

Evaluating Local Features for Day-Night Matching



Hao Zhou¹, Torsten Sattler ², David W. Jacobs¹

¹University of Maryland, College Park, USA

²Department of Computer Science, ETH Zurich, Switzerland

PROBLEM

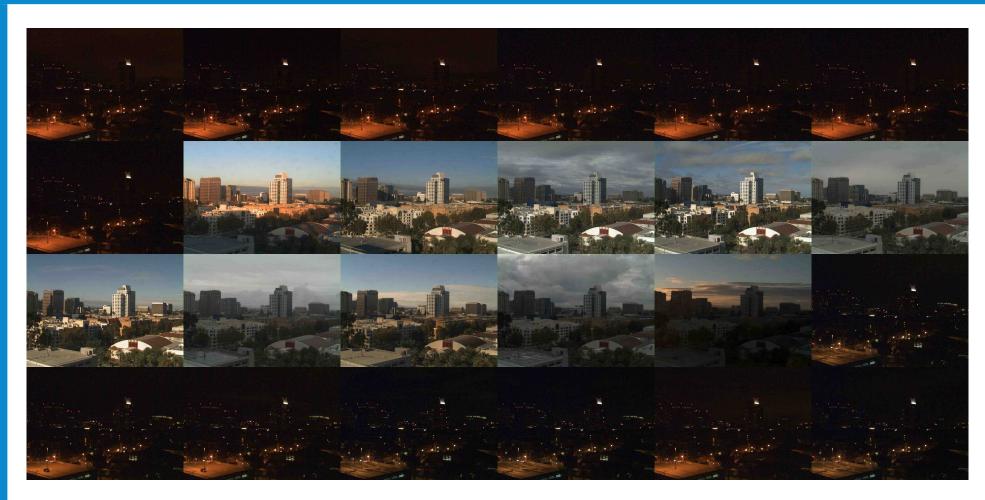
Day-night image matching is important (*e.g.* for large-scale localization and place recognition).

Current performance is far from satisfactory.

This work evaluated local features under day-night illumination changes to answer:

- 1. How seriously are detectors affected by day-night illumination changes?
- 2. Is repeatability the main challenge of day-night matching?
- 3. Is there room to improve day-night matching?

DATASET



The data we used are:

- (1) Collected from AMOS dataset [1].
- (2) Taken by a fixed webcam.
- (3) Taken at different times of the day.
- (4) Available at http://www.umiacs.umd.edu/~hzhou/dnim.html.

EVALUATION

Feature detectors used:

- 1. DoG, Hessian, HessianLaplace, MultiscaleHessian, HarrisLaplace, MultiscaleHarris from vlfeat.
- 2. TILDE [2] and its extended version: MultiscaleTILDE, TILDE4 and MultiscaleTILDE4.

Feature descriptors used: RootSIFT

Evaluation methods:

Repeatability: for feature detectors.

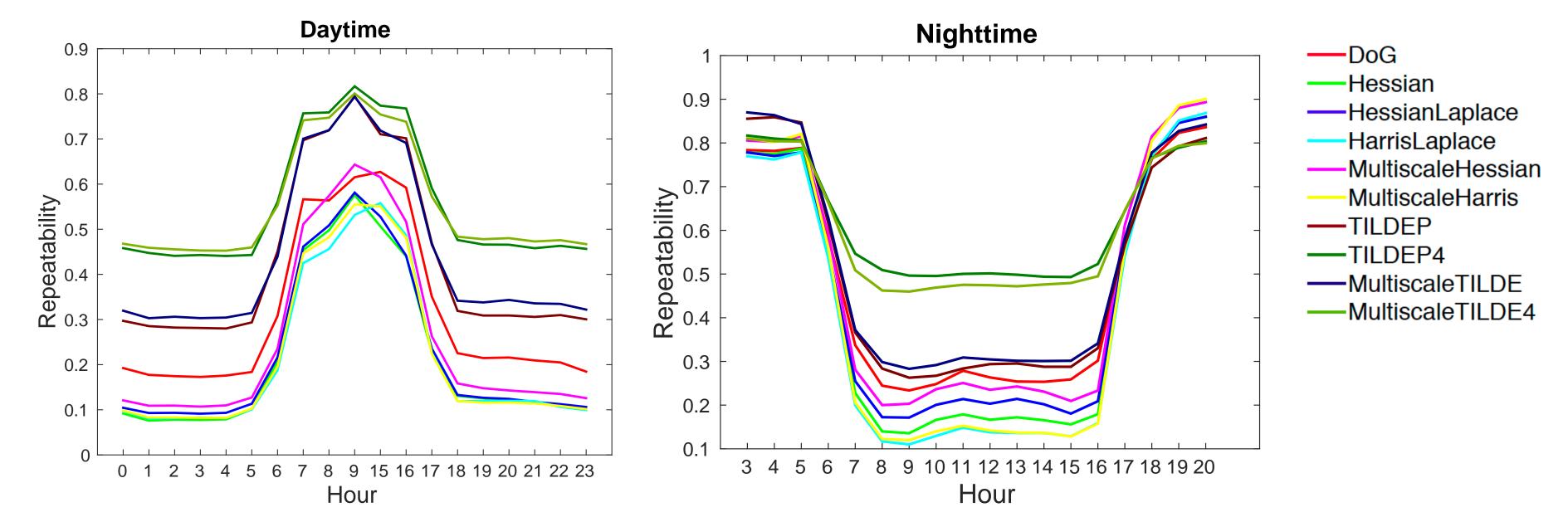
Precision and recall: for feature detectors + descriptors.

