

# Diffuse-Specular Separation of Multi-View Images under Varying Illumination

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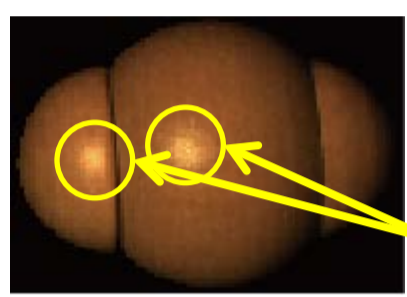
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九州工業大学

## Objective

Separating **diffuse** and **specular** reflection components for **photometric stereo** based on **light fields**

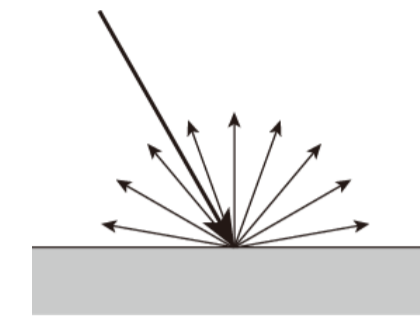
- Input images
  - multi-view images taken under varying lighting directions
- Specular reflection components
  - conventional PS: noise
  - uncalibrated PS: useful for resolving the GBR ambiguity



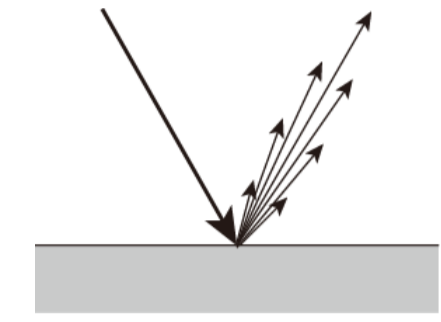
specular reflection components

## Key Idea

Integrating two complement clues based on **varying viewing directions** and **varying lighting directions**



diffuse reflection



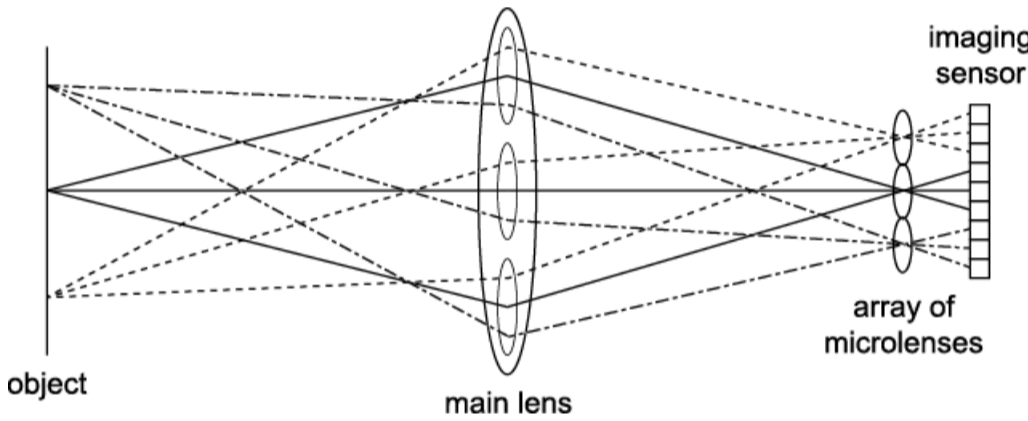
specular reflection

- Varying viewing directions
  - diffuse reflection components: **viewpoint-invariant**
  - specular reflection components: viewpoint-dependent
- Varying lighting directions
  - diffuse reflection components: **low-dimensional** (3D subspace)

