

A Closed Loop between Microgeometry and BRDF for Wave Optics

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Given a material prototype whose visual appearance is determined by micro-scale details of its surface geometry, it's tempting to fabricate this appearance in any arbitrary shape. In this report, we investigate a closed loop between microgeometry in surface heightfields and the corresponding BRDFs for wave optics. We presented both derivations of BRDF from microgeometry, and vice versa using both geometric and wave optics methods.

Additional Key Words and Phrases: Computer Graphics, Wave Optics, Microfacet models, spatially-variant anisotropic BRDF

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1 INTRODUCTION

Novel materials fabricated in lab space are of small scales and possess complex surface geometry. These properties make them difficult to measure and simulate to produce realistic rendering results.

Realistic Rendering of novel materials is important for car industry. In car advertisements, they want to realistically recreate metal paints on the cars to match with their own appearance in real life. Being able to measure and render a material prototype allows preview of their products. Another potential application is for scientists to visualize their results in a virtual environment and have better analysis for their work

An established surface reflectance model is based on microfacet theory which states that the overall BRDF of the object can be modeled based on an arrangement of infinitesimally small facets.

But The way a surface reflects light is represented by its bidirectional reflectance distribution function (BRDF). The shape of a microfacet BRDF is primarily determined by the distribution of micro-scale surface normals, which is represented as a normal distribution function (NDF). Traditionally, simple distributions based on statistical assumptions about the surface, such as the Beckmann distribution, are used so that the parameters can be obtained by fitting to a relatively sparse set of BRDF measurements.[Walter et al. 2007; Zhao et al. 2014]

One approach in the past captured normal distribution by measuring microscopic surface topography. A profilometer that uses

white-light interferometry through a microscope was used to measure the height fields, and measurements were done at high resolution regions at micron scales. With these measurements, they predicted accurate BRDF from the geometric surface normals. This method successfully captures BRDF information with easy setup and little time, but their method only examined known metal materials such as stainless steel, aluminum, and copper.[Zhao et al. 2014]

The article explores both the realm of high resolution rendering and geometry fabrication, which we hope to form a closed loop between the two variables : surface microgeometry and BRDF. We first discusses derivation of BRDFs from measured heightfields using both geometric and wave optics methods. Alternatively, we discuss fabrication of surface height fields from BRDFs using milling process. The ultimate goal of this article is to acquire and fabricate accurate, high resolution physical surfaces based on real measurements of material prototype in micron-scale.

2 RELATED WORKS

2.1 Microfacet BRDF

Microfacet theory is a geometric optics model which represents a material as an arrangement of infinitesimally small specular facets. It has been shown to be efficient in reproducing the behavior of a wide range of real materials.[Dupuy and Jakob 2018] The resulting BRDF thus have three terms, the microfacet Normal Distribution Function, a Fresnel term based on the material's complex index of refraction, and a shadow-masking term to ensure energy conservation. Out of the three terms, the most important is NDF since it is used to determine the pattern of reflected light. Many different parametric forms have been proposed to account for NDF. To model anisotropies of materials, Ward [Ward 1992] applied the anisotropic Beckmann distribution, which ignored the Fresnel and the shadowing masking term for simplicity. Walter [Walter et al. 2007] introduced the GGX distribution which is better suited to modelling spatial variations in materials.

Microfacet theory assumes the diffraction effects can be ignored using geometric optics. But such an assumption holds only when micro-surfaces are locally flat compared to the wavelength. In reality, material surfaces break this assumption. The above methods has not addressed their limits to the actual microgeometry of surfaces. Zhao [Zhao et al. 2014] measured surface geometry and developed a modified NDF estimation in a geometric optics context to accurately predict BRDFs for anisotropic materials.

2.2 Modeling Microgeometry

Zhao [Zhao et al. 2014] used X-ray computed tomography (CT) to measure the 3D structure of a small area of the cloth and acquire a volumetric model. They use multiple CT images to reconstruct density and orientation fields, then use optical parameters of the volumetric model to pattern match across the whole cloth to generate highly realistic results. Dong [Dong et al. 2015] measured surface

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microgeometry of metals using a profilometer which is generally found in photolithography and nanofabrication. Using a profilometer allows rapid BRDF acquisition with both high spatial and angular resolution, but it only predicts the first surface reflection for the surfaces. CT imaging, though slow in speed, captures the full 3D volumetric information and is suitable for complex, thick materials like textiles. Yan [Yan et al. 2014] captures the true normal distributions on a surface patch seen through a pixel.

