

# Mathematical Aspects of 3D Photography

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# Outline of talk

- What is 3D Photography, and what is it good for ?
- Sensors
- Modeling 2D manifolds by subdivision surfaces
- Parametrization and multiresolution analysis of meshes
- Surface light fields
- Conclusions

# 1. What is 3D Photography and what is it good for ?

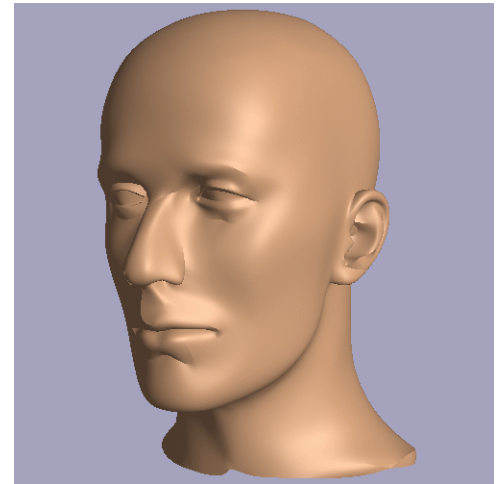
Emerging technology aimed at

- capturing
- viewing
- manipulating

digital representations of shape and visual appearance of 3D objects.

Will have large impact because 3D photographs can be

- stored and transmitted digitally,
- viewed on CRTs,
- used in computer simulations,
- manipulated and edited in software, and
- used as templates for making electronic or physical copies

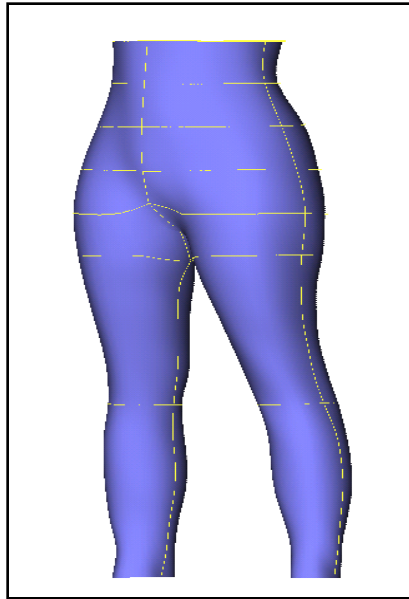


# Modeling humans

- Anthropometry
- Create data base of body shapes for garment sizing
- Mass customization of clothing
- Virtual dressing room
- Avatars



**Scan of lower body**  
(Textile and Clothing Technology Corp.)



**Fitted template**  
(Dimension curves drawn in yellow)



**Full body scan**  
(Cyberware)

## Modeling artifacts

- Archival
- Quantitative analysis
- Virtual museums

Image courtesy of Marc Levoy and the  
**Digital Michelangelo** project

Left: Photo of David's head

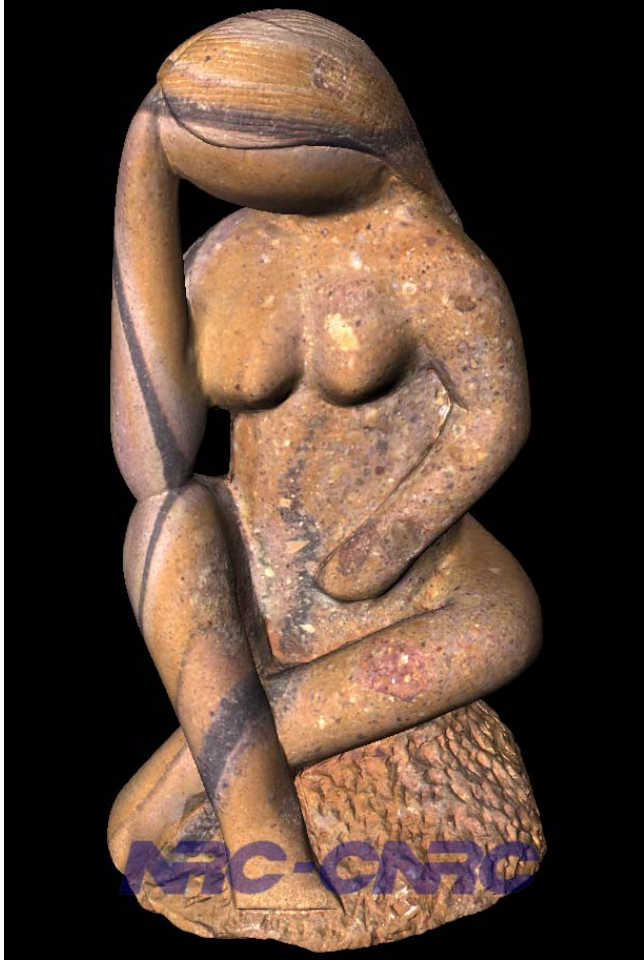
Right: Rendition of digital model

(1mm spatial resolution, 4 million polygons)

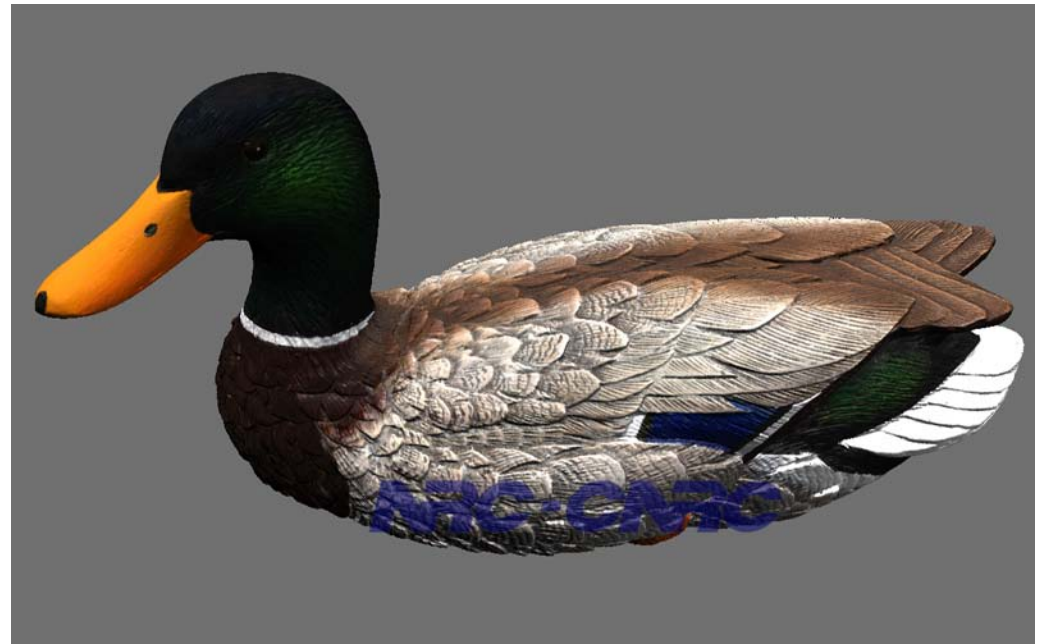


## Modeling artifacts

Images courtesy of Marc Rioux and the  
Canadian National Research Council



Nicaraguan stone figurine



Painted Mallard duck

## Modeling architecture

- Virtual walk-throughs and walk-arounds
- Real estate advertising
- Trying virtual furniture

