

# Generation of surface for producing image using caustics

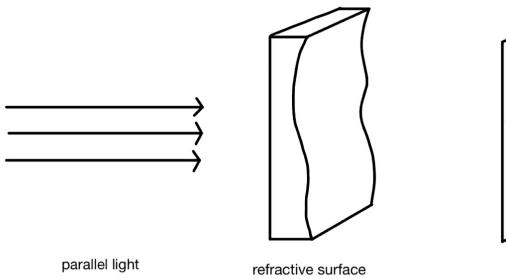
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**Abstract**—A continuous surface which generates a given gray-scale image when illuminated by parallel light is computed via caustics and manufactured. The test image and the lens surface were first divided to  $N \times N$  grid, where  $N$  is determined by the resolution of the test image in pixels ( $N = 500$  in the first trial). The lens cells were morphed with gradient descent such that each cell  $(i,j)$  has area proportional to the brightness of image pixel  $(i,j)$ . The height-map of the lens surface was then found by applying Snell's law and small angle approximation. Morphing the grid and finding height-map both rely on solving Poisson's equation in Python. A simulation was built to test the output surface, and test images were mostly reproduced at  $N = 1000$ . The surface is then manufactured using acrylic by CNC milling, and tested under parallel light.

## I. INTRODUCTION

A given gray-scale image can be produced by reflection or refraction of light rays through curved surfaces or objects. Some methods had been used to obtain such surfaces in computing graphics, including reflectance field[1], refractive steganography[2], subsurface scattering[3], and holography[4].

Among these methods, caustics provides satisfactory illumination effect, with the setup shown in figure 1. The shape of the transparent material, or specifically the refractive surface, needs to calculated such that it produces the expected caustic image under parallel and normal incident light. Methods proposed by Finckh et al.[5], Papas et al.[6] and Yue et al[7]. are restricted by either complexity of patterns or continuity of surfaces. However, Yue et al.[8] suggests a different approach using Poisson's equation, which yields continuous surfaces and highly reproduced patterns. Matt Ferraro[9] simplified the above method using Julia without significant loss of outcome image quality. Our aim is to reproduce this result using Python.



**Fig. 1.** Illustration of display system. Parallel light from either sun or projector, perpendicularly incident on a transparent refractive surface, results in caustic image on the projection screen.

## II. METHOD

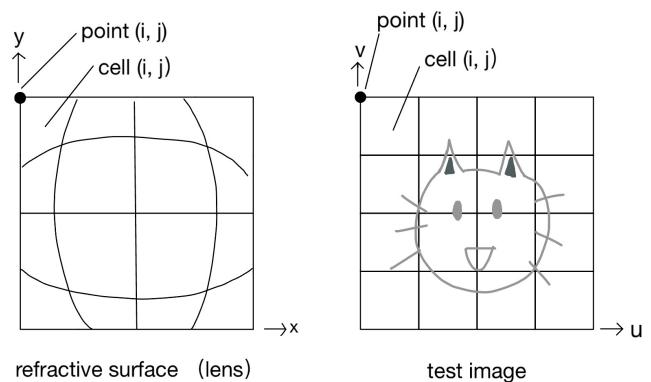
The method described by Yue et al.[8] consists of two steps. First, the corresponding relationship between incident light and the resultant image is determined. After that, the refractive surface is computed through finding the heightmap.

### A. Morphing lens grid

As demonstrated in Figure 2, for a sample image with  $N \times N$  pixels, each pixel is assigned an index  $(i, j)$ , which does not change over the course of calculations. Since pixels have the same size, the  $(u, v)$  coordinate system is essentially a uniform square grid.

Next, the refractive surface is also divided into  $N \times N$  grids. The index of a particular cell is determined by the index of point on its top left corner, as shown in figure 2. As such, image pixel  $(i, j)$  corresponds to lens cell  $(i, j)$ . Initially, the grids on refractive plane with coordinates  $(x, y)$  will also forms a uniform mesh, but this will change as individual points moves through morphing. Consequentially, the area of lens cell  $(i,j)$  can be morphed to be proportional to the light intensity of pixel  $(i,j)$  on the image.

