

# Quantification of gaseous structures with volumetric reconstruction from visual hulls

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# Introduction

- Methane gas ( $\text{CH}_4$ ) one of the most harmful greenhouse gases
- Increasing emissions of  $\text{CH}_4$  from landfills/municipal waste (3%-19% of amounts of anthropogenic sources world wide)
- Fixed point measurements
- Limited accuracy



# Background

- Quantitative volumetric quantification is difficult with existing fixed point measuring techniques
- Special-purpose IR imaging can make gas plums visible in 2D images (Åhlén et al., 2010)
- Goal: Estimation of 3D volumes from 2D camera images



# Related work

Multi-View Geometry (Hartley&Zisserman, 2003)

Visible surface triangulation from point clouds

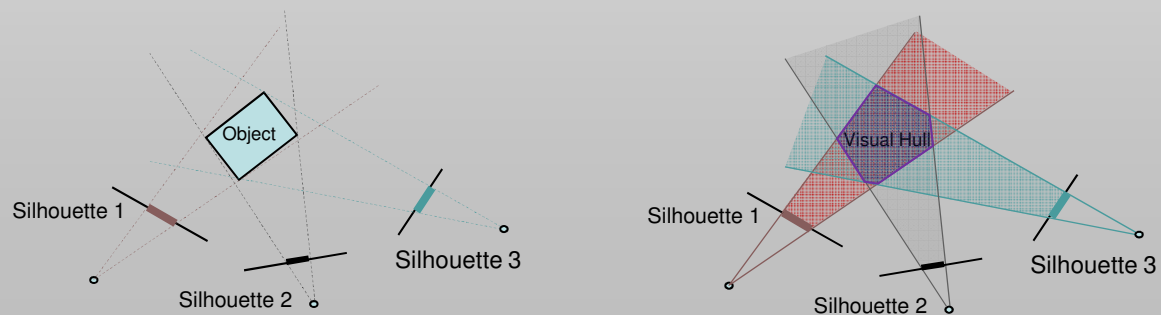
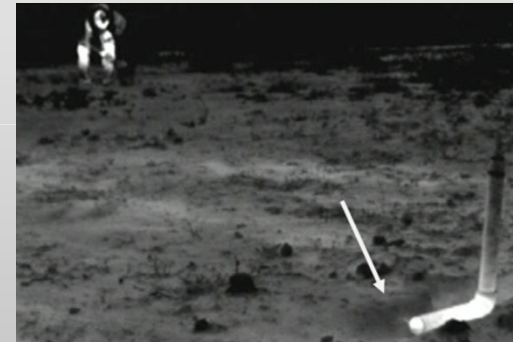
Point correspondences are used to determine camera relations needed for 3D triangulation

Shape-from-Silhouette based 3D reconstruction (space carving)

The Visual Hull concept (Laurentini,1997)

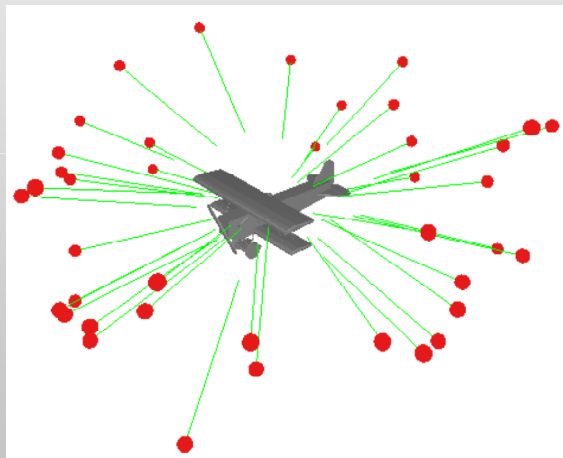
2D silhouette and camera parameters define a general cone in 3D

Intersection volume of several cones forms the visual hull

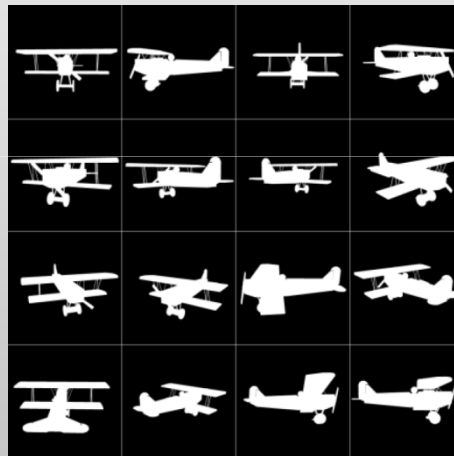


# Visual Hulls - Properties

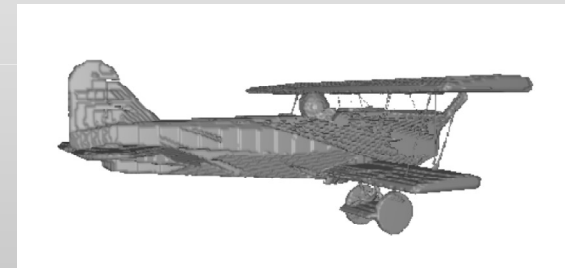
## Quality of Visual Hull reconstruction



40 randomly chosen camera positions



16 binary silhouettes



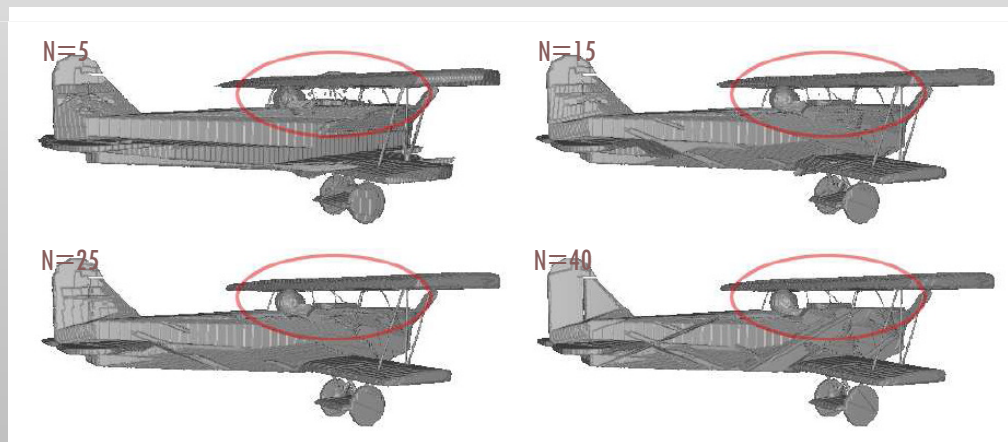
3D reconstruction result using a  $512^3$  voxel grid