Left image: Paul Debevec, Camillo Taylor, Jitendra Malik (Berkeley)

Right image: Chris Haley (Berkeley)



**Model of Berkeley Campanile**



**Model of interior with artificial lighting**

# Modeling environments

- Virtual walk-throughs and walk arounds
- Urban planning



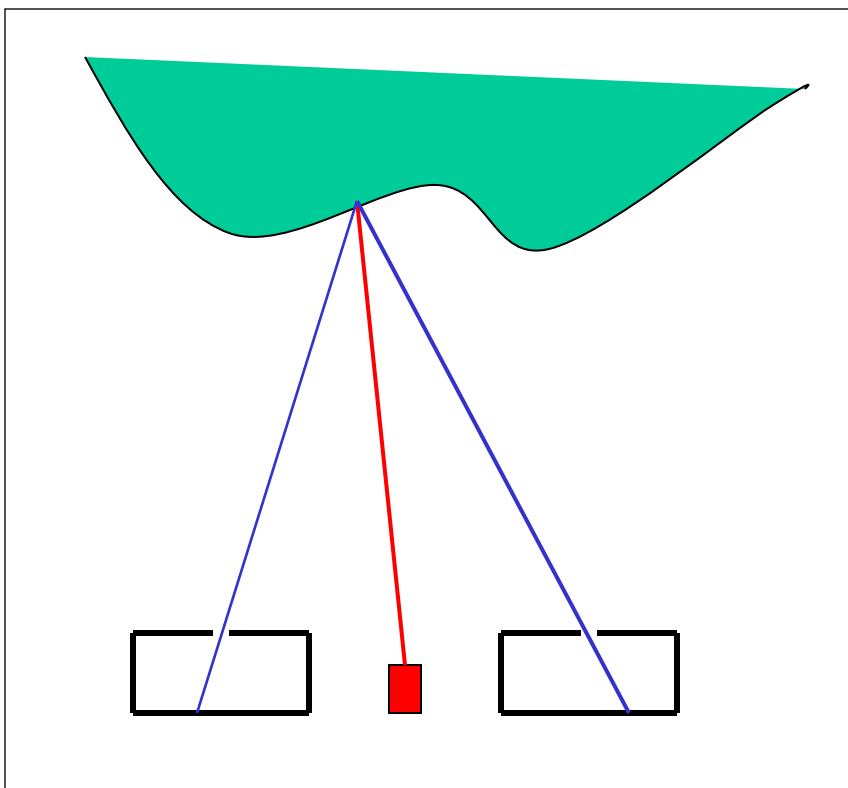
**Two renditions of model of MIT campus**  
(Seth Teller, MIT)



## 2. Sensors

Need to acquire data on shape and “color”

**Simplest idea for shape:** Active light scanner using triangulation



UW “handknit” scanner

Laser spot on object allows matching of image points in the cameras

A more mature engineering effort:

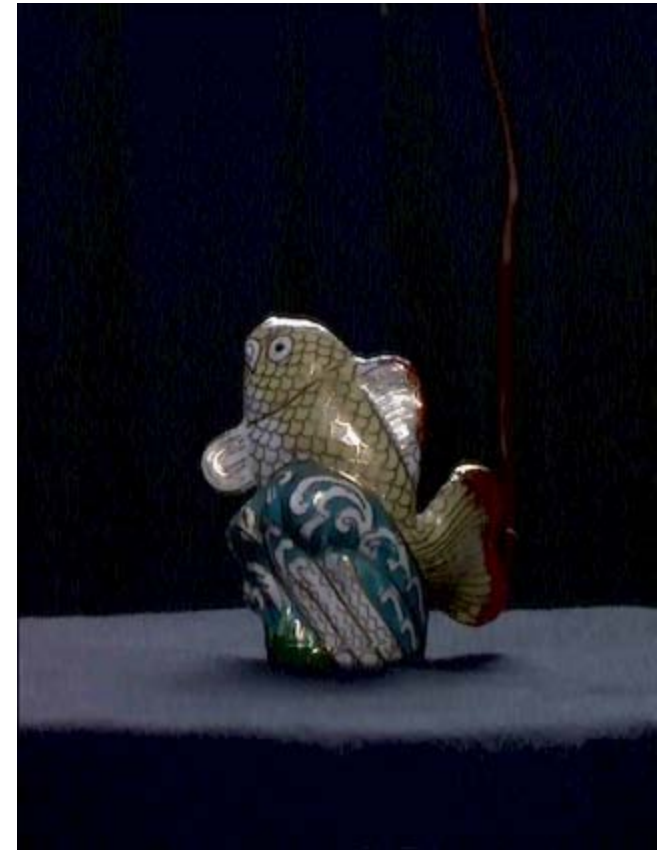
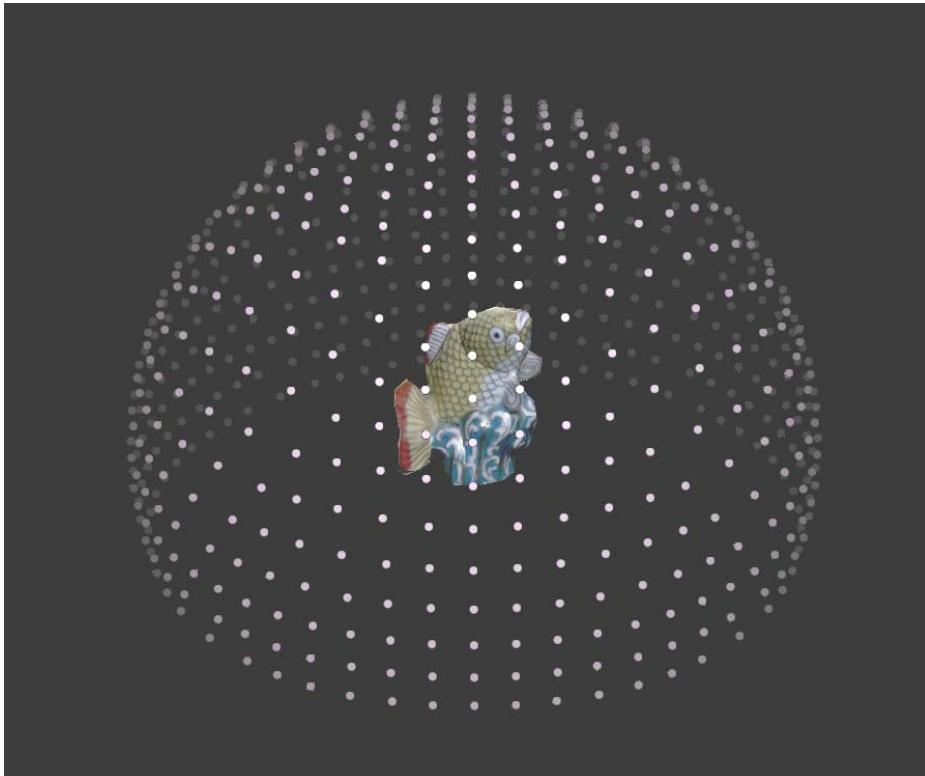
## The Cyberware Full Body Scanner



