#### **Bidirectional Scattering Distribution Functions**

UCSD CSE 272 Advanced Image Synthesis

Tzu-Mao Li

lots of images/figures from Eric Heitz/Jonathan Dupuy/Wenzel Jakob



#### BSDFs describe reflection/transmission properties



 $f_{\mathbf{p}}(\omega, \omega') L(\mathbf{p}', -\omega') | n_{\mathbf{p}} \cdot \omega' | d\omega'$ 





# BSDFs describe reflection/transmission properties $(\mathcal{D})$

 $f_{\mathbf{p}}(\omega, \omega')$ 



# BSDFs describe reflection / transmission properties $(\mathbf{I})$ ()

 $f_{\mathbf{p}}(\omega, \omega')$ 





## BSDFs describe reflection / transmission properties () $(\mathcal{O})$ rough

 $f_{\mathbf{p}}(\omega, \omega')$ 







## BSDFs describe reflection / transmission properties $(\mathbf{0})$ $(\mathcal{O})$ shiny

 $f_{\mathbf{p}}(\omega, \omega')$ 









## BSDFs describe reflection / transmission properties () $(\mathcal{O})$

 $f_{\mathbf{p}}(\omega, \omega')$ 





## Isotropic BRDFs vs anisotropic BRDFs

#### $f_r(\theta', \phi', \theta, \phi) = f_r(\theta', \theta, \phi' - \phi)$

• isotropic BRDFs: reduces 4D BRDFs to 3D by only considering differences in azimuth angles







## Isotropic BRDFs vs anisotropic BRDFs



#### isotropic: circular highlights





#### anisotropic: "directional" highlights





# Reciprocity of BSDFs . Q'

#### **quiz 1:** why and when will this hold?

#### $f_{\mathbf{p}}(\omega, \omega') = f_{\mathbf{p}}(\omega', \omega)$

https://icons8.com/icons/set/flashlight https://icons8.com/icons/set/camera

quiz 1: why and when will this hold? quiz 2: what is the consequence of a non-reciprocal BSDF?

$$f_{\mathbf{p}}(\boldsymbol{\omega},\boldsymbol{\omega}') = f_{\mathbf{p}}(\boldsymbol{\omega}',\boldsymbol{\omega})$$

https://icons8.com/icons/set/flashlight https://icons8.com/icons/set/camera







Figure 5.2: When light enters a medium with a higher refractive index, the same light energy is squeezed into a smaller volume. This causes the radiance along each ray to increase.

**ROBUST MONTE CARLO METHODS** FOR LIGHT TRANSPORT SIMULATION







Figure 5.2: When light enters a medium with a higher refractive index, the same light energy is squeezed into a smaller volume. This causes the radiance along each ray to increase.

"real" reciprocity principle:

 $f_{\mathbf{p}}(\omega, \omega')$  $f_{\mathbf{p}}(\omega',\omega)$ 

**ROBUST MONTE CARLO METHODS** FOR LIGHT TRANSPORT SIMULATION





Figure 6.2: When absorbing media such as metals are present, the path of a light beam is not always reversible. For example, when a light beam  $A_i$  is transmitted from air into some metals, there is a non-zero angle of incidence  $\theta_0$  for which the beam does not change its direction of propagation (Figure (a)). However, a beam of light  $B_i$  traveling in the reverse direction (from metal into air) is refracted at the surface, and follows a different path (Figure (b)).

absorbing media breaks reciprocity

**ROBUST MONTE CARLO METHODS** FOR LIGHT TRANSPORT SIMULATION





magnetic field (rotates the electric field oscillation regardless of the polarization direction)

polarized ray (electric field where the electrons only oscillate in one direction)

**ROBUST MONTE CARLO METHODS** 

FOR LIGHT TRANSPORT SIMULATION



## Energy conservation of BSDFs

 $\int f_{\mathbf{p}}(\boldsymbol{\omega}, \boldsymbol{\omega}') \left| n_{\mathbf{p}} \right|$ 

**quiz:** what happens if your BSDF is not energy conserving?

$$\mathbf{p} \cdot \omega' \mid \mathrm{d}\omega' \leq 1$$



• we can actually measure it!



real material

quiz: how would you design a device for this?



https://icons8.com/icons/set/flashlight https://icons8.com/icons/set/camera



• we can actually measure it!



