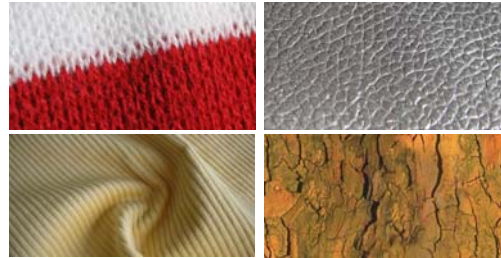


Capturing Reflectance From Theory to Practice

Reflectance Fields for Distant Lights

Gero Müller
University of Bonn

Introduction



- Opaque materials with complex mesogeometry (rough textures)

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Introduction

- Goal
 - Capture „look-and-feel“ of those materials independent of a specific physical object
- Capture appearance from material samples
- Standard: single RGB-image
 - Appearance captured only for one view and one lighting situation
 - Valid only for flat and diffuse materials (paper, cardboard,...)

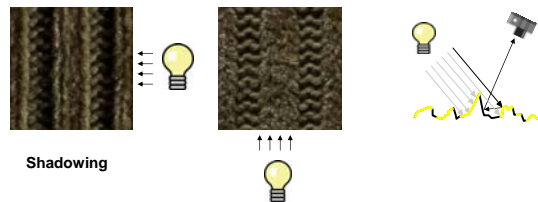


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Introduction

- Images of rough textures with meso-structure contain view- and light dependent shadows, occlusions and local/global illumination effects

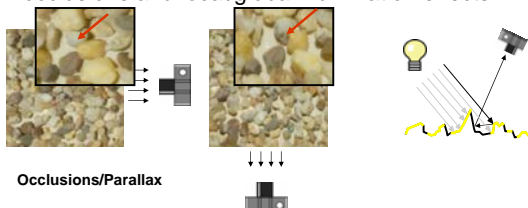


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Introduction

- Images of rough textures with meso-structure contain view- and light dependent shadows, occlusions and local/global illumination effects



Occlusions/Parallax

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Introduction

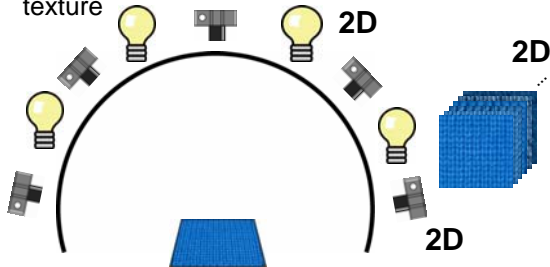
- Lighting distance large compared to extent of material sample
- Materials are applied to opaque physical objects (furniture, walls, car interior, cloth, ...)
- Neglect near-field illumination and explicit light-transport between surface points
- Measure only far-field reflectance field of sample
- Bidirectional Texture Function [Dana et al. 1997]

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Introduction

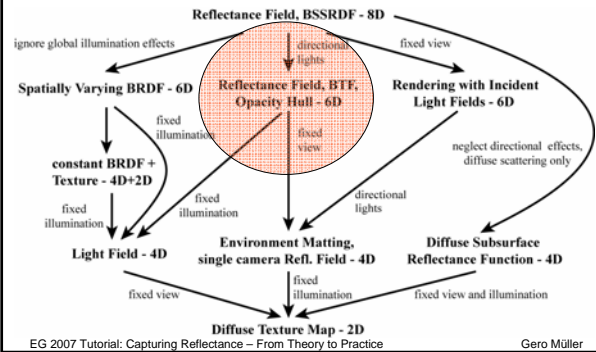
- BTF \Leftrightarrow 6D far-field reflectance field of texture



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Taxonomy



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Overview

- Acquisition
- Compression
- Rendering
- Non-planar objects

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Acquisition

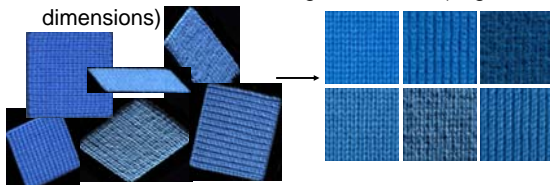


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BTF Acquisition

- Sampling a 6D-function $BTF_{rgb}(\mathbf{x}, \mathbf{v}, \mathbf{l})$
 - Take pictures... (spatial dimension)
 - ...under various view and light directions (angular dimensions)