## “Color” acquisition

“Color” can mean:

- RGB value for each surface point
- RGB value for each surface point and viewing direction
- BRDF (allows re-lighting)



One of ~ 700 images

Camera positions

## Output of sensing process

- 1,000's to 1,000,000's of surface points assembled into triangular mesh
- RGB value for each vertex or
- Collection of (direction, RGB value) pairs for each vertex



Mesh generated from fish scans

# 4. Modeling shape

## A computer scientist's view

“Triangular mesh” is a basic abstraction in computer graphics and computational geometry.

Extensive set of tools for storing and manipulating meshes

Representing object surface by triangular mesh interpolating surface points comes natural to a computer scientist

## A mathematician's view

Mathematical abstraction for surface of 3D object is “embedded 2D manifold” (subset of 3D space that locally looks like a piece of the plane)

Study of 2D manifolds has a long history going back to Gauss and Euler

Important result: There are infinitely many fundamentally different 2D manifolds that cannot be smoothly deformed into each other: impossible to deform balloon into coffee cup without tearing.

This fact accounts for some of the difficulties in 3D photography.

## A statistician's view

We have a set of data - surface points produced by the sensor.

We want to “fit a parametric model” to these data, in our case a 2D manifold.

Parameters of model control shape of the manifold.

We define a goodness-of-fit measure quantifying how well model approximates data.

We then find the best parameter setting using numerical optimization.

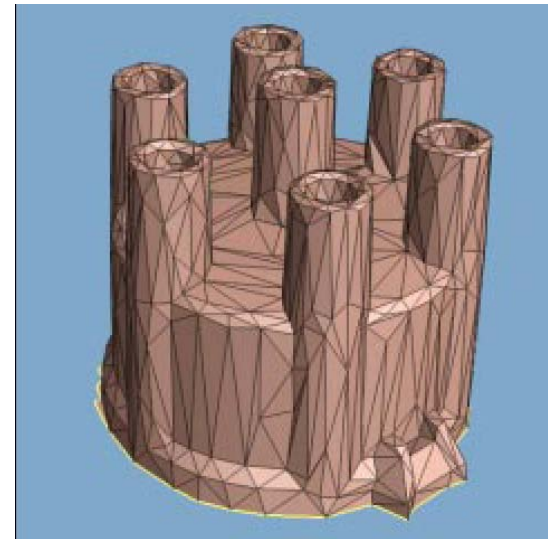
Basic questions:

- What's the form of the parametric model ?
- What's the goodness-of-fit measure ?
- ( How will we optimize it ?)

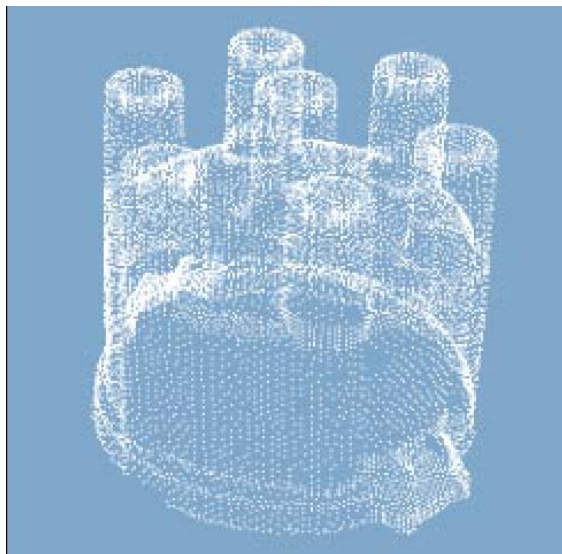
## Fitting 2D manifolds

Why not stick with meshes ?

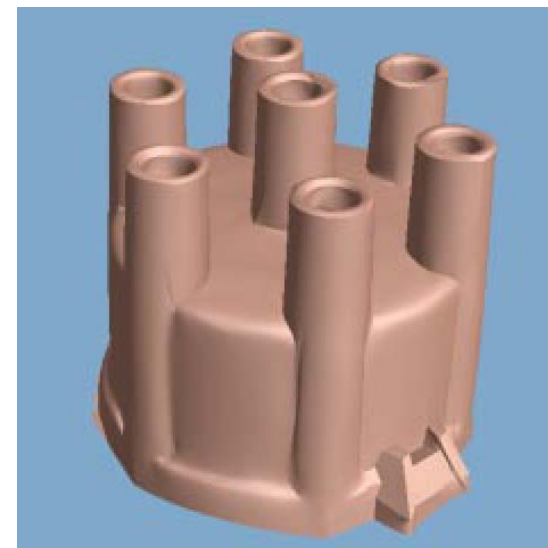
- Real world objects are often smooth or piecewise smooth
- Modeling a smooth object by a mesh requires lots of small faces
- Want more parsimonious representation