# Visual Hulls - Properties

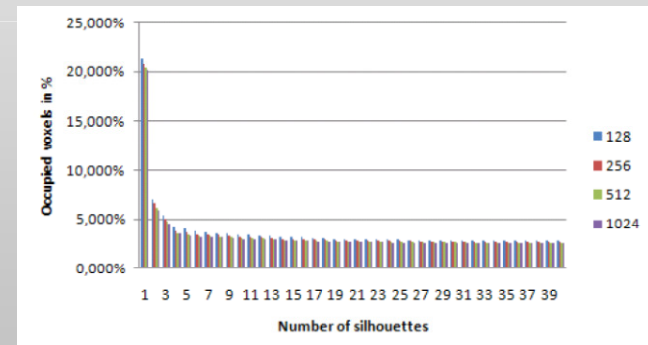
## Quality of Visual Hull reconstructions (Fredriksson 2011)

Salient visual artifacts exist for 40 and more silhouettes

Volume converges rather quickly – but unknown ground truth



Reconstruction results for different number N of silhouette images



Percentage of occupied voxels using a  $512^3$

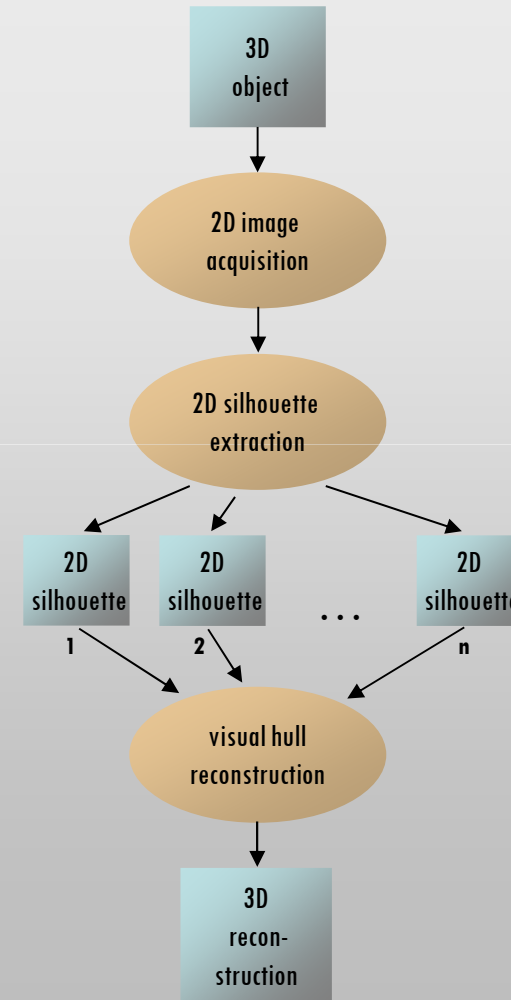
# Visual Hulls for Volume Estimation

## Estimation Volume of Gaseous Structures

- Visual quality is not important
- Visual details contribute little to volume

## Research objective:

Identifying the sources of variation in measurement



# Visual Hulls for Volume Estimation

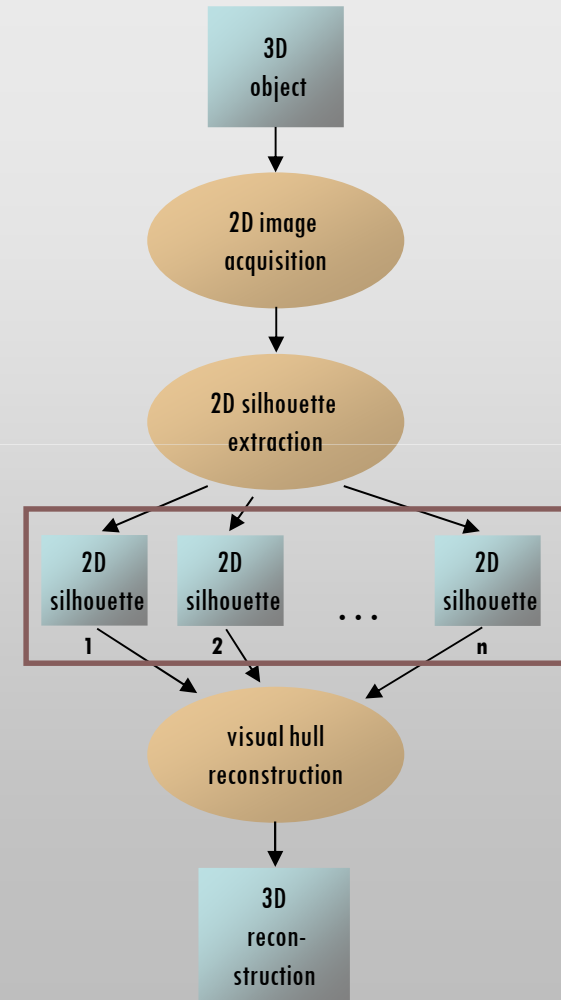
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## Research objective:

Identifying the sources of variation in measurement

a) Number of camera views (practically limited)





# Visual Hulls for Volume Estimation

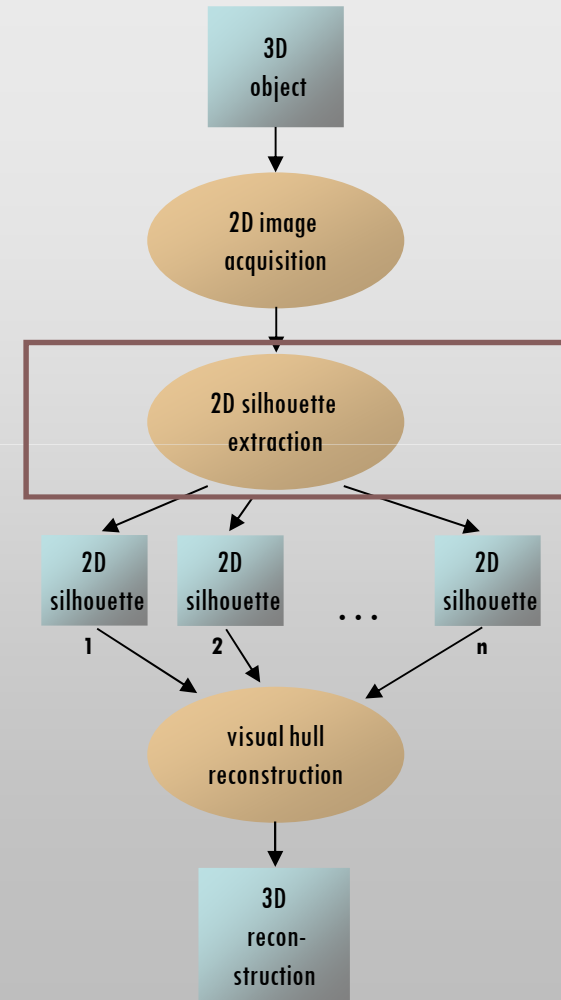
## Estimation Volume of Gaseous Structures