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Measurement setups

- Gonioreflectometer-like

– Advantages

- fully automatic
- flexible sampling rate

– Problems

- measurement time: ~14h (81x81=6561 images)
- moving parts: camera, light, sample carrier



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Measurement setups

- Using a camera array [Müller et al. 2005]

- Advantages

- fast, parallel ~1 hour (151x151=22501 images)
- no moving parts
- high resolution

- Problems

- fixed angular sampling
- complex control apparatus



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BTF Camera Array

- Custom built hemi-spherical aluminium gantry (80 cm radius) mounted on aluminium base rack
- 151 Canon Powershot A75 digicams (3.2 mpixel)
 - cheapest consumer camera with powerful SDK
 - built-in light source (supports different intensities)
- USB-controllable 160-port relay box for on/off toggling
- Custom built power supply

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Tasks

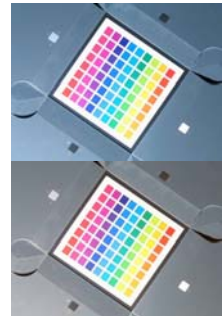
- Synchronized control
 - One camera flashes while all cameras take picture
 - High dynamic range
 - 4 passes with different flash intensities and exposures
 - 8 PCs (~19 cameras/PC)
 - 1 Master PC for synchronization

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Tasks

- Calibration
 - Response curve
 - Color calibration
 - Varying flash intensity
 - Camera mapping
 - Lens distortion
 - Intrinsic + extrinsic camera parameters

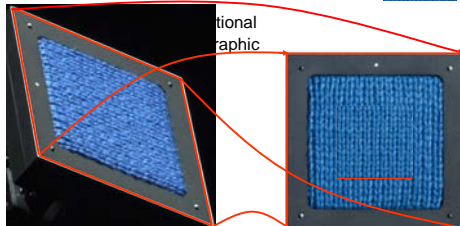


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Post-processing

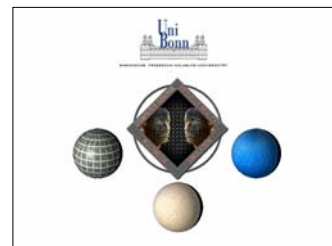
- Extraction of consistent ROI
 - Backprojection onto planar base geometry



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BTF Database Bonn

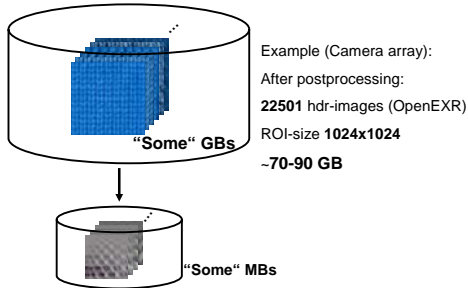


www.cg.cs.uni-bonn.de/btf

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Compression



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Compression

- Preferable properties:
 - fast (real-time), random access decompression
 - preservation of visual important features
 - maximum of a few MBs
- Two main approaches
 - Fitting analytical functions
 - Statistical data analysis

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Fitting Analytical Functions

- Spatial variation (texture domain) too complex
- Fixing spatial position

$$B_x(\mathbf{v}, \mathbf{l}) := BTF(\mathbf{x}, \mathbf{v}, \mathbf{l})$$

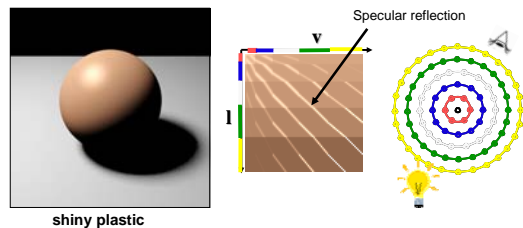
Apply techniques from BRDF modeling

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Fitting Analytical Functions

- How do these functions look like?
- How do typical BRDFs look like?



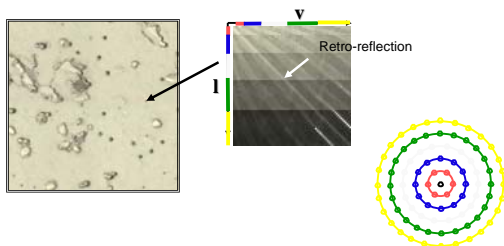
shiny plastic

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Fitting Analytical Functions

- How do these functions look like?

