

# Point-Sampled Shape Representations

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## Why Point-Based Graphics ?

- simplicity
- generality
- flexibility
- efficiency ?
  - point- vs. splat-approximation
  - GPU processing
- quality ?

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## You are here ...

- 1.) Science
- ...
  - 1.1.) Computer Science
  - ...
    - 1.1.1.) Computer Graphics
    - ...
      - 1.1.1.1.) Point-based Graphics
        - 1.1.1.1.1.) Point-based Rendering Technology
        - 1.1.1.1.2.) Point-based Geometry Processing

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## Overview

- point-based representations
  - shape approximation
  - surface topology
- octree point clouds
- optimized splat subsampling

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## Point-Based Approximation

• what is the approximation power ?

error =  $O(h^2)$

polygons

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## Point-Based Approximation

• what is the approximation power ?

error =  $O(h)$

points

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## Point-Based Approximation

- what is the approximation power ?

error =  $O(h^2)$

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## Point-Based Approximation

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## Point-Based Approximation

- what is the required precision ?

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## Point-Based Approximation

- what is the required precision ?

- Points : precision =  $O(\text{ sampling density })$   
number =  $O(\text{ surface area })$
- Splats : precision =  $O(\text{ sampling density}^2)$   
number =  $O(\text{ surface curvature })$

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## Consequences

- pure point-based representations
  - insufficient object space approximation power
  - screen-space dependent sampling resolution
  - screen-space dependent sampling resolution
  - forward mapping techniques independent from scene complexity ?!
  - efficient culling and adaptive super-sampling techniques required

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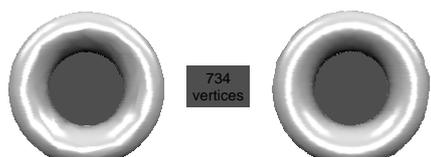
## Consequences

- splat-based representations are (as least) as powerful as polygon meshes
  - locally optimal linear approximation (ellipses)
  - added flexibility („ $C^{-1}$ “)
  - sharp features can be represented (splat clipping)

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## Point-Based Surface Topology

- manifold surfaces are at least  $C^0$
- locally independent approximation yields  $C^1$
- visual *continuity* through overlapping splats (object vs. image space)
- visual *smoothness* through normal blending
- topology information embedded in a point cloud ?

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## Point-Based Surface Topology

- $\epsilon$ -neighborhood
  - symmetric, non-manifold, uniform
  - super-linear complexity
- uniform sampling vs. „ $r$ -sampling“
  - geometrical precision
  - topological precision
- k-nearest neighborhood
  - asymmetric, non-manifold, adaptive
  - linear complexity

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## Overview

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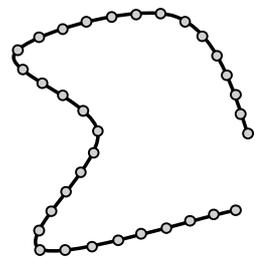
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## Point Clouds

- piecewise constant approximation
  - sampling resolution :  $h$
  - $O(h^2)$  sample points
  - $3 * \log(h)$  bits per sample
  - total complexity  $O(h^2 * \log(h))$
  - can we obtain  $O(h^2)$  total complexity ?

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## Point Clouds



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### Point Clouds

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### Point Clouds

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### Octree Point Clouds

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### Octree Point Clouds

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### Octree Point Clouds

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### Octree Point Clouds

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### Zero Tree Coding

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### Zero Tree Coding

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### Zero Tree Coding

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### Zero Tree Coding

$O(h^3)$

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### Zero Tree Coding

$O(h^2)$

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### Octree Point Clouds

- storage per point
  - $8/4 + 8/16 + \dots = 8/3 = 2.67$  bit (*uncompressed*)
  - 1.00 – 1.50 bit (*entropy encoded*)
- resolution independent :  $O(h^2)$ 
  - coarser octree levels encode *many* samples
- fast rendering by octree traversal
  - 4 scalar additions and 2 divisions per point
- level of detail representation

