# Estimating the glossiness transfer function induced by illumination change and testing its transitivity

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The light reflected from a glossy surface depends on the reflectance properties of that surface as well as the flow of light in the scene, the *light field*. We asked four observers to compare the glossiness of pairs of surfaces under two different real-word light fields, and used this data to estimate a transfer function that captures how perceived glossiness is remapped in changing from one real-world light field to a second. We wished to determine the form of the transfer function and to test whether for any set of three light fields the transfer function from light field 1 to light field 2 and the transfer function from light field 2 to light field 3 could be used to predict the glossiness transfer function from light field 1 to light field 3. Observers' estimated glossiness transfer functions for three sets of light fields were best described by a linear model. The estimated transfer functions exhibited the expected transitivity pattern for three out of four observers. The failure of transitivity for one observer, while significant, was less than 12.5% of the gloss range.

Keywords: perception of surface gloss, transitivity, glossiness transfer function, surface material perception, gloss constancy, complex illumination

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# Introduction

The perceived glossiness of a material depends on a number of parameters including the specular reflectance of the surface, specular blur, and the angles of the surface normal to the light sources and the line of sight. Hunter and Harold (1987) specified six distinct types of gloss each depending on a specific modification of those parameters. Early studies investigating the perception of surface gloss focused on the properties of specular highlights (Beck, 1972; Beck & Prazdny, 1981; more recently, Berzhanskaya, Swaminathan, Beck, & Mingolla, 2005). A specular highlight however only constitutes a special case of specular reflection (Figure 1A). Those that one usually encounters in daily life in indoor and outdoor settings are by far more complex. Advances in computer graphics (Debevec, 1998) have made it possible to capture real-world high dynamic range illuminations and to employ

these illumination maps in realistic renderings of objects and scenes, including glossy materials (Figure 1B).

Research using rendering techniques simulating complex light sources (light fields, Gershun, 1939) has shown that perceived glossiness also depends on the spatial distribution and intensity of light sources in the scene (Fleming, Dror, & Adelson, 2003). Fleming et al. (2003) showed that observers are able to match (though not perfectly) the gloss and surface roughness of CRT-displayed, monocularly viewed glossy surfaces rendered under two different real-world light fields drawn from a data base of light probes collected by Debevec (1998). However matching performance did not indicate that perception of gloss was independent of choice of light field (gloss constancy). Surfaces appeared less glossy under simple light fields generated by a small number of point sources than under real world light fields as those sampled by Debevec.

In summary, Fleming et al. showed that glossiness constancy is not perfect even among complex, real world

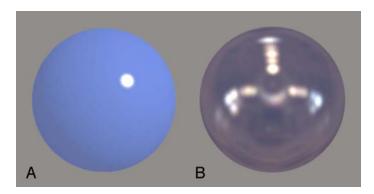


Figure 1. The same virtual object rendered under two different illuminants. The sphere is rendered using the model of Ward (1992). A. A collimated source. B. A real-world illuminant measured by Debevec (1998).

illuminations. While making an important contribution to our understanding of the perception of surface gloss, Fleming et al. did not quantify how changes in illumination affected perceived gloss. In this research we characterize how perceived glossiness varies as we move from one particular illumination environment to another by introducing the concept of the *glossiness transfer function*.

## The glossiness transfer function $\Gamma$

We would like to capture how the perceived glossiness of surfaces changes with changes in illumination. Consider Figure 2: A sphere with certain surface reflectance characteristics is rendered at different gloss levels under light probe (LP) 1 and compared to a second sphere with the same reflectance characteristics rendered at the same gloss levels under LP 2. The diamonds on the plot mark the points of perceived equal gloss. For example, the sphere rendered under LP 1 at level 5 is perceived to be as glossy as the sphere under LP 2 at level 3.

These points of equal perceived gloss trace an *isogloss* contour. We refer to this contour as the glossiness transfer function  $\Gamma_{1\rightarrow 2}$ . It describes how perceived glossiness is remapped in changing from one real world light field to a second. That is, if a surface has perceived glossiness  $g_1$  under LP 1 then it has perceived glossiness  $g_2 = \Gamma_{1\rightarrow 2}(g_1)$  under LP 2.