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Identifying the sources of variation in measurement

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- b) Variation of silhouette extraction (segmentation accuracy)



# Visual Hulls for Volume Estimation

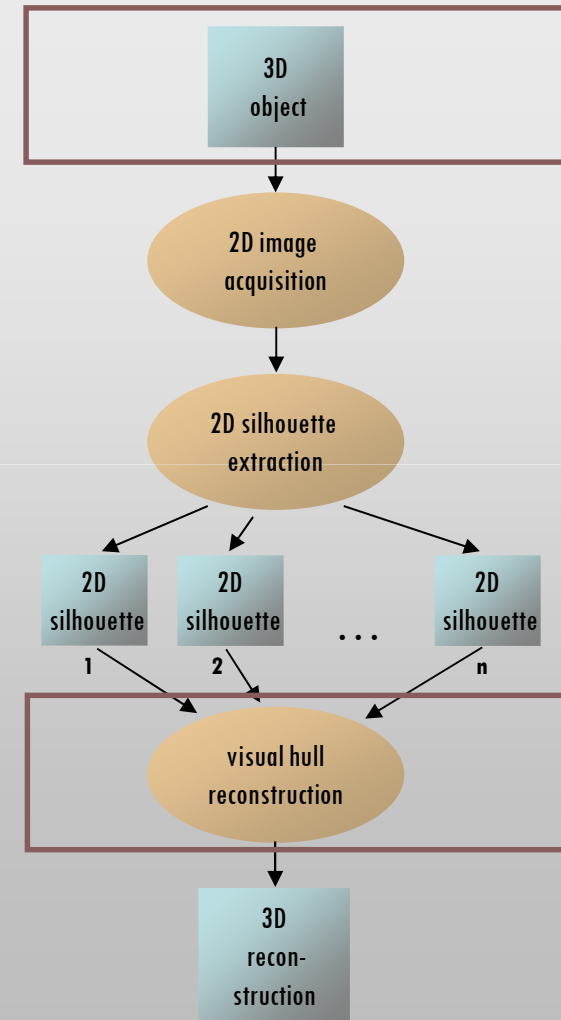
## Estimation Volume of Gaseous Structures

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## Research objective:

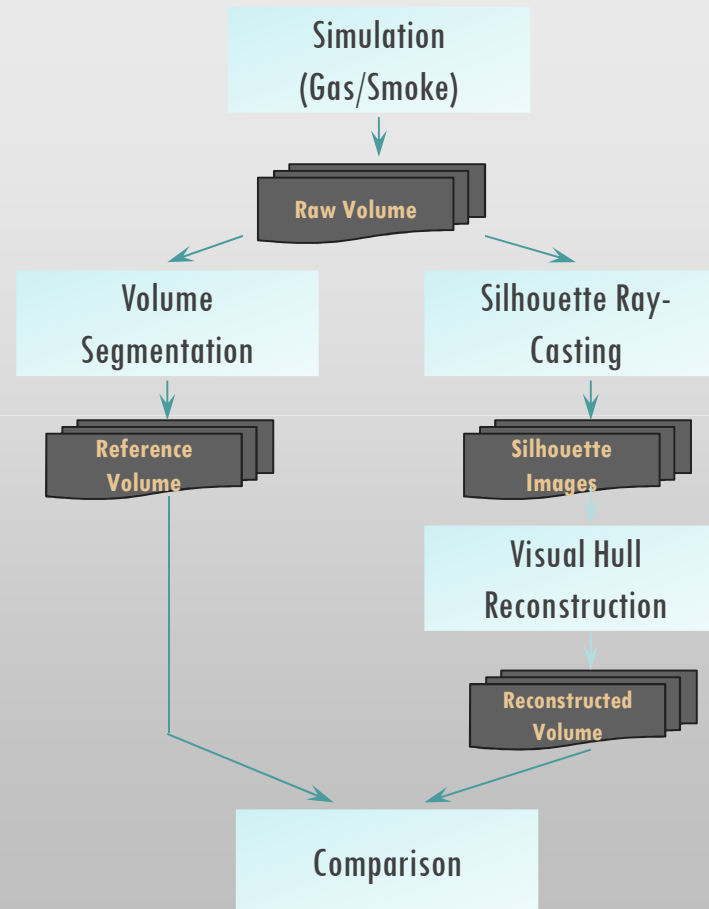
Identifying the sources of variation in measurement

- a) Number of camera views (practically limited)
- b) Variation of silhouette extraction (segmentation accuracy)
- c) Base-line bias/offset (depending on object structure)



# Evaluation Method

## General Approach



# Evaluation Method

## Ground Truth Data Generation:

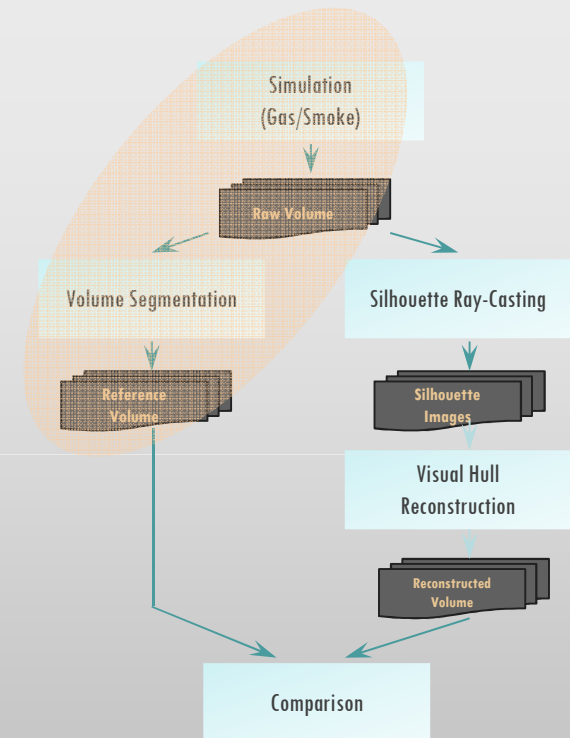
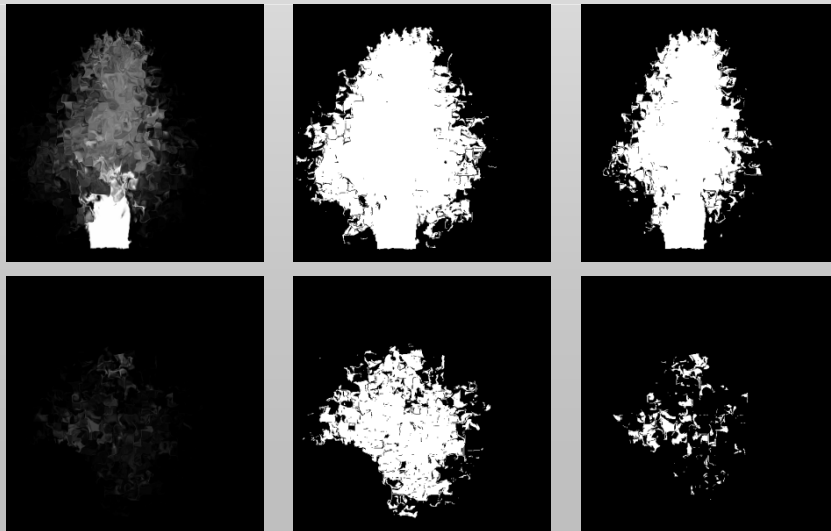
Wavelet Turbulence Simulation (Kim et al., 2008)