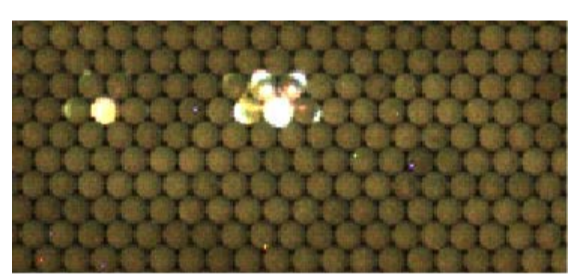
## Proposed Method

### Assumption

- microlens-based light field camera
- focus on an object of interest



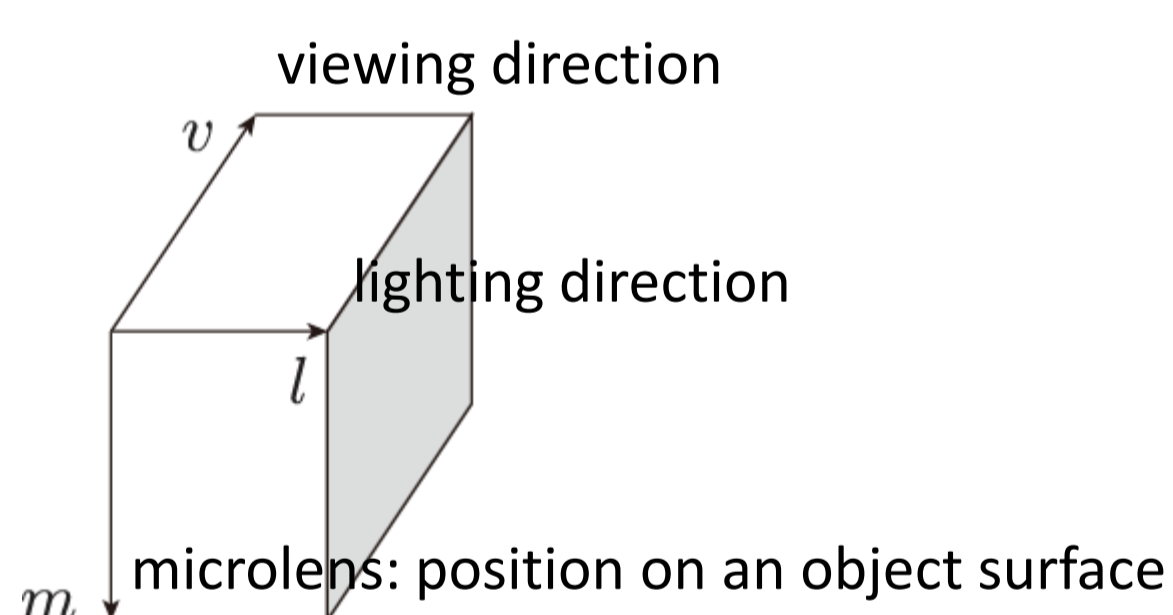
observe the **same** point from **different** viewing directions