In the analysis below we first measure  $\Gamma$  for 10 different surfaces differing in glossiness under three different real-world light fields.

Second, we test the transitivity of the measured glossiness transfer functions,

$$\Gamma_{1\to 3} = \Gamma_{2\to 3} \circ \Gamma_{1\to 2},\tag{1}$$

where  $\Gamma_{1\rightarrow 2}$  is the glossiness transfer function from LP 1 to LP 2,  $\Gamma_{2\rightarrow 3}$  is the glossiness transfer function from LP 2 to LP 3,  $\Gamma_{1\rightarrow 3}$  is the glossiness transfer function from LP 1

to LP 3, and 'o' denotes composition of functions. That is, for any surface with perceived glossiness  $g_1$  under LP 1, we test whether  $g_3 = \Gamma_{2\rightarrow 3}(\Gamma_{1\rightarrow 2}(g_1))$  across the range of surfaces considered.

Intuitively, the transitivity test is a test of an implicit model of how human observers perceive glossiness. Given any surface under any illumination conditions, we assume that the visual system effectively estimates a single scale value that represents the perceived gloss of the surface. These numbers control judgments of glossiness and, in particular, when observers are asked to report which of two stimuli viewed under two light fields is glossier, they pick the stimulus with the higher scale value. If this model is correct, then observers' judgments will be transitive. A failure of transitivity would lead to rejection of the model just described.

How could the model fail? An evident possibility is that perceived gloss is not univariate but rather multivariate. If for example there are multiple cues to gloss, one based on the sharpness of edges, another on skewness of the intensity histogram (Motoyoshi, Nishida, Sharan, & Adelson, 2007), then the observer, may rely primarily on one glossiness cue in comparing surfaces under LP 1 and LP 2 and switch to a second cue in comparing surfaces under LP 2 and LP 3. If, for example, two light fields are produced by multiple light sources with sharp edges, it would be natural to rely on the sharpness of edges in comparing the glossiness of surfaces. For two light fields that are primarily diffuse, the skewness cue may be selected. If glossiness cues are not highly correlated

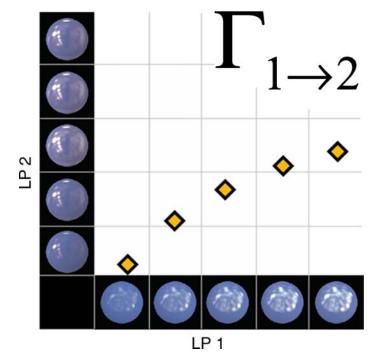


Figure 2. An illustration of the glossiness transfer function  $\Gamma$  for two light probes. Yellow diamonds represent points of perceived equal glossiness.

across surfaces and lighting conditions and the observer switches among cues in this way, there is no reason to expect transitivity. If the observer uses only a single cue or a fixed rule of combination on multiple cues, we expect transitivity.

Fundamentally, the transitivity test is a test of whether we should describe glossiness as a univariate perceptual attribute like lightness (Gilchrist, 2006; Gilchrist & Kossyfidis, 1999) or the result of a dynamic integration of possibly conflicting cues such as perception of depth (Landy, Maloney, Johnston, & Young, 1995).

## **Experiment**

## **Methods**

## Stimuli

The stimuli were three-dimensional spheres computerrendered with the Radiance software package (Larson & Shakespeare, 1996). We choose to work with stereo images in order to increase the realism of the renderings. The spheres were rendered under three different high dynamic range real world-illumination maps (Debevec, 1998) at 10 different specularity levels (Figure 3). To achieve different levels of gloss we varied the specular reflectance parameter  $\rho_s$  (Ward, 1992) from 0.02 to 0.139, while holding the diffuse component  $(\rho_d)$  and surface roughness ( $\alpha$ ) constant. The chosen values of  $\rho_s$  do not correspond to perceptually equally spaced values of gloss. Furthermore we did not perform any compression of the luminance values, nor introduced artificial glare to our renderings. If a luminance value was greater than 1, as it is often encountered with high dynamic range illumination maps it was cut off.