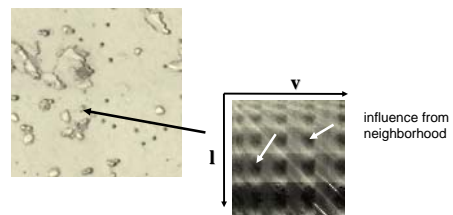


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Fitting Analytical Functions

- Are these functions typical BRDFs?



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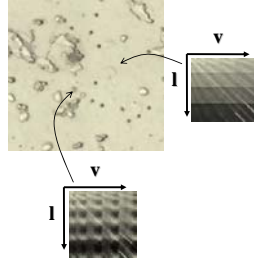
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Fitting Analytical Functions

- ABRDF = Apparent BRDF [Wong et al. 97]

– Contains also influence from neighborhood:

- Self-Shadowing
- Self-Occlusion
- Sub-Surface Scattering
- Resampling artefacts
- ...



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Fitting BRDF-Models

- Generalized Cosine-Lobe Model [Lafortune et al. 97] :

$$\Rightarrow BTF(\mathbf{x}, \mathbf{v}, \mathbf{l}) \approx f_{\mathbf{x}}(\mathbf{v}, \mathbf{l}, \mathbf{p}) = \rho_{d,\mathbf{x}} + \sum_{i=1}^k \rho_{s,i,\mathbf{x}} \cdot \left(\mathbf{v}^T \mathbf{D}_{\mathbf{x},i} \mathbf{l} \right)^{n_{x,i}}$$

diffuse color
 specular color
 specular lobe

- Non-linear least-squares fitting (Levenberg-Marquardt)
- typically around 2 lobes
- Improvement [Daubert et al. 2001]: view-dependent scale factor per texel to account for shadowing effects

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Fitting BRDF-Models

- Advantages

- High compression
- Efficient evaluation

- Problems

- loss of depth impression
- Non-linear fitting
 - expensive
 - results depend on initialization



McAllister 2002

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Statistical Data Analysis

- Motivation

- Assuming general basis functions (polynomials, lobes, etc...) suboptimal for a given measured BTF-dataset

- Idea

- Find customized basis functions adapted for the actual data set
- Exploit the inherent redundancy more effectively

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Statistical Data Analysis

- Linear approaches

- Full BTF-matrix factorization [Koudelka et al. 2003] [Liu et al. 2004]
- Per-texel ABRDF factorization [Suykens et al. 2003]
- Per-view factorization [Sattler et al. 2003]
- Per-cluster factorization [Mueller et al. 2003]

- Tensor approaches

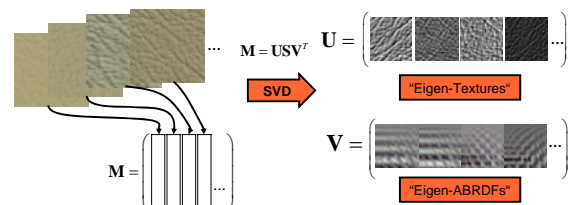
- TensorTextures [Vasilescu et al. 2004]
- Out-of-Core Tensor Approximation [Wang et al. 2005]

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Full BTF-Factorization

- Stack images as column vectors into large matrix



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Full BTF-Factorization

- Write the BTF as sum of products of two functions

$$\Rightarrow BTF(\mathbf{x}, \mathbf{v}, \mathbf{l}) = \sum_j^N \sigma_j \cdot t_j(\mathbf{x}) b_j(\mathbf{v}, \mathbf{l}) \approx \sum_j^c \sigma_j \cdot t_j(\mathbf{x}) b_j(\mathbf{v}, \mathbf{l})$$

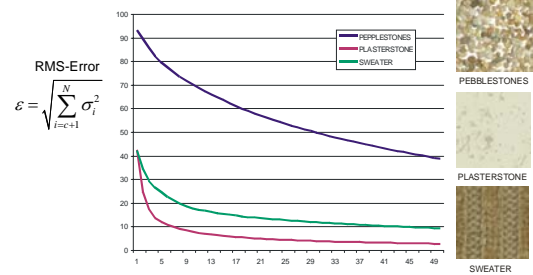
↑
↑
"Eigen-Textures"
"Eigen-ABRDFs"

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Full BTF-Factorization

- Number of terms



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Full BTF-Factorization

- Advantages
 - simple and straight-forward
- Problems
 - complex materials require many terms
 - not suitable for real-time reconstruction



