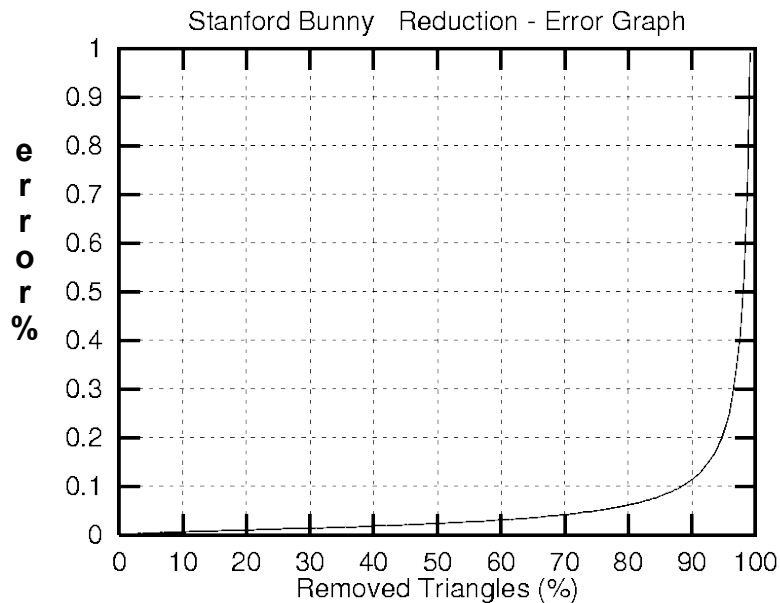
## Simplification Envelopes - *Evaluation*

- ❖ works on manifold surface **only**
- ❖ bounded approximation
- ❖ construction of envelopes and intersection tests are not cheap
- ❖ > three times more RAM (input mesh + envelopes + border tubes)
- ❖ preserve topology, vertices are a subset of the original, prevents self-intersection

***available in public domain***

## Results

- ❖ Simplification times  $\approx$  linear with mesh size



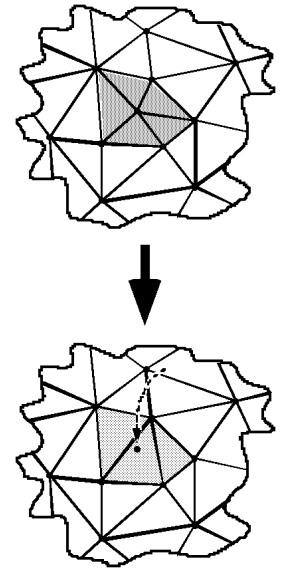
no staircase abrupt  
error increase  
(fundamental for the quality of  
the multiresolution output)

# Construction of a multiresolution model

... Enhancing Decimation -- Jade ...

Keep the *history* of the simplification process :

- ❖ when we remove a vertex we have **dead** and **newborn** triangles
- ❖ assign to each triangle  $t$  a **birth error**  $t_b$  and a **death error**  $t_d$  equal to the error of the simplified mesh just before the removal of the vertex that caused the birth/death of  $t$



By storing the *simplification history* (faces+errors) we can

simply extract *any approximation level* in real time

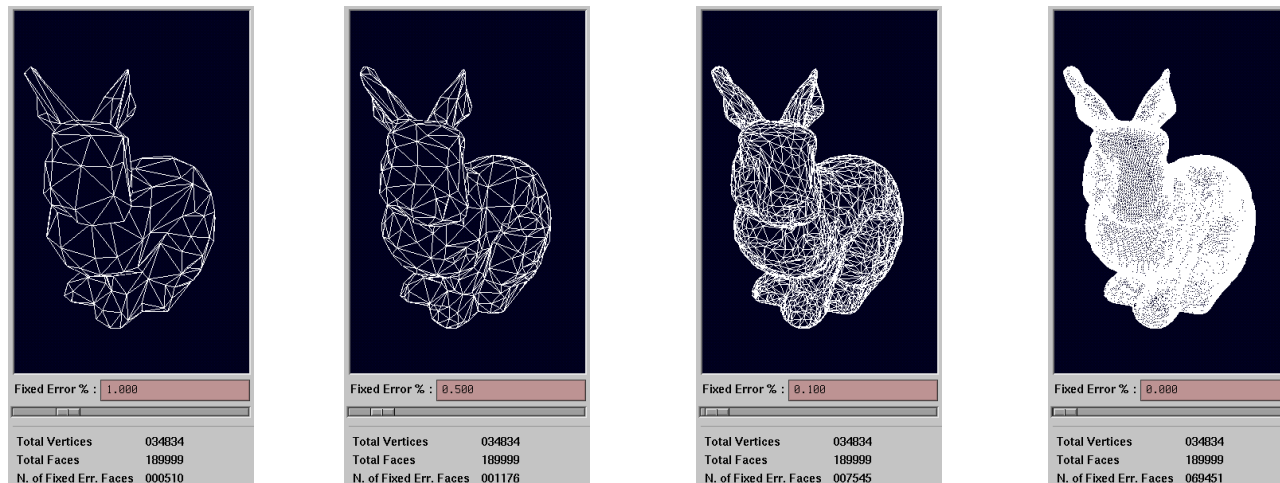
# Real-time resolution management

- ❖ by extracting from the *history* all the triangles  $t_i$  with

$$t_b \leq \epsilon < t_d$$

we obtain a model  $M_\epsilon$  which satisfies the approximation error  $\epsilon$

- ❖ maintaining the whole *history* data structure costs approximately 2.5x - 3x the full resolution model

