## Supplementary Material for: End-to-End Learned, Optically Coded Super-Resolution SPAD Camera

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## 1 FABRICATION DETAILS



Fig. 1. Steps of DOE fabrication. First, patterns are transferred from masks to photoresist on the Fused Silica wafer through the exposure under UV illumination and the following develop process. Then, the transferred patterns are converted to binary profiles on the wafer by Cr etching and reactive ion beam (Ar + SF6) bombardment. The final binary profile is obtained by removing the Cr layer.

As mentioned in the main text, the designed phase plates are discretized to eight height levels, which can then be realized by repeatedly applying the photolithography and reactive ion etch (RIE) process three times [2]. The core of fabrication (i.e., photolithography and RIE) is shown in Figure 1. The thickness of the Cr layer



Fig. 2. 5X microscope images of a fabricated DOE.

is 100 nm, and the etching depths for each circle are 178, 356, and 712 nm sequentially.

The microscope images of fabricated diffractive phase plates are shown in Figure 2. Each phase unit is designed as  $0.873 \times 0.873$ mm, and we repeat  $16 \times 16$  units for the final diffractive phase plate. With this kind of repeatable designing scheme, our phase plates fit well with different sizes of aperture, exhibiting an apertureinvariant PSF behaviour. In addition, our designed phase unit has a smooth and continuous profile. This releases the requirement of a very high precision fabrication method. For commercial use, one can use state-of-the-art micro-stamp methods [3] to fabricate the phase plates in a low budget.

## 2 ADDITIONAL RESULTS

*Simulations.* We present selected visualization results tested on well-known image datasets, as shown in Figure 3 and Figure 4. For insets of each group, GT represents the ground truth image. The four different sampling models include (1) the *low fill-factor* model, which uses the SPAD sensor model but without the phase plate; (2) the *full fill-factor* model, which uses the full fill-factor

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Fig. 3. Selected examples from Set14 [4] for the comparison of a  $4\times$  super-resolution effect with different sampling models.

sensor model without a phase plate as an additional comparison, as it is a very common sensor model; and (3) *our* model, which uses the SPAD sensor model with the phase plate optimized using our end-to-end framework.

Fig. 4. Selected examples from BSDS100 [1] for the comparison of a  $4\times$  super-resolution effect with different sampling models.

## REFERENCES

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