close-up of a raw light field image

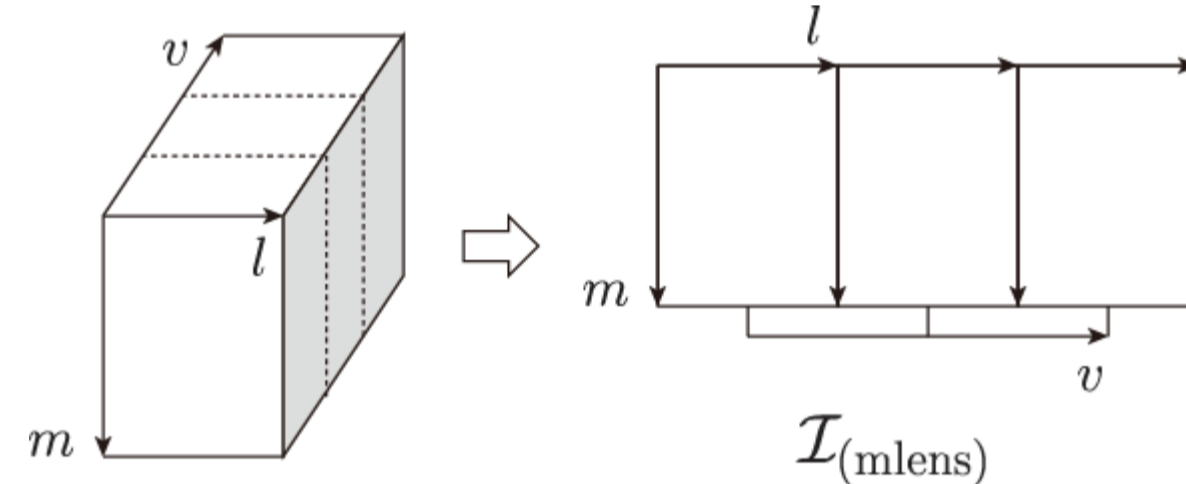
### Representation

- a set of raw images = **3rd order tensor**



### Structure of 3rd order tensor

- unfolding w.r.t. **microlens axis**

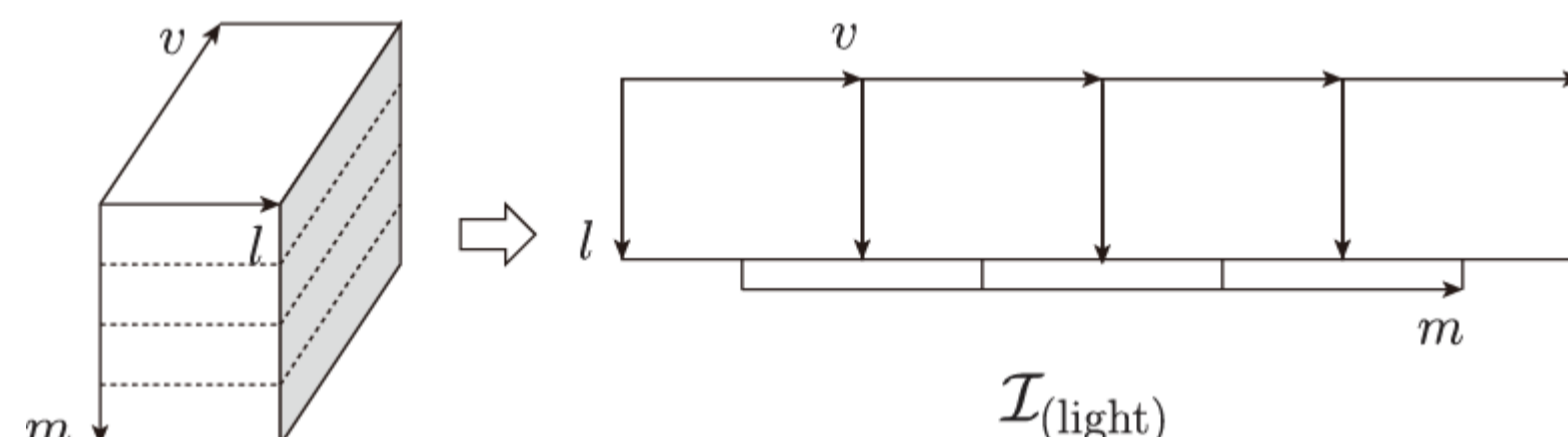


$$\begin{pmatrix} \rho_1 \mathbf{n}_1^\top \\ \vdots \\ \rho_M \mathbf{n}_M^\top \end{pmatrix} \mathbf{s}_l$$