#### **Apparatus**

The experimental apparatus was a computer-controlled stereoscope. The left and right images were presented to the corresponding eye of the observer on two 21" Sony Trinitron Multiscan GDM-F500 monitors placed to the observer's left and right. The screens on these monitors are close to physically flat, with less than 1 mm of deviation across the surface of each

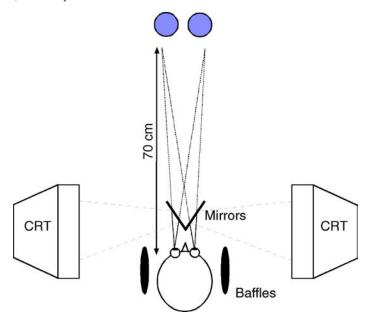


Figure 4. Computer-controlled stereoscope. The left and right images of each stereo pair were displayed on two monitors placed to the left and the right of the observer. The observer viewed these images reflected in small mirrors directly in front of his or her eyes. The fused image appeared approximately 70 cm in front of the observer, the optical distance to either screen.

monitor. Two small mirrors were placed directly in front of the observer's eyes. These mirrors reflected the images displayed on the left and right monitors upon the corresponding eye of the observer (Figure 4).

Look-up tables were used to correct nonlinearities in the gun responses and to equalize the display values on the two monitors. The tables were prepared after direct measurements of the luminance values on each monitor with a Photo Research PR-650 spectrometer. The maximum luminance achievable on either screen was 114 cd/m². The stereoscope was contained in a box 124 cm on a side. The front face of the box was open and that is where the observer sat in a chin/head rest. The interior of the box was coated with black flocked paper (Edmund Scientific) to absorb stray light. Only the stimuli on the screens of the monitors were visible to the observer. The casings of the monitors and any other features of the room were hidden behind the non-reflective walls of the enclosing box.

Additional light baffles were placed near the observer's face to prevent light from the screens reaching the

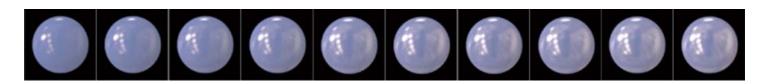


Figure 3. A sphere rendered at the 10 gloss levels. The different gloss levels are achieved by varying the specular reflectance parameter  $\rho_s$  in the Ward model (Ward, 1992).

observer's eyes directly. The optical distance from each of the observer's eyes to the corresponding computer screen was 70 cm. To minimize any conflict between binocular disparity and accommodation depth cues, the spheres were rendered to be exactly 70 cm in front of the observer.

## A note on psychophysical method

In a first attempt to find the glossiness transfer function  $\Gamma$  we used the method of adjustment, that is, we asked the observers for any given pair of spheres to adjust the gloss levels of the left sphere such that it matches the gloss level of the right one. Observers performed this task for all possible LP combinations at every gloss (specularity) levels. For each observer we obtained three pairs of data sets, where in each pair test and match LP were exchanged. For example in one set LP 1 would be used in rendering the test sphere and LP 2 in rendering the match, and, conversely, in a second set LP 1 would be used in rendering the match sphere and LP 2, the test. We would expect that the settings for each pair of surfaces should not depend on whether the test is viewed under LP 1 and the match under LP 2 or vice versa. However, results from 6 observers show strong biases in the results for perceived equal glossiness. A surface is perceived as less glossy when it is the test surface than when it is the matching surface. This asymmetry may be due to a response bias (conservatism), or possibly due to adaptation to the gloss level of the test surface. In Figure 5 we show the results for two representative observers. Note, how the measured  $\Gamma$  deviates from the predicted one. Fleming et al. (2003) used method of adjustment for all of their data and noted this same problem.

We abandoned the adjustment paradigm and replaced it with a two alternative forced choice (2AFC) task in order to avoid the observed response bias and to make mean-

ingful estimates of the effect of different light fields on perceived surface gloss.