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### Octree Traversal

- fixed translation vectors for cell centers



Level i



Level i-1

$$d_{i,j} = \begin{pmatrix} +1 \\ \pm 1 \\ +1 \end{pmatrix}$$



### Octree Traversal

- leaf node centers

$$p = c + \sum_{i=1}^k d_{i,j_i}$$

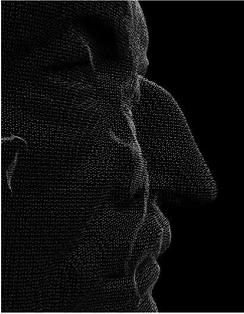
- modelview + viewport transformation

$$Mp = Mc + \sum_{i=1}^k Md_{i,j_i} = c' + \sum_{i=1}^k d'_{i,j_i}$$

- incremental summation during traversal



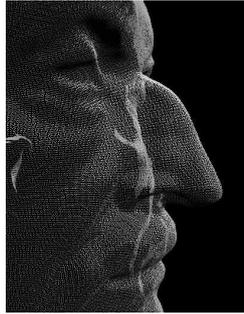
### Level of Detail



8 octree levels  
compression factor  
 $\approx 1:24$



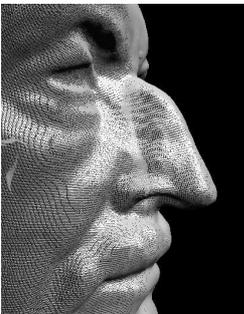
### Level of Detail



9 octree levels  
compression factor  
 $\approx 1:27$



### Level of Detail



10 octree levels  
compression factor  
 $\approx 1:30$

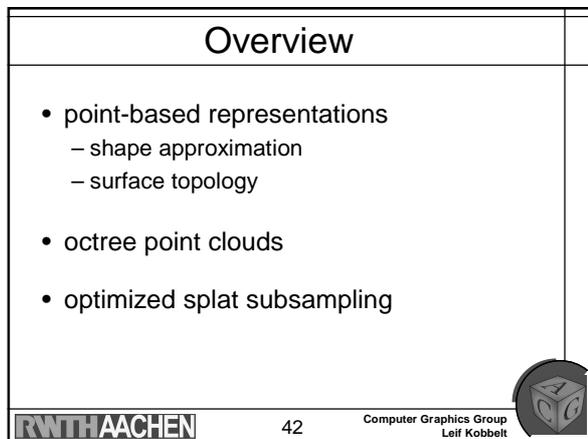
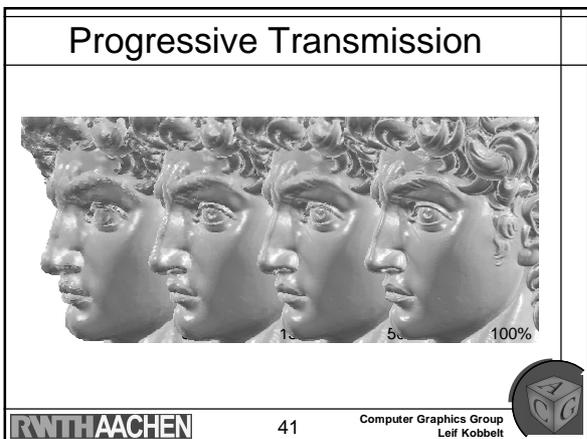
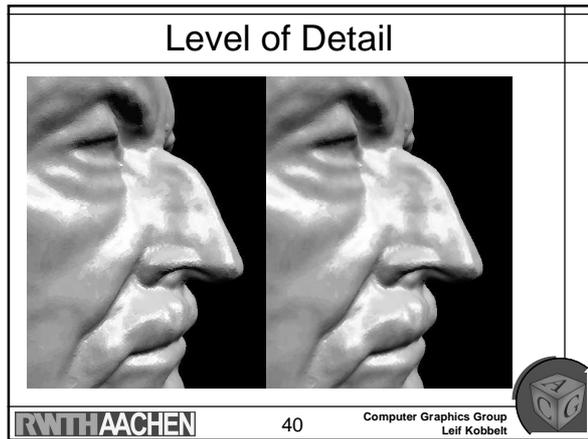
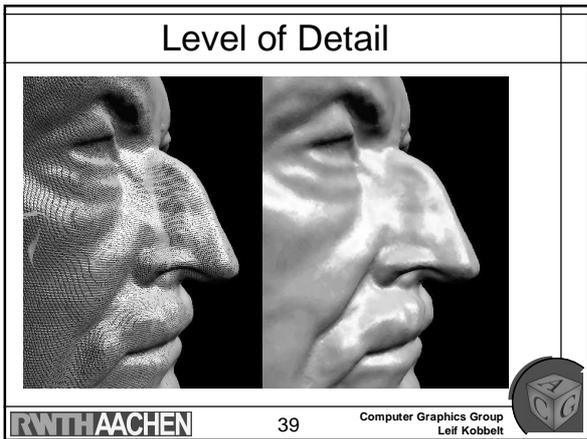
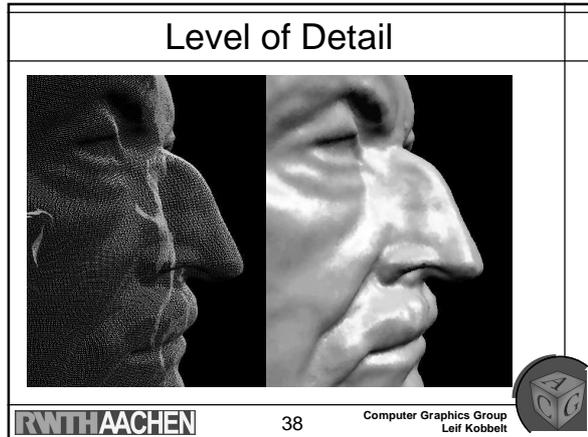
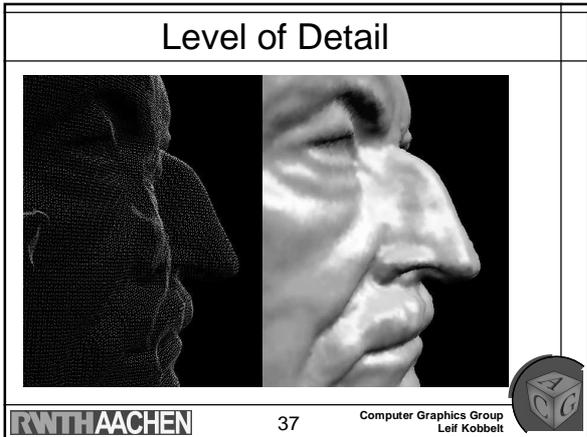