**Fitted mesh**



**Sensor data**



**Fitted subdivision surface**

## Subdivision surfaces

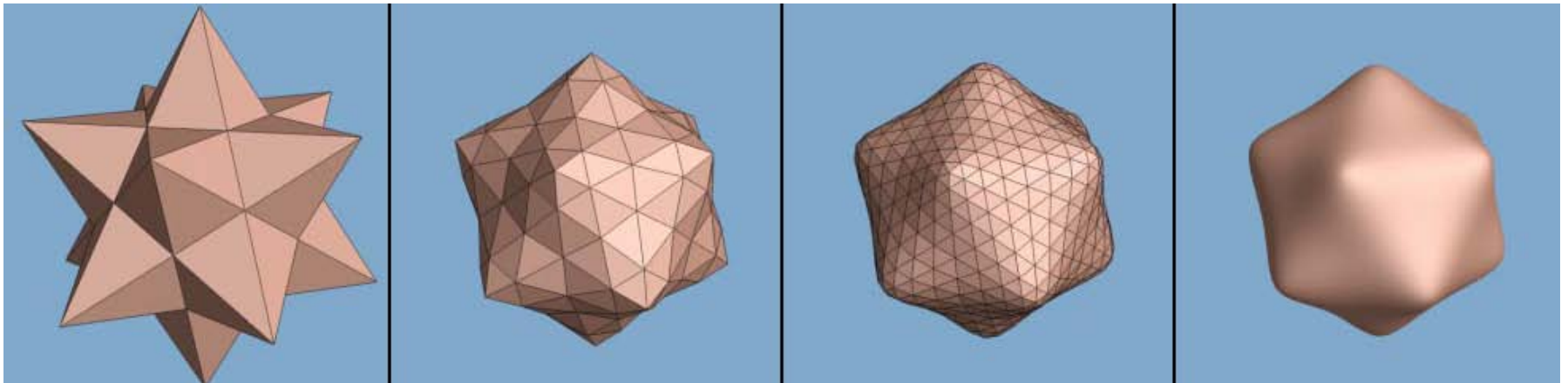
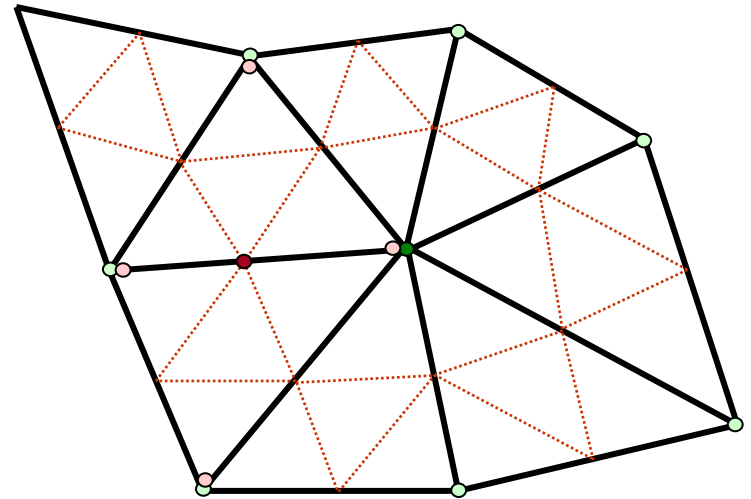
Defined by limiting process, starting with control mesh (bottom left)

Split each face into four (right)

Compute positions of new **edge vertices** as weighted means of **corner vertices**

Compute new positions of **corner vertices** as weighted means of their **neighbors**