REFERENCES

- [1] N. Jacobs, N. Roman and R. Pless. Consistent Temporal Variations in Many Outdoor Scenes. In *CVPR*
- [2] Y. Verdie, K.M. Yi, P. Fua and V. Lepetit. TILDE: A Temporally Invariant Learned DEtector. In *CVPR* '15
- [3] K. Mikolajczyk, T. Tuytelaars, C. Schmid, A. Zisserman, J. Matas, F. Schaffalitzky, T. Kadir and L.V. Gool. A Comparison of Affine Region Detectors. IJCV '05

REPEATABILITY OF DETECTORS

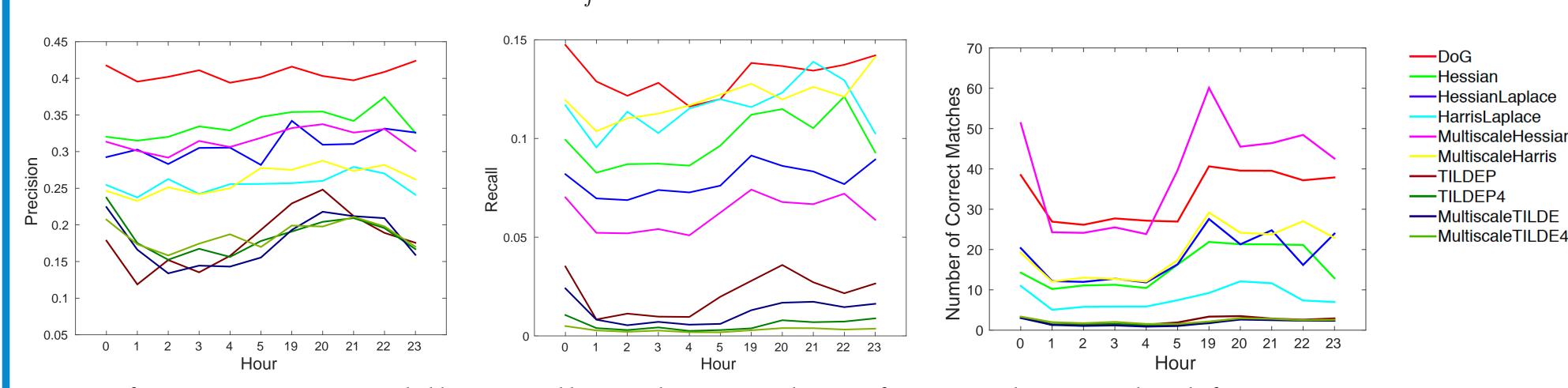
Question: how seriously are detectors affected by day-night illumination changes? Method: select time periods to get "ground truth" feature points and compute repeatability of points w.r.t. different times.