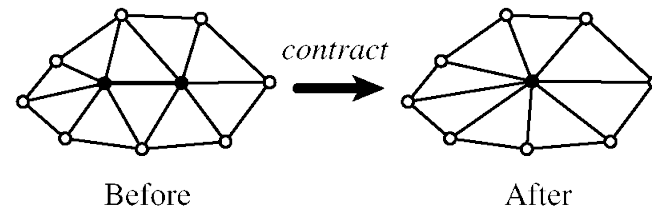


← real-time LOD →

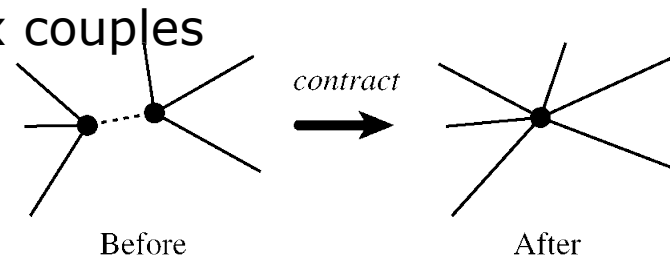
## Simplification using Quadric Error Metrics

[Garland et al. Sig'97]

- ❖ Based on incremental **edge-collapsing**



- ❖ **but** can also collapse vertex couples which are **not connected** (topology is not preserved)



Geometric error approximation is managed by simplifying an approach based on **plane set distance**  
[Ronfard,Rossignac96]

- ❖ INIT: store for each vertex the set of incident planes
- ❖ Vertex\_Collapsing  $(v_1, v_2) \Rightarrow v_{\text{new}}$ 
  - ❖ plane\_set  $(v_{\text{new}})$  = union of the two **plane sets** of  $v_1, v_2$
  - ❖ collapse only if  $v_{\text{new}}$  is not “farther” from its plane set than the selected target error  $\epsilon$

***criticism:***

- ❖ storing plane sets and computing distances is not cheap !



## Quadric Error Metrics solution:

- ❖ quadratic distances to planes represented with **matrices**
  - ❖ plane sets merge *via* matrix sums
  - ❖ very efficient evaluation of error *via* **matrix operations**

**but**

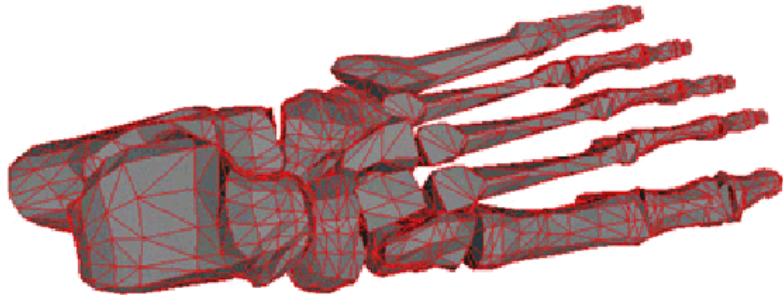
- ❖ triangle size is taken into account only in an approximate manner (orientation only in Quadrics + weights)

## Algorithm structure:

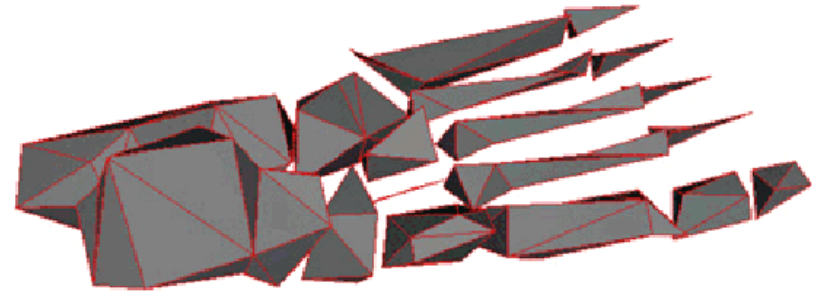
- ❖ select valid vertex pairs (upon their distance),  
insert them in an heap sorted upon minimum cost;
- ❖ **repeat**
  - ❖ extract a valid pair  $v_1, v_2$  from heap and contract into  $v_{\text{new}}$ ;
  - ❖ re-compute the cost for all pairs which contain  $v_1$  or  $v_2$   
and update the heap;
- until** sufficient reduction/approximation **or** heap empty

## An example

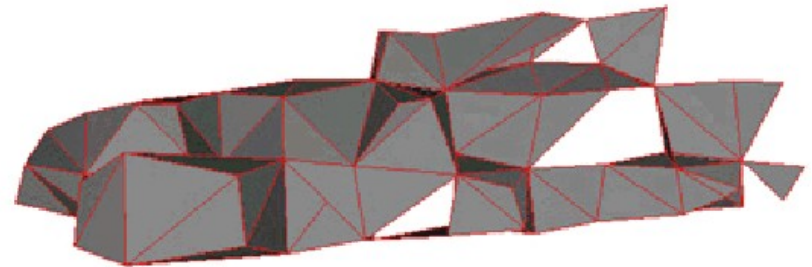
- ❖ **Original.** Bones of a human's left foot (4,204 faces).
- ❖ Note the many separate bone segments.



- ❖ **Edge Contractions.** 250 face approximation.
- ❖ Bone segments at the ends of the toes have disappeared; the toes appear to be receding back into the foot.



- ❑ **Clustering.** 262 face approximation.



