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RESEARCH REPORT

Vlastimil Havran, Jiří Filip, Karol Myszkowski

Bidirectional Texture Function Compression Based on Multi-Level Vector Quantization SUPPLEMENTAL MATERIAL

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ÚTIA AV ČR, Pod vodárenskou věží 4, 182 08 Prague, Czech Republic E-mail: filipj@utia.cas.cz Tel: +420 266 052 365 Fax: +420 284 683 031

Bidirectional Texture Function Compression Based on Multi-Level Vector Quantization

SUPPLEMENTAL MATERIAL

V. Havran¹ J. Filip² K. Myszkowski³ ¹Faculty of Electrical Engineering, Czech Technical University in Prague, Czech Republic ²Institute of Information Theory and Automation of the AS CR, Czech Republic ³MPI Informatik, Saarbrücken, Germany

Abstract

The Bidirectional Texture Function (BTF) is becoming widely used for accurate representation of real-world material appearance. In this paper a novel BTF compression model is proposed. The model resamples input BTF data into a parametrization, allowing decomposition of individual view and illumination dependent texels into a set of multidimensional conditional probability density functions. These functions are compressed in turn using a novel multi-level vector quantization algorithm. The result of this algorithm is a set of index and scale code-books for individual dimensions. BTF reconstruction from the model is then based on fast chained indexing into the nested stored code-books. In the proposed model, luminance and chromaticity are treated separately to achieve further compression. The proposed model achieves low distortion and compression ratios 1 : 233 - 1 : 2040, depending on BTF sample variability. These results compare well with several other BTF compression methods with predefined compression ratios, usually smaller than 1 : 200. We carried out a psychophysical experiment comparing our method with LPCA method. BTF synthesis from the model was implemented on a standard GPU, yielded interactive framerates. The proposed method allows the fast importance sampling required by eye-path tracing algorithms in image synthesis.

This document provides supplemental material to the paper:

Havran V., Filip J., Myszkowski K., Bidirectional Texture Function Compression Based on Multi-Level Vector Quantization Computer Graphics Forum, 2010.

1 Method

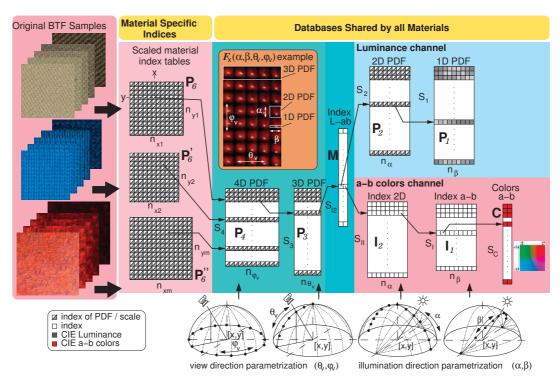


Figure 1: The proposed BTF model scheme illustrating dependencies of individual VQ code-books.

The scheme of the proposed BTF compression model is shown in Fig. 1. The compression scheme is based on subsequent decomposition of 4D, 3D, 2D, and 1D dimensional slices of BTF data. These slices are obtained by resampling original BTF data to a novel parametrization of

illumination and viewing directions. The model's compression is achieved by vector quantization of slices to individual dimensions to obtain a set of code-books. These code-books work as nested look-up tables of indices and scales of the individual slices while only the code-books at the lowest level contain the resampled original BTF data. For more information please refer to the original paper.

2 Contents

- Pages 3-38: BTF Model Renderings: Comparison of original BTF renderings and those from the proposed model for point-light and grace environment (using images, similarity measures, and VDPs)
- Pages 39-54: Proposed Method Comparison with Existing BTF Compression Methods: Comparison of performance of the proposed method with three reference BTF compression methods (based on both single rendered image and whole BTF dataset).
- Pages 55: Comparison of the proposed method performance on HDR BTF samples.
- Pages 56-58: Apparent BRDFs Comparison: Examples of original and modelled PDF4D slices of BTF data. PDF4D slice shows decomposition of single view and illumination pixel in proposed data parametrization.

3 BTF Model Renderings

This section contains rendered results of the proposed BTF compression model. Each page consists of original BTF data rendering (the first and the third row) compared with the proposed BTF model rendering (the second and the fourth row). The first two row shows three different 3D models: sphere, tablecloth, and bunny illuminated by a single point light, the last two rows shows the same models illuminated by a grace¹ environment.

All couples of original and models renderings are accompanied by their difference expressed using:

- MSSIM_W weighted MSSIM [Wang et al. 2004] computed in YCrCb color-space with weights (Y: 0.8, Cr: 0.1, Cb: 0.1).
- MSSIM_Y weighted MSSIM computed in Luminance channel Y of YCrCb color-space.
- $\Delta \hat{E}$ is average difference in CIE LAB color-space computed over all pixels.
- VDP results of visual difference predictor [Mantiuk et al. 2004], showing perceptual difference between original and proposed images for screen size 37.5×30cm, resolution 1280×1024 pixels, observer distance 0.7m, and screen luminance 80cd/m².

¹http://www.debevec.org

Figure 2: BTF sample **alu** for point light from the left.

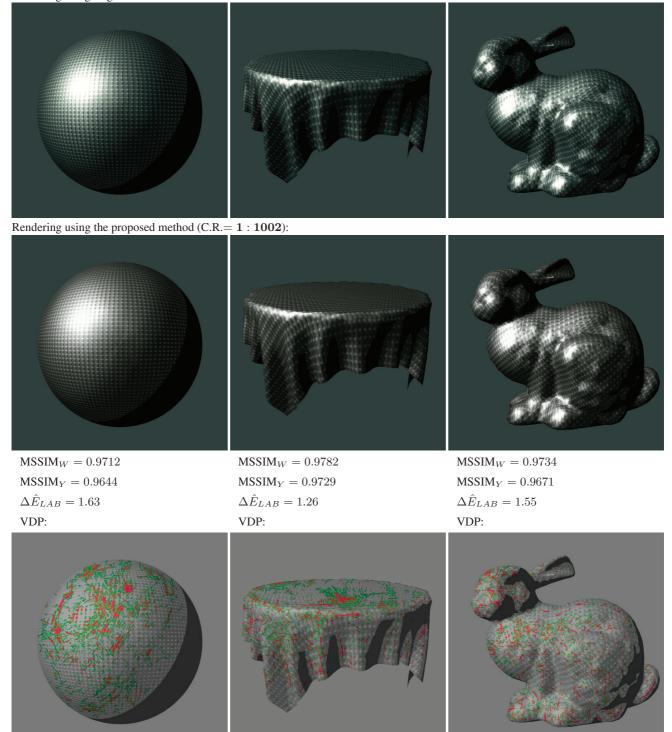
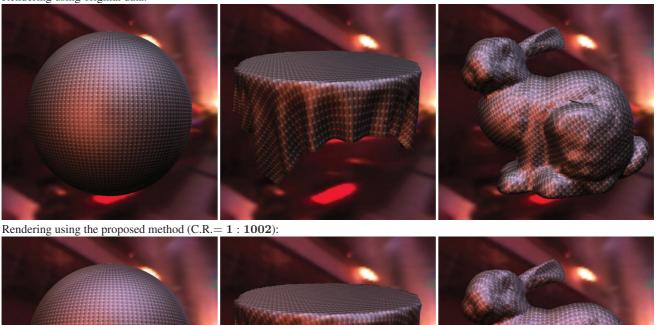


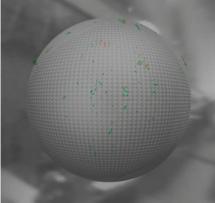
Figure 3: BTF sample **alu** for **grace** environment.



$$\begin{split} \text{MSSIM}_W &= 0.9908\\ \text{MSSIM}_Y &= 0.9887\\ \Delta \hat{E}_{LAB} &= 1.66\\ \text{VDP:} \end{split}$$

$$\begin{split} \text{MSSIM}_W &= 0.9894\\ \text{MSSIM}_Y &= 0.9869\\ \Delta \hat{E}_{LAB} &= 1.56\\ \text{VDP:} \end{split}$$

$$\begin{split} \text{MSSIM}_W &= 0.9910\\ \text{MSSIM}_Y &= 0.9890\\ \Delta \hat{E}_{LAB} &= 1.72\\ \text{VDP:} \end{split}$$



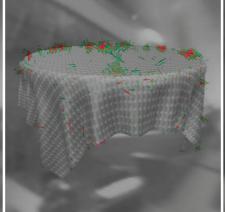




Figure 4: BTF sample **corduroy** for point light from the left.

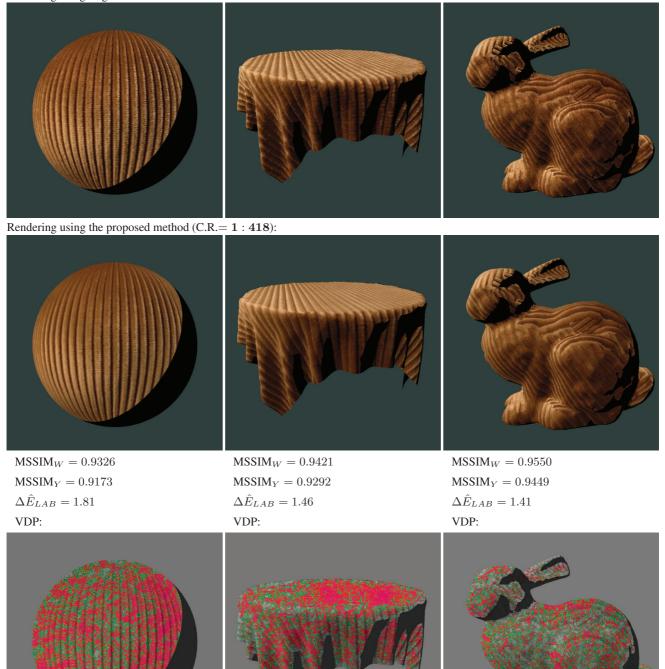


Figure 5: BTF sample **corduroy** for **grace** environment.

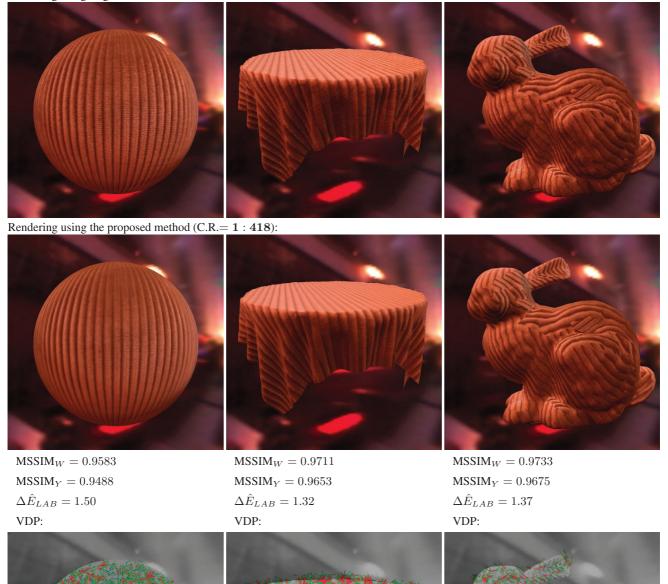


Figure 6: BTF sample **fabric01** for point light from the left.