We used source-code at <http://www.cs.cornell.edu/~tedkim/wturb/source.html>

Naïve implementation and randomly sampling volumes from a time series

Volume size:  $512^3$  size, scalar data

Segmentation using thresholds  $t$  ranging between 1% - 40%



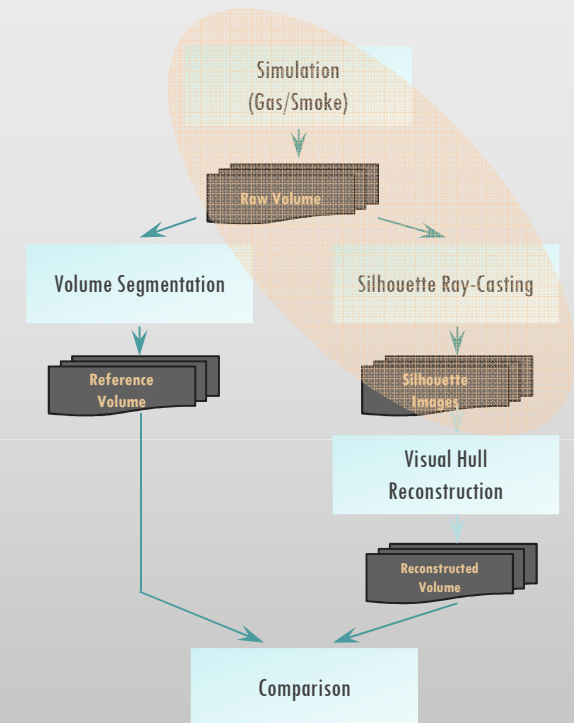
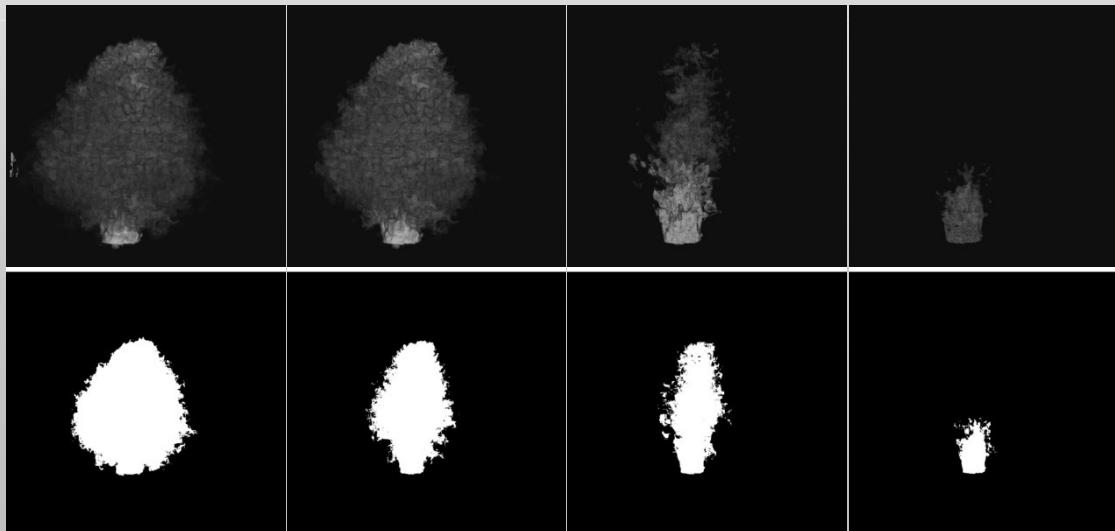
# Evaluation Method

## Controlled Silhouette Generation:

Synthetic data + Synthetic camera → Control of image formation process

GPU-Based Volume Ray-Caster

Renders volume binary silhouettes based on same classification criteria



# Evaluation Method

## Visual Hull Reconstruction:

GPU-based, multi-pass render algorithm

Slice-by-slice reconstruction of volume

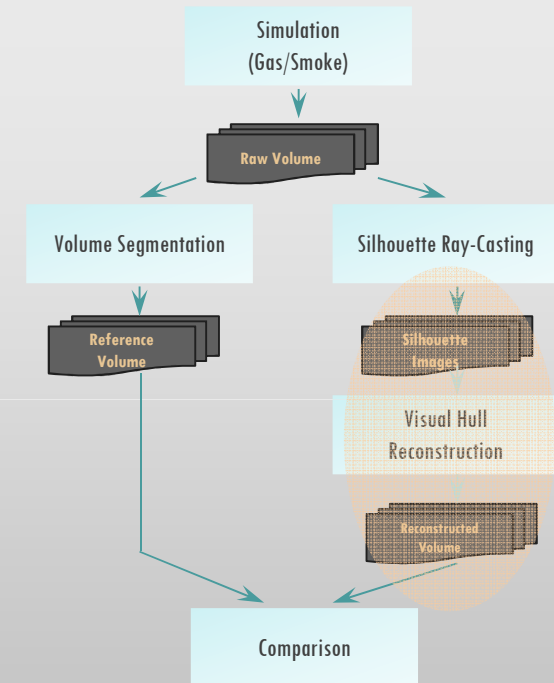
Use 2D projective texture mapping to render silhouettes