light source vector = 3D

**rank = 3**

- unfolding w.r.t. **lighting direction**

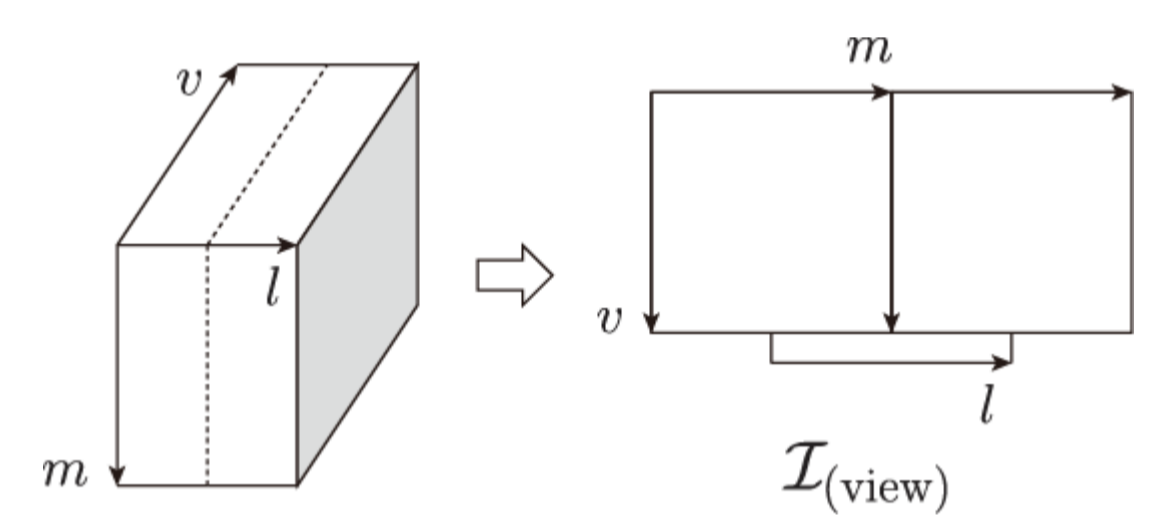


$$\begin{pmatrix} \mathbf{s}_1^\top \\ \vdots \\ \mathbf{s}_L^\top \end{pmatrix} \rho_m \mathbf{n}_m$$

surface normal vector = 3D

**rank = 3**

- unfolding w.r.t. **viewing direction**



diffuse reflection components: viewpoint-invariant

**rank = 1**

### Low-rank approximation

- higher-order SVD** [Vasilescu 2002]

$$\hat{\mathcal{I}}_{(\text{mlens})} = \hat{U}_{(\text{mlens})} \hat{\Sigma}_{(\text{mlens})} \hat{V}_{(\text{mlens})}^\top$$

low-rank approximation of unfolded matrices

$$\hat{\mathcal{I}} = \hat{\mathcal{Z}} \times_1 \hat{U}_{(\text{mlens})} \times_2 \hat{U}_{(\text{light})} \times_3 \hat{U}_{(\text{view})}$$

product of unfolded and low-ranked matrices

- SVD with missing data [Shum 1995]

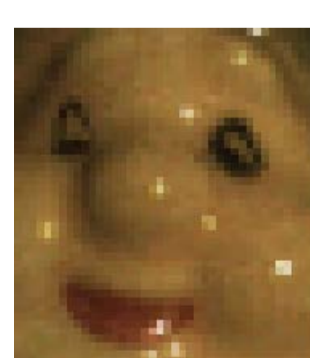
robust against outliers such as specular reflection components and shadows

## Experiments

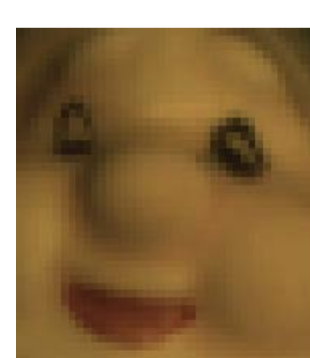
### Setup

- input: 10 images captured by **LYTRO ILLUM**
- objects: ceramic dwarf & wood bread

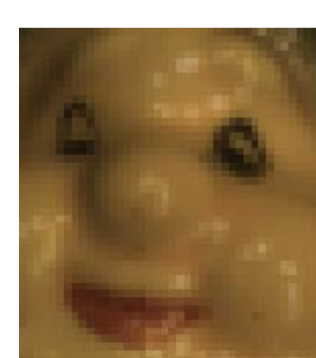
### Qualitative comparison



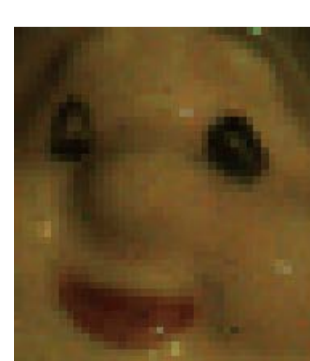
input image



proposed method



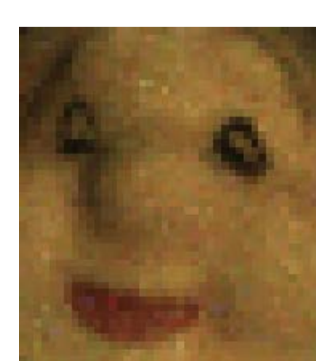
proposed method w/o outlier removal



varying viewing direction



varying lighting direction



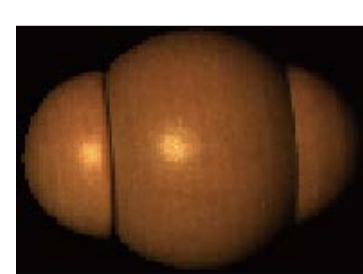
polarization

### Application to **uncalibrated PS**

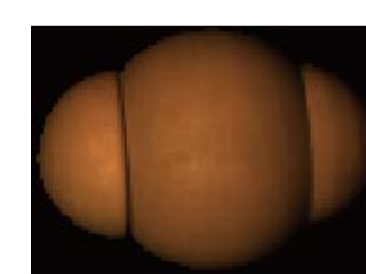
- diffuse only: up to the GBR ambiguity
- diffuse + specular: unique shape