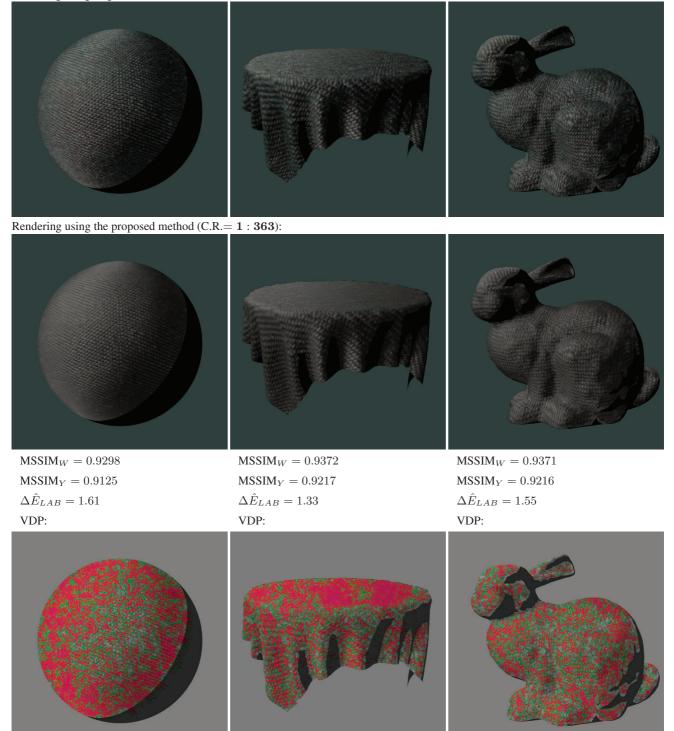
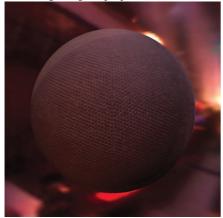


Figure 7: BTF sample **fabric01** for **grace** environment.



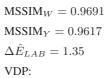
Rendering using the proposed method (C.R. = 1 : 363):







$$\begin{split} \text{MSSIM}_W &= 0.9644\\ \text{MSSIM}_Y &= 0.9557\\ \Delta \hat{E}_{LAB} &= 1.49\\ \text{VDP:} \end{split}$$



$$\begin{split} \mathrm{MSSIM}_W &= 0.9665\\ \mathrm{MSSIM}_Y &= 0.9585\\ \Delta \hat{E}_{LAB} &= 1.46\\ \mathrm{VDP:} \end{split}$$

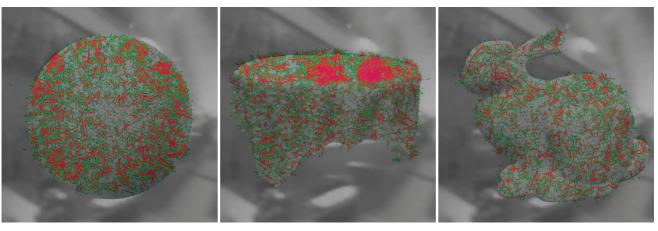
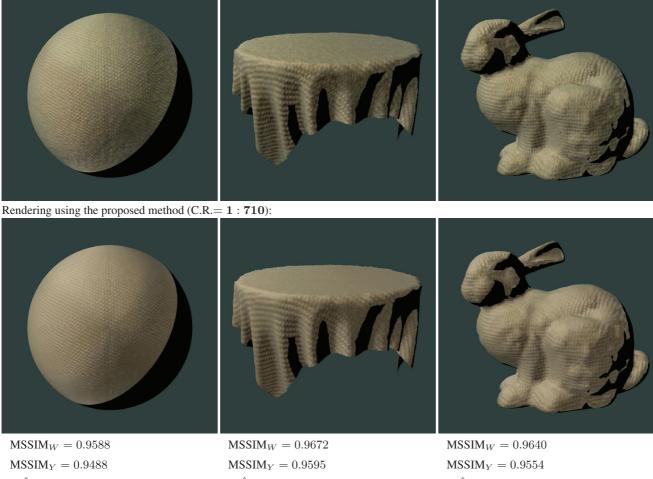
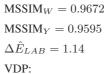


Figure 8: BTF sample **fabric02** for point light from the left.

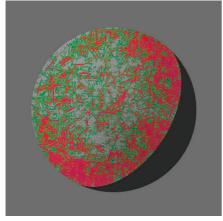
Rendering using original data:

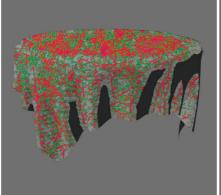


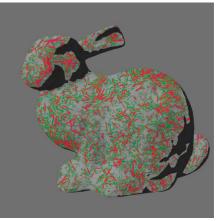
 $\Delta \hat{E}_{LAB} = 1.31$ VDP:



 $\Delta \hat{E}_{LAB} = 1.30$ VDP:







Rendering using the proposed method (C.R.= 1:710):



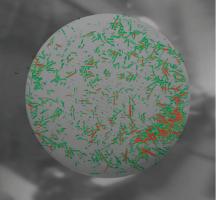
 $MSSIM_W = 0.9863$ $MSSIM_Y = 0.9830$ $\Delta \hat{E}_{LAB} = 1.26$ VDP:

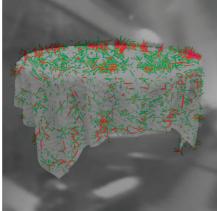
 $MSSIM_W = 0.9849$ $MSSIM_Y = 0.9815$ $\Delta \hat{E}_{LAB} = 1.24$

VDP:



 $\text{MSSIM}_W = 0.9848$ $MSSIM_Y = 0.9814$ $\Delta \hat{E}_{LAB} = 1.30$ VDP:





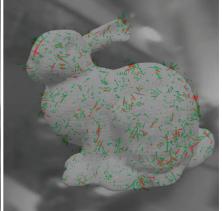




Figure 10: BTF sample **foil01** for point light from the left.

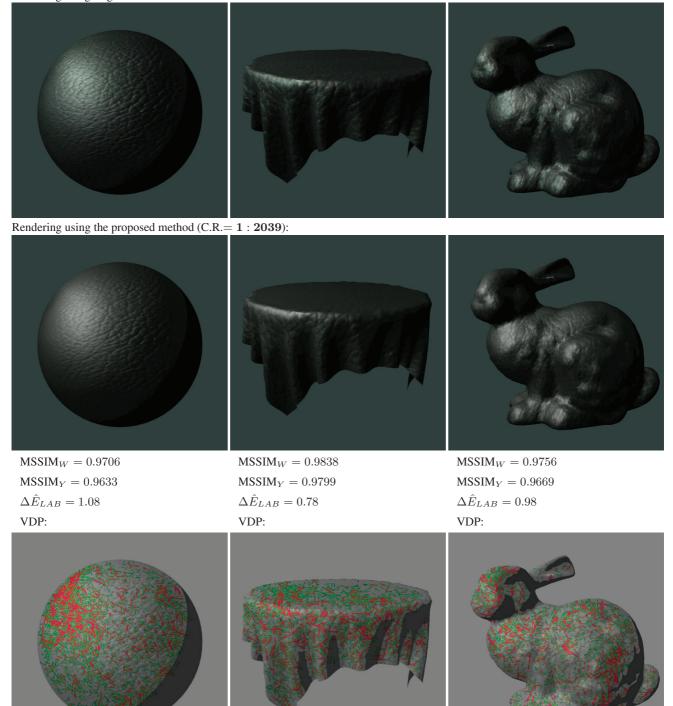
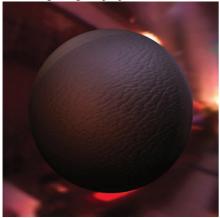


Figure 11: BTF sample **foil01** for **grace** environment.



Rendering using the proposed method (C.R.= 1 : 2039):



 $MSSIM_W = 0.9909$

 $MSSIM_Y = 0.9887$

 $\Delta \hat{E}_{LAB} = 1.04$

VDP:



 $MSSIM_W = 0.9919$

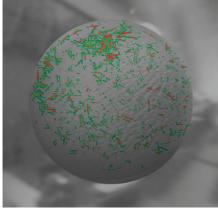
 $MSSIM_Y = 0.9899$

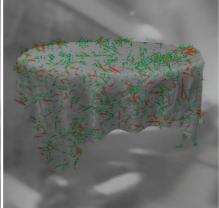
 $\Delta \hat{E}_{LAB} = 0.95$

VDP:



$$\begin{split} \text{MSSIM}_W &= 0.9904\\ \text{MSSIM}_Y &= 0.9881\\ \Delta \hat{E}_{LAB} &= 1.06\\ \text{VDP:} \end{split}$$





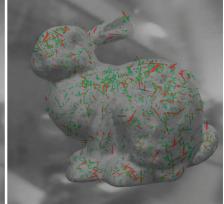


Figure 12: BTF sample **foil02** for point light from the left.

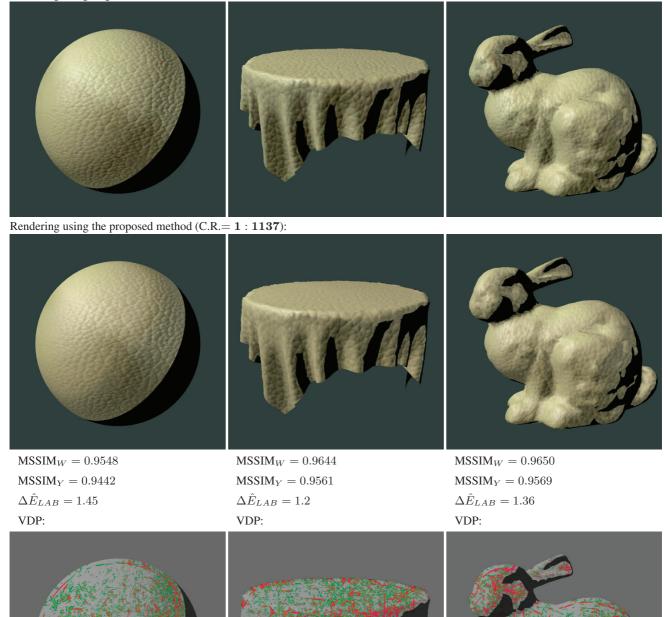
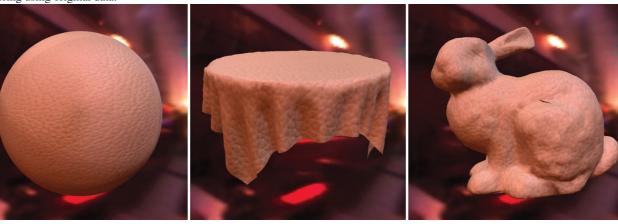
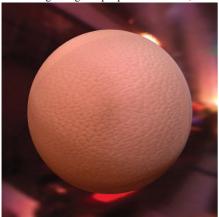


Figure 13: BTF sample **foil02** for **grace** environment.