Stencil-buffer used to count region overlap

Transfer render buffer to 3D volume data

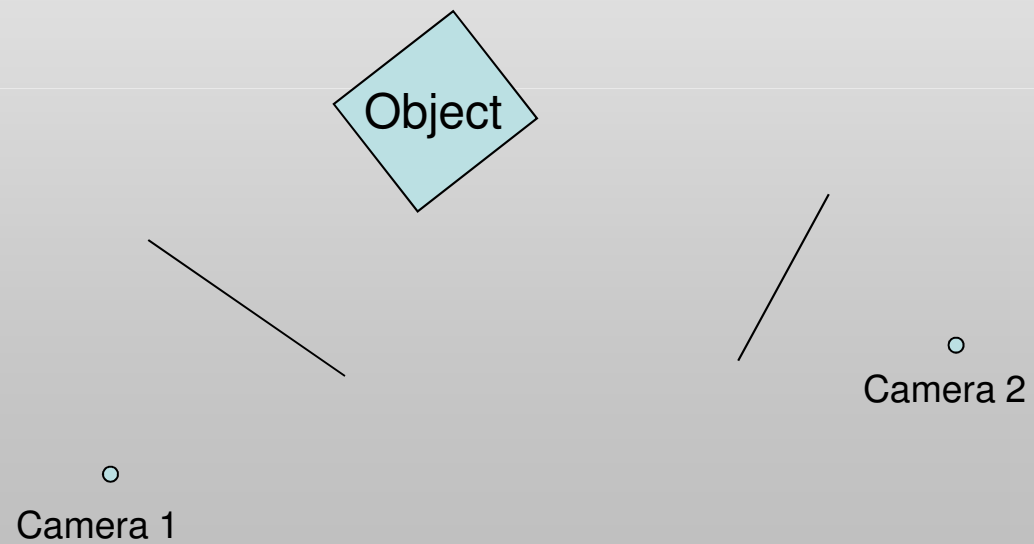
$Z$  Rendering passes for a volume of size  $x * y * z$  voxels

$n$  screen filling polygons per pass for  $n$  different silhouettes



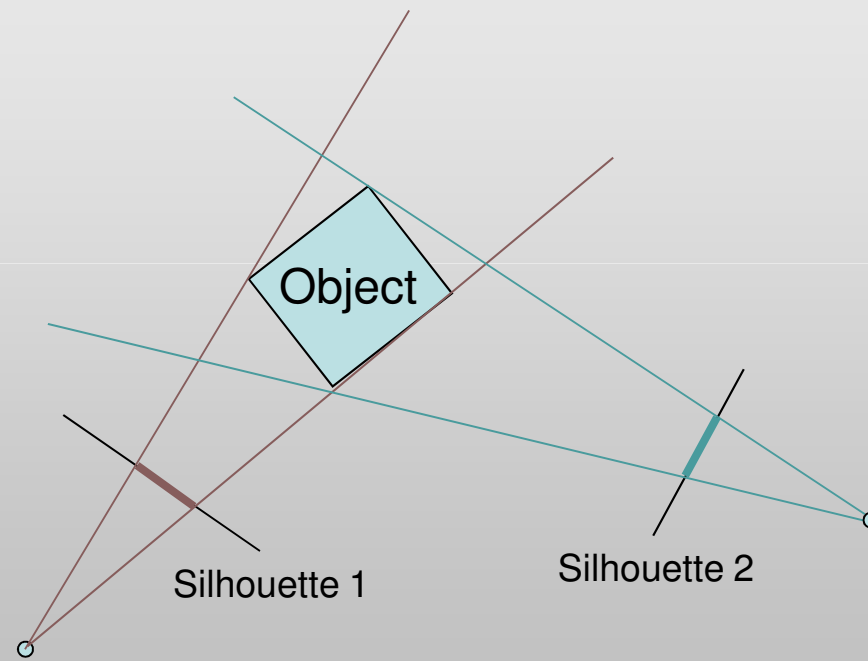
# Implementation of VH algorithm

## 1. Silhouette acquisition (here 2 views only)



# Implementation of VH algorithm

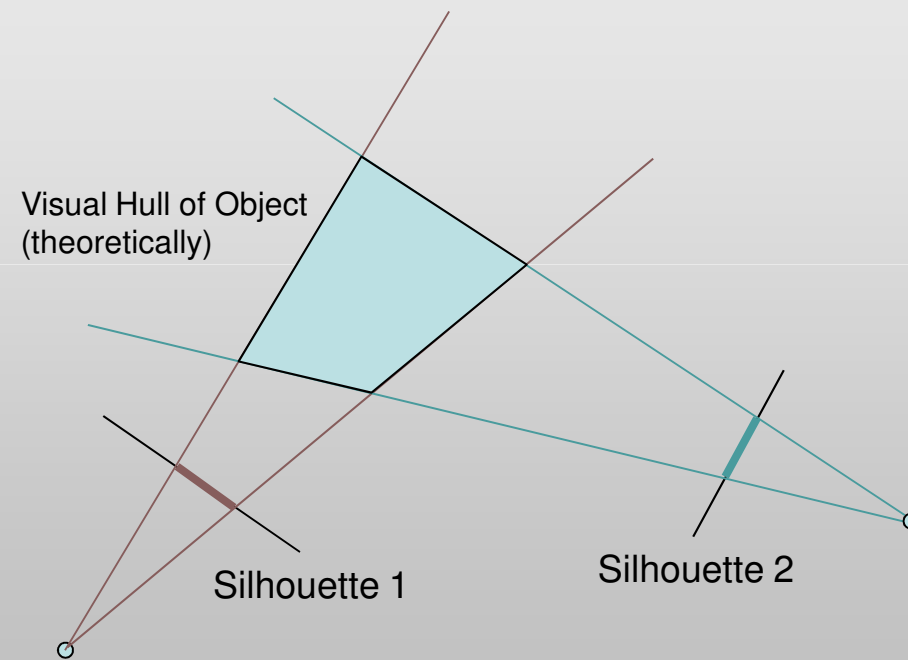
## 1. Silhouette acquisition (here 2 views only)





# Implementation of VH algorithm

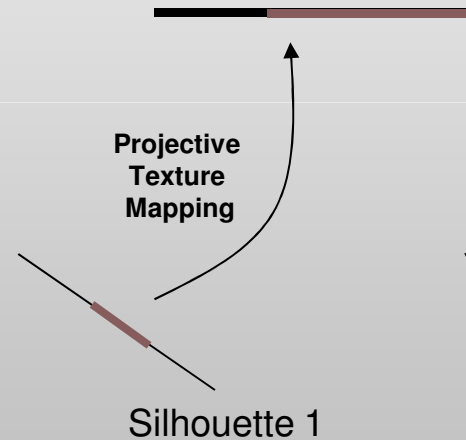
## 2. The Visual Hull (Analytical Result)