2.3 Material Fabrication

Dong [Dong et al. 2010] presented a method for fabricating a material volume with a desired BSSRDF (bidirectional subsurface scattering reflectance distribution function). Optically thick materials whose subsurface scattering behavior is captured by diffusion approximation are stacked with varying thickness and composition and reproduce a wide variety of heterogeneous BSSRDFs. Hašan [Hašan et al. 2010] proposed a different pipeline process which produces both homogeneous and heterogeneous composites with a multi-material 3D printer instead of a milling machine and a 3D printed color texture as proposed by Dong et al [2010] Rouiller [Rouiller et al. 2013] uses analytic NDF as input to optimize a microgeometry that reproduces a normal distribution corresponds to the desired NDF, allowing fabrication of spatially varying BRDFs (svBRDFs) on 3D models.

2.4 Fabricating Microgeometry

Weyrich [2009] proposed a system for manufacturing physical surfaces given a user-specified BRDF using milling machines. The derived surface height field has high angular resolution, but the spatial resolution is limited. Levin et al. [2013] incorporated wave optics into fabrication design, and fabricated spatially varying BRDF using photolithography, improving spatial resolution up to 220 dpi (dots per inches). Alternatively, Schwartzburg et al [2014] presented an algorithm for inverse caustic design by integrating adaptive Voronoi discretization scheme. Their methods enabled high-contrast target images.

3 METHODS

Our goal is to reproduce complex surface appearances in high spatial resolution for material surfaces given information about height fields. In addition, we hope to fabricate heightfields given existing BRDFs, forming a closed loop between the two variables. Given the limits of access to optical profilometer, we use prior height field data to reconstruct BRDF based on the following methods. Using microfacet theory to predict normal distribution function (NDF) as the primary determinant of a BRDF's shape. An alternative method is based on approximating the micron-resolution surface wave effects using Gabor kernels (products of Gaussians with complex exponentials). In section 4, we will first discuss wave optics theory. Section 5 describes microfacet theory. section 6 will introduce efficient BRDF evaluation using Gabor kernels. Section 7 touches on the derivation of heightfield from BRDF.

Diffraction BRDF model	ξ_1	ξ_2	ξ_3
Kirchhoff	$\frac{ \psi \cdot n ^2 F}{4\lambda^2 \omega_i \cdot n \omega_o \cdot n }$	$1 - \frac{\psi \cdot \bar{H}(s)}{\psi \cdot n}$	$\psi \cdot n$

Table 1. List of symbols

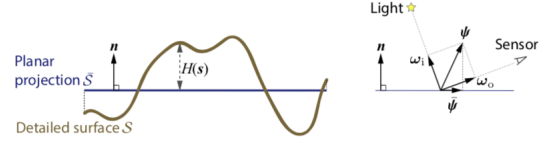


Fig. 1. Heightfield surface and BRDF directions example. [2014]

4 WAVE BRDF THEORY

In wave optics, light is considered as wave that satisfy certain boundary conditions and governing differential equations. Each wavelength (denoted as λ) is considered individually and encoded by magnitude and phase using complex-valued fields. The local light energy is characterized as squared magnitude of the field as that point. Certain scalar diffraction models, including Kirchhoff theory, can be used to estimate the reflected field from a rough surface. Unlike geometry optics, wave optics can result in characteristic diffraction effects, attributing from non-linear sum due to interference effects. [2014]

Given a surface heightfield $H(s)$ (seen Table 1) for a 2D point, $s = [s_x, s_y]$, we have a corresponding 3D point on the rough surface denoted as $[s_x, s_y, H(s)]$. Here, we are discretizing heightfield into texel of $1\mu m$ resolution, and our goal is to estimate the BRDF with these height information. Due to difference in local surface height, light reflecting from different parts of the surface will travel different distances. This causes phase shifts in reflected waves which can be described as interference to determine the BRDF.