Rendering using the proposed method (C.R.= 1: 1137):



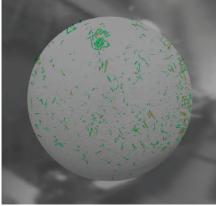
$$\begin{split} \text{MSSIM}_W &= 0.9858\\ \text{MSSIM}_Y &= 0.9824\\ \Delta \hat{E}_{LAB} &= 1.21\\ \text{VDP:} \end{split}$$

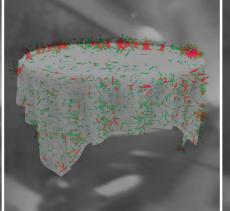


$$\begin{split} \text{MSSIM}_W &= 0.9850\\ \text{MSSIM}_Y &= 0.9818\\ \Delta \hat{E}_{LAB} &= 1.15\\ \text{VDP:} \end{split}$$



$$\begin{split} \text{MSSIM}_W &= 0.9869\\ \text{MSSIM}_Y &= 0.9840\\ \Delta \hat{E}_{LAB} &= 1.18\\ \text{VDP:} \end{split}$$





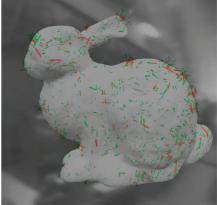


Figure 14: BTF sample **impalla** for point light from the left.

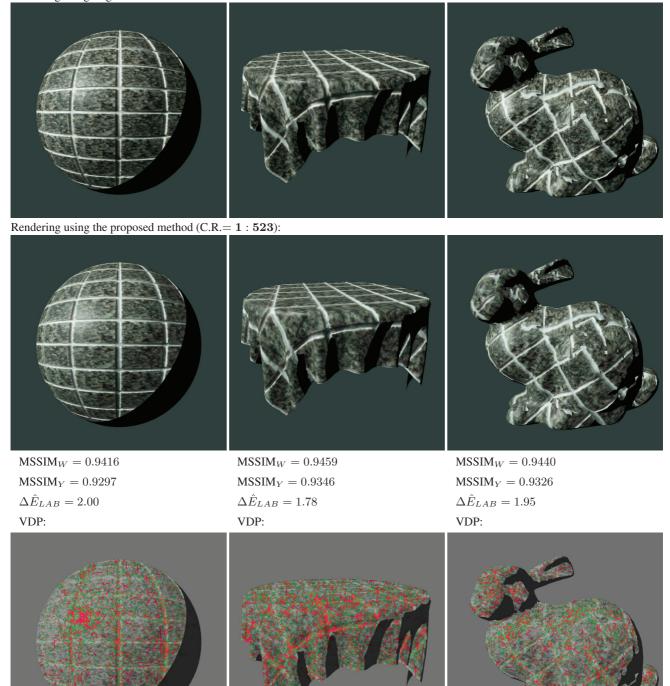
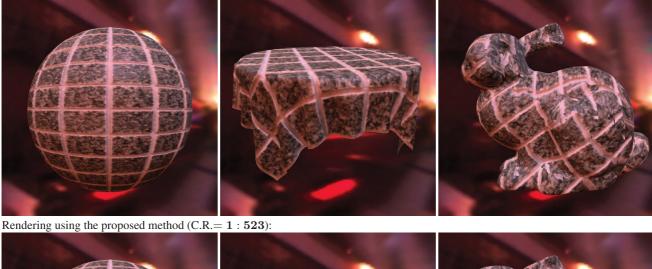


Figure 15: BTF sample impalla for grace environment.



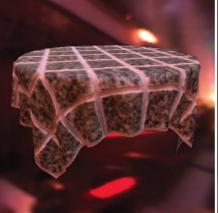


 $MSSIM_W = 0.9625$

 $MSSIM_Y = 0.9551$

 $\Delta \hat{E}_{LAB} = 1.82$

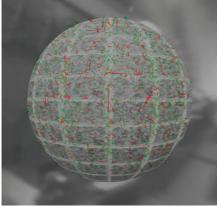
VDP:

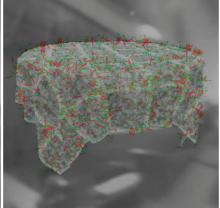




 $MSSIM_W = 0.9659$ $MSSIM_Y = 0.9589$ $\Delta \hat{E}_{LAB} = 1.65$ VDP:

 $\text{MSSIM}_W = 0.9639$ $MSSIM_Y = 0.9569$ $\Delta \hat{E}_{LAB} = 1.82$ VDP:





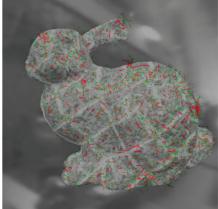
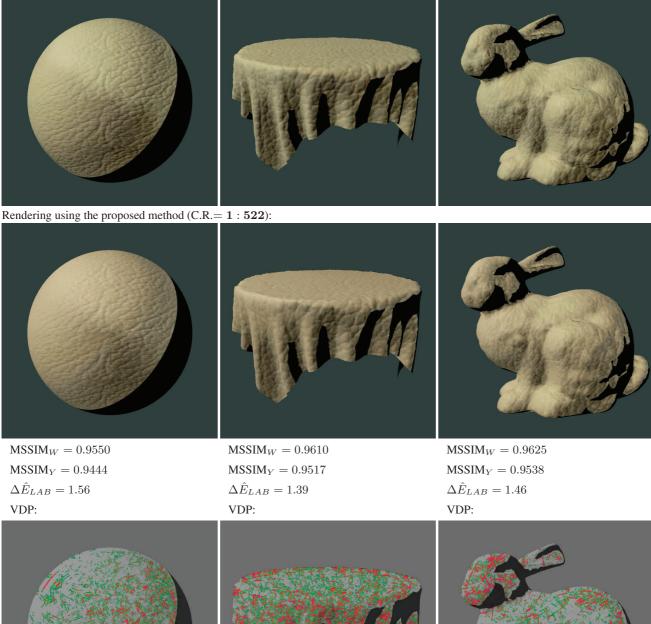
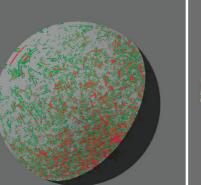
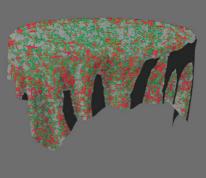


Figure 16: BTF sample leather02 for point light from the left.

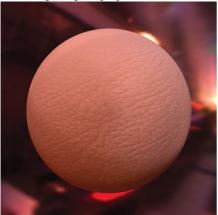




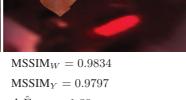




Rendering using the proposed method (C.R.= 1:522):



 $\mathrm{MSSIM}_W = 0.9834$ $MSSIM_Y = 0.9795$ $\Delta \hat{E}_{LAB} = 1.33$ VDP:

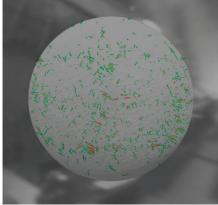


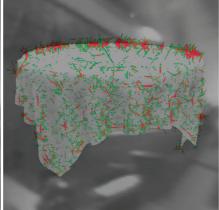
 $\Delta \hat{E}_{LAB} = 1.30$ VDP:

Figure 17: BTF sample **leather02** for **grace** environment.



 $\mathrm{MSSIM}_W = 0.9855$ $MSSIM_Y = 0.9823$ $\Delta \hat{E}_{LAB} = 1.27$ VDP:





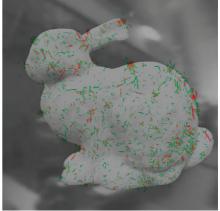


Figure 18: BTF sample **proposte** for point light from the left.

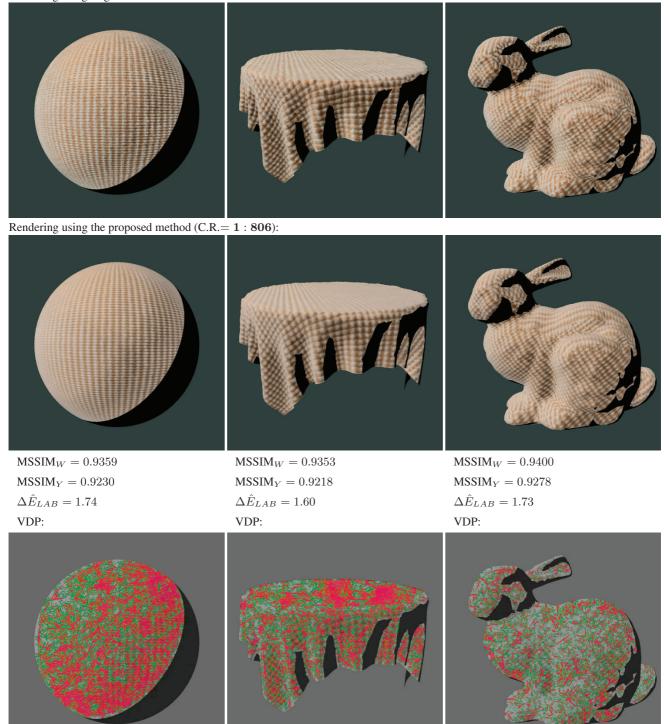
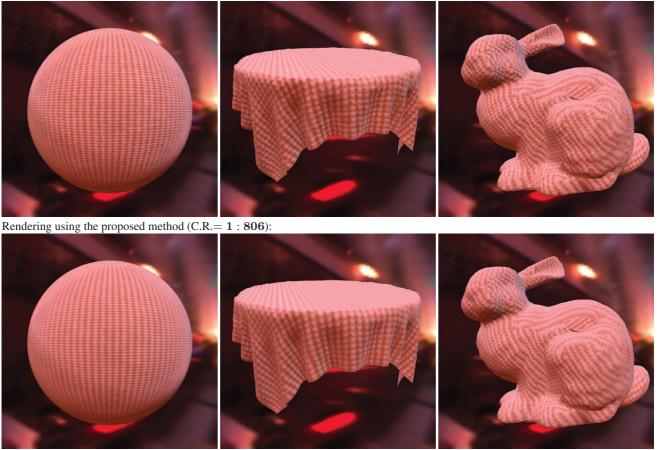


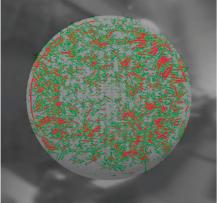
Figure 19: BTF sample **proposte** for **grace** environment.

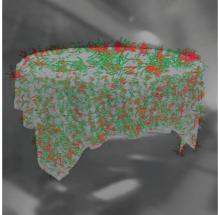


$$\begin{split} \text{MSSIM}_W &= 0.9652\\ \text{MSSIM}_Y &= 0.9580\\ \Delta \hat{E}_{LAB} &= 1.56\\ \text{VDP:} \end{split}$$

$$\begin{split} \text{MSSIM}_W &= 0.9674\\ \text{MSSIM}_Y &= 0.9606\\ \Delta \hat{E}_{LAB} &= 1.46\\ \text{VDP:} \end{split}$$

$$\begin{split} \mathrm{MSSIM}_W &= 0.9658\\ \mathrm{MSSIM}_Y &= 0.9591\\ \Delta \hat{E}_{LAB} &= 1.58\\ \mathrm{VDP:} \end{split}$$





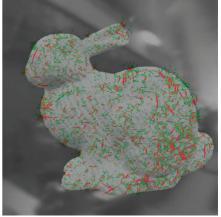
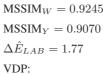


Figure 20: BTF sample **pulli** for point light from the left.