#### Software

The experimental software was written by us in the C language. We used the X Window System, Version 11R6 (Scheifler & Gettys, 1996) running under Red Hat Linux 6.1 for graphical display. The computer was a Dell 410 Workstation with a Matrox G450 dual head graphics card and a special purpose graphics driver from Xi Graphics that permitted a single computer to control both monitors. We use the open source physics-based rendering package Radiance (Larson & Shakespeare, 1996) to render the left and right images of the stereo pair for a given virtual scene. The output of the rendering described above was a stereo image pair with floating point RGB triplets for each pixel. These triplets were translated to a 24-bit graphics code, correcting for nonlinearities in the monitors' responses by means of measured look-up tables for each monitor.

#### Task

On a given trial the observer was presented with stereo images of a pair of spheres placed side by side, each under a different light field and at a randomly chosen specularity level (Figure 6). The observer was asked to indicate which of the two displayed spheres appeared glossier by pressing the corresponding mouse button. After the button response the next stimulus pair was displayed.

We chose light probes taken from three real-world light fields from the Debevec collection. They had code names *Galileo*, *RNL* (taken in a eucalyptus grove at the University of California at Berkley), and *St. Peter's*. The first and third light probes were recorded indoors and the

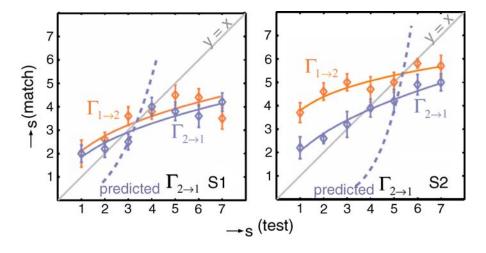


Figure 5. Data for two representative observers collected with the method of adjustment. The letter  $\rho_s$  denotes the magnitude of the specularity component in the Ward model (Ward, 1992). The lines are least square fits of the form  $\Gamma(g) = ag^b$  to the points of perceived equal gloss. we measure  $\Gamma_{1\to 2}$  and  $\Gamma_{2\to 1}$ . It becomes apparent that the inverse of  $\Gamma_{1\to 2}$  does not agree with the function  $\Gamma_{2\to 1}$ . We abandoned this method because of the evident, strong response bias.

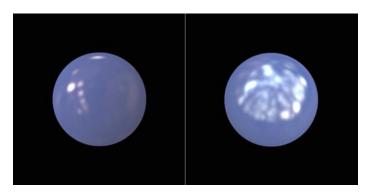


Figure 6. A typical stimulus pair as it was presented to the observer. The task was to indicate which one of the two spheres appeared glossier. Note that in our experiment stimuli were presented binocularly.

second is sampled from an outdoors scene in a sparse forest. We will refer to these three light probes as LP 1, LP 2 and LP 3, in that order, when convenient. We estimated glossiness transfer functions for the three pairings of these three LP. On any given trial the stimuli corresponding to one of the 30 staircases would be picked at random and displayed side by side. The two stimuli on each trial were randomly placed on the left or right side of the display.

#### Staircases

We ran a total of 30 interleaved one-up, one-down staircases (3 comparison pairs, 10 gloss levels) each of which ran for 50 trials (1500 trials total). In order to speed up convergence we combined the one-up, one-down procedure with an accelerated start that is a crude bisection search for threshold. The stimulus level (glossiness) presented on trial n is denoted  $g_n$ . It could take on any of the glossiness levels $\{1, 2, \dots, 10\}$ . The stimulus level on the following trials  $g_{n+1}$  was computed as

$$g'_{n+1} = g_n - S_n(2R_n - 1)$$

$$g_{n+1} = \min\{\max\{g'_{n+1}, 1\}, 10\},$$
(2)

where  $S_n$  is the step size and  $R_n$  is the response (0 or 1) on the n'th trial. The second part of the computation ensures that the stimulus level  $g_{n+1}$  remains within the range  $\{1, \dots, 10\}$ . The step size on the next trial is reduced by a factor of 2 but could not be less than 1:

$$S_{n+1} = \max\{S_n/2, 1\}. \tag{3}$$

The initial value of each staircase was  $S_1 = 8$  and after the first three trials the step size is 1 and the staircase behaves as a one-up, one-down staircase for the remaining 47 trials in the staircase.