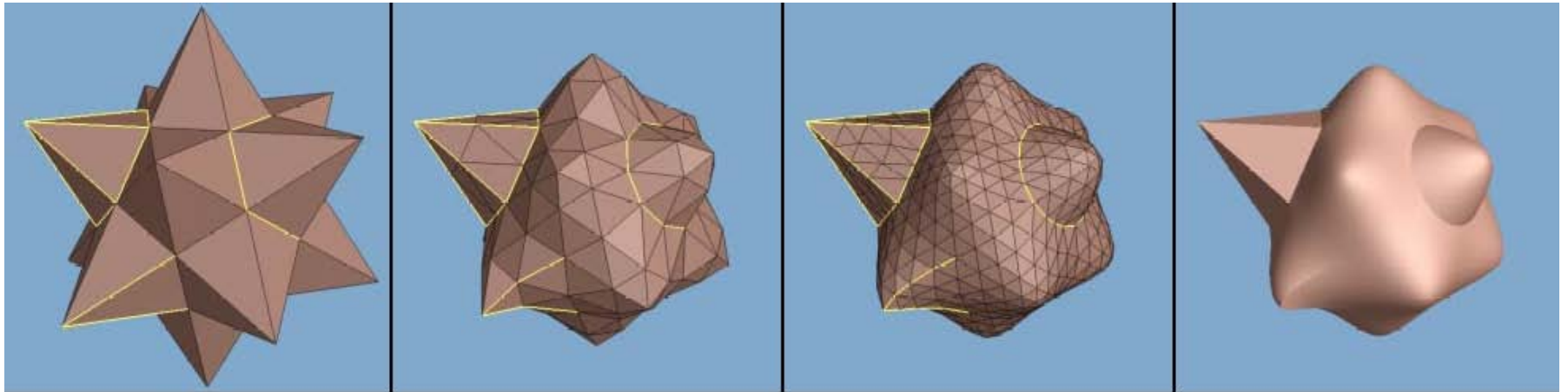
Repeat the process

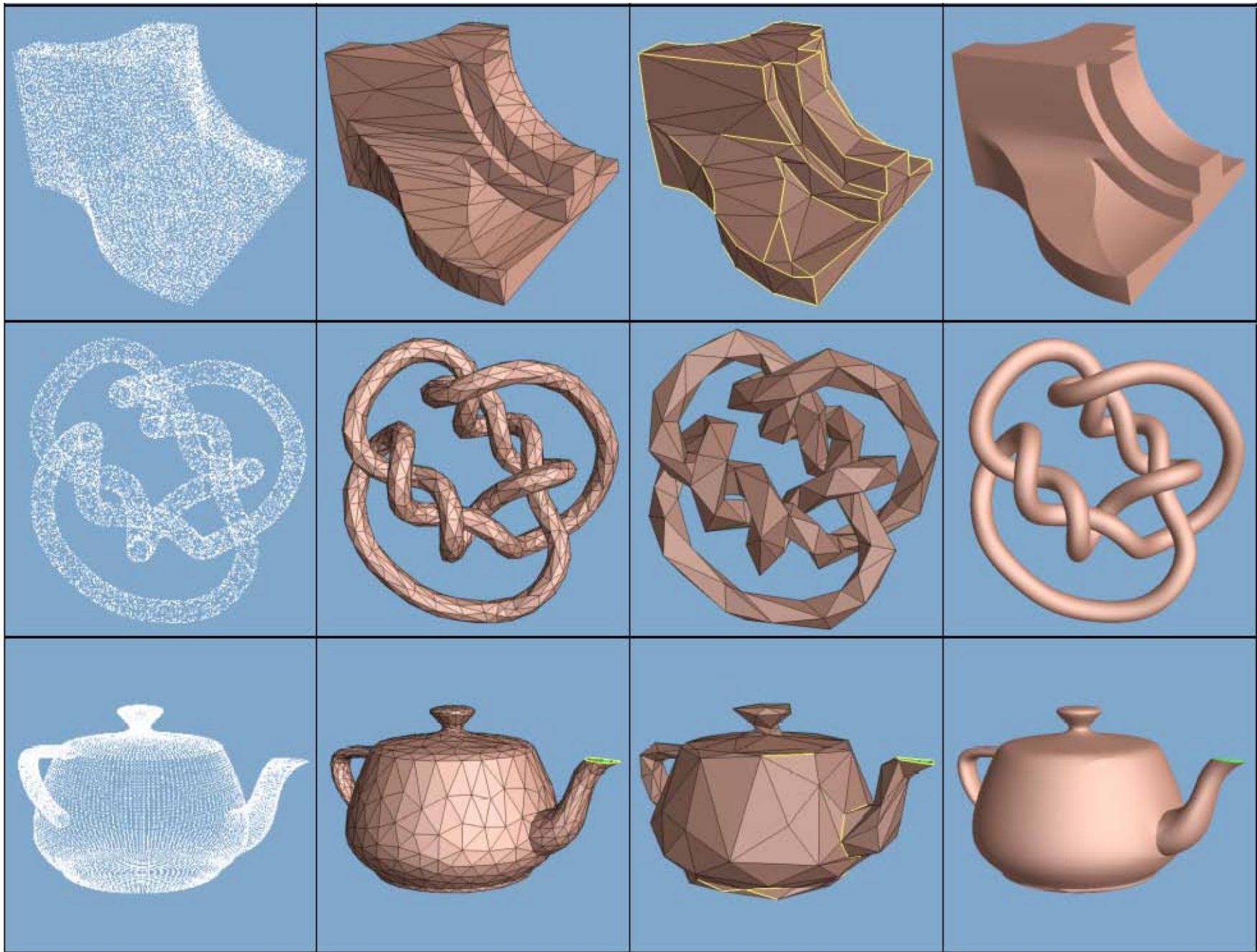




## Remarks

- Limiting position of each vertex is weighted mean of control vertices.
- Important question: what choices of weights produce smooth limiting surface ?
- Averaging rules can be modified to allow for sharp edges, creases, and corners (below)
- Fitting subdivision surface to data requires solving nonlinear least squares problem.

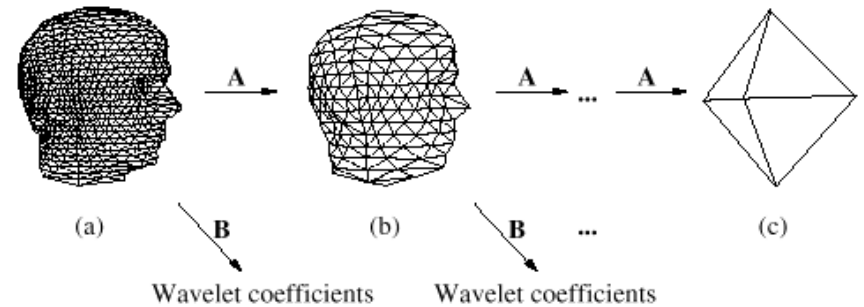




# 6. Parametrization and multiresolution analysis of meshes

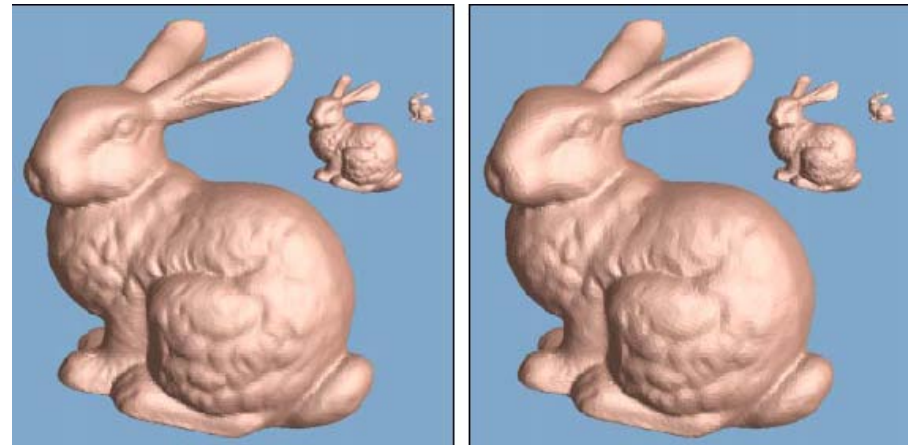
## Idea:

Decompose mesh into simple “base mesh” (few faces) and sequence of “wavelet” correction terms of decreasing magnitude



## Motivation:

- Compression
- Progressive transmission
- Level-of-detail control
  - Rendering time ~ number of triangles
  - No need to render detail if screen area is small