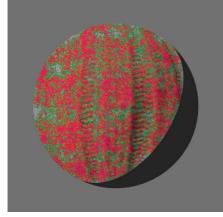
Rendering using original data:

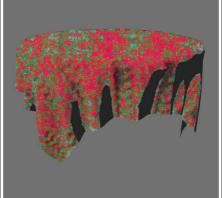


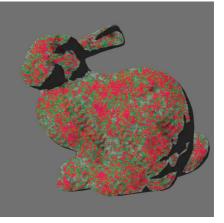
 $MSSIM_W = 0.9016$ $MSSIM_Y = 0.8785$ $\Delta \hat{E}_{LAB} = 2.13$ VDP:



 $MSSIM_W = 0.9146$ $MSSIM_Y = 0.8946$ $\Delta \hat{E}_{LAB} = 1.99$ VDP:



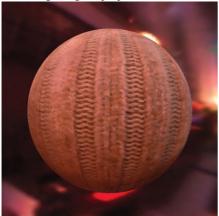








Rendering using the proposed method (C.R.= 1: 264):



$$\begin{split} \text{MSSIM}_W &= 0.9425\\ \text{MSSIM}_Y &= 0.9290\\ \Delta \hat{E}_{LAB} &= 1.66\\ \text{VDP:} \end{split}$$



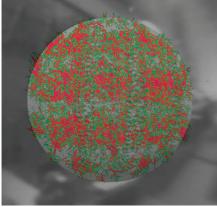
 $MSSIM_Y = 0.9472$

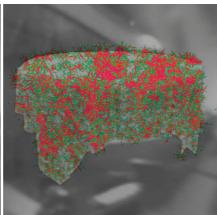
 $\Delta \hat{E}_{LAB} = 1.47$

VDP:



$$\begin{split} \text{MSSIM}_W &= 0.9431\\ \text{MSSIM}_Y &= 0.9299\\ \Delta \hat{E}_{LAB} &= 1.72\\ \text{VDP:} \end{split}$$





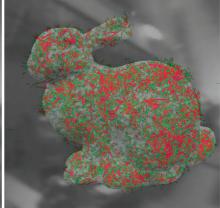


Figure 21: BTF sample **pulli** for **grace** environment.

Figure 22: BTF sample **wallpaper** for point light from the left.

Rendering using original data:







Rendering using the proposed method (C.R.= 1:728):



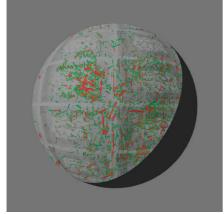
 $MSSIM_W = 0.9577$ $MSSIM_Y = 0.9493$ $\Delta \hat{E}_{LAB} = 1.44$ VDP:



$$\begin{split} \text{MSSIM}_W &= 0.9626\\ \text{MSSIM}_Y &= 0.9552\\ \Delta \hat{E}_{LAB} &= 1.28\\ \text{VDP:} \end{split}$$



 $MSSIM_W = 0.9607$ $MSSIM_Y = 0.9530$ $\Delta \hat{E}_{LAB} = 1.41$ VDP:











Rendering using the proposed method (C.R. = 1:728):



$$\begin{split} \text{MSSIM}_W &= 0.9822\\ \text{MSSIM}_Y &= 0.9793\\ \Delta \hat{E}_{LAB} &= 1.43\\ \text{VDP:} \end{split}$$

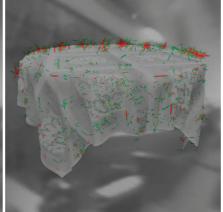


$$\begin{split} \text{MSSIM}_W &= 0.9808\\ \text{MSSIM}_Y &= 0.9773\\ \Delta \hat{E}_{LAB} &= 1.33\\ \text{VDP:} \end{split}$$



$$\begin{split} \text{MSSIM}_W &= 0.9826\\ \text{MSSIM}_Y &= 0.9798\\ \Delta \hat{E}_{LAB} &= 1.44\\ \text{VDP:} \end{split}$$





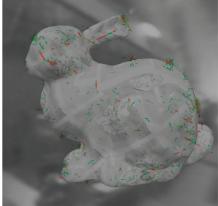
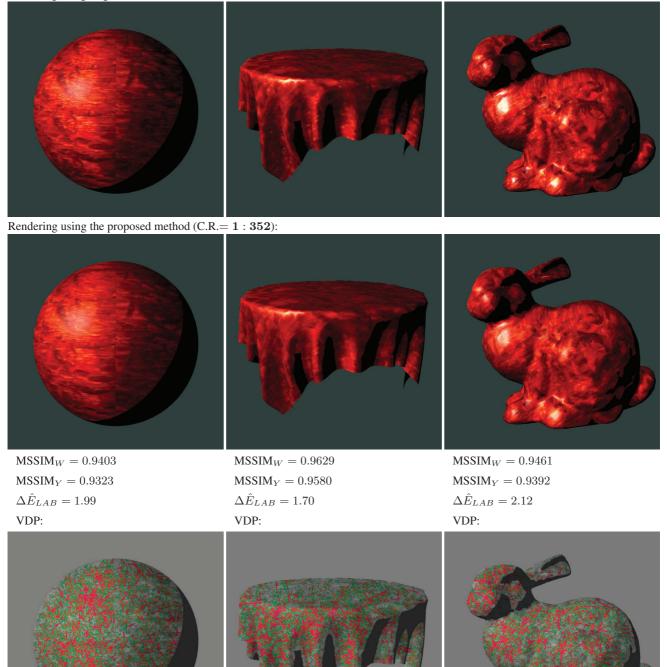


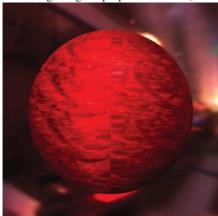
Figure 23: BTF sample **wallpaper** for **grace** environment.

Figure 24: BTF sample **wood01** for point light from the left.

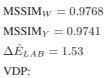




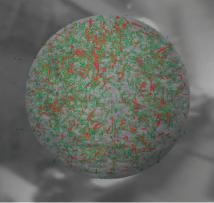
Rendering using the proposed method (C.R.= 1:352):



$$\begin{split} \text{MSSIM}_W &= 0.9640\\ \text{MSSIM}_Y &= 0.9592\\ \Delta \hat{E}_{LAB} &= 1.75\\ \text{VDP:} \end{split}$$



$$\begin{split} \text{MSSIM}_W &= 0.9631\\ \text{MSSIM}_Y &= 0.9582\\ \Delta \hat{E}_{LAB} &= 1.75\\ \text{VDP:} \end{split}$$





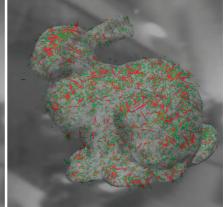


Figure 25: BTF sample **wood01** for **grace** environment.

Figure 26: BTF sample **wood02** for point light from the left.

Rendering using original data:







Rendering using the proposed method (C.R.= 1:278):



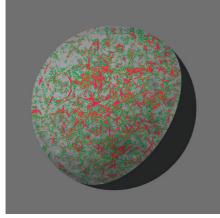
$$\begin{split} \text{MSSIM}_W &= 0.9647\\ \text{MSSIM}_Y &= 0.9601\\ \Delta \hat{E}_{LAB} &= 1.65\\ \text{VDP:} \end{split}$$



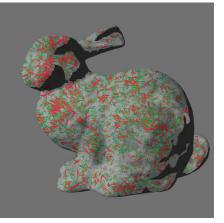
$$\begin{split} \text{MSSIM}_W &= 0.9731\\ \text{MSSIM}_Y &= 0.9692\\ \Delta \hat{E}_{LAB} &= 1.46\\ \text{VDP:} \end{split}$$



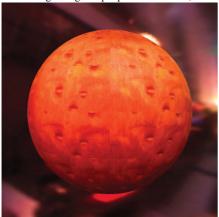
$$\begin{split} \text{MSSIM}_W &= 0.9715 \\ \text{MSSIM}_Y &= 0.9683 \\ \Delta \hat{E}_{LAB} &= 1.68 \\ \text{VDP:} \end{split}$$



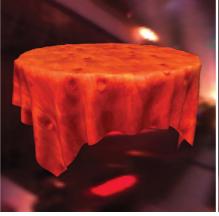




Rendering using the proposed method (C.R. = 1 : 278):



$$\begin{split} \mathrm{MSSIM}_W &= 0.9862\\ \mathrm{MSSIM}_Y &= 0.9851\\ \Delta \hat{E}_{LAB} &= 1.35\\ \mathrm{VDP:} \end{split}$$

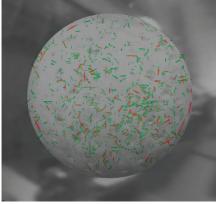


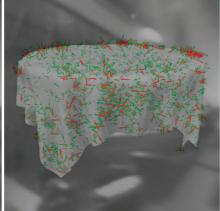
 $MSSIM_W = 0.9840$ $MSSIM_Y = 0.9819$ $\Delta \hat{E}_{LAB} = 1.25$

VDP:



$$\begin{split} \mathrm{MSSIM}_W &= 0.9850\\ \mathrm{MSSIM}_Y &= 0.9837\\ \Delta \hat{E}_{LAB} &= 1.40\\ \mathrm{VDP:} \end{split}$$





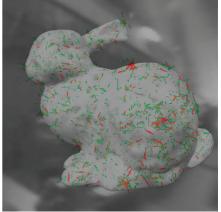


Figure 27: BTF sample **wood02** for **grace** environment.

Figure 28: BTF sample **wool** for point light from the left.