These phase shifts can be approximated using a planar surface that reflects light with spatially-varying phase shift, specified by its reflection function [2014]:

$$R(s) = \xi_2 e^{-i \frac{2\pi}{\lambda} \xi_3 H(s)} \quad (1)$$

A typical diffraction models we use is Kirchhoff model with values of ξ_2 and ξ_3 specified in Table 2. Here, we represent directions ω_i and ω_o as 3D unit vectors. Let $\psi = \omega_i + \omega_o$ and $\bar{\psi}$ be its 2D projection on XY plane as seen in Table 2. The BRDF of this planar representation can be computed using a surface integral of the form:

$$f_r(\omega_i, \omega_o) = \frac{\xi_1}{A_S} \left| \int_S R(s) e^{-i \frac{2\pi}{\lambda} (\bar{\psi} \cdot s)} ds \right|^2 \quad (2)$$

where \bar{S} is the domain of the heightfield, A_S is its area, and ξ_i depends on the chosen BRDF model.

4.1 Coherence area

Kirchhoff diffraction model simulates incident lights as coherent light wave, but in reality, the light sources from real scenes are

229	i	Imaginary unit for complex numbers,
230	λ	Wavelength of light
231	n	Average surface normal(equal to z axis)
232	s	2D point(on the XY plane)
233	$H(s)$	Height of surface above s
234	\bar{S}	domain of height function
235	$A_{\bar{S}}$	Area of \bar{S}
236	ω_i	Direction of incident light (3D unit vector)
237	ω_o	Direction of reflected light (3D unit vector)
238	ψ	$\psi = \omega_i + \omega_o$
239	$\bar{\psi}$	2D projection of ψ on XY plane
240	f_x	Bidirectional reflectance distribution function (BRDF)
241	F	surface reflectance
242	ξ_1, ξ_2, ξ_3	see Figure 2

Table 2. List of symbols

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much more complicated, so an infinite coherence area as shown in equation 2 is impractical. Thus, we define the spatial area over which the phase of light remains coherent is called the coherence area. This area is usually inversely correlated to the solid angle. For a simple uniform source, the coherence area is approximately given by $A_c \approx \lambda^2/\Omega_l$, where Ω_l is the solid angle subtended by light source in steradians [Mandel and Wolf 1995]. To account for the effect of coherence area, we spatially limit the surface integral using coherence kernels $w(s)$, and then take an average of the resulting BRDF over the region of interest. The principle effect of limiting the coherence area is the blurring of the BRDF. The BRDF estimation over one coherence area now becomes

$$261 \quad f_r(\omega_i, \omega_o) = \frac{\xi_1}{A_c} \left| \int_{\bar{S}_c} R^*(s) e^{-i\frac{2\pi}{\lambda}(\bar{\psi} \cdot s)} ds \right|^2 \quad (3)$$

$$264 \quad R^*(s) = w(s - x_c)R(s) \quad (4)$$

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where \bar{S}_c is the portion of \bar{S} within the support of the coherence kernel centered at x_c , the corresponding normalization factor is $A_c = \int |w(s)|^2 ds$, and R^* is the product of $R(s)$ and the coherence kernel.[2014]. Generally, the actual coherence area depends of the details of the lighting configuration which is unknown in advance, so we can't predict the exact coherence area. Although overestimation and underestimation can cause problems such as high angular frequency aliasing and over-blurring of the BRDF, we can resolve this by capturing more light samples.

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To simplify rendering procedure, we applied a fixed size coherence area over the entire region and use a Gaussian with standard deviations of 10 microns for w [Werner et al. 2017].

278 5 MICROFACET THEORY

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Microfacet theory considers a surface as a collection of tiny flat mirror facets, that obey geometric optics. At each point, the surface reflects incident light to their corresponding mirror direction based on the local surface normal. So light coming from incident direction ω_i will only be reflected to out direction ω_o by facets on the surface whose normals are equal to ψ . The area density with

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a given local normal is described by the surface's normal distribution function(NDF) [2014]. The BRDF function corresponding to the microfacet model is given by

$$292 \quad f_r(\omega_i, \omega_o) = \frac{D_M(\psi)F(\omega_i, \psi)G(\omega_i, \omega_o)}{4|\omega_i \cdot n||\omega_o \cdot n|} \quad (5)$$

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where D_M is the surface's normal distribution function, F is the Fresnel term, G is a shadowing-masking term, and n is the average of the normal. [2014]. The Fresnel term is determined by the material type and can be computed based on its reflectance index and extinction coefficients. The shadow-masking term is used for energy conservation and is typically close to one. So the most important function is the normal distribution function.