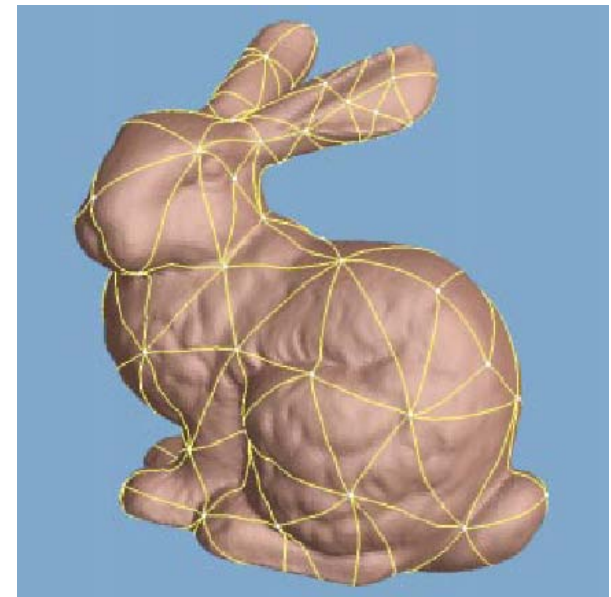


Full resolution  
70K faces

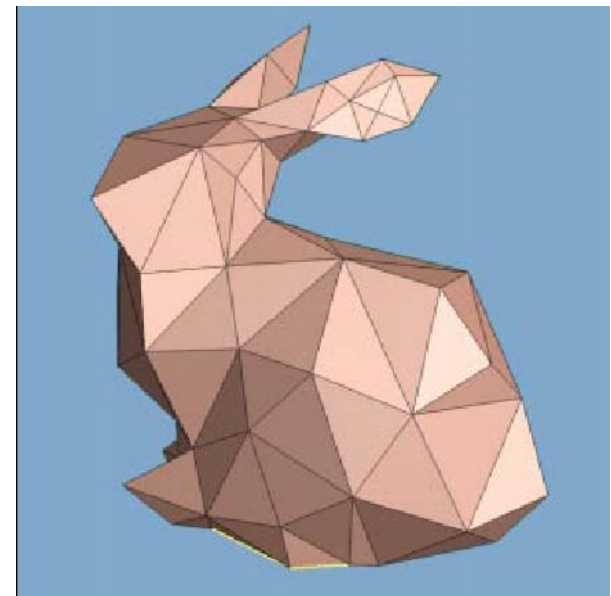
LoD control  
38K - 4.5K - 1.9K  
faces

## Procedure (“computational differential geometry”)

- Partition mesh into triangular regions, each homeomorphic to a disk
- Create a triangular “base mesh”, associating a triangle with each of the regions
- Construct a piecewise linear homeomorphism from each region to the corresponding base mesh face
- Now we have representation of original as vector-valued function over the base mesh
- Multi-resolution analysis of functions is (comparatively) well understood.

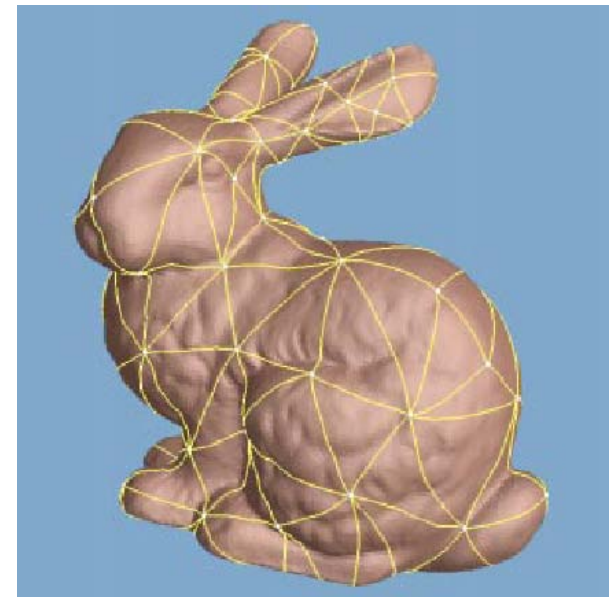


**PL homeomorphism**



## Texture mapping

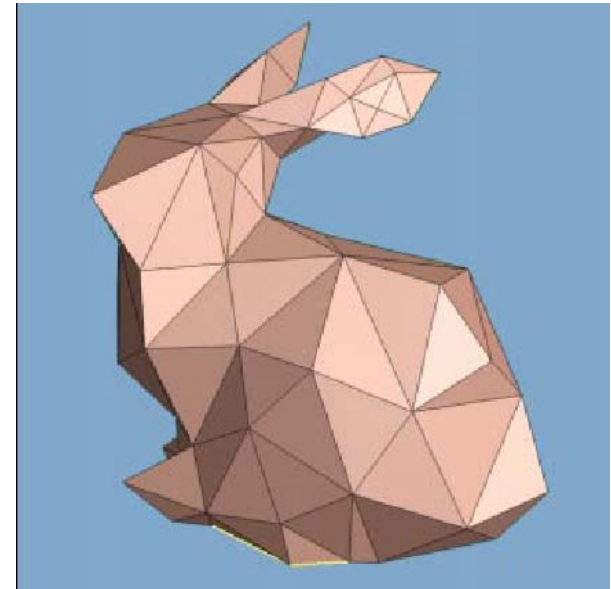
- Homeomorphism allows us to transfer color from original mesh to base mesh
- This in turn allows us to efficiently color low resolution approximations (using texture mapping hardware)
- Texture can cover up imperfections in geometry



**PL homeomorphism**

Mesh doesn't much look like face, but...

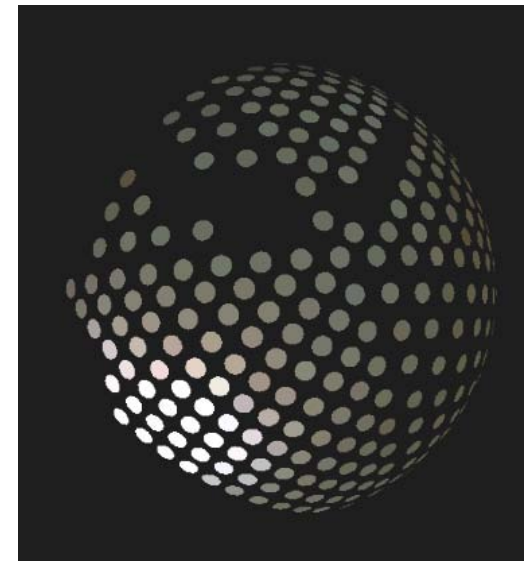
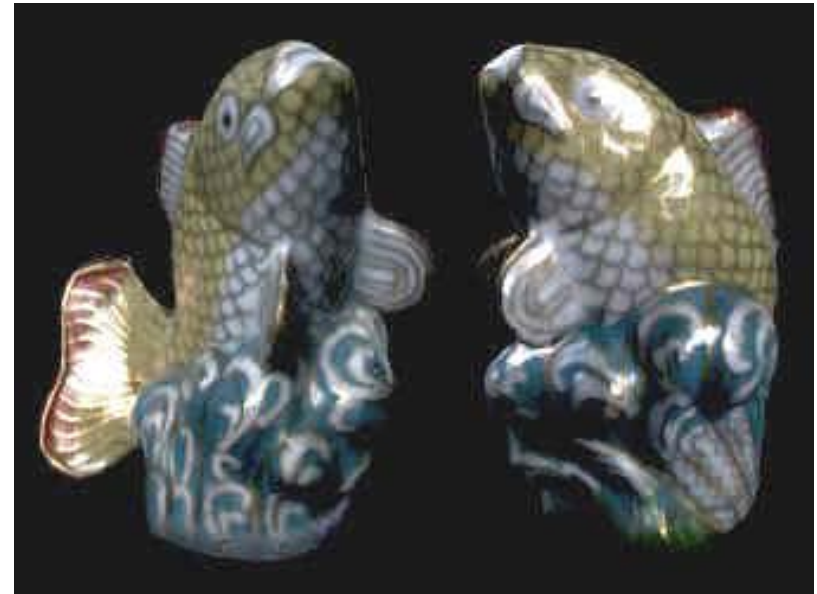
What would it look like without texture ?