# Quadric Error for Surfaces

- ❖ Let  $\mathbf{n}^T \mathbf{v} + d = 0$  be the equation representing a plane
- ❖ The squared distance of a point  $\mathbf{x}$  from the plane is

$$D(\mathbf{x}) = \mathbf{x}(\mathbf{n}\mathbf{n}^T)\mathbf{x} + 2d\mathbf{n}^T\mathbf{x} + d^2$$

- ❖ This distance can be represented as a quadric

$$Q = (A, \mathbf{b}, c) = (\mathbf{n}\mathbf{n}^T, d\mathbf{n}, d^2)$$

$$Q(\mathbf{x}) = \mathbf{x}A\mathbf{x} + 2\mathbf{b}^T\mathbf{x} + c$$

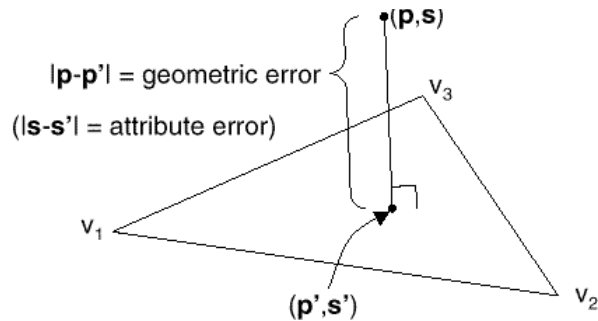
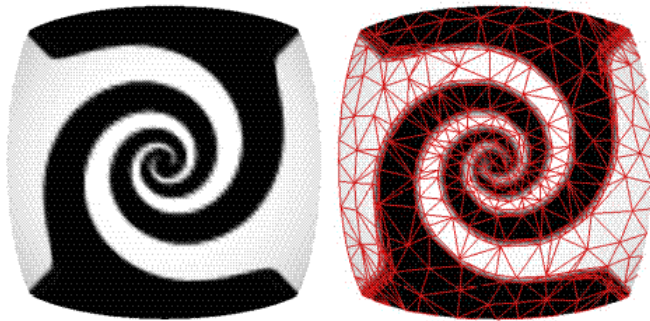
# Quadric

- ❖ The boundary error is estimated by providing for each boundary vertex  $v$  a quadric  $Q_v$  representing the sum of the all the squared distances from the faces incident in  $v$ 
  - ❖ The error of collapsing an edge  $e=(v,w)$  can be evaluated as  $Q_w(v)$ .
  - ❖ After the collapse the quadric of  $v$  is updated as follow  $Q_v = Q_v + Q_w$

# Domain Error

- ❖ The two dataset  $D$  and  $D'$  span different domains  $\Omega, \Omega'$
- ❖ Same problem of classical surface simplification
- ❖ Measure the Hausdorff distance between the boundary surfaces of the two datasets  $D$  and  $D'$ 
  - $e_f^a(D, D') = \max_{x \in \Omega} ( \min_{y \in \Omega'}(\text{dist}(x,y)) )$
  - $e_f(D, D') = \max(e_f^a(D, D'), e_f^a(D', D))$
  -
- ❖ Various techniques to approximate this distance between two surfaces [Ciampalini et al. 97]
- ❖
- ❖

## ... Quadric Error Metrics Extension ...

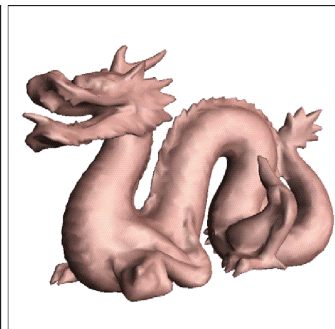


Quadric can be extended to take into account:

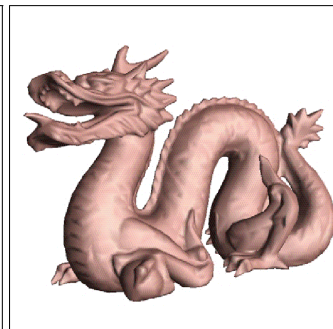
- color and texture attributes error are computed by projecting them in  $R^{3+m}$  [Garland 98]
- by computing attribute error as the squared deviation between original value and the value interpolated [Hoppe 99]



(a) Original mesh



(b)  $Q$  is just geometric error



(c)  $Q$  also includes normals

## Quadric Error Metrics -- *Evaluation*

- ❖ iterative, incremental method
- ❖ error is bounded
- ❖ allows topology simplification (aggregation of disconnected components)
- ❖ results are very high quality and ***times incredibly short***
- ❖ Various commercial packages use this technique (or variations)



## Not-incremental methods:

❖ coplanar facets merging

[Hinker et al. '93, Kalvin et al. '96]

❖ re-tiling

[Turk '92]

❖ clustering

[Rossignac et al. '93, ... + others]

❖ wavelet-based

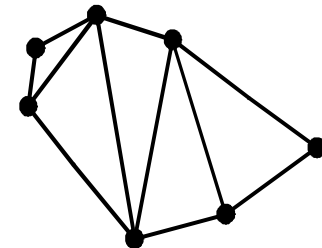
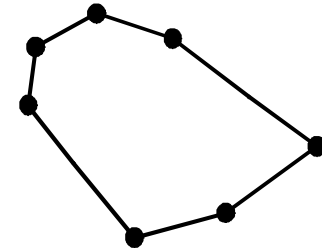
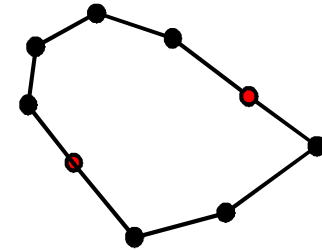
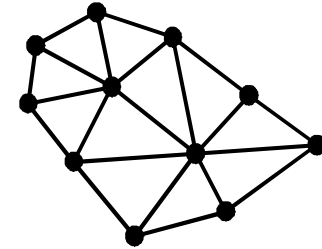
[Eck et al. '95]

# Coplanar Facets Merging

## ***Geometric Optimization***

[Hinker '93]