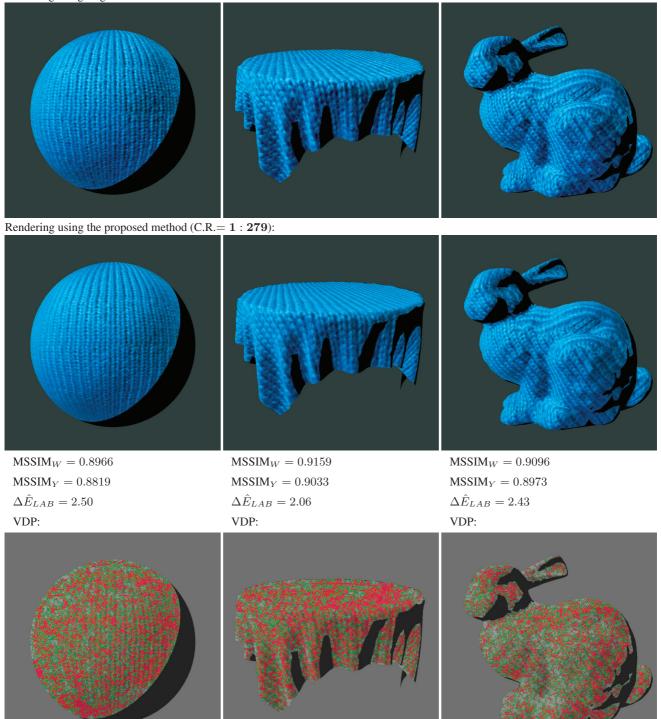
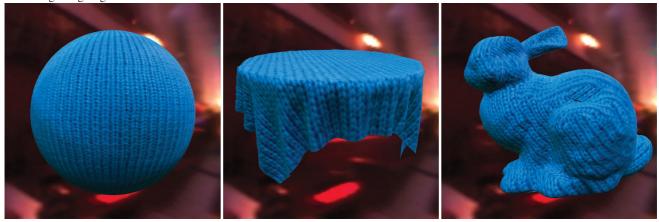
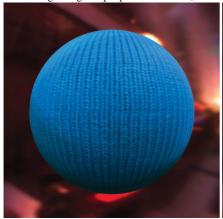


Figure 29: BTF sample **wool** for **grace** environment.

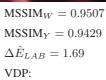


Rendering using the proposed method (C.R.= 1:279):

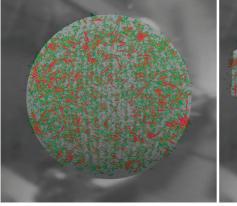


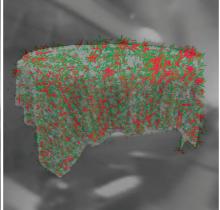


$$\begin{split} \text{MSSIM}_W &= 0.9384\\ \text{MSSIM}_Y &= 0.9294\\ \Delta \hat{E}_{LAB} &= 1.91\\ \text{VDP:} \end{split}$$



$$\begin{split} \text{MSSIM}_W &= 0.9401\\ \text{MSSIM}_Y &= 0.9318\\ \Delta \hat{E}_{LAB} &= 2.01\\ \text{VDP:} \end{split}$$





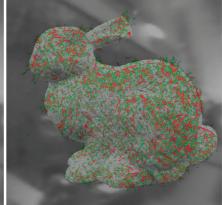
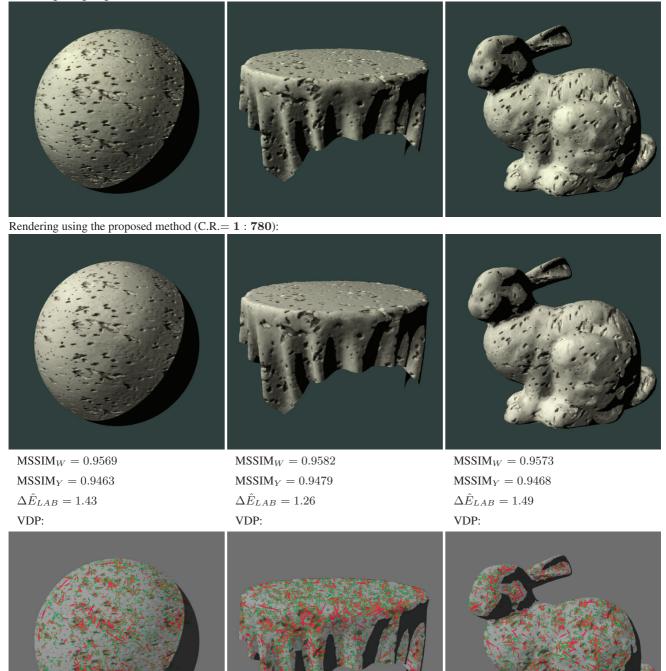


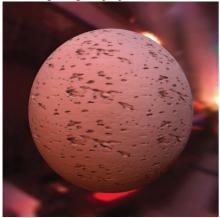
Figure 30: BTF sample **ceilingHDR** for point light from the left.







Rendering using the proposed method (C.R.= 1:780):



$$\begin{split} \text{MSSIM}_W &= 0.9761\\ \text{MSSIM}_Y &= 0.9708\\ \Delta \hat{E}_{LAB} &= 1.43\\ \text{VDP:} \end{split}$$

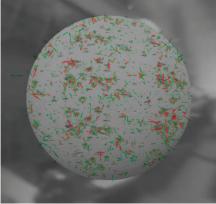


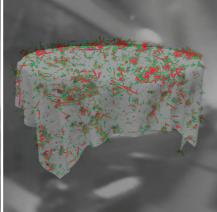
 $MSSIM_Y = 0.9689$

 $\Delta \hat{E}_{LAB} = 1.30$

VDP:

$$\begin{split} \text{MSSIM}_W &= 0.9736\\ \text{MSSIM}_Y &= 0.9679\\ \Delta \hat{E}_{LAB} &= 1.49\\ \text{VDP:} \end{split}$$





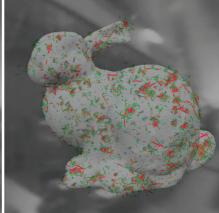


Figure 31: BTF sample ceilingHDR for grace environment.

Figure 32: BTF sample **floortileHDR** for point light from the left.

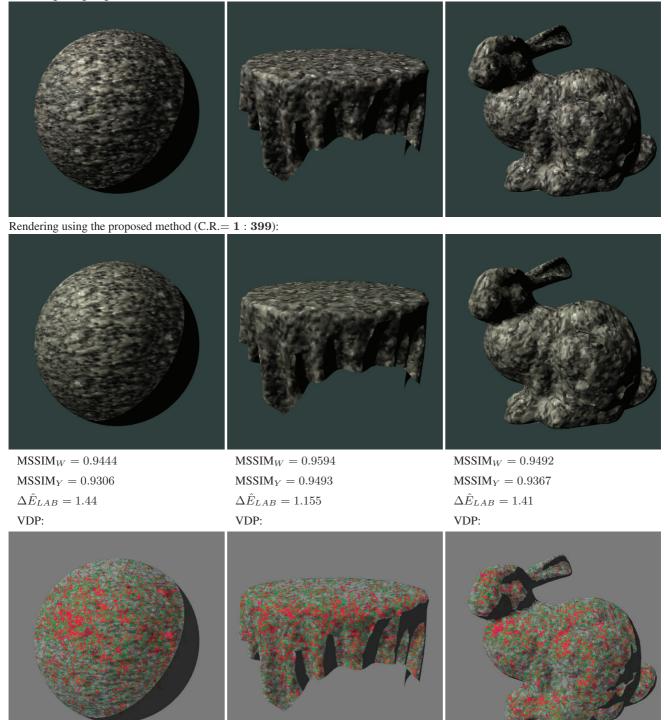


Figure 33: BTF sample floortileHDR for grace environment.



Rendering using the proposed method (C.R.= 1:399):

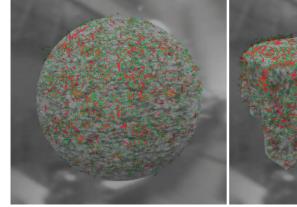




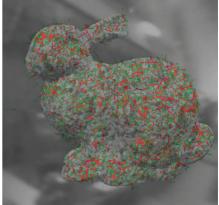
$$\begin{split} \text{MSSIM}_W &= 0.9583\\ \text{MSSIM}_Y &= 0.9486\\ \Delta \hat{E}_{LAB} &= 1.61\\ \text{VDP:} \end{split}$$

$$\begin{split} \text{MSSIM}_W &= 0.9650\\ \text{MSSIM}_Y &= 0.9567\\ \Delta \hat{E}_{LAB} &= 1.43\\ \text{VDP:} \end{split}$$

$$\begin{split} \text{MSSIM}_W &= 0.9590\\ \text{MSSIM}_Y &= 0.9492\\ \Delta \hat{E}_{LAB} &= 1.64\\ \text{VDP:} \end{split}$$

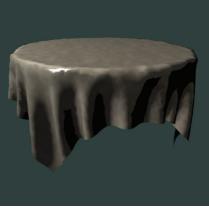






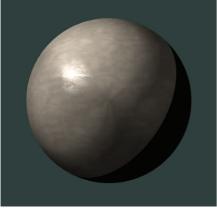




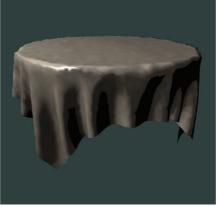




Rendering using the proposed method (C.R.= 1:2397):



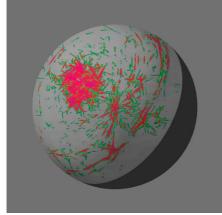
$$\begin{split} \text{MSSIM}_W &= 0.9910\\ \text{MSSIM}_Y &= 0.9888\\ \Delta \hat{E}_{LAB} &= 0.81\\ \text{VDP:} \end{split}$$



$$\begin{split} \mathrm{MSSIM}_W &= 0.9923\\ \mathrm{MSSIM}_Y &= 0.9904\\ \Delta \hat{E}_{LAB} &= 0.65\\ \mathrm{VDP:} \end{split}$$



 $MSSIM_W = 0.9899$ $MSSIM_Y = 0.9874$ $\Delta \hat{E}_{LAB} = 0.83$ VDP:







Rendering using original data:





Figure 35: BTF sample **pinktileHDR** for **grace** environment.



Rendering using the proposed method (C.R.= 1 : 2397):



 $MSSIM_W = 0.9973$

 $MSSIM_Y = 0.9967$

 $\Delta \hat{E}_{LAB} = 1.01$

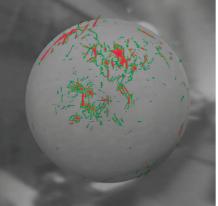
VDP:

 $MSSIM_W = 0.9942$ $MSSIM_Y = 0.9929$ $\Delta \hat{E}_{LAB} = 0.88$





$$\begin{split} \text{MSSIM}_W &= 0.9921 \\ \text{MSSIM}_Y &= 0.9903 \\ \Delta \hat{E}_{LAB} &= 1.06 \\ \text{VDP:} \end{split}$$





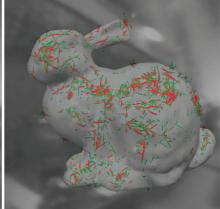
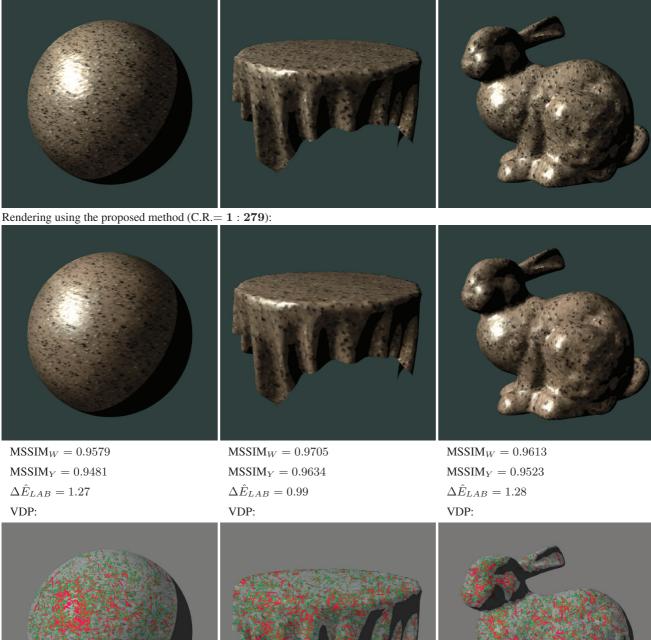
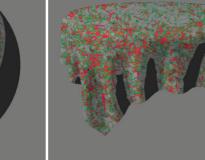


Figure 36: BTF sample **walkwayHDR** for point light from the left.