Mathematically, this process can be thought as a mapping of the  $(u, v)$  coordinate system on the image to the  $(x, y)$  coordinate system on the refractive surface.



**Fig. 2.** Corresponding relationship of cells and positions. Each cell  $(i, j)$  on the  $(u, v)$  plane of the test image corresponds to a cell  $(i, j)$  on the  $(x, y)$  plane of the refractive surface.

Here, an assumption is made such that all light incident on lens cell  $(i, j)$  is refracted to pixel  $(i, j)$ , so no light is lost. Thus, the following must be true,

$$\frac{A(i, j)}{\Sigma A} = \frac{b(i, j)}{\Sigma b} \quad (1)$$

where  $A(i, j)$  is the area of cell  $(i, j)$  on lens, and  $b(i, j)$  indicates the brightness or light intensity of pixel  $(i, j)$  on image. Since the refractive surface is divided equally at the beginning, so the cells need to expand or shrink. A scalar field  $L$  is used to determine how much the cells are different from the expected value.

$$L = \frac{b(i, j)}{\Sigma b} - \frac{A(i, j)}{\Sigma A} \quad (2)$$

If  $L(i, j) > 0$  at a point  $p(x, y)$ , it means the cell is too small and needs to expand. If  $L(i, j) < 0$ , then the cell needs to shrink. The magnitude of scalar field  $L$  is expected to decrease through mapping, so the points can be updated with  $\frac{d\vec{p}}{dt} = -\nabla L$ , where  $\nabla L$  is the gradient of  $L$  (a vector field points to increasing direction), and  $t$  is a virtual time defined to represent computational process. However,  $L$  is not a continuous scalar field, so  $\nabla L$  is a discontinuous vector field, which is normally extremely random and thus performs poorly in computation. Therefore, this method is not used.

Instead of finding gradient of  $L$ , a concept 'pressure field' from computational fluid dynamics is applied. The analogy between cells with positive and negative  $L$  with source and sink with high and low pressure allows us to regard the mapping process as relaxation of source and sink, where flux flows from high pressure to low pressure. Therefore, with a pressure field  $\phi$ , we have:

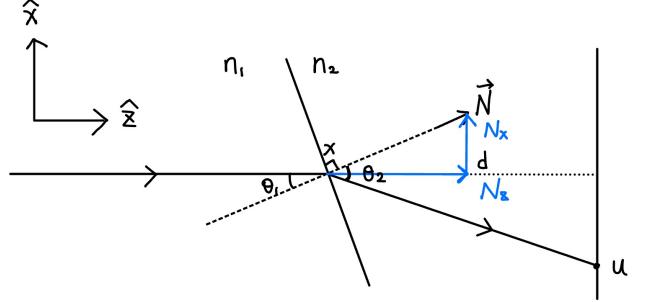
$$\frac{d\vec{p}}{dt} = \nabla\phi \quad (3)$$

The concept, divergence, is also used to connect the pressure field  $\phi$  to the scalar field  $L$ . Divergence of a vector field is a scalar field, which represents the outward flux from an infinitesimal volume around a given point. For example, consider the case of heating air, in which the velocities of air molecules form a vector field. When air is heated in a region, air molecules expand in all directions, so the divergence of the velocity vector field is positive. Similarly, in this case, cells with positive  $L$  expands, and ones with negative  $L$  shrinks, depending on the magnitude of  $L$ . Using this method, the following can be obtained:

$$\nabla^2\phi = L \quad (4)$$

Solving this Poisson's equation gives a scalar field  $\phi$ , from which a well-behaved vector field can be deduced for gradient descent. Positions  $p(x, y)$  of points  $(i, j)$  is updated repeatedly by computing the difference  $L$ , solving equation (4) and updating according to equation (3).