#### A Data-Driven Reflectance Model

Wojciech Matusik \*Hanspeter Pfister †Matt Brand †L



• we can actually measure it!



robot arm for BSDF measurement @ UCSD

https://cseweb.ucsd.edu/~ravir/nearfield.pdf



• we can actually measure it!



the robot arm in action @ EPFL

video from Wenzel Jakob <u>https://rgl.epfl.ch/pages/lab/pgII</u>



### Measuring BRDFs is time/memory consuming



need to measure a 4D domain

100 samples at each dimension:  $100^{4} = 100,000,000$  (100 million samples) 1 second per sample: 3 years 380 MB per wavelength







#### Trick 1: focus on mirror reflection direction

• by applying a change of variable (again!)



amazing illustrations from Jonathan Dupuy http://onrendering.com/data/papers/powitacq/slides/powitacq.html

Szymon Rusinkiewicz, "A New Change of Variables for Efficient BRDF Representation", 1998







#### Trick 1: focus on mirror reflection direction

• by applying a change of variable (again!)

define half-vector H = normalize( $\omega + \omega'$ )

idea:

measure differences between normals/directions & the half-vector

Szymon Rusinkiewicz, "A New Change of Variables for Efficient BRDF Representation", 1998

when  $H = n_{\mathbf{p}}$  $\omega$  and  $\omega'$  are mirror reflection directions





#### Trick 1: focus on mirror reflection direction

• by applying a change of variable (again!)

idea: measure differences between normals/directions & the half-vector

change of variable:  $(\theta, \phi, \theta', \phi') \rightarrow (\theta_h, \phi_h, \theta_d, \phi_d)$ 

https://www.cs.princeton.edu/~smr/papers/brdf\_change\_of\_variables/brdf\_change\_of\_variables.pdf

Szymon Rusinkiewicz, "A New Change of Variables for Efficient BRDF Representation", 1998







### Trick 2: focus on elevation, ignore azimuth

- assume the BSDF does not change over azimuthal angles (not always true)
  - "isotropic BSDF"









## Trick 3: estimate the roughness

Jonathan Dupuy and Wenzel Jakob, "An Adaptive Parameterization for Efficient Material Acquisition and Rendering", 2018

• and apply another change of variable to scale the samples!



(still need ~2 hours to measure a material after all these tricks)





## The MERL BSDF dataset [Matusik 2003]



#### most popular data 100 isotropic BRDFs

warning: not a perfect dataset! lots of camera artifacts (defocus/bokeh/lens flare)

#### **A Data-Driven Reflectance Model**

Wojciech Matusik \* Hanspeter Pfister<sup>†</sup> Matt Brand<sup>†</sup>



Leonard McMillan<sup>‡</sup>

## MERL anisotropic extension



renderings



satin



velvet

actual photographs

#### 4 anisotropic BRDFs

#### **Experimental Analysis of BRDF Models**

Addy Ngan, Frédo Durand,<sup>†</sup> and Wojciech Matusik<sup>‡</sup>

MIT CSAIL

MERL



#### Brushed metal: common anisotropic material



#### real photograph

https://en.wikipedia.org/wiki/Brushed\_metal





## EPFL material database [2018]

50 isotropic BRDFs 12 anisotropic BRDFs (probably much higher quality than MERL)

http://onrendering.com/data/papers/powitacq/slides/powitacq.html



### Downsides of measured BSDFs

quiz: what are they?