- ❖ Construct nearly co-planar sets (comparing normals)
- ❖ Create edge list and remove duplicate edges
- ❖ Remove colinear vertices
- ❖ Triangulate resultant polygons



## ***Geometric Optimization - Evaluation***

simple and efficient heuristic

- ❖ evaluation of approximation error is highly inaccurate and not bounded

(error depends on relative size of merged faces)

- ❖ vertices are a subset of the original

- ❖ preserves geometric discontinuities (e.g. sharp edges) and topology

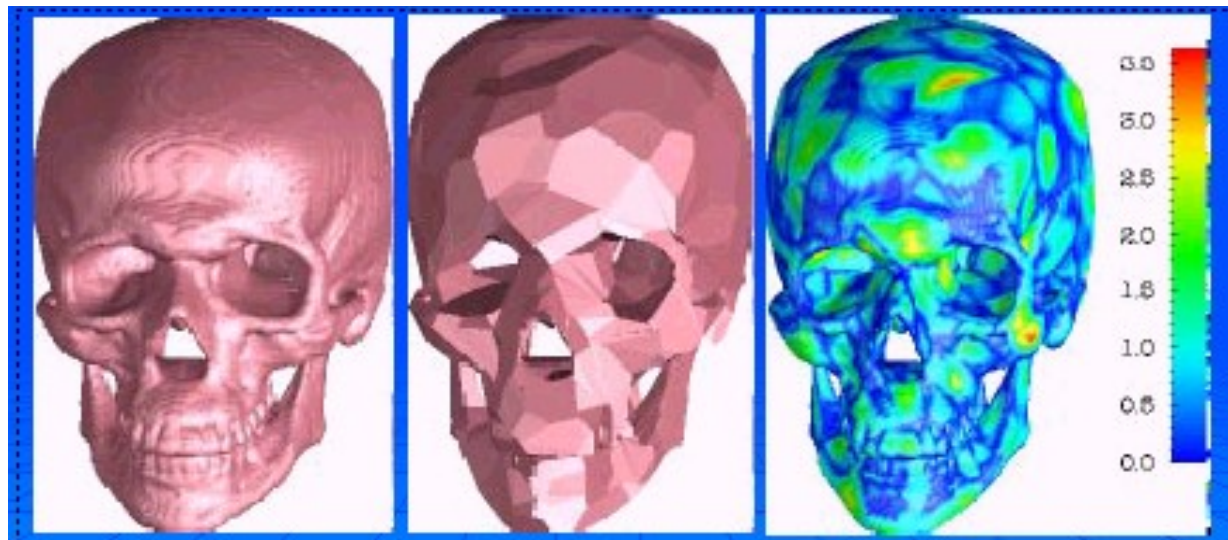
## ***Superfaces*** '96]

[Kalvin, Taylor

- ❖ group mesh faces in a set of *superfaces*:
  - ❖ iteratively choose a seed face  $f_i$  as the current *superface*  $Sf_j$
  - ❖ find by propagation all faces adjacent to  $f_i$  whose vertices are at distance  $\epsilon/2$  from the mean plane to  $Sf_j$  and insert them in  $Sf_j$
  - ❖ moreover, to be merged each face must have orientation similar to those of others in  $Sf_j$
- ❖ straighten the *superfaces* border
- ❖ re-triangulate each *superface*

## Superfaces - an example

- ❖ Simplification of a human skull (fitted isosurface), *images courtesy of IBM*



## ***Superfaces* - Evaluation**

- ❖ slightly more complex heuristics
- ❖ evaluation of approximation error is more accurate and bounded
- ❖ vertices are a subset of the original ones
- ❖ preserves geometric discontinuities (e.g. sharp edges) and topology

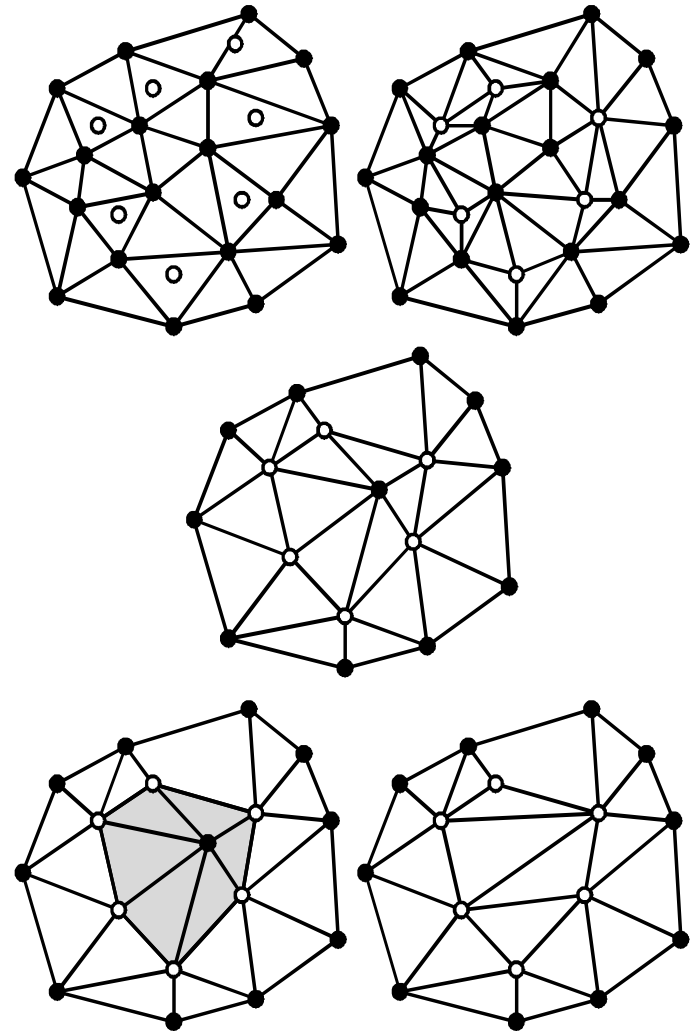
# Re-tiling

## **Re-Tiling**

[Turk `92]

