

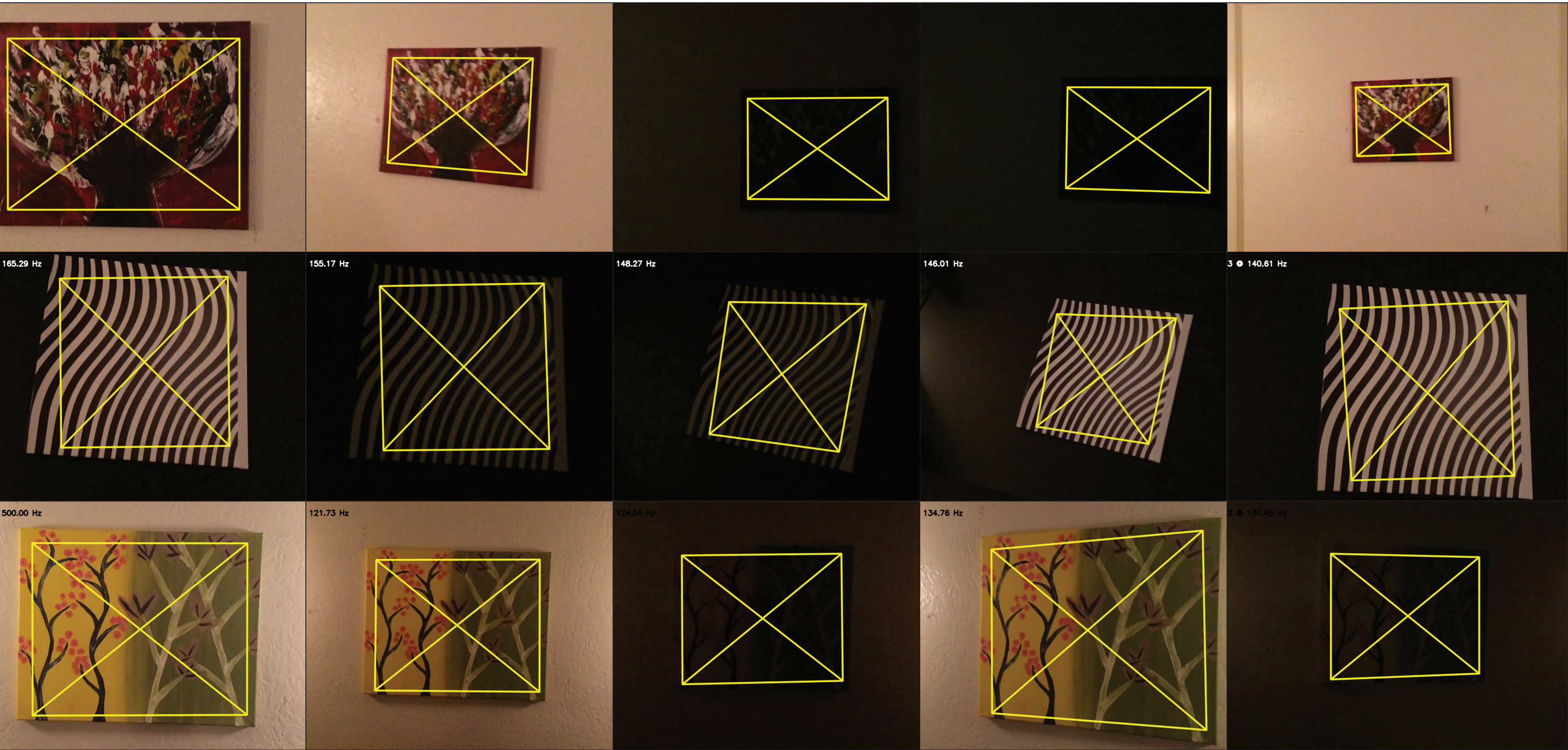
Robust Tracking in Low Light and Sudden Illumination changes

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Goal: Robust, precise and efficient tracking under challenging illumination conditions



Approach: Illumination invariant tracking using binary descriptors

8	12	200	8<42	12<42	200<42	1	1	0
56	42	55	56<42		55<42	0		0
128	16	11	128<42	16<42	11<42	0	1	1

Census Transform/LBP is invariant to monotonic changes
Efficient to compute
Must be matched under a binary norm (e.g. Hamming) to preserve invariance.