# 7. Modeling of surface light fields

## Motivation

- Real objects don't look the same from all directions (specularity, anisotropy)
- Ignoring these effects makes everything look like plastic
- Appearance under fixed lighting is captured by "surface light field" (SLF)
- SLF assigns RGB value to each surface point and each viewing direction - SLF is function assigning vector valued function on the sphere to each surface point.



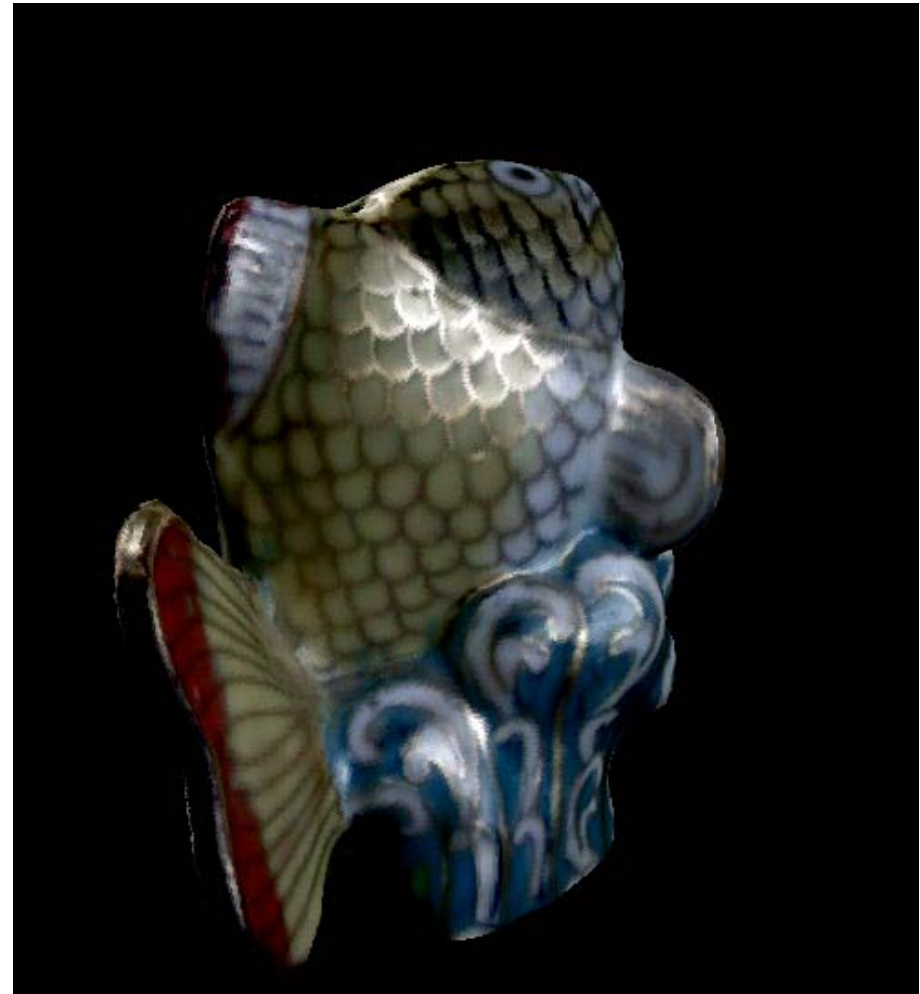
**Data lumisphere: observed direction - color pairs for single surface point**

## Payoff

Modeling and rendering SLF adds a lot of realism

## Issues

- Compression: uncompressed SLF for fish is about 170 MB
- Real time rendering non-trivial
- Interesting mathematical / statistical problems: smoothing and approximation on general manifolds



## 8. Conclusions

3D Photography is an active, exciting research area

There is opportunity, and need, for contributions from Computer Science, Mathematics, and Statistics:

- Computer Scientists, Mathematicians, and Statisticians have a different ways of thinking about problems.
- Each discipline has evolved its own set of abstractions and created its own sets of tools.
- Casting 3D photography into the language of Mathematics and Statistics allows one to bring to bear the tools of these fields
- Thinking about 3D photography in mathematical or statistical terms suggests interesting research problems in those fields
- Broadening one's view through collaborative research is intellectually stimulating as well as enjoyable