- ❖ Distribute a new set of vertices into the original triangular mesh (points positioned using repulsion/relaxation to allow optimal surface curvature representation)
- ❖ Remove (part of) the original vertices
- ❖ Use local re-triangulation

*no info in the paper on  
time complexity!*

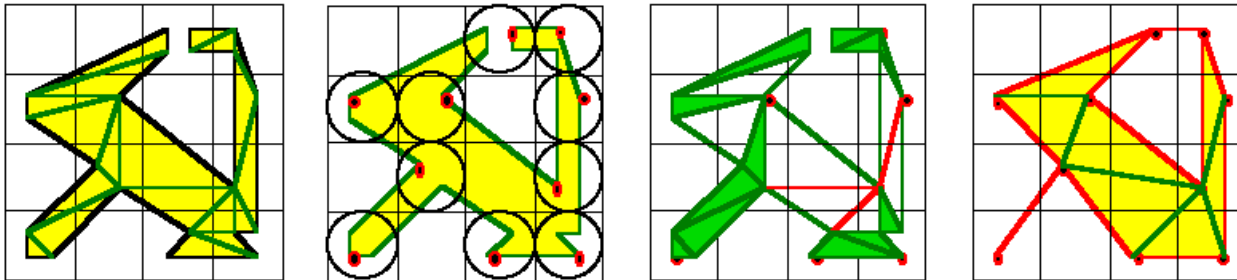


# Clustering

## ***Vertex Clustering***

[Rossignac, Borrel `93]

- ❖ detect and unify *clusters* of nearby vertices  
(discrete gridding and coordinates truncation)
- ❖ all faces with two or three vertices in a cluster are removed
- ❖ does not preserve topology (faces may degenerate to edges, genus may change)
- ❖ approximation depends on grid resolution

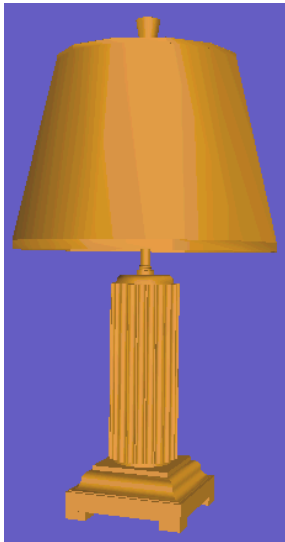


(figure by Rossignac)



# Clustering -- Examples (1)

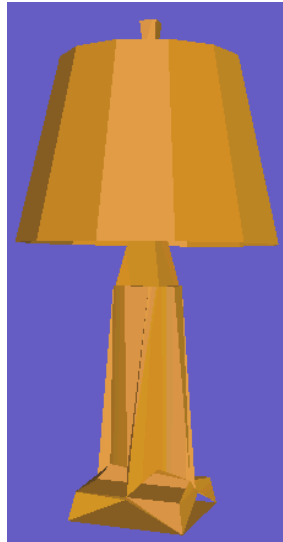
- ❖ Simplification of a table lamp,  
IBM 3D Interaction Accelerator,  
courtesy IBM



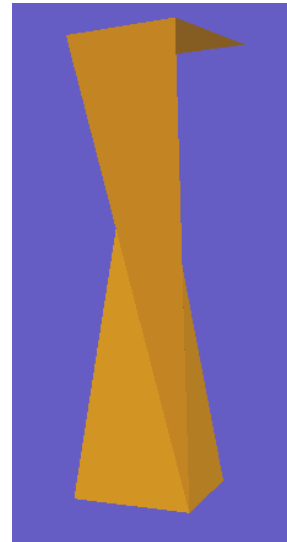
10,108 facets



1,383 facets



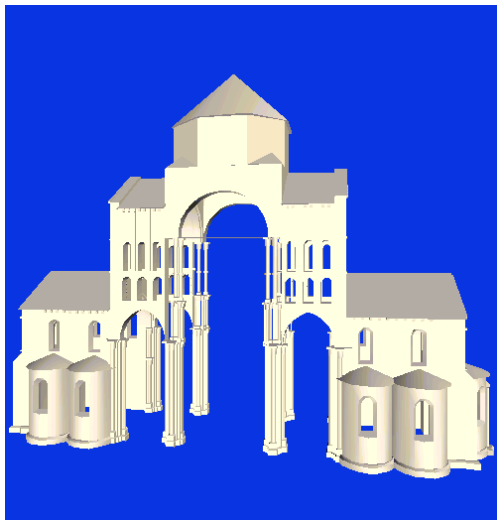
474 facets



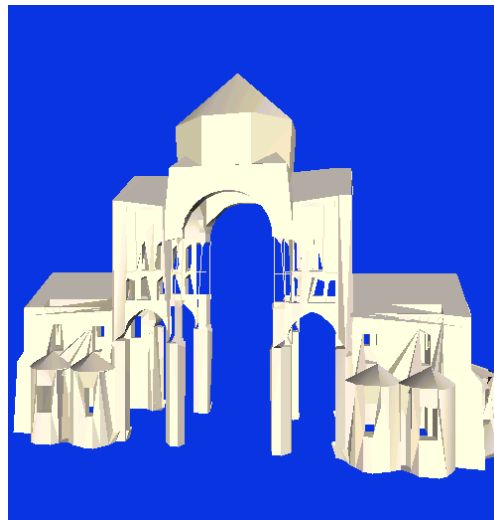
46 facets

## Clustering -- Examples (2)

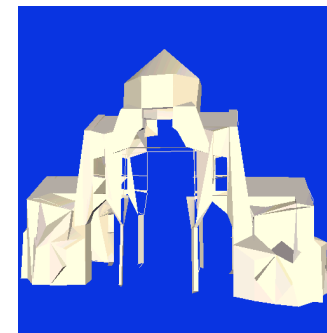
- ❖ Simplification of a portion of Cluny Abbey, IBM 3D Interaction Accelerator, courtesy IBM France.