But, binary norms are non-differentiable



Bit-Planes

Bit-Planes: Multi-channel binary descriptor image

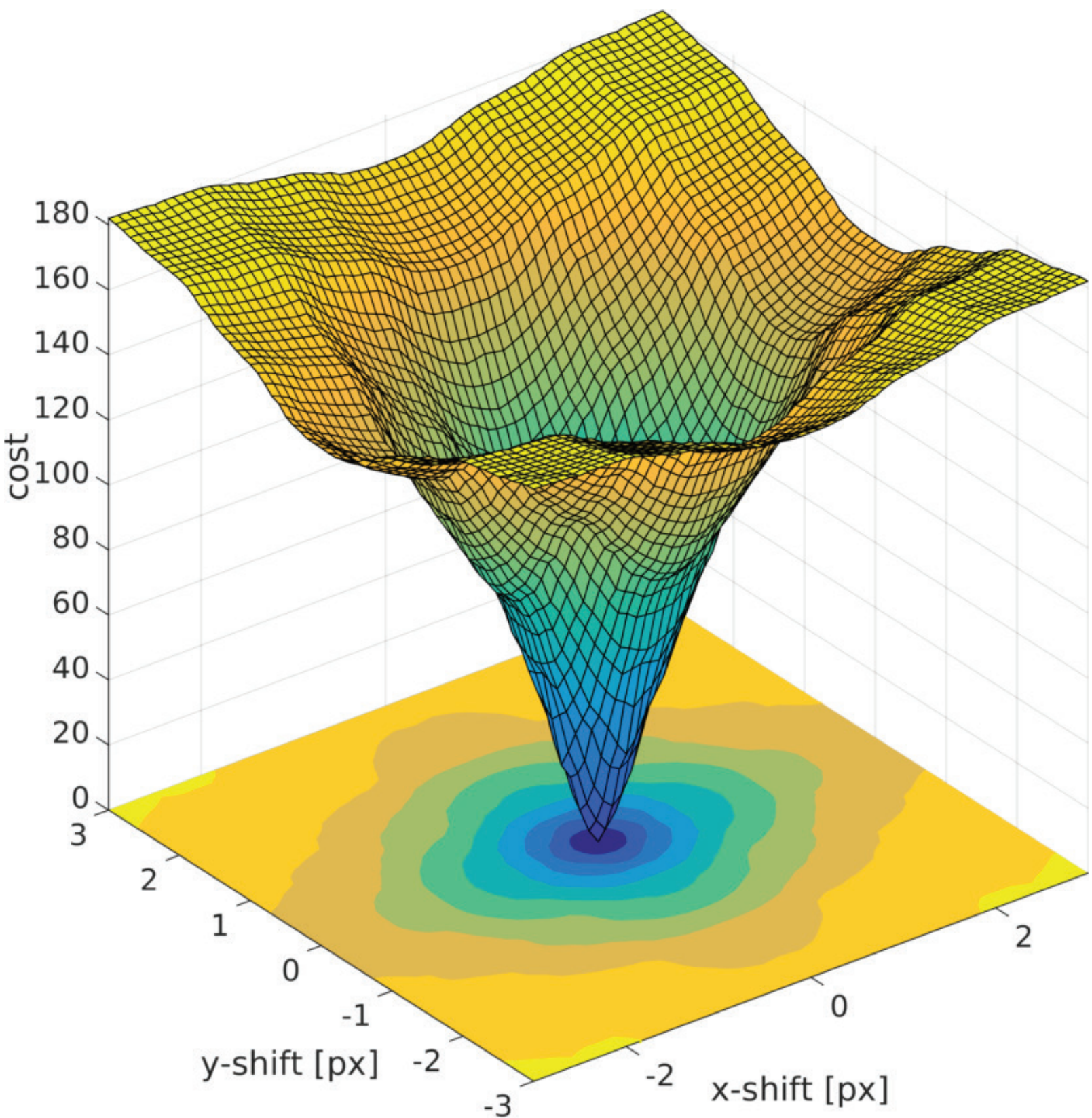
Preserves the Hamming distance under least-squares

$$\text{hamming}(\mathbf{a}, \mathbf{b}) = \text{SSD}(\mathbf{a}, \mathbf{b})$$
$$\begin{array}{r} \mathbf{a} = 1 \ 0 \ 1 \ 1 \ 0 \ 0 \ 1 \ 0 \\ \mathbf{b} = 0 \ 0 \ 1 \ 1 \ 1 \ 0 \ 1 \ 0 \\ \hline 1 \ 0 \ 0 \ 0 \ 1 \ 0 \ 0 \ 0 \end{array}$$