Rendering using original data:





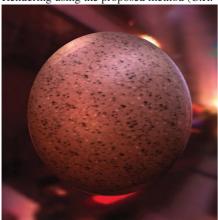
Rendering using original data:



Figure 37: BTF sample **walkwayHDR** for **grace** environment.



Rendering using the proposed method (C.R. = 1 : 279):

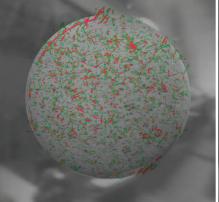


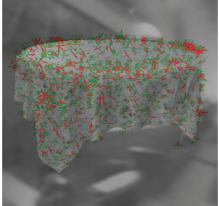


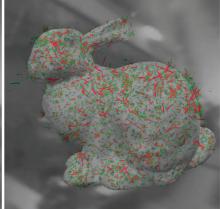
$$\begin{split} \text{MSSIM}_W &= 0.9718\\ \text{MSSIM}_Y &= 0.9653\\ \Delta \hat{E}_{LAB} &= 1.37\\ \text{VDP:} \end{split}$$

$$\begin{split} \mathrm{MSSIM}_W &= 0.9768\\ \mathrm{MSSIM}_Y &= 0.9714\\ \Delta \hat{E}_{LAB} &= 1.28\\ \mathrm{VDP:} \end{split}$$

$$\begin{split} \text{MSSIM}_W &= 0.9698\\ \text{MSSIM}_Y &= 0.9628\\ \Delta \hat{E}_{LAB} &= 1.40\\ \text{VDP:} \end{split}$$







4 Proposed Method Comparison with Existing BTF Compression Methods

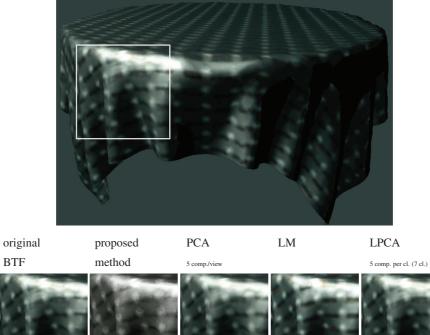
A cutoff images from rendered images for point-light obtained using the proposed method were compared with results of three other existing BTF compression methods [Sattler et al. 2003] (**PCA**), [Filip and Haindl 2005] (**LM**), and [Müller et al. 2003] (**LPCA**) in terms of visual appearance and weighted MSSIM [Wang et al. 2004] in YCrCb color-space (weights: Y: 0.8, Cr: 0.1, Cb: 0.1). The test were performed for 3D object tablecloth and single point light from top-left.

Additionally there is a table for each sample summarising difference between original data and data rendered by the proposed method as well as reference methods PCA, LM, and LPCA. The difference is computed across all images in BTF sample and various distance measures were used:

- MSSIM_W weighted MSSIM [Wang et al. 2004] computed in YCrCb color-space with weights (Y: 0.8, Cr: 0.1, Cb: 0.1).
- MSSIM_Y weighted MSSIM computed in Luminance channel Y of YCrCb color-space.
- $\Delta \hat{E}$ is average difference in CIE LAB color-space computed over all pixels.
- MSE_W average weighted MSE (mean square error) in RGB color-space computed over all pixels with weights (R: 0.2126, G: 0.7152, B: 0.0722).

All distance measures were computed for as both mean and median from values for all BTF images.

Table also compares compression errors obtained by the proposed and the reference methods.

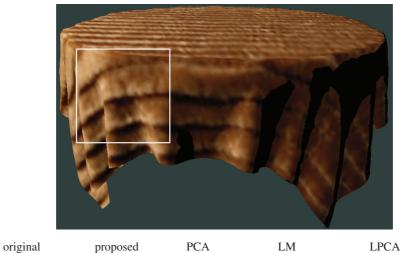


MSSIM_W 0.7699 0.9213 0.8264 0.9545

Figure 38: Visual comparison of the proposed method with different BTF compression methods for material **alu**. The first row from left to right original, compressed using the proposed method, methods PCA, LM, and LPCA. The second row show difference from original for the individual methods.

Table 1: Overall error in BTF sample alu					
distance measure	proposed	PCA	LM	LPCA	
Compression ratio	1:1002	1:14	1:16	1:275	
median of MSSIM _W	0.2678	0.9761	0.9236	0.9821 †	
median of $MSSIM_Y$	0.0881	0.9786	0.9313	0.9839 †	
median of $\Delta \hat{E}$	19.82	3.80	6.94	4.14^{\dagger}	
median of MSE_W	2496.5	29.0	129.1	15.9^{\dagger}	
mean of $MSSIM_W$	0.2905	0.9294	0.8825	0.9409 †	
mean of $MSSIM_Y$	0.1167	0.9396	0.8922	0.9496 †	
mean of $\Delta \hat{E}$	27.88	5.21	8.75	4.14^{\dagger}	
mean of MSE_W	8363.4	50.4	249.3	29.05^{\dagger}	

Table 1: Overall error in BTF sample alu



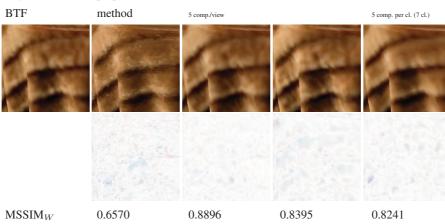
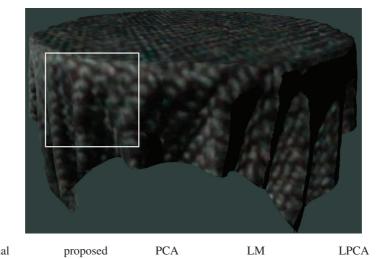


Figure 39: Visual comparison of the proposed method with different BTF compression methods for material **corduroy**. The first row from left to right original, compressed using the proposed method, methods PCA, LM, and LPCA. The second row show difference from original for the individual methods.

Table 2. Overall error in BTF sample corduroy				
distance measure	proposed	PCA	LM	LPCA
Compression ratio	1:418	1:14	1:16	1:275
median of $MSSIM_W$	0.5672	0.9786	0.9572	0.9711 †
median of $MSSIM_Y$	0.5618	0.9887	0.9744	0.9869 †
median of $\Delta \hat{E}$	5.53	5.73	8.53	6.44^{\dagger}
median of MSE_W	139.4	64.8	148.4	111.7^{\dagger}
mean of $MSSIM_W$	0.5549	0.9210	0.8985	0.9160 †
mean of $MSSIM_Y$	0.5455	0.9282	0.9109	0.9254 †
mean of $\Delta \hat{E}$	5.80	6.74	9.78	7.25^{+}
mean of MSE_W	174.8	79.0	230.7	132.7^{\dagger}

Table 2: Overall error in BTF sample corduroy



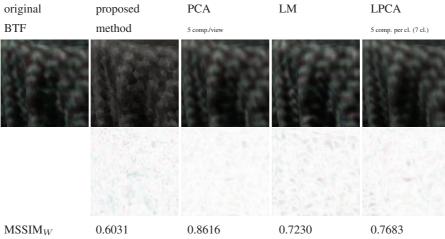
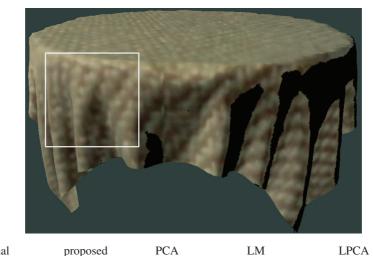


Figure 40: Visual comparison of the proposed method with different BTF compression methods for material **fabric1**. The first row from left to right original, compressed using the proposed method, methods PCA, LM, and LPCA. The second row show difference from original for the individual methods.

Table 5: Overall erfor III BTF sample fabrici					
distance measure	proposed	PCA	LM	LPCA	
Compression ratio	1:363	1:14	1:16	1:275	
median of $MSSIM_W$	0.5328	0.9770	0.9400	0.9710 [†]	
median of $MSSIM_Y$	0.4583	0.9207	0.9460	0.9740 [†]	
median of $\Delta \hat{E}$	4.65	4.95	7.47	5.61 [†]	
median of MSE_W	110.4	70.0	139.24	98.47^{\dagger}	
mean of $MSSIM_W$	0.5106	0.9152	0.8889	0.9149 †	
mean of $MSSIM_Y$	0.4307	0.9207	0.8967	0.9217 †	
mean of $\Delta \hat{E}$	4.87	6.45	8.93	7.1^{+}	
mean of MSE_W	130.6	78.9	187.1	116.78^{\dagger}	

Table 3: Overall error in BTF sample fabric1



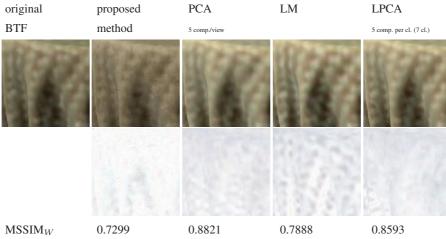
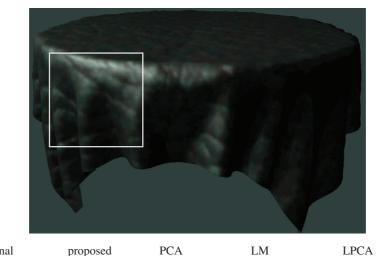


Figure 41: Visual comparison of the proposed method with different BTF compression methods for material **fabric2**. The first row from left to right original, compressed using the proposed method, methods PCA, LM, and LPCA. The second row show difference from original for the individual methods.