A square mesh, as described in figure 2, is used to compute  $L$ . The Gauss-Seidel method is applied to solve Poisson's equations, with Neumann boundary conditions and over-relaxation parameter  $\sigma = 1.94$ . The vertices of the square mesh is updated using equation  $\vec{p}(t_{n+1}) = \vec{p}(t_n) + \Delta t \nabla\phi$ , where  $n$  indicates



**Fig. 3.** Refractive in x direction. Light incident at coordinate  $x$  on the lens is refracted onto coordinate  $u$  on the screen. Using Snell's law,  $\frac{\sin(\theta_1)}{\sin(\theta_2)} = \frac{n_2}{n_1}$ , and small angle approximation,  $\frac{\theta_1}{\theta_2} = \frac{n_2}{n_1}$ , equation links  $\theta_1$  and  $\theta_2$  is obtained. By geometry, assuming  $d$  is much greater than  $x$  and  $u$ ,  $\theta_1 = \theta_2 - \tan^{-1}(\frac{x-u}{d})$ . Normalizing  $N_z$  gives  $N_x = \tan(\theta_1)$ .

the  $n^{th}$  computation step. For the points on the edge, their movement is restricted within the side they lie on. A suitable  $\Delta t$  needs to be found for each iteration so that vertices do not surpass their neighbours. To achieve this, the program iterates through all points, finding the limiting case of  $\delta t$  such that the closest two points would be coincidental, and returns half of  $\delta t$  to be  $\Delta t$  [8].

### B. Finding Heightmap

After morphing the grids, the z coordinates, or a scalar field  $z = h(x, y)$  is computed. A normal vector  $\vec{N}$  of the refractive surface can be represented as:

$$\vec{N} = (\frac{dh}{dx}, \frac{dh}{dy}, -1) \quad (5)$$

where the z component is normalized to be 1. Define a vector  $\vec{N}_{xy}$  contains only x and y component, we have:

$$\vec{N}_{xy} = \nabla h \quad (6)$$

The two component of  $N$  can be calculated using Snell's law and small angle approximation as shown in figure 3,

$$N_x = \tan \frac{\tan^{-1}(\frac{u-x}{d})}{(n_1 - n_2)} \quad (7)$$

$$N_y = \tan \frac{\tan^{-1}(\frac{v-y}{d})}{(n_1 - n_2)} \quad (8)$$

where  $n_1 = 1.49$  and  $n_2 = 1$  are the refractive index of acrylic and air. Therefore, a second Poisson's equation is obtained by taking divergence of both sides,

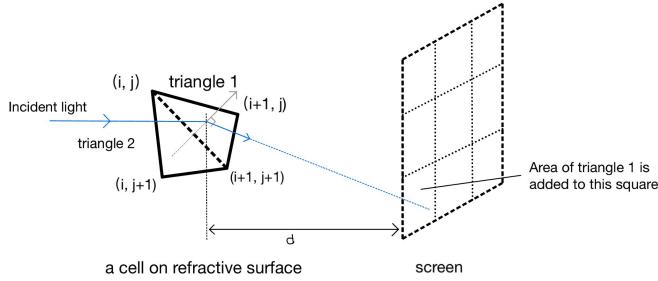
$$\nabla^2 h = \nabla \vec{N}_{xy} \cdot \vec{N} \quad (9)$$

Initially, the refractive surface is set as a plane, so the distance  $d(x, y)$  between the refractive surface and the projection screen is uniform. Components of  $\vec{N}$  in  $x$  and  $y$  direction and gradient of vector field  $\vec{N}_{xy}$  are then computed using equation (7), (8). A heightmap is found by solving equation (9), so that an updated scalar field  $d(x, y)$  can be calculated. These processes are repeated until convergence. The mesh is then organized into .stl format for manufacture.

### C. Computational Simulation

The refractive surface obtained by combining results from the above two steps is tested using a simulation program.

Each cell  $(i, j)$  is split into two triangles. For each triangle, the normal vector is obtained using the plane defined by vertices. Incident light in the direction of  $(0, 0, 1)$  is divided into parallel and orthogonal components with respect to the normal vector of the cell. According to Snell's law, the output parallel component is scaled by factor of  $\frac{n_1}{n_2}$  and the output perpendicular component remains unchanged. Thus, the direction of light (output vector) after refraction is found. For simplicity, all light that lands on the triangle is assumed to be transmitted through the center. Under this assumption, the output vector is scaled to find landing point on screen. If the landing point is within a grid, the area of triangle is added to corresponding point  $(u, v)$ . If the landing point is outside the grid, the incident is recorded, and the light is considered lost. These process are shown in Figure 4.