# Implementation of VH algorithm

## 3. Volumetric Reconstruction

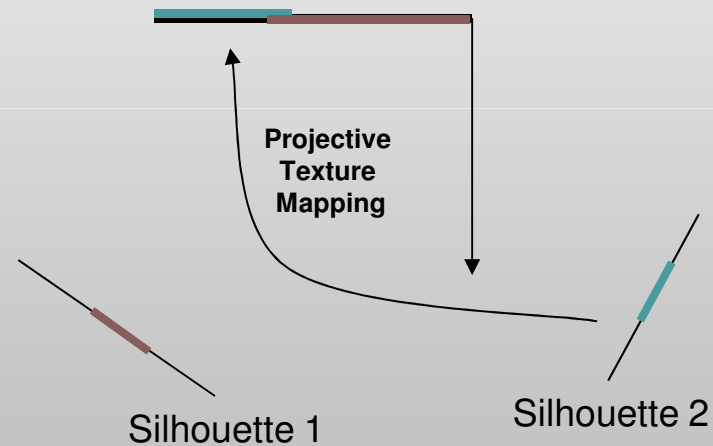
- Render Screen Filling Quads
- Project silhouette 1 on quad



# Implementation of VH algorithm

## 3. Volumetric Reconstruction

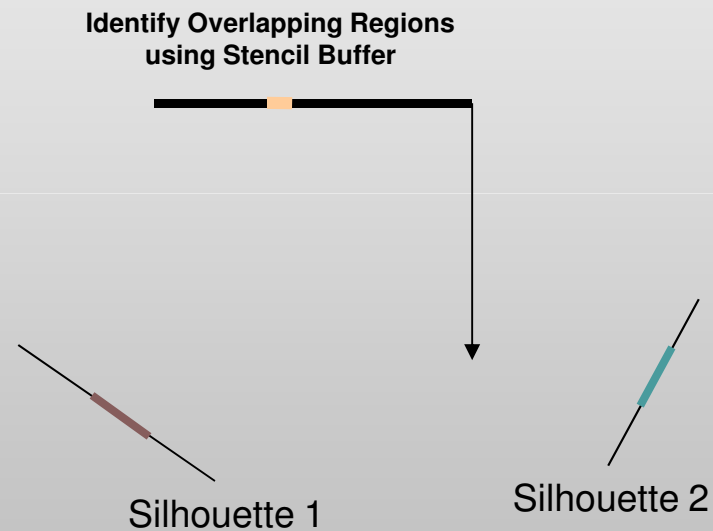
- Render Screen Filling Quad
- Project silhouette 1 on quad
- Project silhouette 2 on quad



# Implementation of VH algorithm

## 3. Volumetric Reconstruction

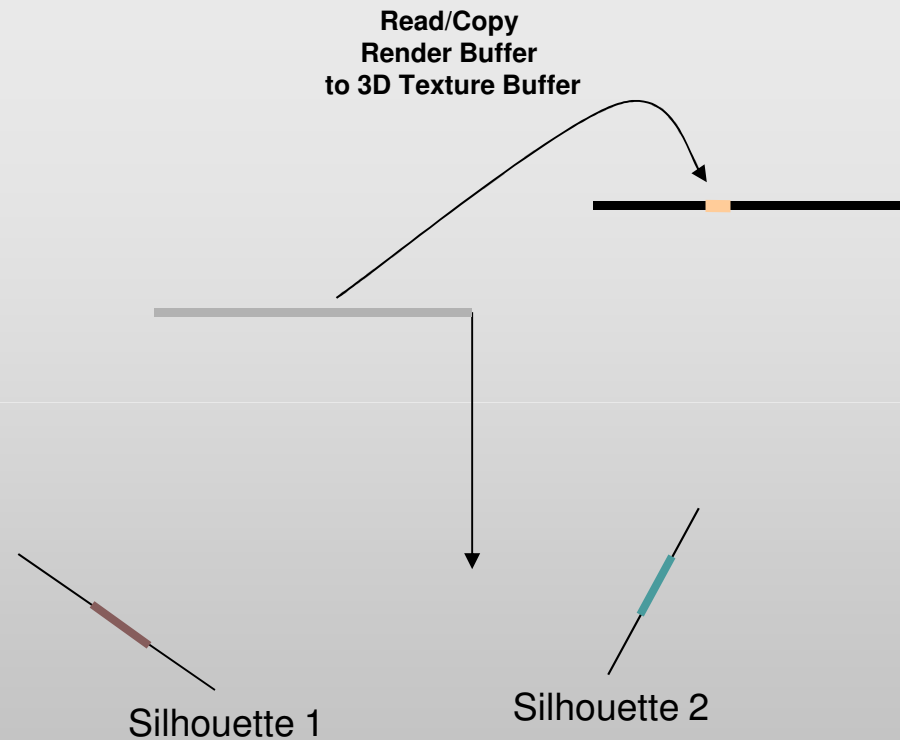
- Render Screen Filling Quad
- Project silhouette 1 on quad
- Project silhouette 2 on quad
- Keep only pixels, where all silhouettes have been drawn



# Implementation of VH algorithm

## 3. Volumetric Reconstruction

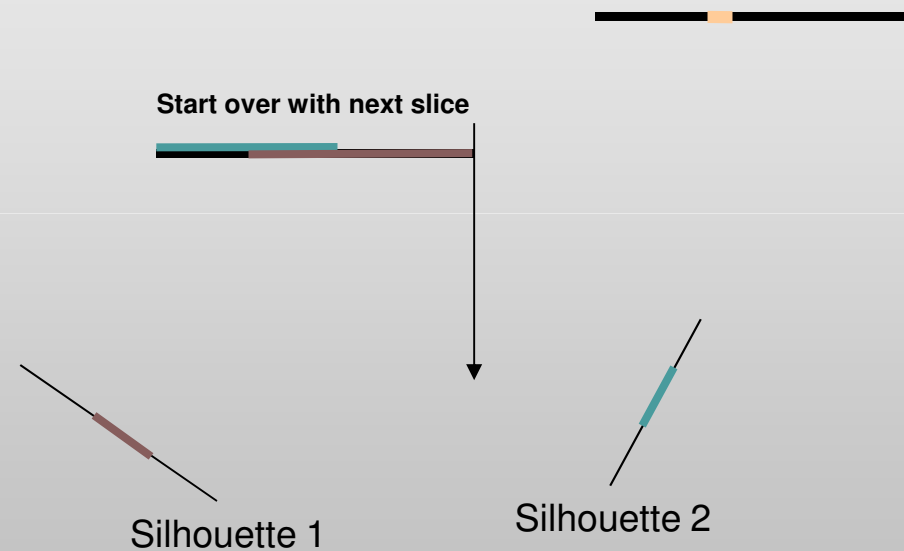
- Render Screen Filling Quad
- Project silhouette 1 on quad
- Project silhouette 2 on quad
- Keep only pixels, where all silhouettes have been drawn
- Save render buffer