Table 4. Overall erfor in B11 sample fabricz					
distance measure	proposed	PCA	LM	LPCA	
Compression ratio	1:710	1:14	1:16	1:275	
median of $MSSIM_W$	0.5822	0.9944	0.9900	0.9936 †	
median of $MSSIM_Y$	0.5483	0.9952	0.9918	0.9945 †	
median of $\Delta \hat{E}$	4.48	2.79	3.76	2.77^{+}	
median of MSE_W	75.9	35.6	82.5	39.5^{\dagger}	
mean of $MSSIM_W$	0.5482	0.9936	0.9865	0.9925 †	
mean of $MSSIM_Y$	0.5059	0.9947	0.9892	0.9937 †	
mean of $\Delta \hat{E}$	4.59	2.92	4.18	2.95^{\dagger}	
mean of MSE_W	91.98	43.3	127.2	51.9^{\dagger}	

Table 4: Overall error in BTF sample fabric2



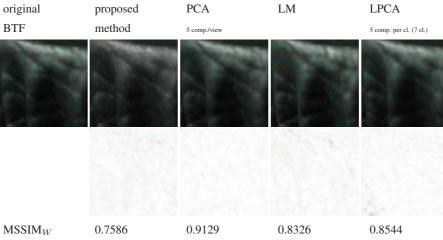
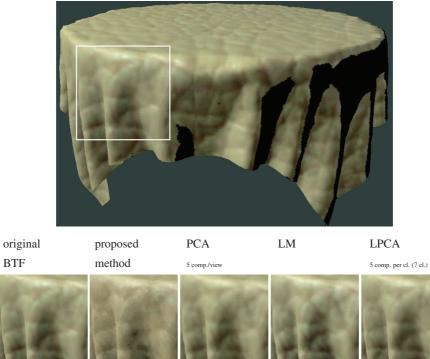


Figure 42: Visual comparison of the proposed method with different BTF compression methods for material **foil1**. The first row from left to right original, compressed using the proposed method, methods PCA, LM, and LPCA. The second row show difference from original for the individual methods.

Table 5: Overall error in BTF sample foll					
distance measure	proposed	PCA	LM	LPCA	
Compression ratio	1:2039	1:14	1:16	1:275	
median of $MSSIM_W$	0.5511	0.9922	0.9667	0.9889 †	
median of $MSSIM_Y$	0.4564	0.9930	0.9708	0.9902 †	
median of $\Delta \hat{E}$	2.49	2.80	4.83	3.01 [†]	
median of MSE_W	25.3	12.5	26.5	13.1^{+}	
mean of $MSSIM_W$	0.5391	0.9236	0.8929	0.9232 †	
mean of $MSSIM_Y$	0.4445	0.9315	0.9017	0.9309 †	
mean of $\Delta \hat{E}$	2.93	5.57	8.00	5.70^{\dagger}	
mean of MSE_W	49.3	18.3	77.5	30.1 [†]	

Table 5: Overall error in BTF sample foil1

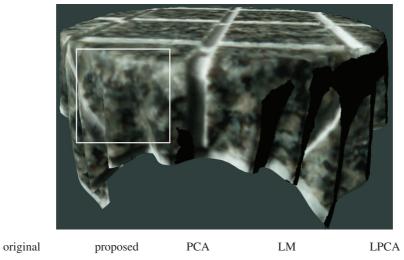


MSSIM_W 0.7730 0.9292 0.8850 0.9009

Figure 43: Visual comparison of the proposed method with different BTF compression methods for material **foil2**. The first row from left to right original, compressed using the proposed method, methods PCA, LM, and LPCA. The second row show difference from original for the individual methods.

Table 6. Overall erfor in BTF sample 10112					
distance measure	proposed	PCA	LM	LPCA	
Compression ratio	1:1137	1:14	1:16	1:275	
median of $MSSIM_W$	0.5309	0.9968	0.9956	0.9961 †	
median of $MSSIM_Y$	0.4674	0.9972	0.9963	0.9966 †	
median of $\Delta \hat{E}$	3.88	2.36	2.55	2.07^{\dagger}	
median of MSE_W	50.6	15.0	27.6	15.5^{+}	
mean of $MSSIM_W$	0.5152	0.9951	0.9899	0.9936 †	
mean of $MSSIM_Y$	0.4455	0.9910	0.9921	0.9948 †	
mean of $\Delta \hat{E}$	3.93	2.55	3.24	2.43^{\dagger}	
mean of MSE_W	67.5	23.0	70.8	29.3 [†]	

Table 6: Overall error in BTF sample foil2



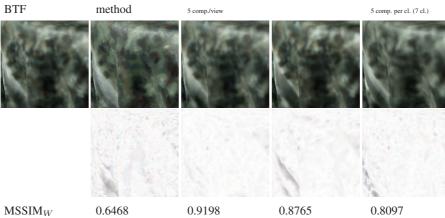


Figure 44: Visual comparison of the proposed method with different BTF compression methods for material **impalla**. The first row from left to right original, compressed using the proposed method, methods PCA, LM, and LPCA. The second row show difference from original for the individual methods.

Table 7. Overall erfor in BTF sample impana				
distance measure	proposed	PCA	LM	LPCA
Compression ratio	1:523	1:14	1:16	1:275
median of $MSSIM_W$	0.4649	0.9832	0.9727	0.9795 †
median of $MSSIM_Y$	0.4610	0.9866	0.9775	0.9840 [†]
median of $\Delta \hat{E}$	9.09	4.83	6.67	5.05^{++}
median of MSE_W	671.4	193.0	405.5	177.3^{\dagger}
mean of $MSSIM_W$	0.4419	0.9707	0.9594	0.9701 †
mean of $MSSIM_Y$	0.4313	0.9758	0.9659	0.9758 [†]
mean of $\Delta \hat{E}$	9.21	5.33	7.31	5.28^{\dagger}
mean of MSE_W	753.2	206.4	528.4	197.3 [†]

Table 7: Overall error in BTF sample impalla

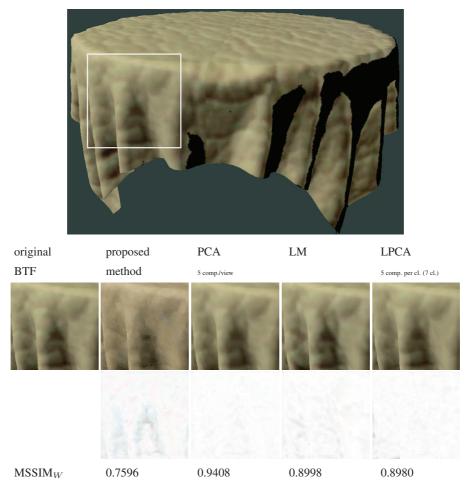
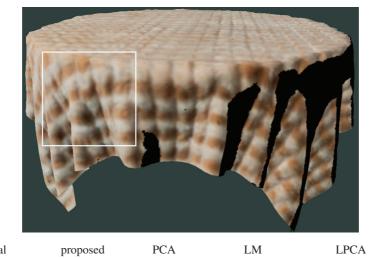


Figure 45: Visual comparison of the proposed method with different BTF compression methods for material **leather**. The first row from left to right original, compressed using the proposed method, methods PCA, LM, and LPCA. The second row show difference from original for the individual methods.

Table 8. Overall erfor in BTF sample leather					
distance measure	proposed	PCA	LM	LPCA	
Compression ratio	1:522	1:14	1:16	1:275	
median of MSSIM _W	0.4926	0.9976	0.9970	0.9967 †	
median of $MSSIM_Y$	0.4285	0.9979	0.9975	0.9972 [†]	
median of $\Delta \hat{E}$	4.81	2.17	2.13	1.96^{\dagger}	
median of MSE_W	77.8	10.4	18.4	14.2^{\dagger}	
mean of $MSSIM_W$	0.4794	0.9936	0.9915	0.9936 †	
mean of $MSSIM_Y$	0.4093	0.9945	0.9932	0.9948 †	
mean of $\Delta \hat{E}$	4.82	2.46	2.76	2.32^{\dagger}	
mean of MSE_W	98.2	17.3	43.8	25.4^{\dagger}	

Table 8: Overall error in BTF sample leather



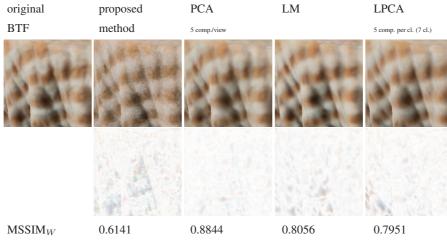
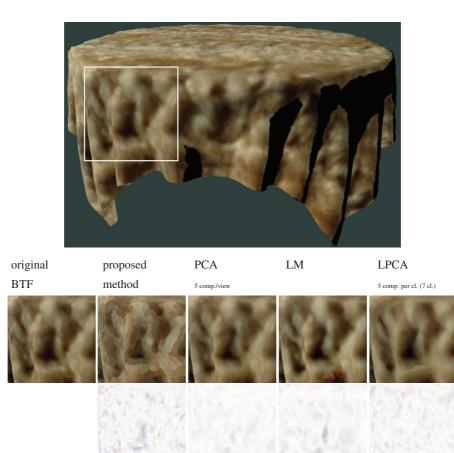


Figure 46: Visual comparison of the proposed method with different BTF compression methods for material **proposte**. The first row from left to right original, compressed using the proposed method, methods PCA, LM, and LPCA. The second row show difference from original for the individual methods.

Table 9: Overall error in BTF sample proposte				
distance measure	proposed	PCA	LM	LPCA
Compression ratio	1:806	1:14	1:16	1:275
median of $MSSIM_W$	0.7353	0.9926	0.9832	0.9898 †
median of $MSSIM_Y$	0.6902	0.9953	0.9887	0.9942 †
median of $\Delta \hat{E}$	6.61	3.66	5.89	4.12^{\dagger}
median of MSE_W	271.3	78.5	212.3	121.1^{\dagger}
mean of $MSSIM_W$	0.7274	0.9897	0.9786	0.9876 †
mean of $MSSIM_Y$	0.6795	0.9929	0.9849	0.9921 †
mean of $\Delta \hat{E}$	6.62	3.97	6.33	4.29^{\dagger}
mean of MSE_W	291.1	102.2	295.5	145.3 [†]

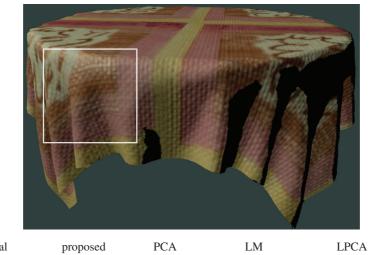


 $MSSIM_W$ 0.5636 0.8750 0.8216 0.7295

Figure 47: Visual comparison of the proposed method with different BTF compression methods for material **pulli**. The first row from left to right original, compressed using the proposed method, methods PCA, LM, and LPCA. The second row show difference from original for the individual methods.

Table 10. Overall error in BTF sample pull				
distance measure	proposed	PCA	LM	LPCA
Compression ratio	1:264	1:14	1:16	1:275
median of $MSSIM_W$	0.4565	0.9902	0.9828	0.9810 †
median of $MSSIM_Y$	0.3924	0.9932	0.9874	0.9878 [†]
median of $\Delta \hat{E}$	6.06	4.45	5.81	6.08^{\dagger}
median of MSE_W	196.51	94.82	176.0	221.8^{\dagger}
mean of $MSSIM_W$	0.4548	0.9641	0.9502	0.9552 †
mean of $MSSIM_Y$	0.3932	0.9679	0.9560	0.9625 †
mean of $\Delta \hat{E}$	6.05	5.34	7.31	6.99^{\dagger}
mean of MSE_W	210.4	4.45	258.9	261.4^{\dagger}

Table 10: Overall error in BTF sample pulli



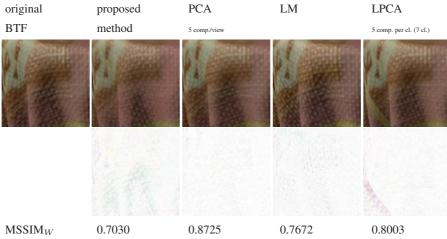
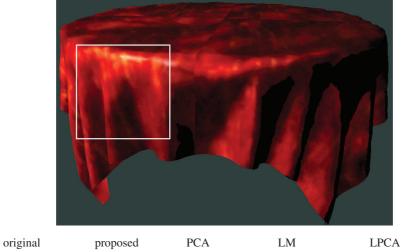


Figure 48: Visual comparison of the proposed method with different BTF compression methods for material **wallpaper**. The first row from left to right original, compressed using the proposed method, methods PCA, LM, and LPCA. The second row show difference from original for the individual methods.