**Fig. 4.** Simulation of refraction for one piece of triangular surface.

After applying this process for all triangles, the average of all points is scaled to 128, or half the maximum brightness in grey-scale. The result is saved as a .png file.

## III. RESULTS

### A. Simulation Result

Simulation results are shown in figure 5, where the test images are put on the left and the results on the right. Some accuracy is lost at small details, and the outline of objects tend to get distorted in the process. Nevertheless, the images are highly reproduced.

### B. Manufactured Result

The acrylic lens are manufactured using a Roland MDX-40A Benchtop CNC Mill. Multiple setups were attempted with mixed results. The setup that yielded the smoothest surface was using R3 ball nose as both roughing and finishing tool. The resulting parts are then wet sanded with 400, 600, 800, 1000, 1200, and 1500 grit sandpapers. The parts are then washed and dried, before the fine and finish Tamiya polishing compounds are applied. The results are shown in figure 8.



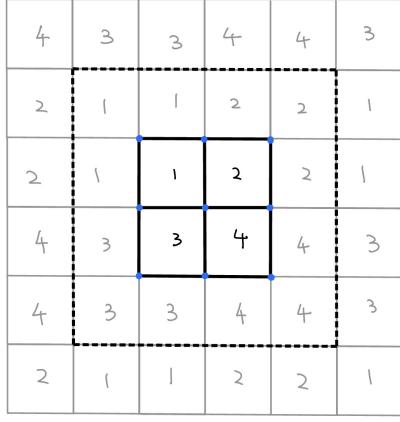
**Fig. 5.** Input images compared with simulated outputs. Resolutions are 500, 3000 and 900 separately.

## IV. DISCUSSION

### A. Computational process

To morph the grids, a  $(N + 1) \times (N + 1)$  vector field is required (as there are  $(N + 1) \times (N + 1)$  points in total), however, the  $N \times N$  scalar field  $\phi$  is not sufficient to generate such a vector field. For the purpose of obtaining sufficient information, the scalar field is mirrored with respect to all four of its edges, turning the scalar field to  $3N \times 3N$ . Only the  $(N + 2) \times (N + 2)$  data points in the center is used. A demonstration of the mirroring step for a  $2 \times 2$  field is shown in Figure 56. This method simplifies the program and also automatically applies Neumann boundary conditions.

The computational process is extremely time consuming for pictures with high resolution, since the algorithm has a  $O(n^2)$  complexity. It takes about 30 minutes for  $N = 500$  and about 5 hours for  $N = 3000$ , with JIT compiler from the Numba library. Therefore, a suitable resolution need to be chosen for each test image, such that it takes the program reasonable amount of time to finish calculation and generates a relative



**Fig. 6.** Mirror for a  $2 \times 2$  scalar field for demonstration. The  $4 \times 4$  data in the dotted square is used to obtain  $3 \times 3$  vectors (blue points).

high-quality output. Most images were initially tested with a version that has reduced resolution ( $300 \times 300$  or less).

#### B. Errors and limitations

The most accurate way to simulate a 3D surface is via a triangle mesh, yet a square mesh is used in the program, leading to a loss of accuracy. In addition, when calculating height-map, interference effect is ignored. This effect is hard to avoid in reality, which limits the output image quality. Moreover, the fact that light passes through the entirety of the cells and may land on multiple pixels is not taken into account in the simulation program. However, the effect of these errors diminish when using high resolutions.

A focusing distance is assumed in advance when solving the height-map, but the entire refractive surface moves shifts during the iterative process, resulting in difficulty to determine the true focusing distance of the manufactured object. Also, this method limit the distance  $d$  between refractive surface and screen to a range, and output image quality drops significantly if  $d$  is out of range.