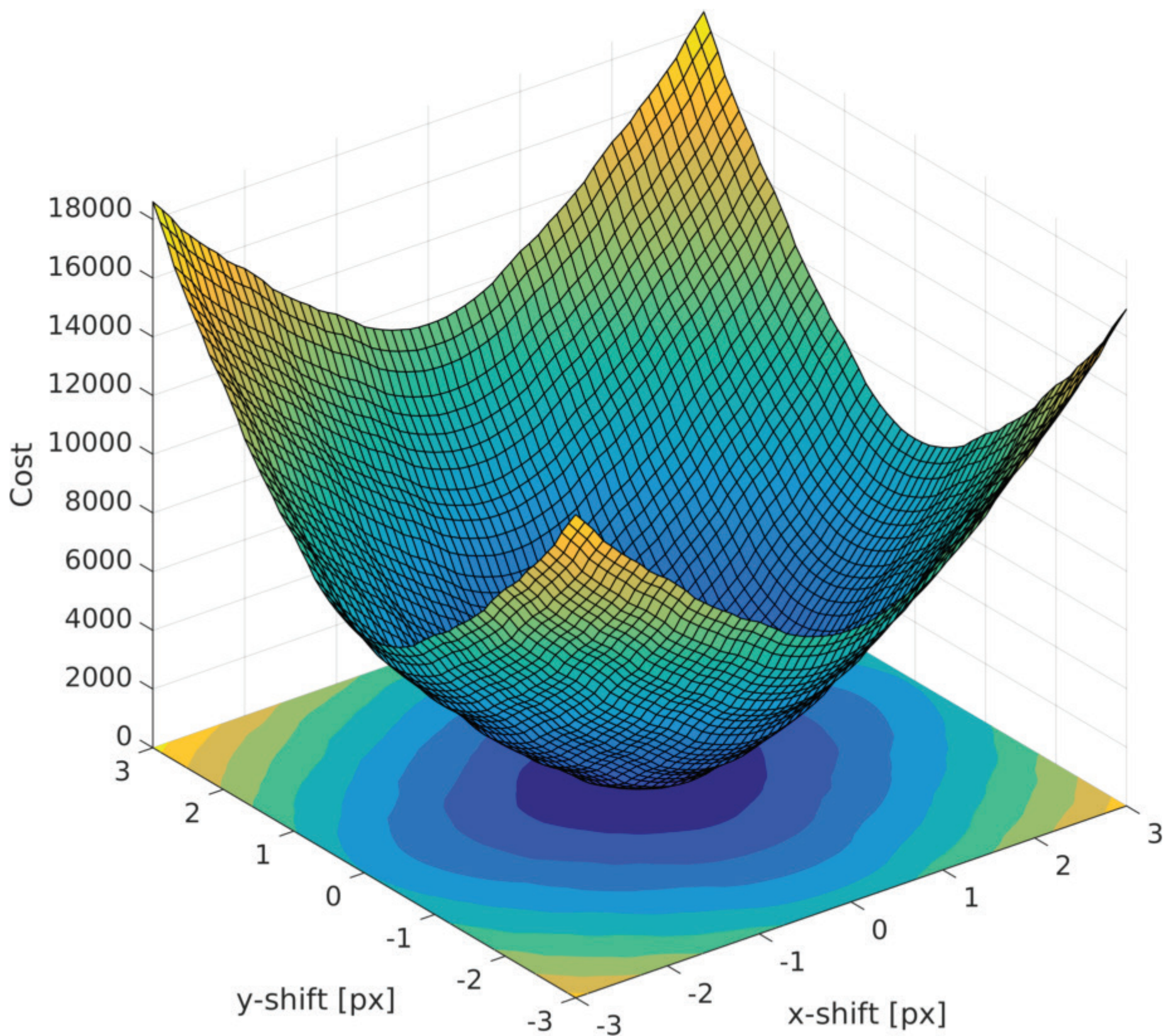
Linearization: Lucas-Kanade with Bit-Planes

$$\sum_{\mathbf{x} \in \Omega_0} \sum_{j=1}^d \|\phi_0^j(\mathbf{x}) - \phi_1^j(\mathbf{x}'(\theta))\|^2$$

descriptor channels (8 for Bit-Planes)