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Traditional Microfacet theory neglects wave effects including diffraction, so it can't accurately capture the roughness at scales near the wavelength of light. To simulate BRDF results, [2014] devised a filtered geometric NDF estimation. A surface's normal distribution function (NDF) is a density function over the sphere of directions that is proportional to the surface area with a given surface normal m [2014]. The NDF can be defined geometrically as

$$306 \quad D_M(m) = \lim_{|\Omega_m| \rightarrow 0} \frac{A(\Omega_m)}{|\Omega_m|A_S^\perp}, \quad (6)$$

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where Ω_m is a solid angle containing the direction m , $A(\Omega_m)$ is the area of surfaces whose normals are inside Ω_m , and A_S^\perp is the total projected surface area in the direction of the large scale surface normal n .

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To account for the effects of wave optics which surface details below wavelength-scale has much reduced influence on BRDF. We propose a modified NDF estimation that uses a Gaussian filter to reduce the influence of small scale features.

317 6 EFFICIENT BRDF EVALUATION

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In this section, we would discuss approaches to efficiently evaluate the BRDF integrals for our wave optics diffraction models. One idea is to approximate the phase-delay reflection function $R^*(s)$ by a weighted combination of *Gabor kernels*, which are products of a 2D Gaussian with a complex exponential (plane wave). These kernels contain desirable properties that represents high frequency features seen in $R^*(s)$

326 6.1 Gabor kernels

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We define a Gabor kernel as the product of a 2D Gaussian and a complex exponential:

$$330 \quad g(s; \mu; \sigma, a) = G_{2D}(s; \mu, \sigma) e^{-i2\pi(a \cdot s)} \quad (7)$$

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where $G_{2D}(s; \mu, \sigma) = \frac{1}{2\pi\sigma^2} \exp(-\frac{\|s-\mu\|^2}{2\sigma^2})$ is a normalized 2D Gaussian isotropic[Yan et al. 2014]. μ is the center, σ the width, and a the plane wave parameter.

336 6.2 Approximating R with Gabor kernels

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Here, we adapted our approximation algorithm from Yan et al.[2014]. We first subdivide our height field domain \bar{S} into uniform grid of cells. The size of these cells should match the original height field texels. Next, we select a set of cells, whose centers are located at m_k that covers the current coherence kernel we are integrating over. We

343 treat the coherence kernel over a cell as constant with value of
 344 $w_k = w(m_k - x_c)$ [2014] since the area of the cell is much smaller
 345 than that of the coherence area. Then we place a Gabor kernel centered
 346 in each of the grid to approximate reflection function $R(s)$
 347 in its neighbor, and this provides us with an approximation of the
 348 $R^*(s)$ expressed as :

$$349 R^*(s) \approx \sum_k w_k R_k(s) = \sum_k w_k C_k g(s; m_k, \sigma_k, a_k) \quad (8)$$

350 , where C_k is a complex constant, incorporating an appropriate
 351 scaling coefficient that incorporates both an appropriate scaling
 352 coefficient and phase shift.

353 We then approximate the heightfield $H(s)$ in each cell using
 354 first order expansion of m_k which results :

$$355 H(s) \approx H(m_k) + H'(m_k) \cdot (s - m_k) \quad (9)$$

$$356 = H'(m_k) \cdot s + (H(m_k) - H'(m_k) \cdot m_k) \quad (10)$$

357 where $H'(m_k)$ is the gradient of the heightfield at m_k . [2014]. Given
 358 this approximation, we now substitute this equation back to our
 359 original definition of $R(s)$ in equation 1, which we approximate the
 360 contribution of a single cell as

$$361 R_k(s) = B_{2D}(s; m_k, l_k) \xi_2 e^{-\frac{i2\pi\xi_3}{\lambda} H(s)} \quad (11)$$

$$362 \approx l_k^2 G_{2D}(s; \mu_k, \sigma_k) \xi_2 e^{-\frac{i2\pi\xi_3}{\lambda} (\alpha_k + H'(m_k) \cdot s)} \quad (12)$$