Liu et al. TVCG2004

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Per-View Factorization

- Apply SVD to BTF-slices with fixed view direction (Spatially varying Hemispherical Functions)
- Idea
 - Increase quality of low-term factored approximations by factorizing fixed subsets of the data

$$\Rightarrow BTF(\mathbf{x}, \mathbf{v}, \mathbf{l}) \approx \sum_{\mathbf{v} \in N(\mathbf{v})} w_{\mathbf{v}} \sum_j^c r_{\mathbf{v},j}(\mathbf{l}) t_{\mathbf{v},j}(\mathbf{x})$$

↑
↑
"Eigen-Hemispherical-Functions"
"Eigen-Textures (per view)"

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Per-View Factorization

- Advantages
 - Low-term factorization enables high-quality interactive rendering on graphics hardware
- Problems
 - Memory consumption
 - Coherence between different views not exploited



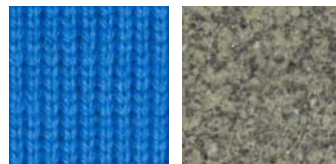
Sattler et al. 2003

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Statistical Data Analysis

- Per-texel or per-view factorization factorize fixed subsets of the BTF data
- Use clustering across spatial dimension to find better subsets

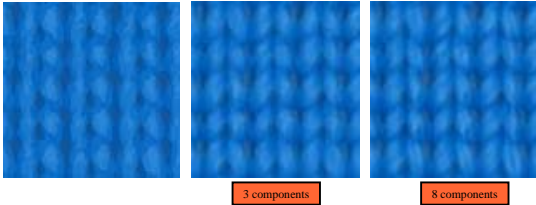


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Statistical Data Analysis

- Clustering alone leads to quantization artifacts



- Solution: linear approximation of data in each cluster (Local-PCA)

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Per-Cluster Factorization

- Clustering BTF-textels (ABRDFs) leads to

$$\Rightarrow BTF(\mathbf{x}, \mathbf{v}, \mathbf{l}) \approx \sum_j^c t_j(\mathbf{x}) b_{k(x),j}(\mathbf{v}, \mathbf{l})$$

"Eigen-Textures" (segmented)
"Eigen-BRDFs" (per cluster)

- Clustering with generalized Lloyd-algorithm and reconstruction error as distance metric

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Per-Cluster Factorization

- Advantages

- Low-term factored representation suitable for GPU implementation
- Good compression
- Reconstruction per cluster reduces quantization artifacts



Mueller et al. 2003

- Problems

- Expensive fitting
- Mip-Mapping

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Storage Requirements

Model	Storage (L , V , T)	V = L =81, T =256² 8-Bit per channel
Raw BTF	L * V * T	1.2 GB
Analytical BRDF-Model	f(k)* T	(k=2) 2.4 MB
Hemispherical Function	f(k)* V * T	(k=2) 95 MB
BTF Factorization	c*(V * L + T)	(c=40) 8.6 MB
ABRDF Factorization	d*(V + L)* T	(d=2) 63 MB
Per-View Factorization	V *c*(L + T)	(c=4) 64 MB
Per-Cluster Factorization	c*(k*(V * L) + T)	(k=32, c=8) 6.6 MB

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Practical Issues

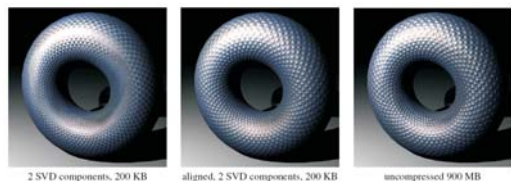
- Factorization approaches require computing SVD of large matrices (up to several GBs)
- Use incremental/online SVD methods
 - Arnoldi iteration
 - EM-PCA [Roweis 1998]
 - Online SVD [Brand 2003]
 - ...