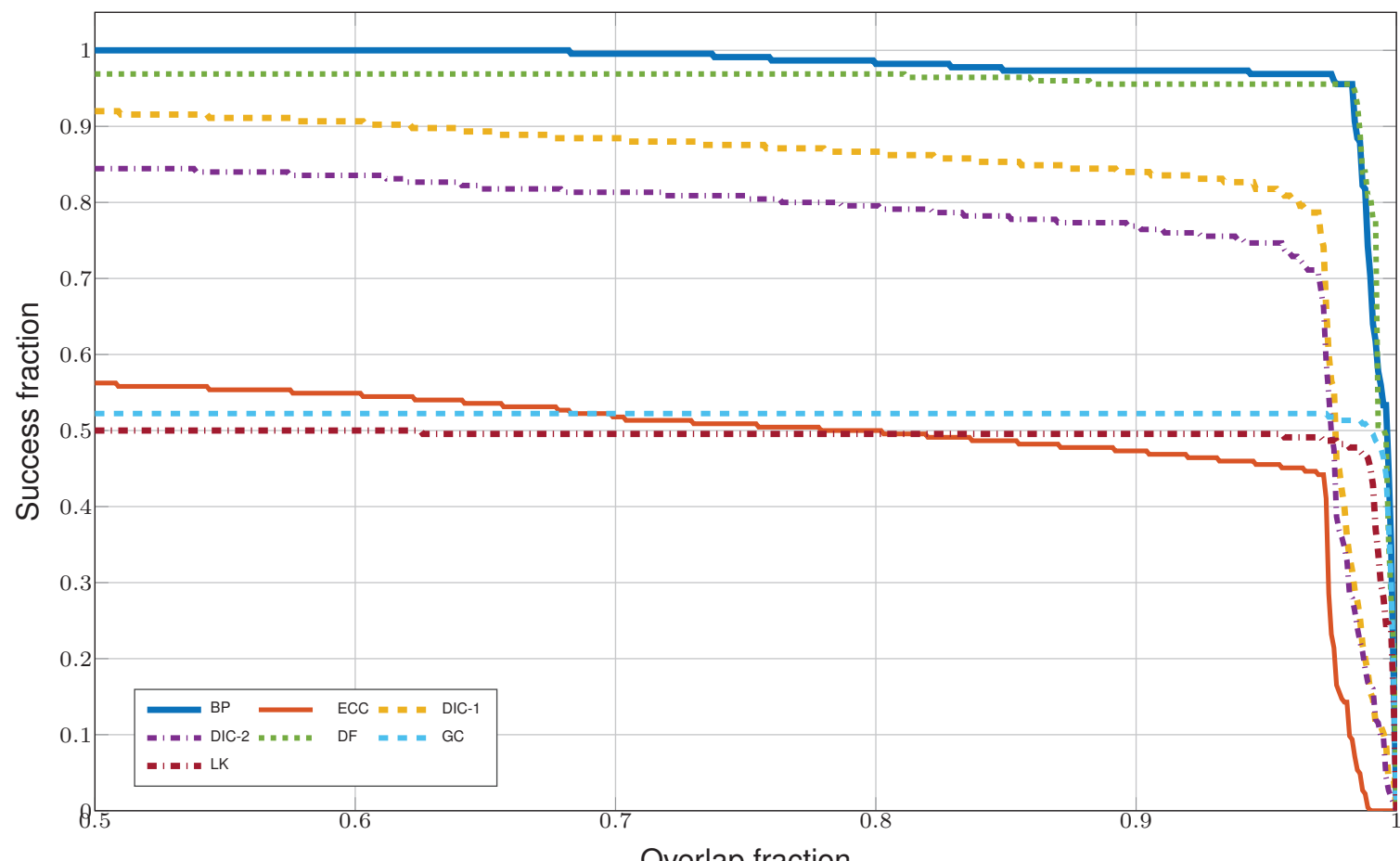


Bit-Planes



Raw intensity

Performance: Robust, accurate and real-time



data courtesy of Gauglitz et al.