### Level of Detail



11 octree levels  
compression factor  
 $\approx 1:33$





### Problem Specification

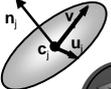
- given:
  - sample points  $\mathbf{p}_i$  on a surface
  - approximation tolerance  $\epsilon$



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### Problem Specification

- given:
  - sample points  $\mathbf{p}_i$  on a surface
  - approximation tolerance  $\epsilon$
- find:
  - minimal set of elliptical splats  $S_j = (\mathbf{c}_j, \mathbf{u}_j, \mathbf{v}_j)$
  - all samples within  $\epsilon$
  - no holes
  - most regular splat distribution




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### Approximation Error

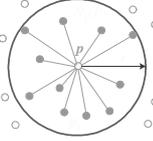
- distance of a sample point to a set of splats  
*(minimum projected distance)*
- replace each splat by an  $2\epsilon$ -cylinder
- splat overlap in object space ?
  - union of solids
  - projected overlap



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### Surface Structure

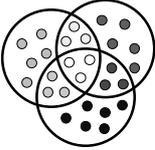
- surface samples  $\mathbf{p}_i$
- k-nearest neighbor graph  $N(i,j)$
- estimated normals  $\mathbf{n}_i$
- surface area element  $\omega_i = r^2$
- splats  $S_j$
- coverage relation  $C(i,j)$
- surface patches  $P_j = C(*,j)$




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### Surface Structure

- surface samples  $\mathbf{p}_i$
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### Our Approach ...