# Implementation of VH algorithm

## 3. Volumetric Reconstruction

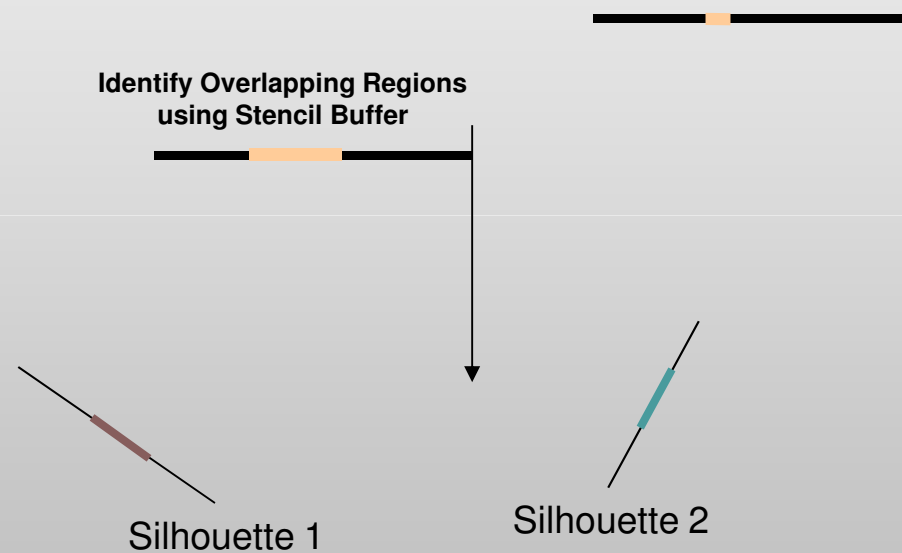
...render next slice/polygon...



# Implementation of VH algorithm

## 3. Volumetric Reconstruction

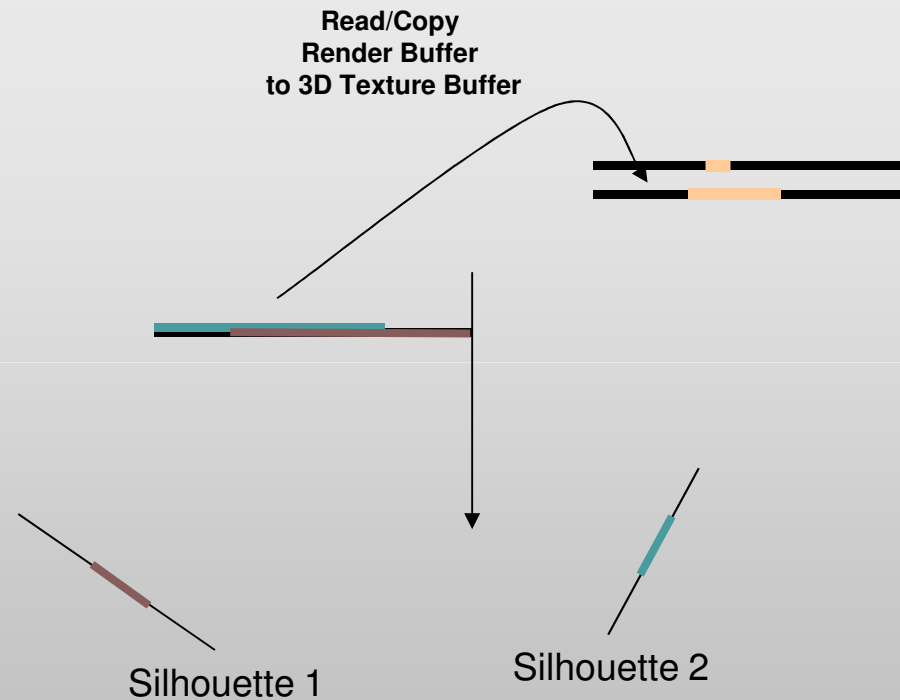
identify overlap...



# Implementation of VH algorithm

## 3. Volumetric Reconstruction

read/copy render buffer  
and render next slice

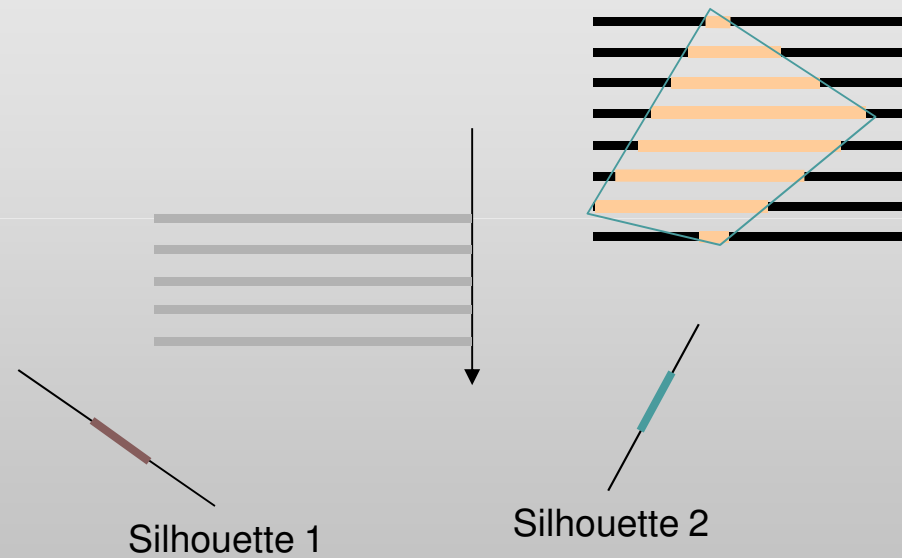




# Implementation of VH algorithm

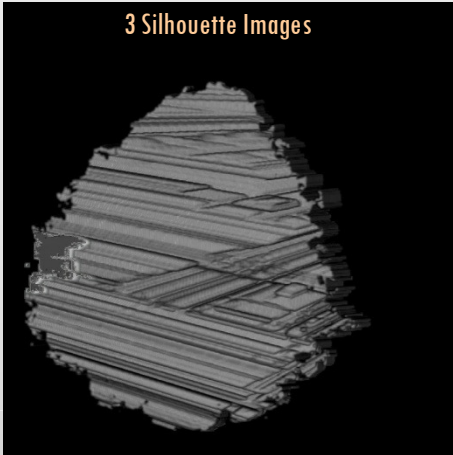
## 3. Volumetric Reconstruction

...repeat for remaining slices...