## Downsides of measured BSDFs

- capturing is time consuming
  - very few of them
- does not support texturing





can't support spatially varying roughness with measured BSDF



## Remedy: let's fit a model to the data!

#### $f_{\mathbf{p}}(\omega, \omega') = \text{some parametric function}$



## Remedy: let's fit a model to the data!

#### $f_{\mathbf{p}}(\omega, \omega') = \text{some parametric function}$

**quiz**: would neural nets be a good idea? why? why not?



#### How to build a model: make physical assumptions

• **explain** and **predict** the behavior of our data

#### $f_{\mathbf{p}}(\omega, \omega') = \text{some parametric function}$

#### based on derivations from simple physical assumptions

https://en.wikipedia.org/wiki/Reductionism


• assumption: surfaces are made of infinitely many little mirrors (microfacets)



Figure inspired by Eric Heitz <u>https://jcgt.org/published/0003/02/03/</u>



- assumption: surfaces are made of infinitely many little mirrors (microfacets)
- BSDF directions  $\omega$  and  $\omega'$  are treated as parallel rays to the microsurface



microsurface

- assumption: surfaces are made of infinitely many little mirrors (microfacets)
- BSDF directions  $\omega$  and  $\omega'$  are treated as parallel rays to the microsurface

**quiz**: given directions  $\omega$  and  $\omega'$ , which microfacet mirror will reflect light?



- assumption: surfaces are made of infinitely many little mirrors (microfacets)
- BSDF directions  $\omega$  and  $\omega'$  are treated as parallel rays to the microsurface
  - given  $\omega$  and  $\omega'$ , only microsurfaces with normal  $m = H = \text{normalize}(\omega + \omega')$  will reflect light



- flat microsurfaces correspond to ...?
- bumpy microsurfaces correspond to ...?

flat microsurface

# 

bumpy microsurface



- flat microsurfaces correspond to shiny surfaces
- bumpy microsurfaces correspond to ...?

flat microsurface





bumpy microsurface

- flat microsurfaces correspond to shiny surfaces
- bumpy microsurfaces correspond to rough, diffusive surfaces

flat microsurface





bumpy microsurface



#### Describing microsurfaces using statistical distributions

• the normal distribution function D(m) describes the probability density of micronormals

• for flat microsurfaces,  $D(m = n_p)$  is very high, and  $D(m \neq n_p)$  is low 





#### Popular normal distribution function: Beckmann NDF $\mathcal{M}_7$

assumption: microfacets are from a heightfield with Gaussian "slopes"



see "Slope Space in BRDF Theory" if you're interested https://www.reedbeta.com/blog/slope-space-in-brdf-theory/



$$-\frac{m_x}{m_z} = \frac{\partial z}{\partial x} \sim N(0, \alpha_x^2)$$
$$-\frac{m_y}{m_z} = \frac{\partial z}{\partial y} \sim N(0, \alpha_y^2)$$

Figure from Eric Heitz & Lingqi Yan et al. https://eheitzresearch.wordpress.com/240-2/ <u>https://sites.cs.ucsb.edu/~lingqi/publications/paper\_glints.pdf</u>

 $m_y$ 

 $m_{Z}$ 



#### Popular normal distribution function: Beckmann NDF $\mathcal{M}_7$

 $m_y$ assumption: microfacets are from a heightfield with Gaussian "slopes"  $M_7$ 



see "Slope Space in BRDF Theory" if you're interested https://www.reedbeta.com/blog/slope-space-in-brdf-theory/ **quiz**: what does large alpha mean?

$$-\frac{m_x}{m_z} = \frac{\partial z}{\partial x} \sim N(0, \alpha_x^2)$$
$$-\frac{m_y}{m_z} = \frac{\partial z}{\partial y} \sim N(0, \alpha_y^2)$$

Figure from Eric Heitz & Lingqi Yan et al. https://eheitzresearch.wordpress.com/240-2/ https://sites.cs.ucsb.edu/~lingqi/publications/paper\_glints.pdf



#### Popular normal distribution function: Beckmann NDF

• assumption: microfacets are from a heightfield with Gaussian "slopes"  $\frac{m_y}{m_z}$ 

$$D(m) \propto \exp\left(-\frac{1}{2} \begin{bmatrix} \frac{m_x}{m_z} & \frac{m_y}{m_z} \end{bmatrix} \begin{bmatrix} \alpha_x^2 \\ 0 \end{bmatrix}\right)$$

see "Slope Space in BRDF Theory" if you're interested https://www.reedbeta.com/blog/slope-space-in-brdf-theory/