#### Instruction to the observer

Prior to the experiment observers were familiarized with the concept of surface gloss by showing them samples of different real glossy materials (e.g. the plastic armrest of a chair, book lamination, a rubber ball). Instructions for the experiment were to indicate by mouse click which of the two displayed spheres appeared glossier. Observers did not otherwise practice before starting the experiment.

#### **Procedure**

The observers completed 1500 trials at their own pace. The experiment took the observer less than an hour.

#### **Observers**

Four observers participated in the study (among them two authors KD and HB who had previously participated in the method of adjustment pilot experiment described above). All had normal or corrected to normal vision. The other two observers were not aware of the hypothesis under test and neither had participated in the method of adjustment pilot experiment. In line with New York University regulations for human subjects, these observers gave their written consent prior to the experiment.

## Analysis and results

## Maximum likelihood estimation I

We used maximum likelihood estimation to obtain estimates of the physical level of gloss under one light field that appeared as glossy as each physical gloss level under a second field. We fit a Gaussian psychometric function to the staircase responses for each physical level under the second light field. The estimates of 50%-tile of the Gaussian are estimates of points of subjective indifference (PSIs) and are plotted as filled circles in Figure 7. The fast converging staircase procedure results in sufficient variability in the data to permit accurate fitting of a cumulative Gaussian, as evidenced by the estimates of standard deviation of the PSIs shown as error bars in Figure 7. These were obtained by an application of Efron's bootstrap (Efron & Tibshirani, 1993) with 1000 replications per bootstrap estimate.

The data obtained from the 2AFC task can be modeled as a psychometric surface such as in Figure 8 (data from observer S1). Where the x and y axes correspond to a real-world light field and individual points on each axes correspond to the tested gloss levels (1–10). The z-axis denotes percent glossier judgments for the sphere under LP 2 (RNL) when compared to the sphere under LP 3 (St. Peter's). For each psychometric surface we found the best fitting curve to the 0.5 threshold contour, which corresponds to the glossiness transfer function for this comparison pair.

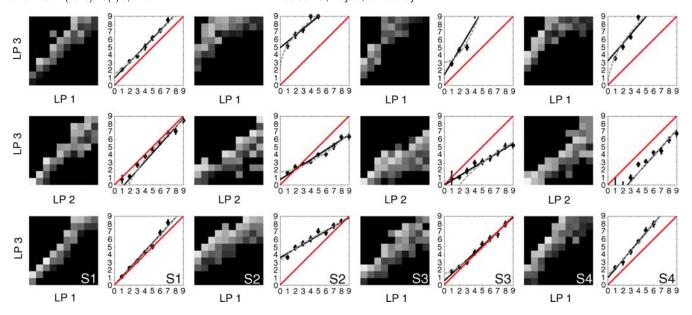


Figure 7. Data for 4 observers. Each observer (S1–S4) has 2 columns. In the left column for each observer preference matrices are shown. Values larger than zero (black) indicate where staircase data was collected and the gray-level indicates the percent judged glossier, brighter values denoting a higher percentage. In the right columns diamonds are the estimated points of perceived equal glossiness. Standard deviations are obtained by bootstrap analysis of the estimation procedure. The black solid lines are the best *linear model* fit obtained by MLE. The light grays dashed lines are the best *power model* fit obtained by MLE. The red lines correspond to the *identity model*.