### Quantitative comparison

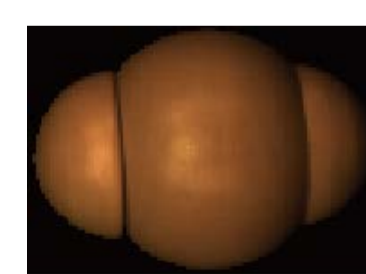
- ground truth: polarization + averaging
- evaluate RMSE of pixel values



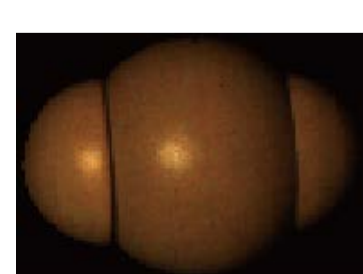
input image



RMSE: 3.67 proposed method



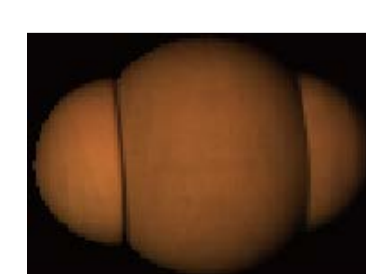
RMSE: 7.49 proposed method w/o outlier removal



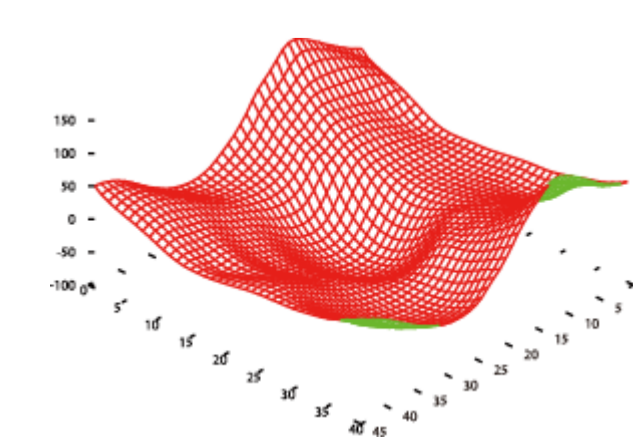
RMSE: 9.24 varying viewing direction



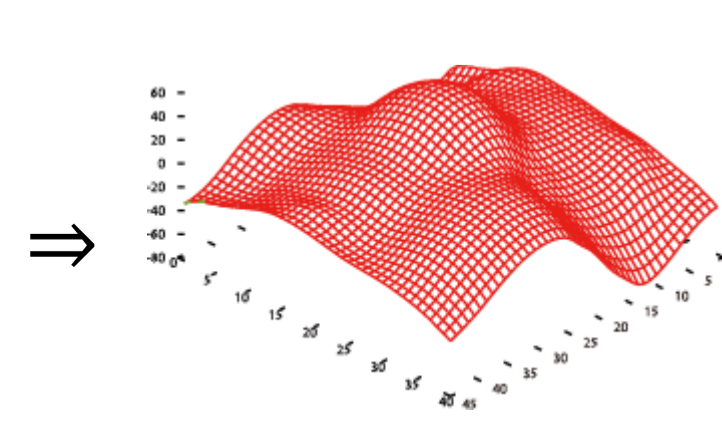
RMSE: 4.91 varying lighting direction



ground truth: polarization + averaging



diffuse only



diffuse + specular

## Conclusion

### Main contribution

Separating **diffuse** and **specular** reflection components for **photometric stereo** based on **light fields**

- reveal the **low-rank structure** of multi-view images under varying lighting directions
- achieve diffuse-specular separation via **low-rank approximation** of 3rd order tensor
- show the effectiveness of integrating two clues based on **varying viewing directions** and **varying lighting directions**

### Future work

- scenes with **non-negligible parallaxes**
- non-Lambertian diffuse reflection

### Acknowledgements

- JSPS KAKENHI Grant Numbers JP16H01676 and JP17H01766