Moreover, despite the resulting image being similar to the input, the simulation program suggests that less than 2% of the light actually land at the locations as specified in figure 2. Most usually land on the neighbors of the specified cells. Such result suggests that the accuracy of the height-map is lower than expected.

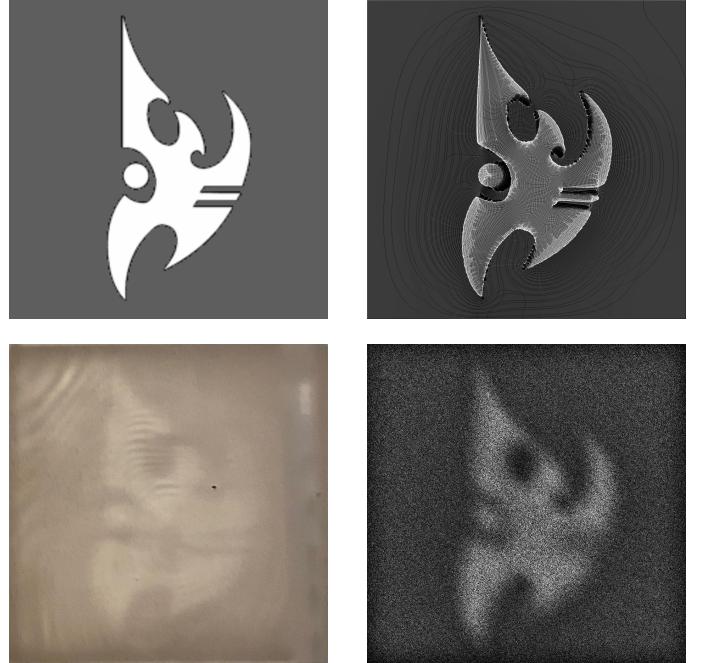
#### C. Manufacturing

Initially, a 1mm square nose is used for roughing, and a engraving tool with 0.02mm tip is used for finishing. This yielded a rough and nontransparent surface. Later approaches used R3 ball noses for both roughing and finishing with mixed results. By far, the smoothest surface is achieved using a R3 ball nose as roughing tool with 0.37mm cut-in stepping and 0.05mm path interval, and a R2 ball nose as finishing tool

with 0.37mm cut-in stepping and 0.20mm path interval with 0.37mm cut-in stepping and 0.05mm path interval.



**Fig. 7.** The surface of the manufactured acrylic lens



**Fig. 8.** In order: input image, simulated output with no error, manufactured object output, simulated output with max  $\pm 0.01\text{mm}$  error

The manufactured objects are also severely affected by the contour lines created by the CNC mill, which are impossible to remove with sandpaper without significantly damaging the heightmap. The edges of the contour lines cast shadows on the projection plane, severely affecting the quality of the output image. Unfortunately, the Roland MDX-40A CNC does not offer the option to remove the contour lines, only upcut or downcut. With alternate settings, this issue can be partially suppressed, at the cost of some accuracy.

The tolerance of CNC milling also limits the performance of the acrylic lens. The standard CNC tolerance is set around  $\pm 0.127\text{ mm}$ . If this is included in the simulation, with every point's z coordinate off by a random number between 0 to  $0.01\text{ mm}$ , the resulting output would be messier yet closer to

the output of the manufactured lens.

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## V. CONCLUSION

In conclusion, the shape of a refractive surface, which is able to form a specific caustic image under parallel light, was computed using methods proposed by Matt Ferraro[9] and Yue et al[8]. Concepts in computational fluid dynamics are used to morph the image to the surface, then the heightmap of the surface is calculated. A computational simulation was built to test the resulting surface. Simulation results suggests that the target images are highly reproduced. The refractive surface was then manufactured by CNC machine and tested under lamp light. Even though only simple caustic patterns could be reproduced due to practical limitations, the experimental result proved effectiveness of the computational process. For future improvements, methods for solving Poisson’s equation with greater accuracy and speed can be used. In addition, the computational process can be modified to improves edge representation.

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