## Hypothesis testing

We used nested hypothesis tests (Mood, Graybill, & Boes, 1974, p. 440) to test the three nested models against one another. The log likelihood of the unconstrained power model  $\lambda_2$  was obtained by fitting a power function of the form

$$\Gamma(g) = c + ag^b,\tag{4}$$

to each observer's data using the method of maximum likelihood. The three parameters c, a and b were free to vary (Figure 7: gray dashed curves). The second, *linear model* is nested within the first with parameter b set to 1,

$$\Gamma(g) = c + ag,\tag{5}$$

(Figure 7: black solid lines). It has log likelihood  $\lambda_1$ . The third, *identity model* (with a = 1, c = 0, b = 1) is nested within the other two,

$$\Gamma(g) = g,\tag{6}$$

(Figure 7: red solid lines). This model has log likelihood  $\lambda_0$ . If an observer's performance is predicted by the identity model then his glossiness matches are independent of the choice of real-world light field, a form of glossiness constancy.

To compare each pair of models, we computed a test statistic  $X_{i+1} = 2(\lambda_{i+1} - \lambda_i)$ . If the model with fewer parameters is the correct model then this test statistic is

asymptotically distributed as a  $\chi^2$  random variable with degrees of freedom equal to the difference in the number of parameters in the two models under comparison (Mood et al., 1974, p. 440). Accordingly we compared  $X_2$  to the 95th percentile of a  $\chi_1^2$  distribution to test the power model against the linear model and we compared  $X_1$  to the 95th percentile of a  $\chi_2^2$ .

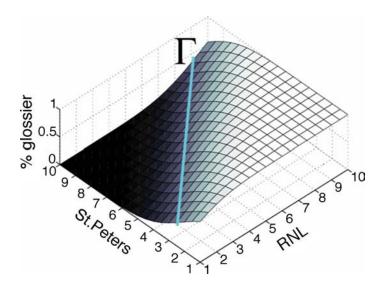


Figure 8. An observer's data can be modeled as a 2D psychometric surface. The curve through the 0.5 thresholds corresponds to the glossiness transfer function from RNL (LP 2) to St. Peter's (LP 3).

For all observers and all transfer functions we could not reject the hypothesis that the *linear model* fit to the data differs significantly from the *power model* fit. Furthermore for all but one condition (observer 3, transfer function  $\Gamma_{1\rightarrow 3}$ ) we rejected the hypothesis that the *identity model* is not significantly different from the linear model, i.e. in only one condition did we observe gloss constancy. The parameter estimates (intercepts, slopes, exponents) and the results of the two sets of model tests are shown in Table 1.

## Is $\Gamma$ transitive? Finding $\Gamma_{1\rightarrow 3}$

Having established the linearity of the estimated transfer functions we could address the question whether  $\Gamma$  is transitive, that is, whether Equation 1 is true.  $\Gamma_{1\rightarrow 2}$  denotes the glossiness transfer function from Galileo to RNL, or equivalently we can say that perceived glossiness under RNL can be measured as a function of perceived glossiness under Galileo. We can express this relation as a linear equation

$$\Gamma_{1\to 2}(g) = c_{12} + a_{12}g,\tag{7}$$

where  $c_{12}$  is the intercept and  $a_{12}$  is the slope of  $\Gamma_{1\rightarrow 2}$ . Similarly we can write  $\Gamma_{2\rightarrow 3}$ , the glossiness transfer function from RNL to St. Peter's as

$$\Gamma_{2\to 3}(g) = c_{23} + a_{23}g,\tag{8}$$

and the glossiness transfer function from Galileo to St. Peter's is

$$\Gamma_{1\to 3}(g) = c_{13} + a_{13}g. \tag{9}$$

Now we can combine Equations 7 and 8 to obtain

$$\Gamma_{1\to 3}(g) = \Gamma_{2\to 3}(\Gamma_{1\to 2}(g))$$
  
=  $c_{23} + a_{23}c_{12} + a_{12}a_{23}g.$  (10)

Comparing Equation 10 with Equation 9 we find that

$$c_{13} = c_{23} + a_{23}c_{12}, (11)$$

and

$$a_{13} = a_{12}a_{23}, (12)$$

should hold for transitivity to be true:  $\Gamma_{2\to 3} \circ \Gamma_{1\to 2} = \Gamma_{1\to 3}$ . We wish to test whether the estimates in Table 1 of  $\hat{a}_{12}$ ,  $\hat{c}_{12}$ ,  $\hat{a}_{23}$ ,  $\hat{c}_{13}$  are consistent with Equations 11 and 12.

