

DASC: Dense Adaptive Self-Correlation for Multi-modal and Multi-spectral Correspondence

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Introduction

Motivation

- In **multi-modal** and **multi-spectral image**, conventional descriptors often fail to estimate correspondence

Goal

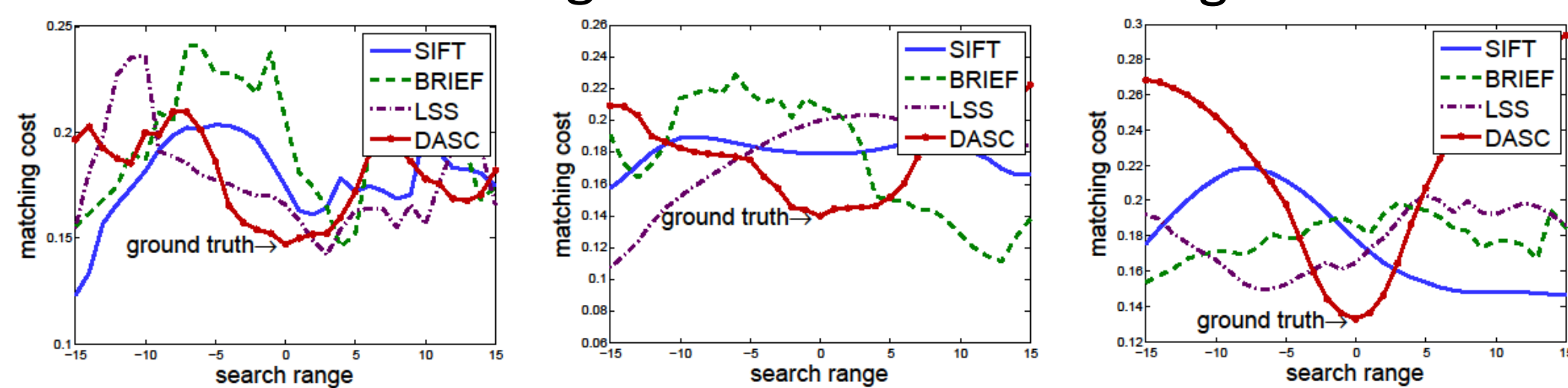
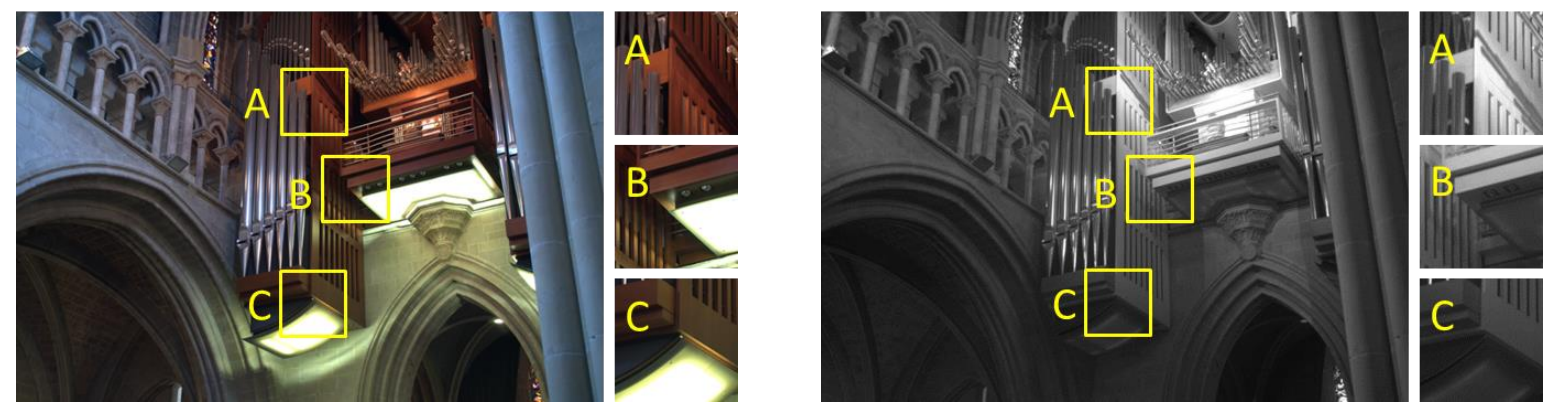
- To establish **dense correspondence** for those images