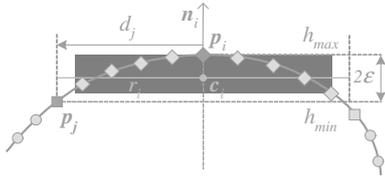
- sub-problems ...
  - global error control
  - prevent holes
  - optimal splat distribution
- techniques ...
  - one-sided Hausdorff distance (splat generation)
  - discrete coverage estimation (set operations)
  - global relaxation (better than greedy)



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## Splat Generation

- grow a *candidate* splat for each point  $p_i$ 
  - no least squares fitting (fixed normal, maximum deviation)



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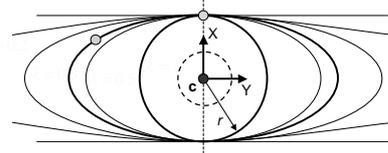
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## Splat Generation

- grow a *candidate* splat for each point  $p_i$ 
  - no least squares fitting (fixed normal, maximum deviation)
  - align elliptical splats to principal directions



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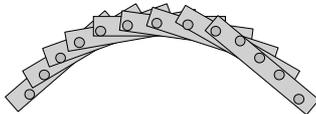
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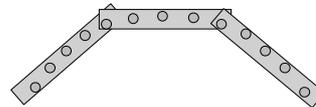
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## Splat Generation

- grow a *candidate* splat for each point  $p_i$ 
  - no least squares fitting (fixed normal, maximum deviation)
  - align elliptical splats to principal directions
  - each selection satisfies error threshold



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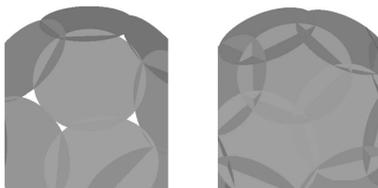
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## Coverage Estimate

- each sample has to be assigned to a splat
- guarantee sufficient overlap



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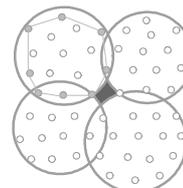
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## Coverage Estimate

- each sample has to be assigned to a splat
- guarantee sufficient overlap
- modified coverage relation  $C'(i,j)$



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## Coverage Estimate

- each sample has to be assigned to a splat
- guarantee sufficient overlap
- modified coverage relation  $C'(i,j)$
- set operations:
  - check if *active* splats cover all samples
- complexity depends on
  - number of active splats
  - number of input samples

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## Greedy Selection

- any selection of candidates satisfies the error tolerance
- find a selection that covers all points
- greedy selection
  - largest un-covered patch

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## Global Relaxation

- optimize splat distribution
- two set-operations ...
  - minimize overlap
  - remove redundant splats
- preserve coverage (*local updates only*)
  - kernel of a splat  $K_j \subseteq P_j$
- iterate over all splats

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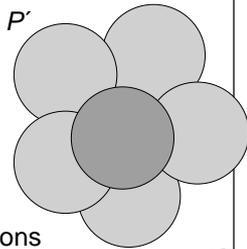
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## Minimize Overlap

- replace a splat  $P_j$  by one of its  $k$ -nearest neighbors  $P'$
- minimize overlap with nearby active splats
- preserve full coverage (kernel  $K_j$ )
- simple local set operations



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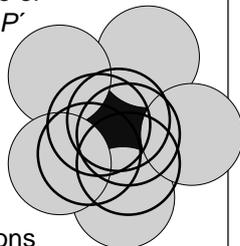
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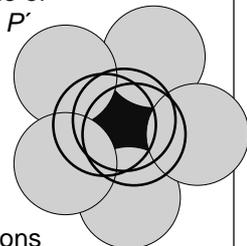
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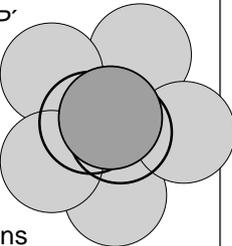
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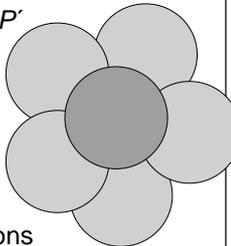
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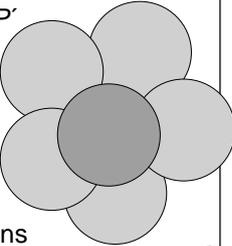
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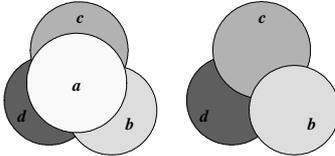
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### Remove Redundant Splats

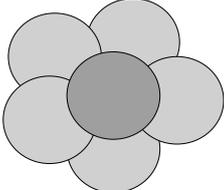
- greedy selection causes redundancy
- remove and re-distribute neighboring active splats