Table 11. Overall erfor in D11 sample wanpaper					
distance measure	proposed	PCA	LM	LPCA	
Compression ratio	1:728	1:14	1:16	1:275	
median of $MSSIM_W$	0.1149	0.9910	0.9797	0.9876 [†]	
median of $MSSIM_Y$	0.0226	0.9934	0.9828	0.9917 †	
median of $\Delta \hat{E}$	38.47	2.92	4.40	3.69^{\dagger}	
median of MSE_W	7304.9	54.6	94.2	64.8^{\dagger}	
mean of $MSSIM_W$	0.1155	0.9552	0.9403	0.9626 †	
mean of $MSSIM_Y$	0.0233	0.9592	0.9460	0.9685 †	
mean of $\Delta \hat{E}$	39.24	4.10	5.90	4.53 [†]	
mean of MSE_W	8745.83	64.8	148.7	81.7^{\dagger}	

Table 11: Overall error in BTF sample wallpaper



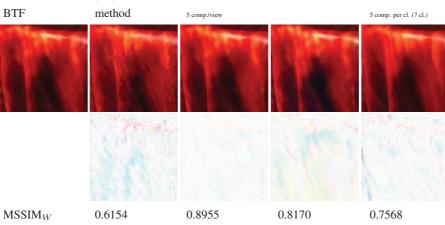


Figure 49: Visual comparison of the proposed method with different BTF compression methods for material **wood1**. The first row from left to right original, compressed using the proposed method, methods PCA, LM, and LPCA. The second row show difference from original for the individual methods.

Table 12: Overall error in BTF sample wood1				
distance measure	proposed	PCA	LM	LPCA
Compression ratio	1:352	1:14	1:16	1:275
median of $MSSIM_W$	0.4590	0.9477	0.9143	0.9437 †
median of $MSSIM_Y$	0.4292	0.9524	0.9328	0.9549 †
median of $\Delta \hat{E}$	4.80	6.82	11.57	8.02^{+}
median of MSE_W	38.0	19.8	38.98	35.9^{\dagger}
mean of $MSSIM_W$	0.4559	0.8265	0.7890	0.8108 †
mean of $MSSIM_Y$	0.4273	0.8291	0.7959	0.8144 †
mean of $\Delta \hat{E}$	4.64	9.22	14.15	10.60^{\dagger}
mean of MSE_W	44.2	22.2	53.58	38.85 [†]

Table 12: Overall error in BTF sample wood1

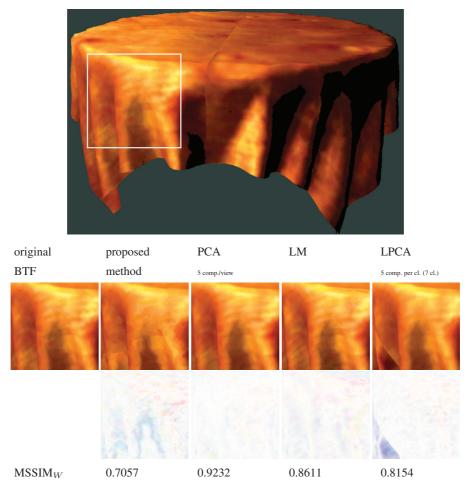
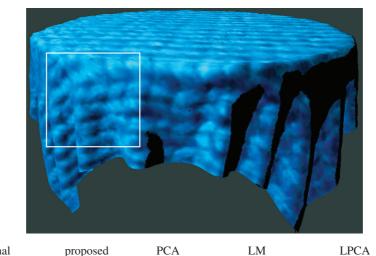


Figure 50: Visual comparison of the proposed method with different BTF compression methods for material **wood2**. The first row from left to right original, compressed using the proposed method, methods PCA, LM, and LPCA. The second row show difference from original for the individual methods.

Table 15: Overall erfor in BTF sample wood2				
distance measure	proposed	PCA	LM	LPCA
Compression ratio	1:278	1:14	1:16	1:275
median of $MSSIM_W$	0.1889	0.9929	0.9315	0.9923 †
median of $MSSIM_Y$	0.1122	0.9954	0.9330	0.9947 †
median of $\Delta \hat{E}$	51.51	3.43	9.68	3.22^{+}
median of MSE_W	5379.6	17.8	86.0	17.7^{\dagger}
mean of $MSSIM_W$	0.2118	0.9540	0.8922	0.9570 †
mean of $MSSIM_Y$	0.1415	0.9578	0.8955	0.9608 †
mean of $\Delta \hat{E}$	53.29	3.43	10.96	4.49^{\dagger}
mean of MSE_W	8839.0	20.5	197.2	23.1 [†]

Table 13: Overall error in BTF sample wood2



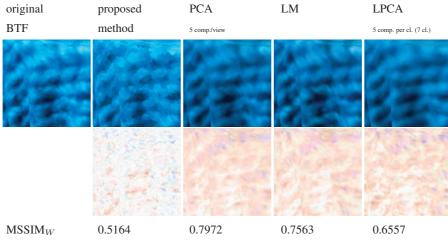


Figure 51: Visual comparison of the proposed method with different BTF compression methods for material **wool**. The first row from left to right original, compressed using the proposed method, methods PCA, LM, and LPCA. The second row show difference from original for the individual methods.

Table 14: Overall error in BTF sample wool				
distance measure	proposed	PCA	LM	LPCA
Compression ratio	1:233	1:14	1:16	1:275
median of MSSIM _W	0.4152	0.9919	0.9819	0.9870 [†]
median of $MSSIM_Y$	0.3953	0.9958	0.9881	0.9941 †
median of $\Delta \hat{E}$	6.85	3.81	5.41	4.71^{+}
median of MSE_W	177.9	77.2	136.2	131.6 [†]
mean of $MSSIM_W$	0.4130	0.9686	0.9534	0.9643 †
mean of $MSSIM_Y$	0.3911	0.9718	0.9587	0.9706 [†]
mean of $\Delta \hat{E}$	6.75	4.35	6.25	5.25^{++}
mean of MSE_W	200.9	88.3	174.4	154.2^{\dagger}

Table 14: Overall error in BTF sample wool

material	ceilingHDR	floortileHDR	pinktileHDR	walkwayHDR
Compression ratio	1:780	1:399	1:2397	1:279
median of $MSSIM_W$	0.5389	0.7716	0.9825	0.8084
median of $MSSIM_Y$	0.4283	0.7155	0.9784	0.7630
median of $\Delta \hat{E}$	0.0634	0.0046	0.0011	0.0193
median of MSE_W	0.0564	0.0004	0.0000	0.0047
mean of $MSSIM_W$	0.5295	0.7432	0.9660	0.7796
mean of $MSSIM_Y$	0.4175	0.6810	0.9579	0.7283
mean of $\Delta \hat{E}$	0.0700	0.0062	0.0016	0.0264
mean of MSE_W	0.0848	0.0019	0.0001	0.0251

Table 15: HDR samples comparison

5 Apparent BRDFs Comparison

In this section the original apparent BRDFs $F_{\mathbf{X}}$ and the results of the model are shown for ten tested BTF samples. The odd columns in each image are resampled BTF data into $[\alpha, \beta, \theta_v, \varphi_v]$ representation (see Fig.4 in article) while the even columns illustrates fitting of the proposed model. The individual angles discretization was set to $n_{\alpha} = 13$, $n_{\beta} = 13$, $n_{\theta_v} = 7$, and $n_{\varphi_v} = 16$.

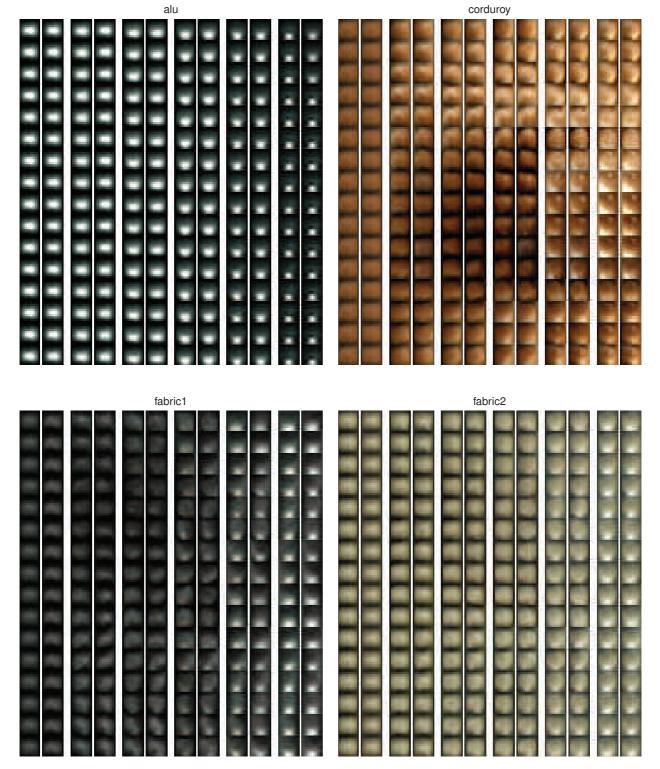


Figure 52: A comparison of original (odd columns) apparent BRDF $F_{\mathbf{X}}$ and its approximation by the proposed model (even columns).

Figure 53: A comparison of original (odd columns) apparent BRDF $F_{\mathbf{X}}$ and its approximation by the proposed model (even columns). wood1

foil1

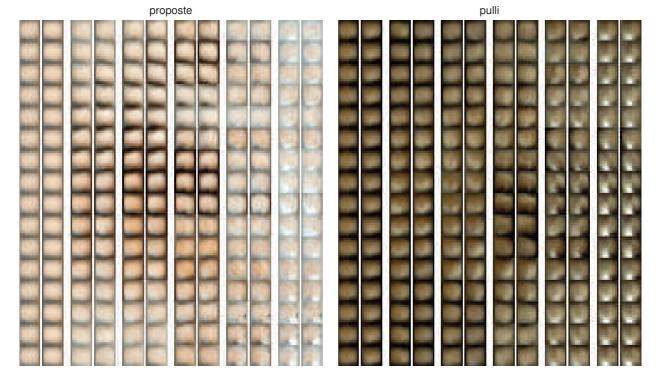


Figure 54: A comparison of original (odd columns) apparent BRDF $F_{\mathbf{X}}$ and its approximation by the proposed model (even columns).