Background

Challenge on Multi-modal Images

- Nonlinear** photometric deformation, e.g., gradient reverses and intensity order variations



Matching Cost A Matching Cost B Matching Cost C

Limitation of Conventional Descriptors

- Image gradient (**SIFT**) or intensity comparison (**BRIEF**) cannot capture coherent matching evidence

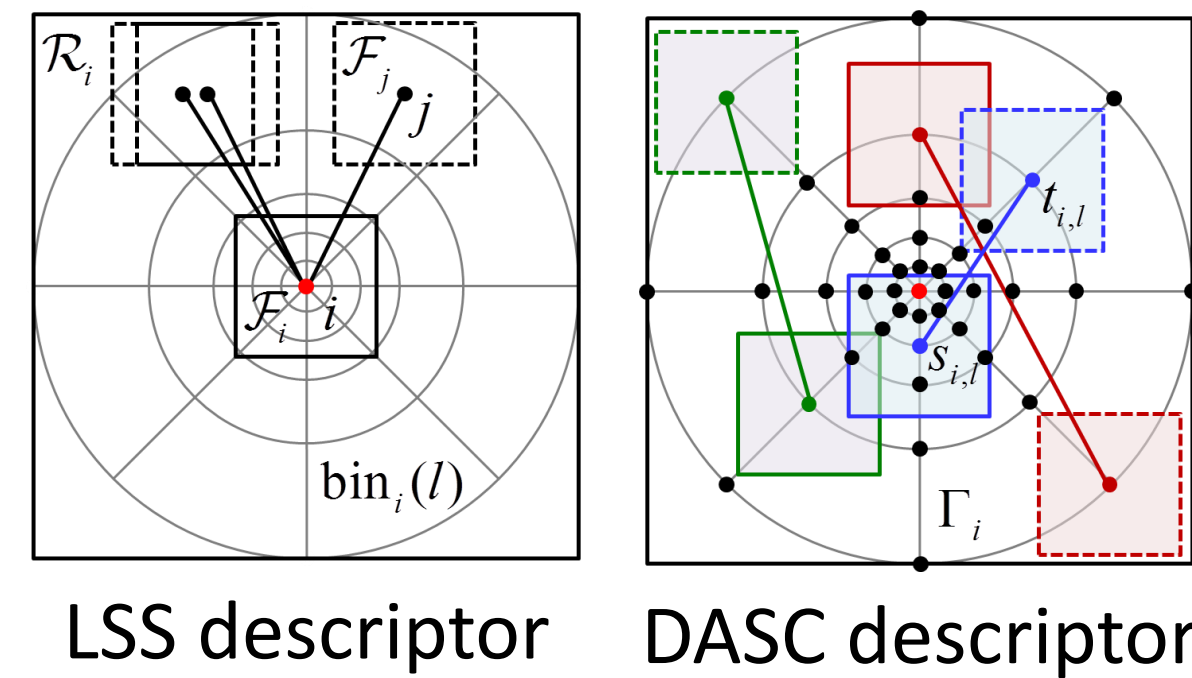
DASC Descriptor

Randomized Receptive Field Pooling

- Unlike **center-biased max pooling** in LSS descriptor, the DASC descriptor incorporates **randomized receptive field pooling**