Having obtained the glossiness transfer function  $\Gamma_{1\to 3}$  (see previous section) from our data we wanted to compare the measured intercept and slope to the predicted  $c_{13}$  and  $a_{13}$ . We tested the hypothesis that the measured  $\Gamma_{1\to 3}$  is significantly different from the predicted one. For the unconstrained log likelihood model  $\lambda_1$  we introduced two

	Parameter	Transfer	S01	S02	S03	S04
POWER	а	$\Gamma_{1\rightarrow 2}$	0.697	3.410	0.326	4.381
		$\Gamma_{2\rightarrow3}$	4.248	0.140	3.895	1.699
		$\Gamma_{1\rightarrow 3}$	0.990	0.909	0.364	0.873
	b	$\Gamma_{1\rightarrow 2}$	1.163	0.474	1.923	0.497
		$\Gamma_{2\rightarrow3}$	0.555	1.625	0.471	0.854
		$\Gamma_{1\rightarrow 3}$	1.050	0.830	1.379	1.129
	С	$\Gamma_{1 \rightarrow 2}$	1.482	1.854	3.001	-0.637
		$\Gamma_{2\rightarrow3}$	-5.881	1.687	-5.422	-3.971
		$\Gamma_{1\rightarrow 3}$	0.058	3.132	1.485	1.387
LINEAR	а	$\Gamma_{1\rightarrow 2}$	1.043	0.817	1.687	1.161
		$\Gamma_{2\rightarrow3}$	1.123	0.651	0.604	1.117
		$\Gamma_{1\rightarrow 3}$	1.103	0.584	0.922	1.184
	С	$\Gamma_{1\rightarrow 2}$	0.936	4.901	1.331	3.170
		$\Gamma_{2\rightarrow3}$	-1.447	0.673	-0.043	-2.899
		$\Gamma_{1\rightarrow 3}$	0.000	3.563	0.532	0.945
POWER vs. LINEAR		$\Gamma_{1\rightarrow 2}$	0.236	0.877	0.067	1.000
		$\Gamma_{2\rightarrow3}$	0.011	0.011	0.028	0.616
		$\Gamma_{1\rightarrow 3}$	0.700	0.278	0.032	0.518
LINEAR vs. IDENTITY		$\Gamma_{1\rightarrow 2}$	0*	0*	0*	0*
		$\Gamma_{2\rightarrow 3}$	0*	0*	0*	0*
		$\Gamma_{1\rightarrow 3}$	0*	0*	0.257	0*

Table 1. A. For each transfer function we show parameter estimates obtained from maximum likelihood fits of the three models (power, linear, identity) to each subject's data. B. The p-values for nested-hypothesis tests of the Power Model versus the Linear Model and the Linear Model versus Identity Model are shown. Asterisks mark those p-values that are less than 0.00001, the Bonferroni corrected level for 12 tests with an overall significance level of 0.05.

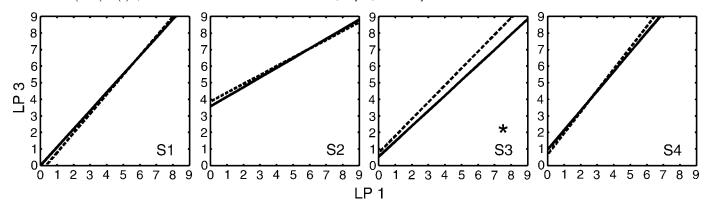


Figure 9. Results for transitivity. The black line corresponds to the measured, and the dashed black line to the predicted  $\Gamma_{1\rightarrow3}$ . The star symbol indicates a significant failure of transitivity.

parameters  $\Delta c$  and  $\Delta a$ . These will be estimated additive constants to the predicted intercept and slope, such that

$$c_{13} = c_{23} + a_{23}c_{12} + \Delta c$$

$$a_{13} = a_{12}a_{23} + \Delta a,$$
(13)

where  $\Delta c$  and  $\Delta a$  vary freely. For the constrained model  $\lambda_0$  we set  $\Delta c = 0$  and  $\Delta a = 0$ . Comparing the resulting test statistics  $R = 2(\lambda_2 - \lambda_0)$  for each equation to the 95th percentile of a  ${\chi_2}^2$  random variable, we found that for three out of four observers the predicted  $\Gamma_{1\rightarrow 3}$  was not significantly different from the measured one. For plots and p-values see Figure 9. While the failure of transitivity was significant for one subject, the magnitude of the failure was less than 12.5% of the full range of specularity.