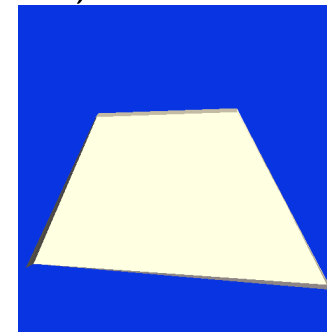
46,918 facets



6,181 facets



1,790 facets



16 facets

## **Clustering - *Evaluation***

- ❖ high efficiency (but timings are not reported in the paper)
- ❖ very simple implementation and use
- ❖ low quality approximations
- ❖ does not preserve topology
- ❖ error is bounded by the grid cell size

## Multiresolution Analysis

[Eck et al. '95, Lounsbery'97]

- ❖ Based on the **wavelet** approach
  - ❖ simple base mesh
  - ❖ + local correction terms (wavelet coefficients)
  
- ❖ Given input mesh  $M$ :
  - ❖ **partition** : build a low resolution base mesh  $K_0$  with tolerance  $\epsilon_1$
  - ❖ **parametrization** : for each face of  $K_0$  build a parametrization on the corresponding faces of  $M$
  - ❖ **resampling** : apply  $j$  recursive quaternary subdivision on  $K_0$  to build by parametrization different approximations  $K_j$
  
- ❖ Supports:
  - bounded error, compact multiresolution repr., mesh editing at multiple scales

Hoppe's experiment: comparative eval. of quality of multiresolution representation

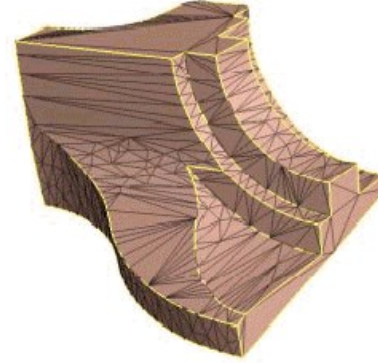
❖ Progressive Meshes



(a)  $\hat{M}$  (12,946 faces)



(b)  $M^{75}$  (200 faces)



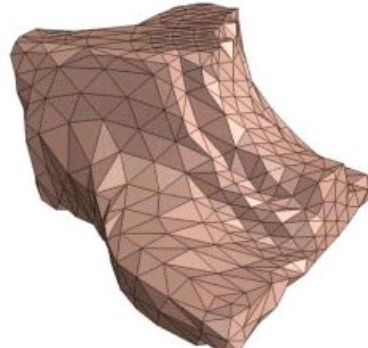
(c)  $M^{475}$  (1,000 faces)



❖ Multiresolution Analysis



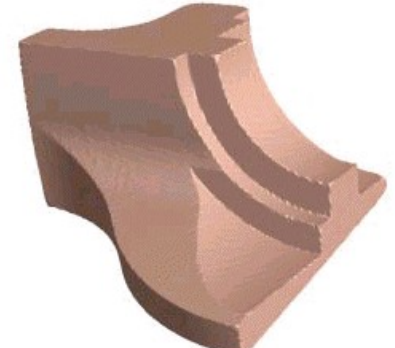
(d)  $\epsilon = 9.0$  (192 faces)



(e)  $\epsilon = 2.75$  (1,070 faces)



(f)  $\epsilon = 0.1$  (15,842 faces)



# Multires Signal Processing for Meshes

[Guskov, Swelden, Schroeder 99]

- ❖ Still the **Partition, Parametrization and Resampling** approach but the original mesh connectivity is retained:
  - ❖ partition is done on the simplified mesh
  - ❖ use of a **non-uniform relaxation procedure** (instead of standard triangle quadrisection) that mimics the inverse simplification process
  - ❖ Possibility of using signal processing techniques on mesh (eg. Smoothing, detail enhancement ...)



# Preserving detail on simplified meshes

## ❖ Problem Statement :

how can we preserve in a *simplified* surface the **detail** (or **attribute value**) defined on the *original* surface ??

## ❖ What one would preserve:

- ❖ **color** (per-vertex or texture-based)
- ❖ **small variations of shape curvature** (bumps)
- ❖ **scalar fields**
- ❖ **procedural textures** mapped on the mesh

Approaches proposed in literature are:

❖ **integrated** in the simplification process

(ad hoc solutions **embedded** in the simplification codes)

❖ **independent** from the simplification process

(post-processing phase to restore attributes detail)



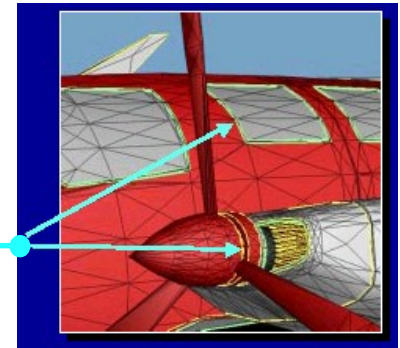
## *Integrated approaches:*

- ❖ attribute-aware simplification
  - ❖ do not simplify an element **e** **IF** **e** is on the boundary of two regions with different attribute values

**or**

- ❖ use an enhanced multi-variate approximation evaluation metrics (shape+color+...)