Intuitions

- Center-biased pooling sensitive to noise
- Randomness of BRIEF



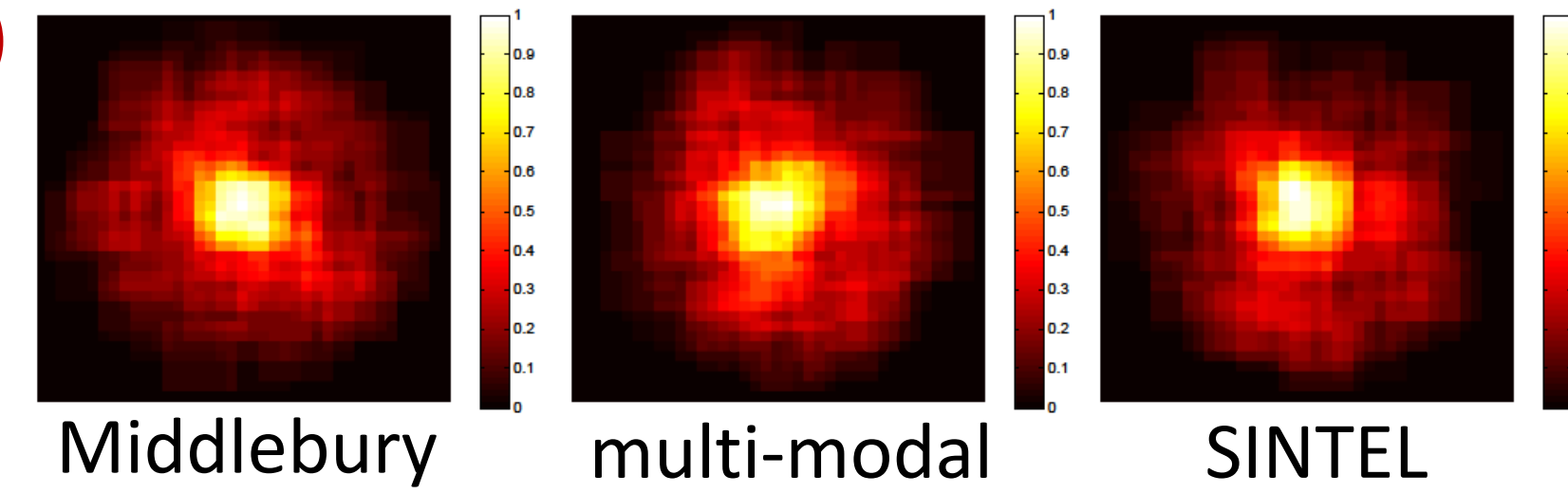
✓ LSS descriptor
 $d_{i,j}^{LSS} = \max_{j \in \text{bin}_i(l)} \mathcal{C}(i, j)$

✓ DASC descriptor
 $d_{i,j} = \mathcal{C}(s_{i,j}, t_{i,j}), s_{i,j}, t_{i,j} \in \Gamma_i$

Sampling Pattern Learning

- Exploit **support vector machine (SVM)** with linear kernel
- Features: $r_{m,l} = \exp(-d_{m,l}^1 - d_{m,l}^2) / 2\sigma_r^2$
- Energy function for SVM