**Thank you for your patience**



# 1. What is 3D Photography and what is it good for ?

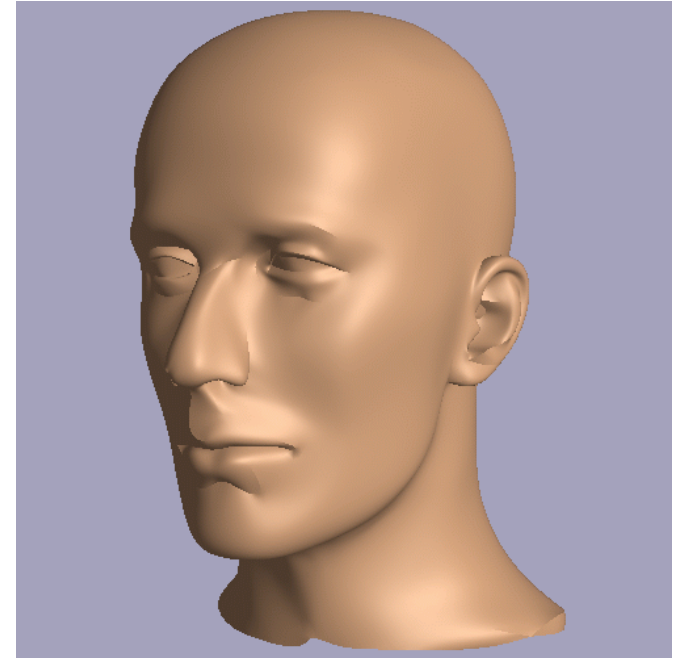
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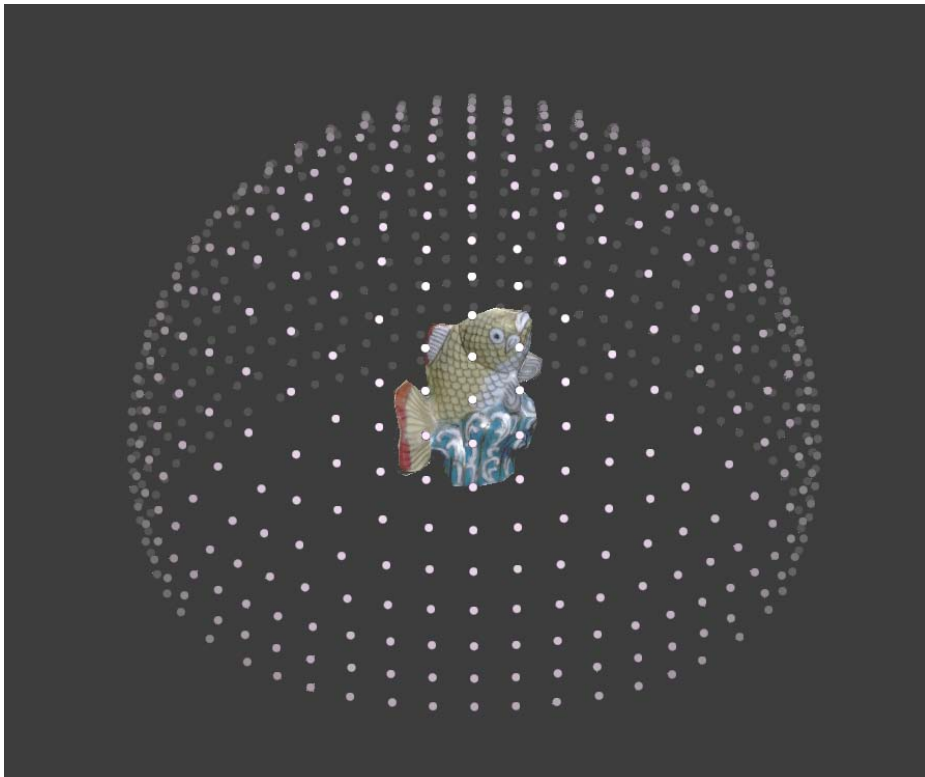
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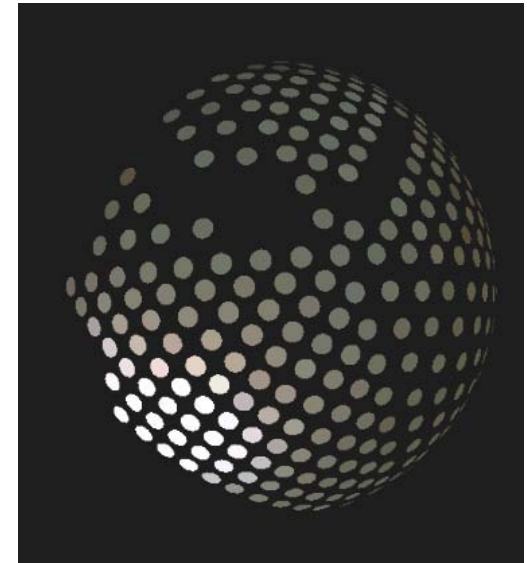
Camera positions

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Standard compression methods not applicable
- Real time rendering non-trivial
- Interesting mathematical / statistical problems: smoothing and approximation on general manifolds

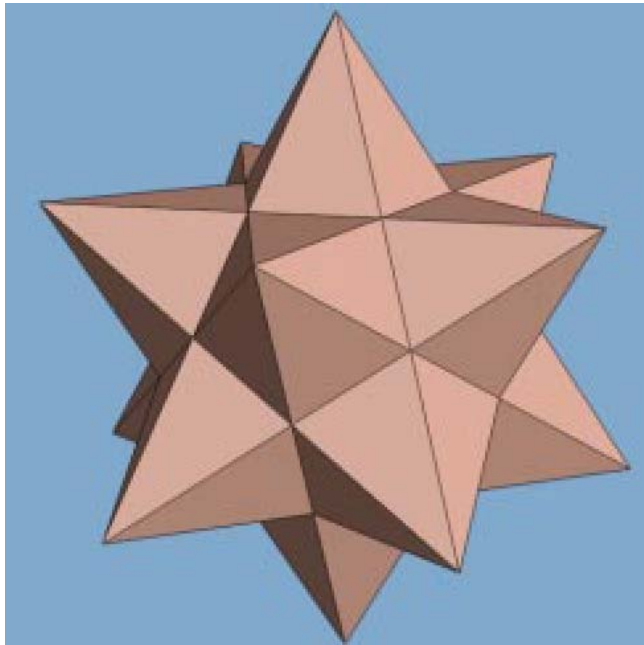
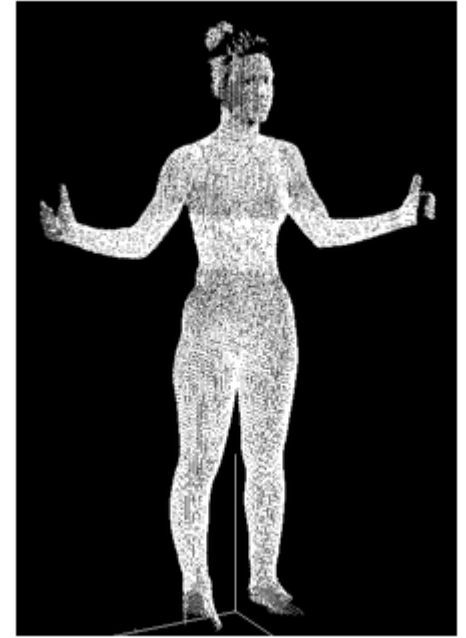


**Data lumispere: observed direction - color pairs for single surface point**



## How would a mathematician think about

- The surface of a 3D object is a 2D manifold
- “Color” is a function assigning a 3D vector (RGB) to each point on a 2D manifold
- “Luminance”



# 3. Casting 3D photography into the language of Mathematics and Statistics

## Why bother ?

- Computer Scientists, Mathematicians, and Statisticians have a different ways of thinking about problems.
- Each discipline has evolved its own set of abstractions and created its own sets of tools.
- Casting 3D photography into the language of Mathematics and Statistics allows us to bring to bear the tools of these fields.
- Thinking about 3D photography in mathematical or statistical terms might suggest interesting research problems in those fields - in fact it has.
- For the individuals involved, broadening the view has proven intellectually stimulating as well as enjoyable.

Will try to illustrate these points using a few examples.