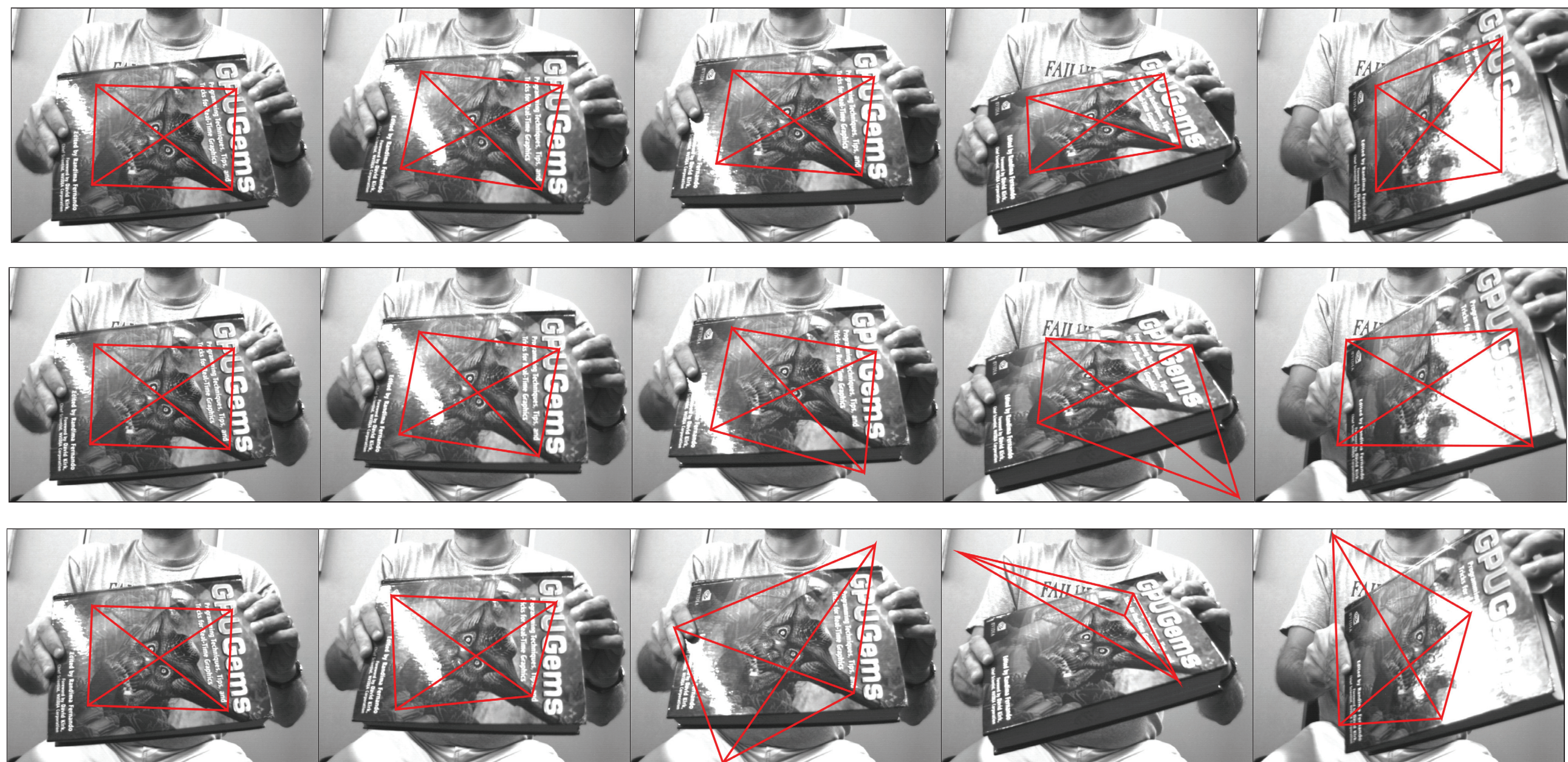
Run time (fps) on mobile devices

template size	iPad Air 2			iPhone 5s		
	BP	ORB	BRISK	BP	ORB	BRISK
70 × 55	123	N/A	N/A	50	N/A	N/A
150 × 115	48	15	15	22	13	13
311 × 230	17	12	14	10	8	11

Bit-Planes

Descriptor
Fields

Gradient
Constraint



data courtesy of Silveira et al.

Future work

Improving basin of convergence (e.g. by incorporating intensity information)

Application to other domains (e.g. Direct Visual Odometry)