$$\mathcal{L}(v) = \lambda \|v\|^2 + \sum_m \max(0, 1 - y_m \rho(r_m))$$



Small Support Window Similarity

- Adaptive self-correlation measure

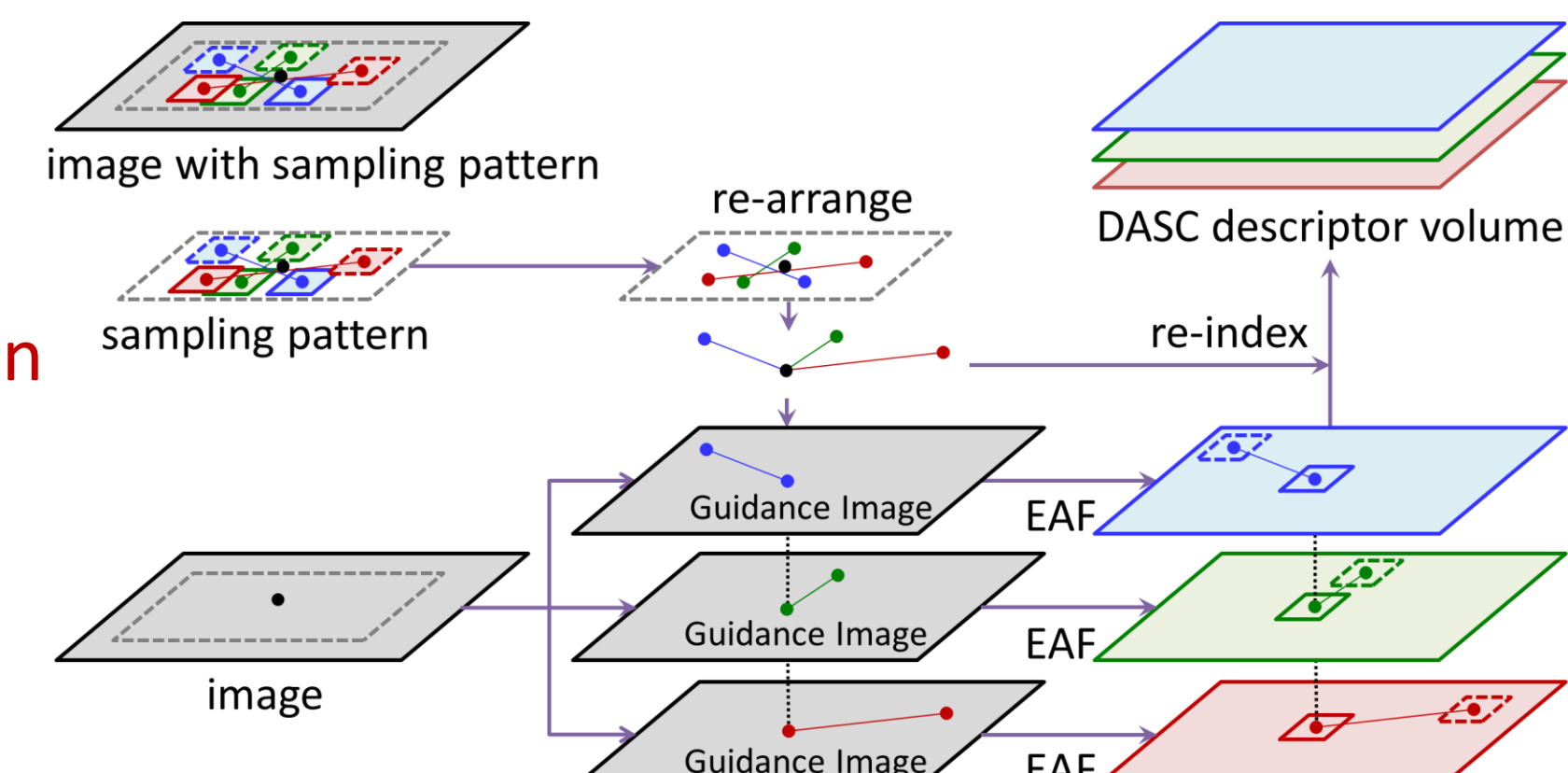
$$\Psi(s, t) = \frac{\sum_{s', t'} \omega_{s, s'} \omega_{t, t'} (f_{s'} - \mathcal{G}_s)(f_{t'} - \mathcal{G}_t)}{\sqrt{\sum_{s'} \{\omega_{s, s'} (f_{s'} - \mathcal{G}_s)\}^2} \sqrt{\sum_{t'} \{\omega_{t, t'} (f_{t'} - \mathcal{G}_t)\}^2}}$$

- Robust estimation
 $\mathcal{C}(s, t) = \max(\exp(-(1 - |\Psi(s, t)|) / \sigma), \tau)$
- The correlation $\mathcal{C}(s, t)$ is normalized with norm of all l