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### Remove Redundant Splats

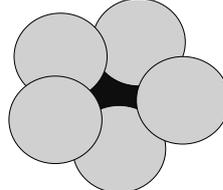
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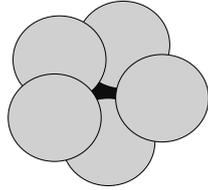
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## Remove Redundant Splats

- greedy selection causes redundancy
- remove and re-distribute neighboring active splats



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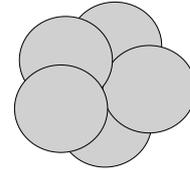
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## Remove Redundant Splats

- greedy selection causes redundancy
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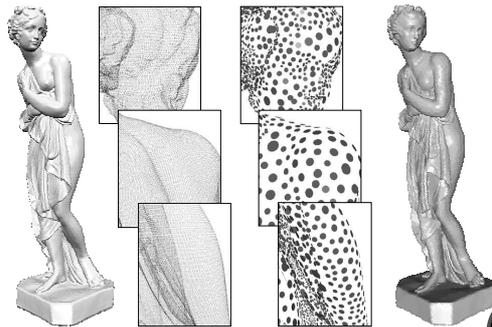
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## Examples



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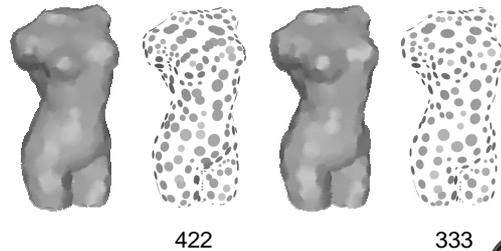
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## Examples

input 170K error 0.47 %



422

333

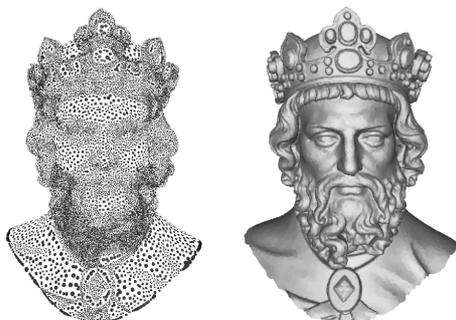
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## Examples



600K  
66K  
0.03%

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## Comparison

- greedy vs. global relaxation



734, 0.29 %

493, 0.29 %

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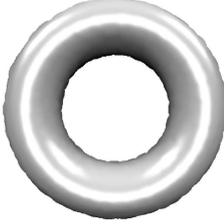


### Comparison

- splats vs triangles



734 triangles

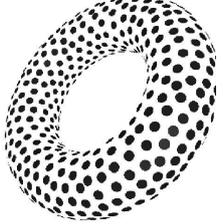


734 splats

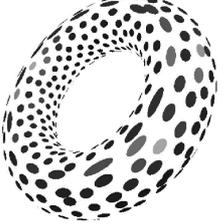
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### Comparison

- circular vs. elliptical splats



734, 0.2 %



510, 0.2 %

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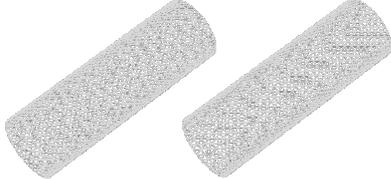

### Advantages

- exploit full flexibility of splat representations (k-nearest neighbors)
- global relaxation leads to better results than greedy selection
- take full splat geometry into account, not just the centers

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### Visual Approximation Quality

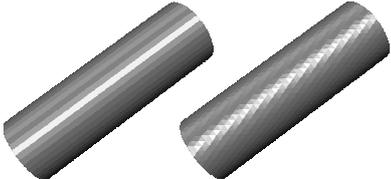
- approximate normal vectors
- known problem of polygons



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### Visual Approximation Quality

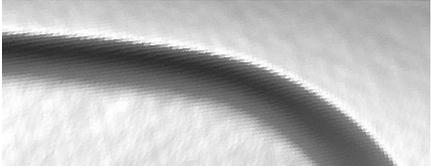
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### Visual Approximation Quality

- approximate normal vectors
- known problem of polygons



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## Visual Approximation Quality