### Popular normal distribution function: Trowbridge-Reitz [1975] (aka GGX [Walter 2007])

• geometric intuition: the distribution of normals of an ellipsoid



Ground Glass Unknown







brilliant figures from Eric Heitz https://jcgt.org/published/0007/04/01/

### Popular normal distribution function: Trowbridge-Reitz [1975] (aka GGX [Walter 2007])



Ground Glass Unknown

$$\begin{array}{ccc} \alpha_x^2 & 0 \\ 0 & \alpha_y^2 \end{array} \right]^{-1} \left[ \begin{array}{c} m_x \\ m_z \\ m_y \\ \hline m_z \end{array} \right] \right)^2$$



#### Popular normal distribution function: Trowbridge-Reitz [1975] (aka GGX [Walter 2007]) Ground Glass Unknown

$$D_{\text{GGX}}(m) \propto \frac{1}{\left(1 + \frac{1}{2} \begin{bmatrix} \frac{m_x}{m_z} & \frac{m_y}{m_z} \end{bmatrix} \begin{bmatrix} \alpha_x^2 & 0 \\ 0 & \alpha_y^2 \end{bmatrix}^{-1} \begin{bmatrix} \frac{m_x}{m_z} \\ \frac{m_y}{m_z} \end{bmatrix} \right)^2} \qquad \begin{array}{c} 0.40 \\ 0.35 \\ 0.30 \\ 0.25 \\ 0.20 \\ 0.15 \\ 0.10 \\ 0.05 \\ 0.00 \\ -4 \end{array}$$

(multivariate student-t distribution with  $\nu = 2 \longrightarrow$  heavy tailed Gaussian)



see <u>https://en.wikipedia.org/wiki/Student%27s\_t-distribution</u> for intuition





### Beckmann vs GGX



#### Beckmann

#### **quiz**: what would GGX look like?



### Beckmann vs GGX



#### GGX

## Microfacets can block each other

- blocked
- need to specify the microsurface geometry profile



• normal distribution function *D* alone is not enough to determine how many mirrors are

# Smith microsurface profile [1960]

- most popular profile in graphics
  - alternative: V-cavity [Cook and Torrence 1982]
- Smith's assumption: microsurfaces are **spatially uncorrelated**

microsurface 



Figure from Eric Heitz <u>https://jcgt.org/published/0003/02/03/</u>



#### We can compute the portion of blocked microsurfaces $\hat{G}$ under Smith's assumption

# $\hat{G}(\omega, m) = \begin{cases} 0 & \text{if } \omega \cdot m \leq 0\\ \frac{\omega \cdot n_{p}}{\int (\omega \cdot m)D(m)dm} & \text{otherwise} \end{cases}$



often call the "shadowing masking term"

see "Understanding the Masking-Shadowing Function in Microfacet-based BRDFs", Eric Heitz https://jcgt.org/published/0003/02/03/





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often call the "shadowing masking term"

derivation: Smith's assumption implies  $\hat{G}(w,m) = \begin{cases} 0 & \text{if } \omega \cdot m \leq 0 \\ \hat{G}'(\omega) & \text{otherwise} \end{cases}$ we also know projected area conserves  $\omega \cdot n_{\mathbf{p}} = |\hat{G}(\omega, m)D(m)\omega \cdot mdm|$ see "Understanding the Masking-Shadowing Function in Microfacet-based BRDFs", Eric Heitz https://jcgt.org/published/0003/02/03/





#### The microfacet BRDF: counting visible micronormals at the half vector

 $f_{\mathbf{p}}(\omega, \omega')$ 







#### The microfacet BRDF: counting visible micronormals at the half vector $D(H)\hat{G}(\omega, H)\hat{G}(\omega', H)$ $f_{\mathbf{p}}(\omega, \omega')$