Efficient Computation

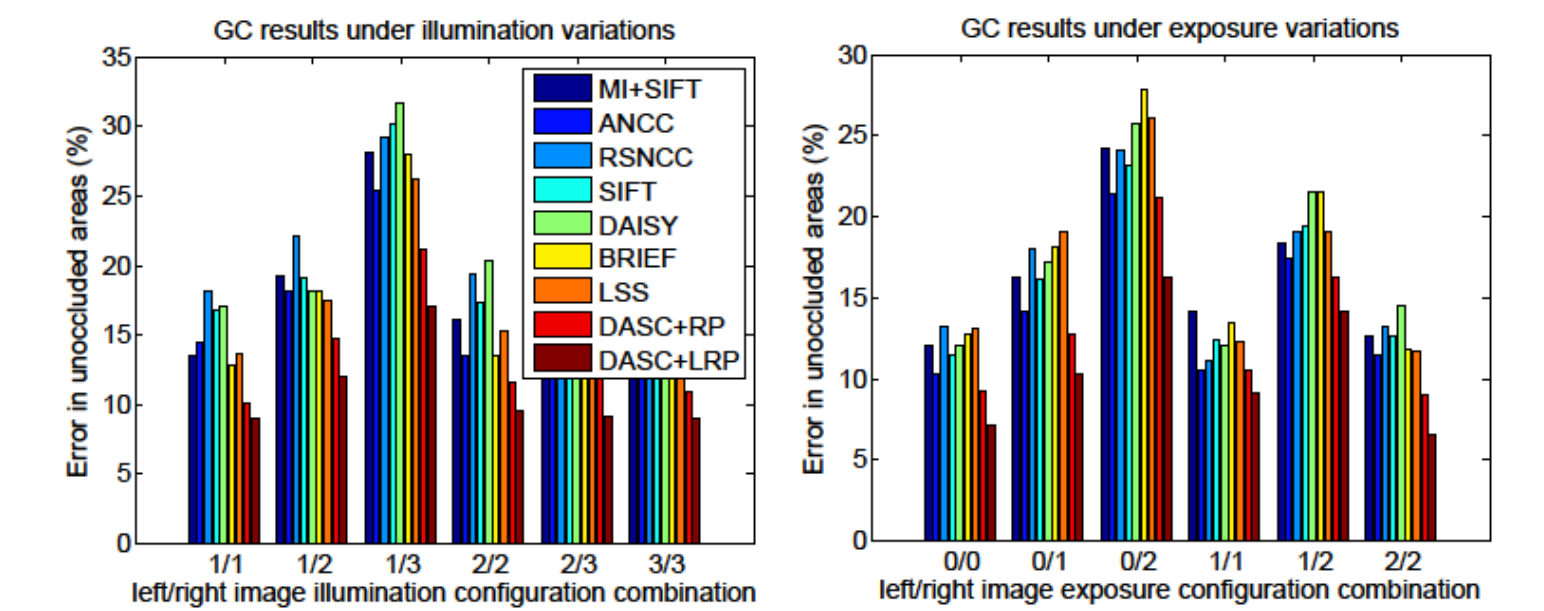
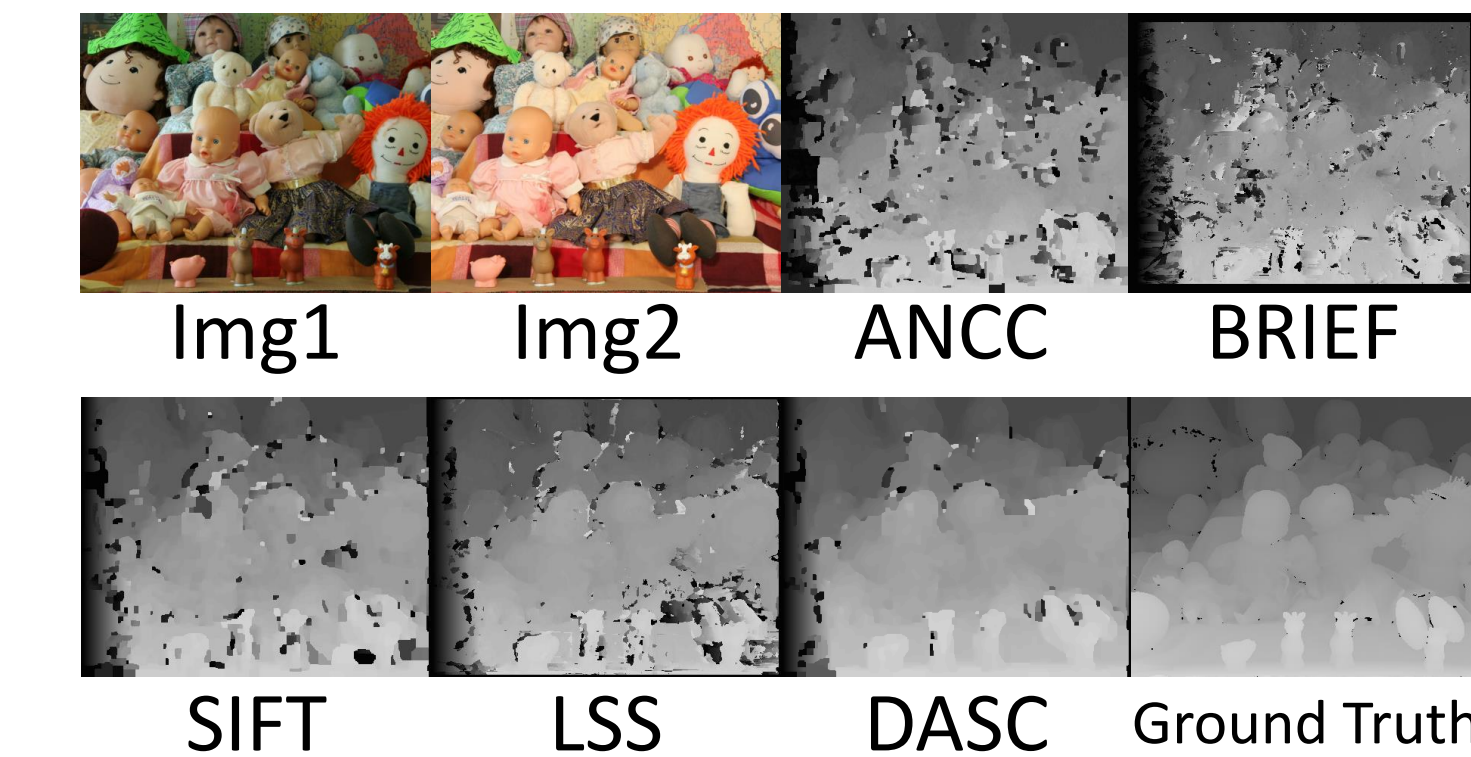
- Asymmetric weights $\omega_{s, s'}$
- Reference-biased sampling pairs
 $(i, j) = (i, i + t_{i,j} - s_{i,j})$
- Approximated adaptive self-correlation**