363 where $\alpha_k = H(m_k) - H'(m_k) \cdot m_k$ as the result of first order ap-
 364 proximation. B_{2D} is a binary box function inferring the domain of
 365 the grid cell, which integrates to the cell's area l_k^2 . Subsequently, we
 366 replace this box function with a 2D Gaussian function covering the
 367 same area. Lastly, by comparing the result from equation 12 to that
 368 of equation 8, we have

$$369 C_k = l_k^2 \xi_2 e^{-\frac{i2\pi\xi_3}{\lambda} (H(m_k) - H'(m_k) \cdot m_k)} \quad (13)$$

$$370 a_k = \frac{\xi_3 H'(m_k)}{\lambda} \quad (14)$$

371 6.3 BRDF Approximation

372 Lastly, we can use the Gabor kernel approximation derived earlier
 373 to evaluate the BRDF. Using equation 5, we get

$$374 \hat{f}_r(\omega_i, \omega_o) = \frac{\xi_1}{A_c} \left| \sum_k w_k C_k \mathcal{F}[g(s; m_k, \sigma_k, a_k)] \left(\frac{\vec{y}}{\lambda} \right) \right|^2 \quad (15)$$

375 ,where the fourier transform is defined as

$$376 \mathcal{F}[f](v) \equiv \int_{\mathbb{R}^2} f(s) e^{-i2\pi(s \cdot v)} ds \quad (16)$$

377 7 FROM BRDF TO HEIGHTFIELD

378 7.1 BRDF to Microfacet Distribution

379 In order to form a close loop, we now seek for the inverse process,
 380 namely converting BRDFs to heightfields. Here, we adopt method
 381 presented by Weyrich et al.[2009] and introduce fabrication of mi-
 382 crogeometry using a milling machine. Note that the derivation is
 383 different depending on the fabrication process we are using. For
 384 instance, photolithography prefers surfaces which are composed
 385 of a small number of piece-wise flat layers, while milling prefers
 386 continuous depth surface.[Levin et al. 2013; Weyrich et al. 2009]

400 We first represent BRDF as half-angle distribution, then we convert
 401 this distribution into the desired normal distribution function, by
 402 accounting the base BRDF. The effect of BRDF can be treated as a
 403 convolution. Removing the effect involves solving a deconvolution
 404 problem. Here, we use the iterative Lucy-Richardson deconvolution
 405 algorithm

406 7.2 Microfacet Distribution to Height Field

407 In principle, there may exist an infinite possibility of height field
 408 that produces the same microfacet distribution, but not every distri-
 409 bution describes a continuous tileable surface and can be fabricated.
 410 To constraint the problem, we need to satisfy the following con-
 411 straint, which by rotating the microfacet distribution, its mean is
 412 perpendicular to the surface. Given this precondition, we devise a
 413 sampling method and optimization scheme to maximize tileability,
 414 and minimize discontinuities. Lastly, we solve for the optimal height
 415 of each facet.

416 **Sampling** A possible sampling method is to apply importance
 417 sampling. Since the order of the microfacets does not impact the dis-
 418 tribution, using low-discrepancy sampling techniques will achieve
 419 great-fidelity while maintaining a low noise level. Since we have
 420 no direct control of the "brightness" over the microfacet distribu-
 421 tion(light is reflected based on the base BRDF which we eliminated
 422 in the previous step), we employ a centroidal Voronoi tessellation
 423 technique to place the sample proportional to the local density,
 424 while maintaining a good global distribution of the samples [2009].

425 **Optimization** Given the desired sets of microfacets we sample,
 426 we need to optimize our tiles to meet the necessary preconditions:
 427 a smooth, manufacturable surface. Here, we formulate this mini-
 428 mization problem as a combination of three heuristical energy
 429 functions. The first energy function $C = C_x + C_y$, penalizes slope
 430 incompatibility between adjacent facets in x and y direction:

$$431 C_x = \frac{1}{4} \sum_y \sum_x \left\| \frac{dz(x+1, y) - dz(x, y)}{dy} \right\|^2 \quad (17)$$

432 and C_y analogously.[2009]. This equation enforces neighboring
 433 facets have a similar slope along their common edges. Next, we
 434 enforce integrability along rows and columns by minimizing the
 435 second energy function $I = I_x + I_y$, ensuring that in a cyclic arrange-
 436 ment, the derivatives along each row or column sum to zero

$$437 I_x = \sum_y \left\| \sum_x \frac{dz(x+1, y) - dz(x, y)}{dx} \right\|^2 \quad (18)$$

438 ,and I_y analogously [2009]. Lastly, since we are using milling ma-
 439 chine, we need to account for the shape of milling bits. For instance,
 440 we cannot manufacture arbitrary concave shape since such a shape
 441 would introduces erroneous angles of reflection. To reduce this prob-
 442 lem, we introduce the last term $V = V_x + V_y$ adds a constant penalty
 443 when two neighboring facets form a concave slope

$$444 V_x = w_v |(x, y)| \left| \frac{dz(x+1, y)}{dx} > \frac{dz(x, y)}{dx} \right| \quad (19)$$

445 and V_y analogously, with w_v as a weighting term depending on the
 446 relative influence of concavity compared to other penalty functions
 447 [2009].