#### The microfacet BRDF: counting visible micronormals at the half vector $G(\omega, \omega', H) = \hat{G}(\omega, H)\hat{G}(\omega', H)$ $D(H)G(\omega, \omega', H)$ $f_{\mathbf{p}}(\omega, \omega')$









### The microfacet BRDF: counting visible micronormals at the half vector

 $f_{\mathbf{p}}(\omega, \omega')$ 

from analytically integrating over mirrors (lots of different Jacobians)



$$G(\omega, \omega', H)$$

$$n_{\mathbf{p}} \mid \omega' \cdot n_{\mathbf{p}}$$

 $H = \text{normalize}(\omega + \omega')$ 

(again, see Heitz <u>https://jcgt.org/published/0003/02/03/</u>)





#### The microfacet BRDF: counting visible micronormals at the half vector Fresnel equation $f_{\mathbf{p}}(\omega, \omega') = \frac{D(H)G}{|A| \omega}$



$$F(\omega, \omega', H) F(\omega, H)$$

$$F(\omega, H)$$





# The Cook-Torrance-Sparrow BRDF [1967, 1982]

# $f_{\mathbf{p}}(\omega, \omega') = \frac{D(H)G}{|}$





$$F(\omega, \omega', H)F(\omega, H)$$

#### $H = \text{normalize}(\omega + \omega')$

A Reflectance Model for Computer Graphics

ROBERT L. COOK Lucasfilm Ltd. and **KENNETH E. TORRANCE Cornell University** 











## The refraction extension [Walter 2007]

if reflect if refract

 $H_r = \text{normalize}(\eta \omega + \eta' \omega')$ 

see <u>http://www.graphics.cornell.edu/~bjw/microfacetbsdf.pdf</u> for the scary Jacobian





• light as wave behaves differently for glass-like materials (dielectrics) and metal-like materials (conductors)



real number  $\eta, \eta'$ 

## Fresnel equation



complex number  $\eta, \eta'$ 

#### For metals, the complex index of refraction varies with wavelength



(a) Measured copper material (the default), rendered using 30 spectral samples between 360 and 830nm

(b) Measured gold material (Listing 17)

images from Wenzel Jakob <u>https://www.mitsuba-renderer.org/releases/current/documentation.pdf</u>



# Fresnel equation for metal-like interfaces is scary & unintuitive

• also we don't have a lot of spectral data



complex number  $\eta, \eta'$ 

$$a^{2} = \frac{1}{2n_{i}^{2}} \left( \sqrt{(n_{t}^{2} - k_{t}^{2} - n_{i}^{2} \sin^{2} \theta)^{2} + 4n_{t}^{2} k_{t}^{2}} + n_{t}^{2} - k_{t}^{2} - n_{i}^{2} \sin^{2} \theta \right)$$

$$b^{2} = \frac{1}{2n_{i}^{2}} \left( \sqrt{(n_{t}^{2} - k_{t}^{2} - n_{i}^{2} \sin^{2} \theta)^{2} + 4n_{t}^{2} k_{t}^{2}} - n_{t}^{2} + k_{t}^{2} + n_{i}^{2} \sin^{2} \theta \right)$$

$$R_{s} = \frac{a^{2} + b^{2} - 2a \cos \theta + \cos^{2} \theta}{a^{2} + b^{2} + 2a \cos \theta + \cos^{2} \theta}$$

$$R_{p} = R_{s} \frac{a^{2} + b^{2} - 2a \sin \theta \tan \theta + \sin^{2} \theta \tan^{2} \theta}{a^{2} + b^{2} + 2a \sin \theta \tan \theta + \sin^{2} \theta \tan^{2} \theta}$$

using  $a^2$  and  $b^2$  with  $\eta$  and  $\eta_k$  as follow give the same result:

$$a^{2} = \frac{1}{2} \left( \sqrt{(\eta^{2} - \eta_{k}^{2} - \sin^{2} \theta)^{2} + 4\eta^{2} \eta_{k}^{2}} + \eta^{2} - \eta_{k}^{2} - \sin^{2} \theta \right)$$
$$b^{2} = \frac{1}{2} \left( \sqrt{(\eta^{2} - \eta_{k}^{2} - \sin^{2} \theta)^{2} + 4\eta^{2} \eta_{k}^{2}} - \eta^{2} + \eta_{k}^{2} + \sin^{2} \theta \right)$$