$$\tilde{\Psi}(i, j) = \frac{\sum_{i', j'} \omega_{i, i'} (f_{i'} - \mathcal{G}_i)(f_{j'} - \mathcal{G}_j)}{\sqrt{\sum_{i'} \omega_{i, i'} (f_{i'} - \mathcal{G}_i)^2} \sqrt{\sum_{j'} \omega_{i, j'} (f_{j'} - \mathcal{G}_j)^2}}$$

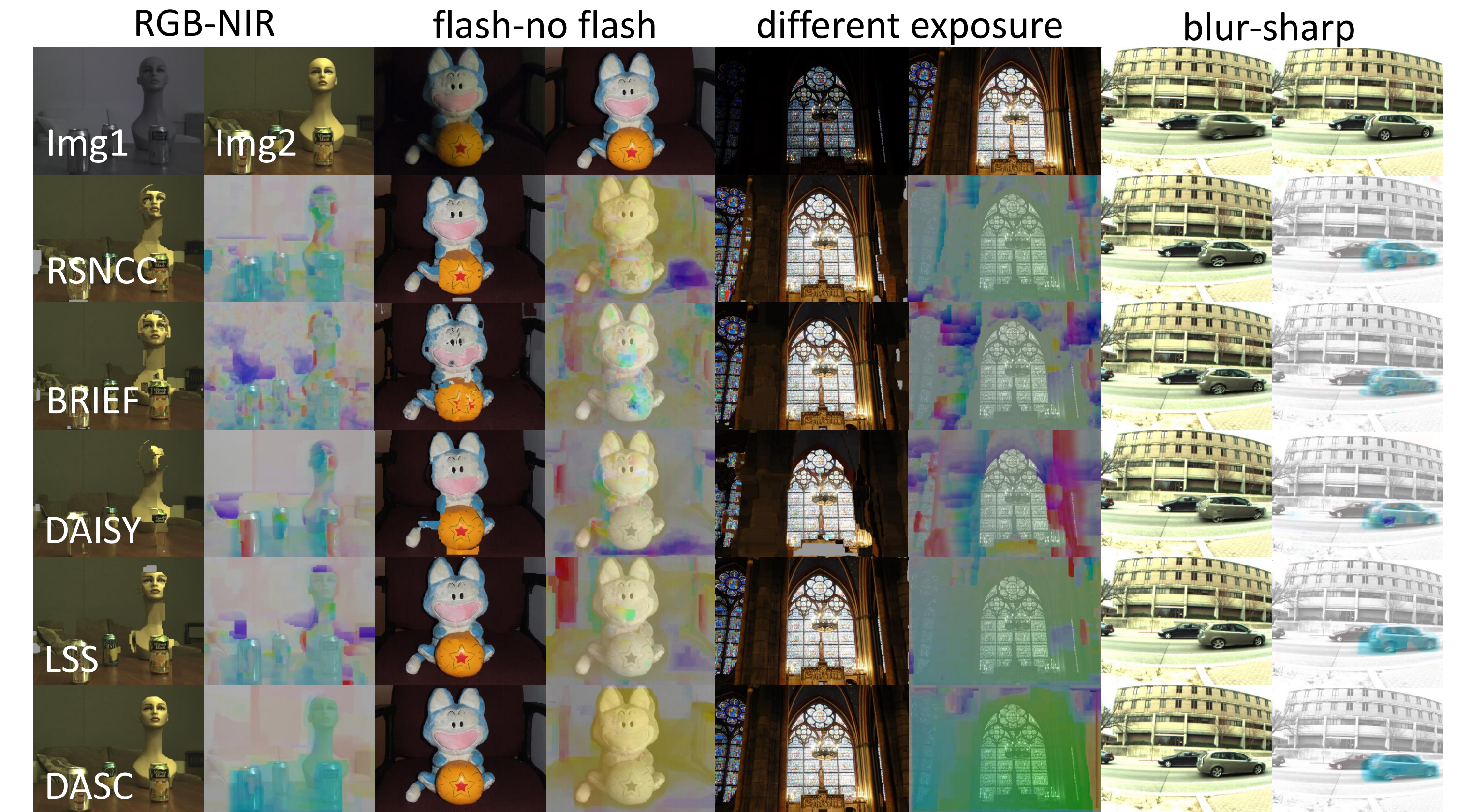


Experimental Results

Middlebury Stereo Benchmark



Multi-modal and Multi-spectral Image Pairs



Conclusion

- Robust novel descriptor called the DASC for **multi-modal correspondence**
- Leverages **adaptive self-correlation** and **randomized receptive pooling**
- Efficient computation with **fast edge-aware filters**

Download the code at <http://seungryong.github.io/DASC/>