[Hoppe96, GarHeck98, Frank et al98, Cohen et al98]



(image by H. Hoppe)

- ❖ store removed detail in textures
  - ❖ *vertex-based* [Maruka95 , Soucyetal96]
  - ❖ *texture-based* [Krisn.etal96]
- ❖ preserve **topology** of the attribute field  
[Bajaj et al.98]

... Preserving detail: Simplif.-Independent...

*Simplification-Independent approach:*

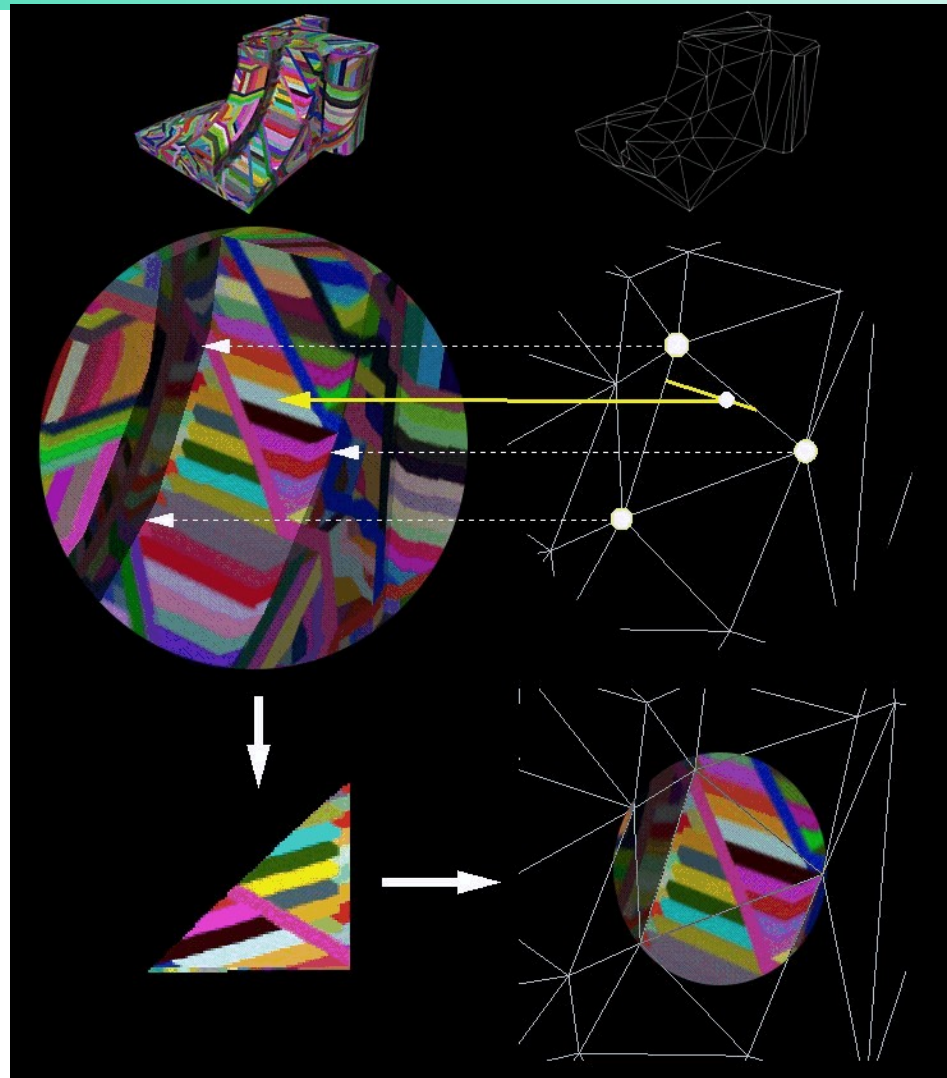
## ***our Vis'98 paper***

[Cignoni etal 98]