## **Discussion**

Other researchers (Ho, Landy, & Maloney, 2008; Obein, Knoblauch, & Viénot, 2004) have used scaling methods to measure the psychophysical functions relating perceived glossiness to physical gloss under single light fields. Our work complements theirs by measuring how changes in light field transform perceived gloss. Our work continues that of Fleming et al. (2003) who demonstrated that changes in LP affect perceived glossiness but without estimating transfer functions.

We asked four observers to compare the glossiness of pairs of surfaces rendered under two different real-word light fields drawn from a database of light fields measured by Debevec (1998). We used this data to estimate a transfer function  $\Gamma$  that captures how perceived glossiness is remapped in changing from one real-world light field (LP) to a second. We wished to determine the form of the transfer function and to test whether for any set of three light fields the transfer function  $\Gamma_{1\rightarrow 2}$  from LP 1 to LP 2 and the transfer function  $\Gamma_{2\rightarrow 3}$  from LP 2 to LP 3 could be

used to predict the glossiness transfer function from LP 1 to LP 3 by the relation  $\Gamma_{1\rightarrow 3} = \Gamma_{2\rightarrow 3} \circ \Gamma_{1\rightarrow 2}$  where 'o' denotes composition of functions. We refer to this property as *transitivity*.

In a pilot experiment we found that using the method of adjustment to match surfaces under different light fields led to large response biases. We therefore replaced this method with a fast converging staircase procedure that we developed. This method combined an initial bisection search with a subsequent 1-up 1-down staircase.

In the larger sense our results agree with that of Fleming et al. (2003) in that the perceived glossiness of a surface depends not just on the specularity of the surface but also on the light field reflected by that surface. Our estimated transfer functions specify how changes in LP transform perceived glossiness. If observers were gloss constant, we would expect that the transfer functions were identity lines but we have shown that they are not. The transfer functions serve to summarize the magnitude and pattern of failure of gloss constancy observed.

We found that, over the range we considered, the measured glossiness transfer functions  $\Gamma(g)$  could be expressed as linear transformations.  $\Gamma(g) = a + bg$ : points of equal perceived gloss between two real world light fields fell on a line.

This is a surprising outcome. Based on previous work (Ho et al., 2008; Obein et al., 2004) we know that the mapping between the physical gloss scale and perceived gloss is non-linear. What we have shown is that, over the range of stimuli we considered, the non-linear perceived gloss scale for one light field is simply a linear transformation of the non-linear perceived gloss field for a second. The two parameters of the transfer function summarize all that need be known to predict how glossy surfaces viewed under one light field will appear under a second. Moreover, the failure to reject transitivity implies that the parameters for two transfer functions that share a light field determine those for a third.

Given the evident complexity of natural light fields as evidenced by the light probes measured by Debevec and colleagues, it is surprising that so little is needed to predict the effect on surface glossiness brought about by a change in light field. If we understood how to predict the parameters linking light fields from the light fields themselves we would have a remarkably parsimonious theory of surface gloss under arbitrary lighting conditions.

As discussed in the Introduction, the test of transitivity is a test of the observer's consistency judging the glossiness of a surface under different light fields. While this consistency in judgment has been implicitly assumed in the vision research community to the best of our knowledge no previous study of material perception has investigated this issue empirically. We tested transitivity for glossiness transfer functions and found that transitivity held for all but one observer. The magnitude of failure of transitivity for this one observer was less than 12.5% of the range of the glossiness scale.

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## **Footnote**

<sup>1</sup>We use the term "light probe" to refer to a measurement of the light field at one location in space.

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