Integration Provided with the optimal 2D arrangement of the microfacets using the previous optimizations, we seek to optimize for maximal continuity in height field by shifting each facet along z direction to their optimal heights. We describe this problem as a discrete Poisson equation

$$\nabla^2 z = \text{div} g \quad (20)$$

, with a gradient field $g = (g_x, g_y)$ and the condition for seamless facet connectivity in the direction being

$$g_x(x, y) = \frac{1}{4} \frac{dz(x-1, y)}{dx} + \frac{1}{2} \frac{dz(x, y)}{dx} + \frac{1}{4} \frac{dz(x+1, y)}{dx} \quad (21)$$

and g_y analogously. As we aim a tileable arrangement given a cyclic system, a Dirichlet boundary condition at a single point suffice to solve the equation.

8 RESULTS AND DISCUSSIONS

We adapted implementation of Gabor kernel solution from Yan et al. [2014], and tested on simulated isotropic and scratched height fields as well as height fields of aluminum captured using profilometer provided by zhao et al [2014]. The results we acquired from the isotropic and scratched heightfields are shown in Figure 2. As for the aluminum surface heightfields, we stitched several patches from the measured data to form an image of size 1024x1024 pixels, and ran the BRDF integration at a wavelength of 0.11 microns, similar to the size of each texel as reported by zhao et al [2014]. However, the derivation we received does not seem reasonable. On the other hand, we derived the NDF for Aluminum 4, copper 4, and Qpanel which is a steel plate with an isotropic rough finish using heightfields data from zhao et al [2014] and Kirchoff diffraction model as shown in figure 3. Due to the time constraint, we didn't get to the other direction of the closed loop: fabricating microgeometry from BRDF. In the future, we would like to derive a heightfields and potentially manufacture these heightfields distribution using various methods such as photolithography and milling.

8.1 Conclusions

In this report, we presented ideas and methods to form a closed loop between heightfields and BRDFs using wave optics. We discussed derivation of BRDFs with measured heightfields in micron scale using either Gabor kernel or microfacet theory. In addition, we discussed methods for fabricating microgeometry from BRDFs, specifically using milling. In results, we showed the BRDF results with simulated isotropic and scratched heightfields, but couldn't get the results for real measurements. Alternatively, we presented the NDF results using Kirchoff diffraction model for Aluminum 4, Copper 4, and Qpanel. We didn't obtain results of microgeometry from BRDF due to the time constraints, but we hope to achieve this in the future.

REFERENCES

Yue Dong, Jiaping Wang, Fabio Pellacini, Xin Tong, and Baining Guo. 2010. Fabricating Spatially-Varying Subsurface Scattering. In *ACM SIGGRAPH 2010 Papers (SIGGRAPH '10)*. Association for Computing Machinery, New York, NY, USA, Article Article 62, 10 pages. <https://doi.org/10.1145/1833349.1778799>

Zhao Dong, Bruce Walter, Steve Marschner, and Donald P Greenberg. 2015. Predicting Appearance from Measured Microgeometry of Metal Surfaces. *ACM Transactions on Graphics* 15, 1 (December 2015). <https://doi.org/10.1145/2815618>