Left: repeatability of different feature detectors w.r.t. daytime ground truth. Right: repeatability of different feature detectors w.r.t. nighttime ground truth. **Detectors are affected by day-night illumination changes to a large extent.**

PRECISION AND RECALL

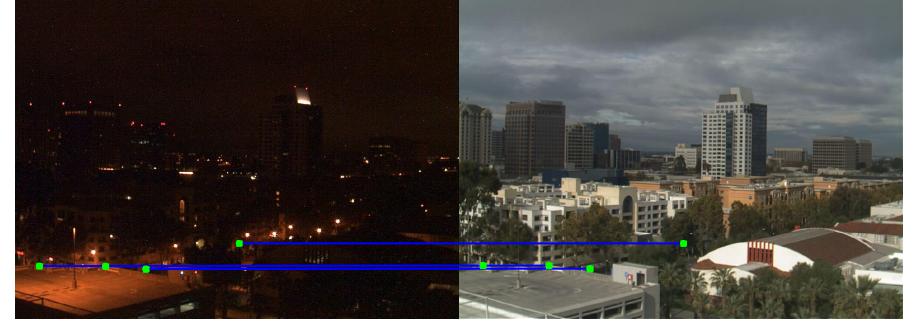
Question: is repeatability the main challenge of day-night matching? Method: compute precision $\frac{N_c}{N_f}$ and recall $\frac{N_c}{N}$ for every day-night image pair.

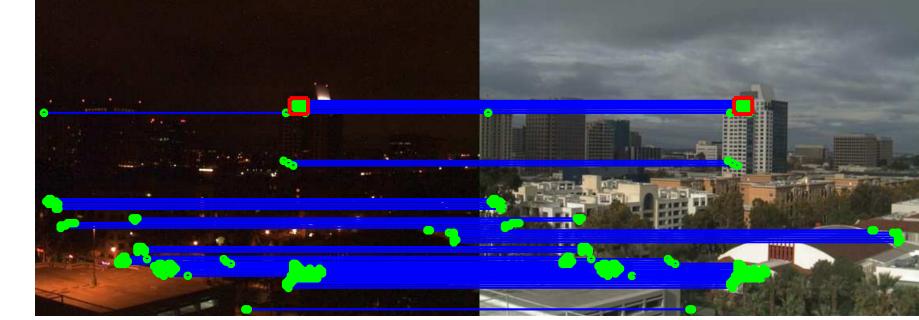


Left: precision. Middle: recall. Right: number of correctly matched features. High repeatability of detector \neq good performance (e.g. TILDE).

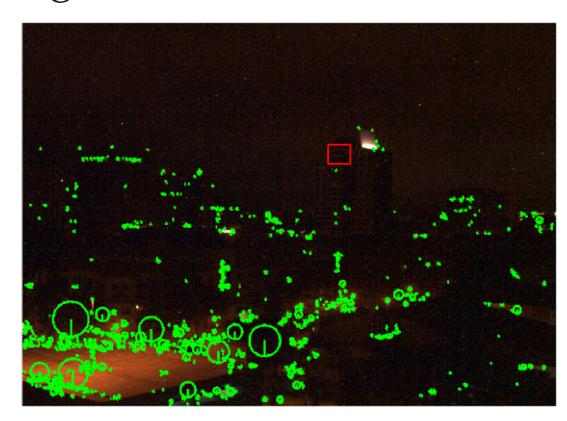
ROOM FOR IMPROVEMENT IN DETECTORS

Question: is there potential to improve detectors? Method: extracting dense RootSIFT for matching.

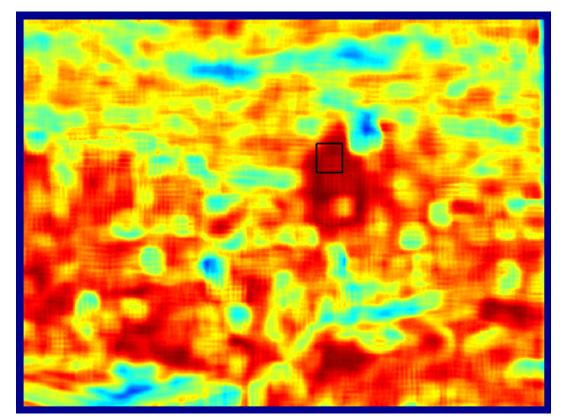




Left: correct matches found by DoG + RootSIFT. Right: correct matches found by dense RootSIFT.







Left and center: features detected by DoG. Right: heat map of cosine distance for RootSIFT. There is great potential for improving detectors for night images.

POTENTIAL OF DESCRIPTORS

Question: is there potential to improve descriptors?

Low recall means a lot of detected features cannot be matched by descriptors, meaning there is still potential to improve descriptors.

CONCLUSION

- 1. Feature detectors are severely affected by day night illumination changes.
- 2. Repeatability is not enough for evaluating feature detectors.
- 3. There is great potential for improving both detectors and descriptors.