- approximate normal vectors
- known problem of polygons  
(where phong shading doesn't help)



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## Phong Splatting

- splat  $S_j = (\mathbf{c}_j, \mathbf{u}_j, \mathbf{v}_j, \mathbf{n}_j, \alpha_j, \beta_j, \text{rgb}_j)$
- $(\mathbf{c}_j, \mathbf{u}_j, \mathbf{v}_j)$  obtained by least squares  
– tangents aligned to principal directions
- $(\mathbf{n}_j, \alpha_j, \beta_j)$  obtained by least squares  
– w.r.t. splat parametrization  
– normal vector length doesn't matter

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## Examples



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## Examples



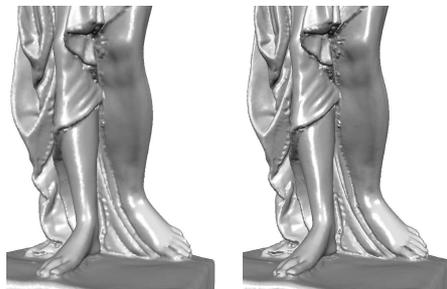
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## Examples



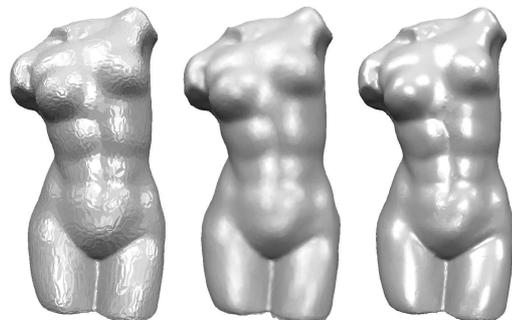
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## Comparison

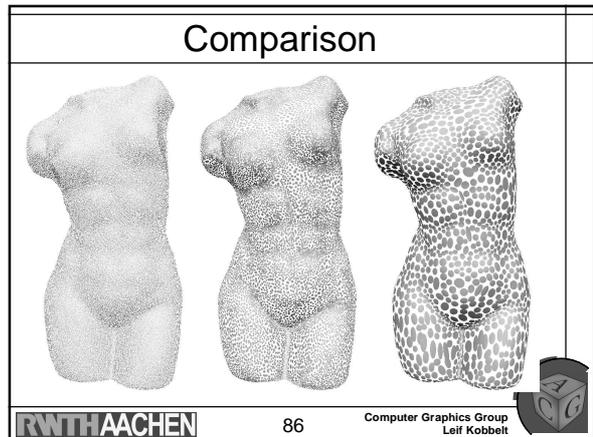
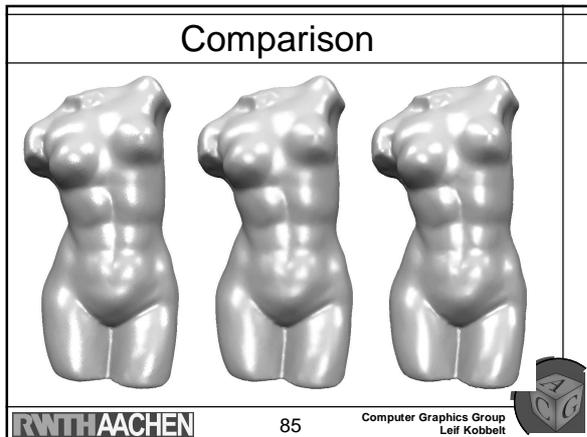


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- ### Overview
- point-based representations
    - shape approximation
    - surface topology
  - octree point clouds
  - optimized splat subsampling
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- ### Conclusions
- point-based representations
    - good for screen space blending
    - view-independent sampling causes redundancy
    - hierarchical octree representation
  - splat-based representation
  - performance ???
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- ### Conclusions
- point-based representations
  - splat-based representation
    - same approximation *order* as polygons
      - ellipses approximate better than triangles
      - overlap more flexible than manifold consistency
    - sharp corners
    - high quality rendering
  - performance ???
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- ### Conclusions
- point-based representations
  - splat-based representation
  - performance ???
    - phong splatting improves visual quality and allows for sparser representations
    - why is the polygon rate still higher than the splat rate ?
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