Derivation from conductor Fresnel equation can be found in [5] (p.111) and use

$$(n_t - \mathbf{i}k_t)\cos\theta_t = (n_t - \mathbf{i}k_t)\sqrt{1 - (\frac{n_i}{(n_t - \mathbf{i}k_t)}\sin\theta)^2} = \sqrt{(n_t - \mathbf{i}k_t)^2 - n_i^2\sin^2\theta}$$
$$a - \mathbf{i}b = \sqrt{(n_t - \mathbf{i}k_t)^2 - n_i^2\sin^2\theta}$$

In practice there is some simplification possible:

$$a^{2} + b^{2} = \sqrt{(\eta^{2} - \eta_{k}^{2} - \sin^{2}\theta)^{2} + 4\eta^{2}\eta_{k}^{2}}$$
$$\tan \theta = \frac{\sin \theta}{\cos \theta}$$
$$R_{p} = R_{s} \frac{\cos^{2} \theta (a^{2} + b^{2}) - 2a \cos \theta \sin^{2} \theta + \sin^{4} \theta}{\cos^{2} \theta (a^{2} + b^{2}) + 2a \cos \theta \sin^{2} \theta + \sin^{4} \theta}$$

### Graphics people use Schlick's approximation



#### $F \approx F_0 + (1 - F_0)(1 - \cos\theta)^5$

 $F_0 = \left(\frac{\eta - \eta'}{n + \eta'}\right)^2 \quad \text{for real index of refraction}$ 



small  $\cos \theta$ , F ~ 1



large  $\cos \theta$ , F ~ F0



### Graphics people use Schlick's approximation



highly recommend "Some Thoughts on the Fresnel Term" <u>https://www.youtube.com/watch?v=kEcDbl7eS0w</u> for metals

#### $F \approx \operatorname{color} + (1 - \operatorname{color})(1 - \cos\theta)^5$

metal becomes colorless/white at grazing angle





# Cook-Torrance-Sparrow BSDF fits well to MERL measured data!



#### measured (nickel material)



#### Cook-Torrance-Sparrow

from Ngan et al. "Experimental Analysis of BRDF Models" <u>http://people.csail.mit.edu/addy/research/ngan05\_brdf\_eval.pdf</u>



### Limitations of microfacet models

#### • from the EPFL dataset



aniso\_brushed\_aluminium



satin\_purple

#### strongly anisotropic but "hazy"

#### iridescence?

awesome material images from Jonathan Dupuy & Wenzel Jakob http://onrendering.com/data/papers/powitacq/slides/powitacq.html



aniso\_morpho\_melenaus

??? (butterfly wings)



https://rgl.epfl.ch/pages/lab/pgII



# Multiple scattering

• Cook-Torrance-Sparrow BSDF ignores multiple bounces inside the microsurfaces



# Multiple scattering

#### • ignoring multiple bounces lead to energy loss, esp. at high roughness $\alpha = 0.1$ $\alpha = 0.5$ $\alpha = 1.0$ $\alpha = 0.05$ $\alpha = 0.4$



images from Heitz et al. https://eheitzresearch.wordpress.com/240-2/


## Remedy: simulate multiple bounces inside the microsurfaces





See Heitz et al. "Multiple-Scattering Microfacet BSDFs with the Smith Model"



## Remedy: simulate multiple bounces inside the microsurfaces

• or not, see "Misunderstanding multiscattering" by Angelo Pesce https://c0de517e.blogspot.com/2019/08/misunderstanding-multiscattering.html



See Heitz et al. "Multiple-Scattering Microfacet BSDFs with the Smith Model"



## Next time: Uber BSDF

## • one BSDF to rule them all?

next Monday is MLK, so see you next Wednesday!