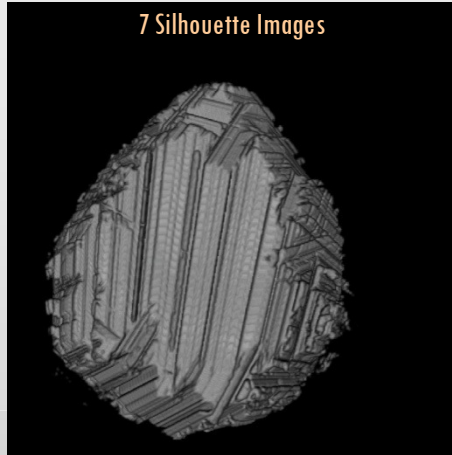


# Results of the Reconstruction

3 Silhouette Images



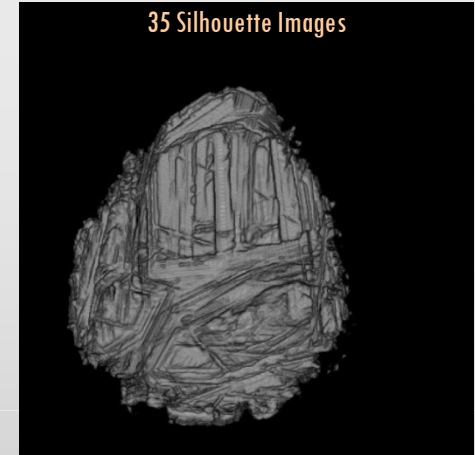
7 Silhouette Images



14 Silhouette Images



35 Silhouette Images



- Reconstruction results for varying numbers of silhouette images
- Segmentation threshold  $t = 1\%$

Ground Truth



# Evaluation

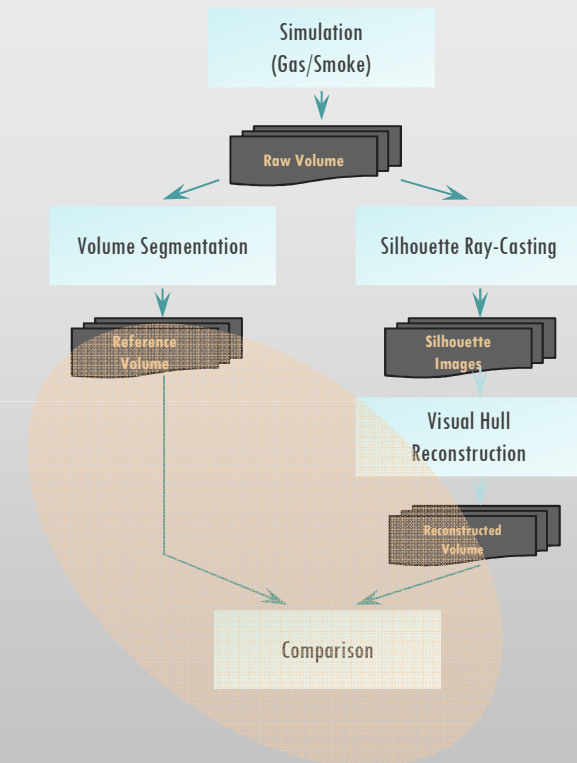
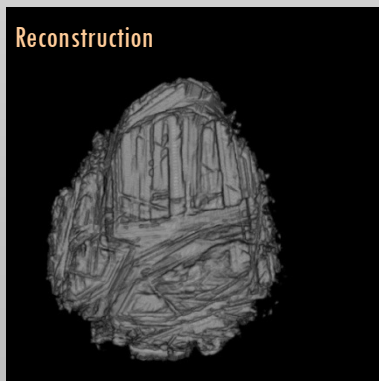
## Volumetric comparison:

Same threshold for ground truth data and silhouette generation

Compare original volume with reconstructed volume

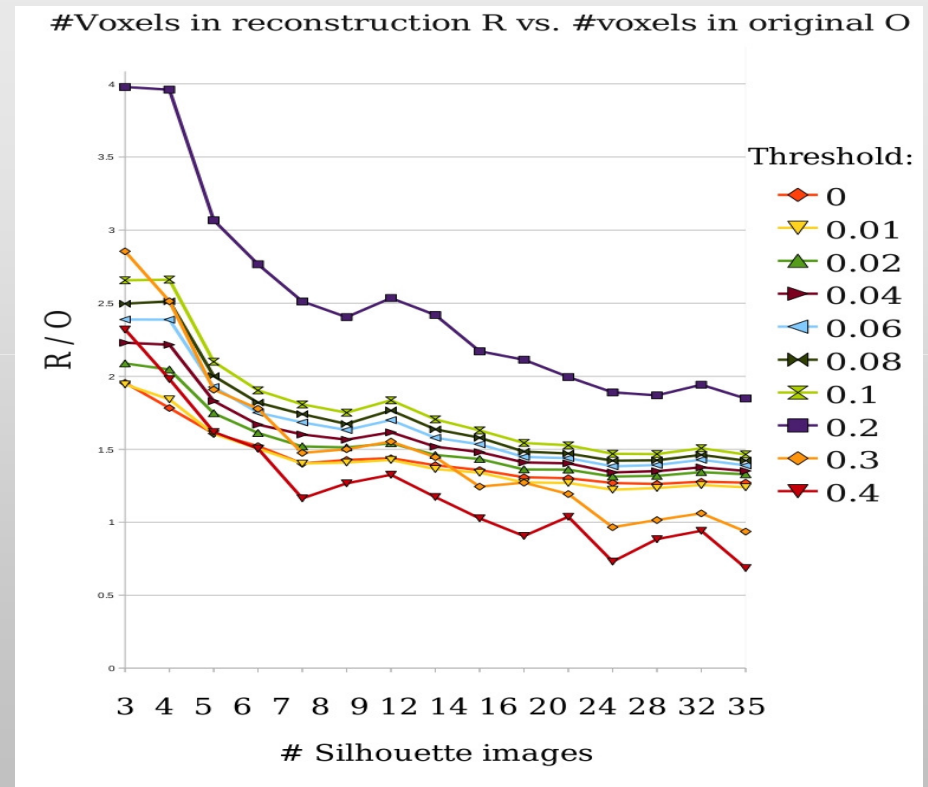
Volumetric enumeration of original  $O$  and reconstruction  $R$

Ratio  $R/O$  for varying  $n$  and  $t$



# Results & conclusions

- Rapidly converging volume size
- Systematic overestimation ( $\sim 150\%$ )
- Segmentation accuracy as important
- 8 camera views seem sufficient for volumetric estimation



# Acknowledgements

**Peter Jenke**, lecturer of computer graphics, for implementation of volumetric smoke simulation and volumetric reconstruction

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**Thank you for your attention!**