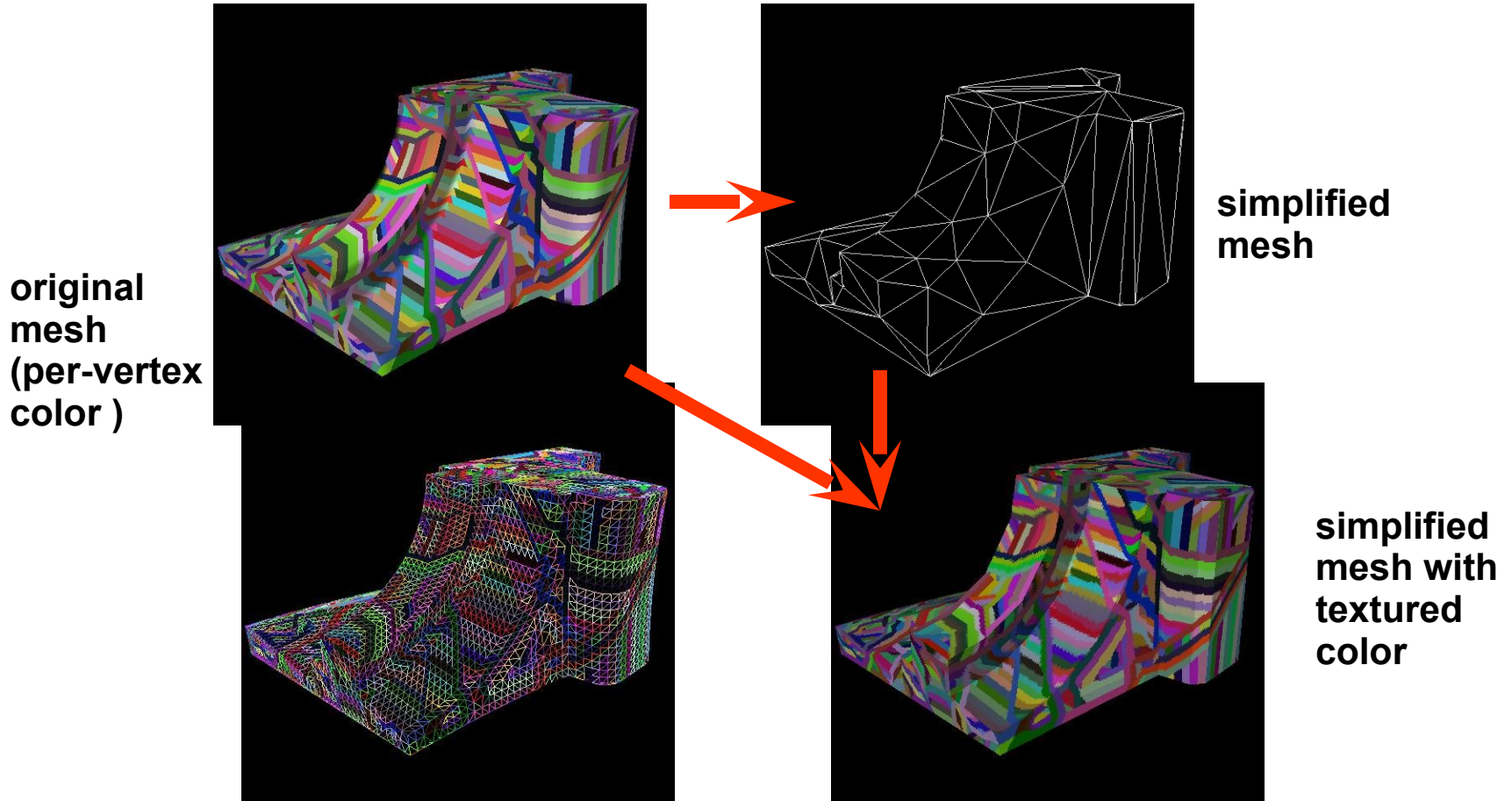
- ❖ ***higher generality:*** attribute/detail preservation is not part of the simplification process
- ❖ performed as a ***post-processing*** phase (after simplification)
- ❖ any attribute can be preserved, by constructing an ad-hoc ***texture map***
- ❖ Used today in most games...

# A simple idea: ... Preserving detail: Simplif.-Independent...

- ❖ for each texel  
simplified face:
  - ❖ detect the original detail by choosing either the closest point or along the normal.

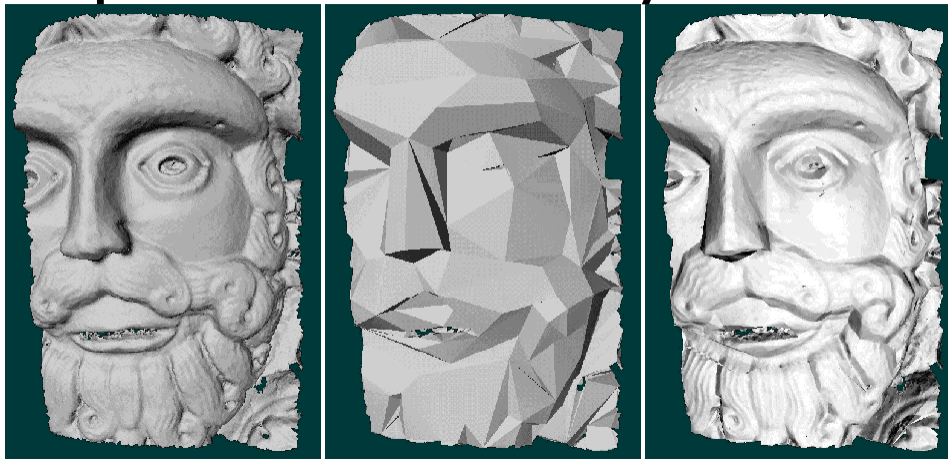


❖ an example of **color** preservation

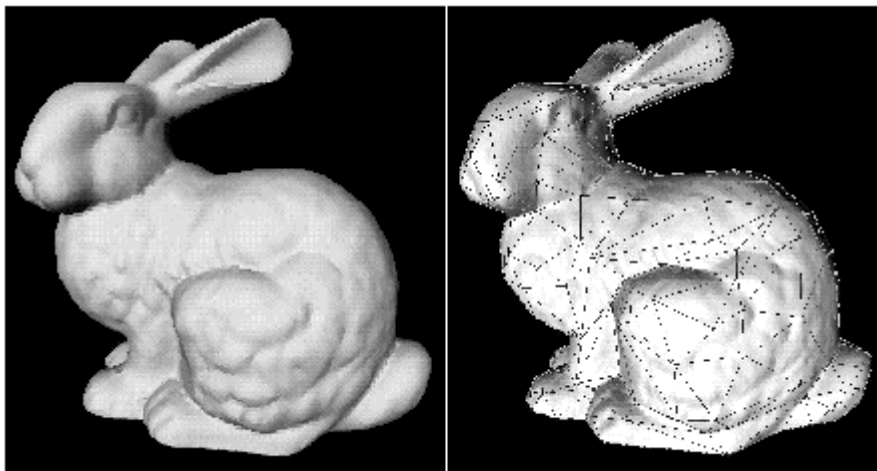


... Preserving detail: Simplif.-Independent...

❖ example of ***geometric detail***  
preservation by ***normal mapping***



Original 20k face  
simplified 500 face



Original 60k faces  
simplified 250 faces