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Using geometry information

- Fitting local coordinate systems
 - In-between image- and geometry-based BTF representation
- Can be done efficiently using FFT over the group of rotations SO(3) [Müller et al. EG2006]



2 SVD components, 200 KB

aligned, 2 SVD components, 200 KB

uncompressed 900 MB

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Rendering



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Rendering

- Determine color / visible radiance for every point

„Exitant Radiance = Emitted Rad. + Reflected Rad.“

$$L_r(\mathbf{x}, \mathbf{v}) = L_e(\mathbf{x}, \mathbf{v}) + L_{ref}(\mathbf{x}, \mathbf{v})$$

„Reflected Rad. = Incoming Rad. combined with reflection properties“

$$L_{ref}(\mathbf{x}, \mathbf{v}) = \int_{\Omega_i} \rho_x^*(\mathbf{v}, \mathbf{l}) \cdot L_i(\mathbf{x}, \mathbf{l}) d\mathbf{l}$$

spatially varying reflectance includes foreshortening term

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Point- and Directional Light Sources

- Finite number of light directions

$$L_{ref}(\mathbf{x}, \mathbf{v}) = \int_{\Omega_i} \rho_x^*(\mathbf{v}, \mathbf{l}) \cdot L_i(\mathbf{x}, \mathbf{l}) d\mathbf{l}$$

$$\downarrow$$

$$L_{ref}(\mathbf{x}, \mathbf{v}) = \sum_{i=1}^n \rho_x^*(\mathbf{v}, \mathbf{l}_i) \cdot \hat{L}_i(\mathbf{x}, \mathbf{l}_i)$$

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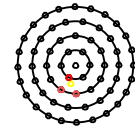
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Rendering with GPUs

- Measured BTFs

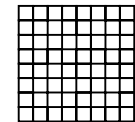
– Evaluation for directions not in the measured set

- Interpolation in angular domain



– Interpolation rather expensive

- graphics hardware
- Interpolation from regular samples

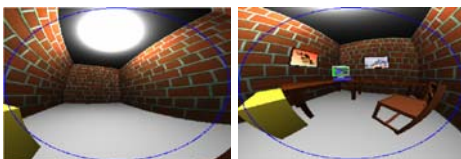


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Hardware Supported Angular Interpolation

- Reparameterization
 - Approximately uniform sampling of hemisphere
 - Suitable for hardware filtering
- Parabolic Maps



Heidrich + Seidel 1998

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Hardware Supported Angular Interpolation

- 2D Data
 - Bilinear filtering on graphics hardware

- 4D Eigen-ABRDFs

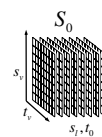
– Quadrilinear filtering

– Hardware: trilinear filtering

→ Trilinear filtering of s_v, t_v, s_l

→ 3D textures S_i for fixed t_i

→ Interpolate t_i in fragment shader



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Anti-Aliasing

- Mip-Mapping compressed BTFs
 - No problem for Eigen-Texture based compression (full-matrix factorization, per-view factorization)
 - Other techniques depend non-linear on compression parameters
 - GPU supported Mip-Mapping not possible
 - Standard Mip-Mapping on uncompressed data
 - Compression of each individual Mip-Map level

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Decompression on GPU

- Full-BTF Factorization/Per-Cluster Factorization
 - Store 4D ABRDFs in 3D texture
 - Use 4D interpolation and combine in pixel shader
 - Cluster look-up

recon. ABRDF = mean + $g_1 h_0$ + $g_2 h_1$ + $g_3 h_2$ + $g_4 h_3$ + ...

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Results



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Image-Based Lighting of BTFs



HDR environments wood, beach, kitchen, building and uffizi from www.debevec.org

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Software Rendering

- Global Illumination
 - Decompression on CPU



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Non-Planar Objects






- BTF techniques can be applied to non-planar objects
 - [Furukawa et al. EGRW 2002]
 - [Matusik et al. SIG 2002]
 - [Mueller et al. VAST 2005]
- Use 3D reconstructed base-geometry instead of planar base geometry

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Non-Planar Objects

- Processing steps

- Image acquisition 
- Image-based 3D-reconstruction 
- Mesh parameterization 
- BTF generation 
- BTF compression 

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Non-Planar Objects



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Conclusions

- BTFs capture 6D-slice of the reflectance field of a complex material
- Represents the “look-and feel” of a material
- Several high-quality acquisition setups
- Effective and appearance preserving compression algorithms available
- Real-time rendering possible with point light sources and image-based lighting

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Challenges

- Editing and modeling
 - [Kautz et al. SIG 2007]
 - [Müller et al. EGSR 2007]
- Material Perception
- Time variation (recent work only SVBRDFs)
- Spectral measurements
- Highly reflective materials

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Acknowledgements

- Reinhard Klein, Ralf Sarlette, Dirk Koch, Jan Meseth, Mirko Sattler
- EPOCH NoE

- RealReflect



- University of Bonn



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