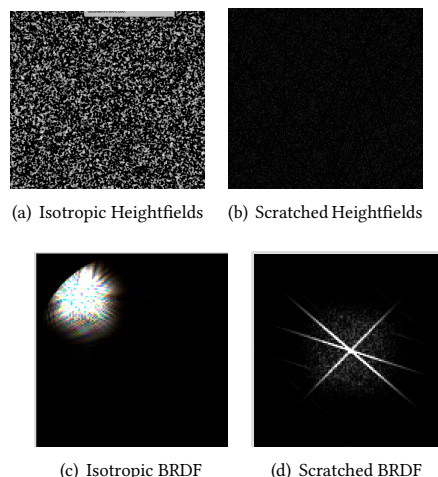


Fig. 2. The heightfields of different surfaces and their corresponding BRDFs

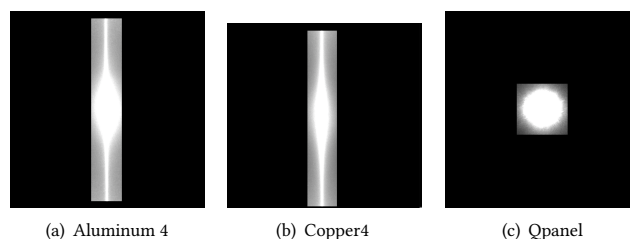


Fig. 3. The NDF of Aluminum 4, Copper 4, and Qpanel using Kirchoff diffraction model

Jonathan Dupuy and Wenzel Jakob. 2018. An Adaptive Parameterization for Efficient Material Acquisition and Rendering. *ACM Trans. Graph.* 37, 6, Article Article 274 (Dec. 2018), 14 pages. <https://doi.org/10.1145/3272127.3275059>

Miloš Hašan, Martin Fuchs, Wojciech Matusik, Hanspeter Pfister, and Szymon Rusinkiewicz. 2010. Physical Reproduction of Materials with Specified Subsurface Scattering. In *ACM SIGGRAPH 2010 Papers (SIGGRAPH '10)*. Association for Computing Machinery, New York, NY, USA, Article Article 61, 10 pages. <https://doi.org/10.1145/1833349.1778798>

Anat Levin, Daniel Glasner, Ying Xiong, Frédo Durand, William Freeman, Wojciech Matusik, and Todd Zickler. 2013. Fabricating BRDFs at High Spatial Resolution Using Wave Optics. *ACM Trans. Graph.* 32, 4, Article 144 (July 2013), 14 pages. <https://doi.org/10.1145/2461912.2461981>

Leonard Mandel and Emil Wolf. 1995. *Optical Coherence and Quantum Optics*. Cambridge University Press. <https://doi.org/10.1017/CBO9781139644105>

Olivier Rouiller, Bernd Bickel, Wojciech Matusik, Marc Alexa, and Jan Kautz. 2013. 3D-Printing Spatially Varying BRDFs. *IEEE Comput. Graph. Appl.* 33, 6 (Nov. 2013), 48–57. <https://doi.org/10.1109/MCG.2013.82>

Yuliy Schwartzburg, Romain Testuz, Andrea Tagliasacchi, and Mark Pauly. 2014. High-Contrast Computational Caustic Design. *ACM Trans. Graph.* 33, 4, Article 74 (July 2014), 11 pages. <https://doi.org/10.1145/2601097.2601200>

Bruce Walter, Stephen R. Marschner, Hongsong Li, and Kenneth E. Torrance. 2007. Microfacet Models for Refraction through Rough Surfaces. In *Proceedings of the 18th Eurographics Conference on Rendering Techniques (EGSR'07)*. Eurographics Association, Goslar, DEU, 195–206.

Gregory J. Ward. 1992. Measuring and Modeling Anisotropic Reflection. *SIGGRAPH Comput. Graph.* 26, 2 (July 1992), 265–272. <https://doi.org/10.1145/142920.134078>

Sebastian Werner, Zdravko Velinov, Wenzel Jakob, and Matthias B. Hullin. 2017. Scratch Iridescence: Wave-Optical Rendering of Diffractive Surface Structure. *ACM Trans. Graph.* 36, 6, Article 207 (Nov. 2017), 14 pages. <https://doi.org/10.1145/3130800.3130840>

571	Tim Weyrich, Pieter Peers, Wojciech Matusik, and Szymon Rusinkiewicz. 2009. Fabricating Microgeometry for Custom Surface Reflectance. <i>ACM Trans. Graph.</i> 28, 3, Article 32 (July 2009), 6 pages. https://doi.org/10.1145/1531326.1531338	628
572		629
573	Ling-Qi Yan, Miloš Hašan, Wenzel Jakob, Jason Lawrence, Steve Marschner, and Ravi Ramamoorthi. 2014. Rendering Glints on High-Resolution Normal-Mapped Specular Surfaces. <i>ACM Trans. Graph.</i> 33, 4, Article Article 116 (July 2014), 9 pages. https://doi.org/10.1145/2601097.2601155	630
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