

EMVS: Event-based Multi-View Stereo

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Event cameras are bio-inspired vision sensors that output pixel-level brightness changes instead of standard intensity frames. They offer significant advantages over standard cameras, namely a very high dynamic range, no motion blur, and a latency in the order of microseconds. However, because the output is composed of a sequence of asynchronous events rather than actual intensity images, traditional vision algorithms cannot be applied, so that a paradigm shift is needed.

We introduce the problem of Event-based Multi-View Stereo (EMVS) for event cameras and propose a solution to it. Unlike traditional MVS methods, which address the problem of estimating *dense* 3D structure from a set of known viewpoints, EMVS estimates *semi-dense* 3D structure from an event camera with known trajectory. Our EMVS solution elegantly exploits two inherent properties of an event camera: (i) its ability to respond to scene edges—which naturally provide semi-dense geometric information without any pre-processing operation—and (ii) the fact that it provides continuous measurements as the sensor moves. Despite its simplicity (it can be implemented in a few lines of code), our algorithm is able to produce accurate, semi-dense depth maps. We successfully validate our method on both synthetic and real data. Our method is computationally very efficient and runs in real-time on a CPU.

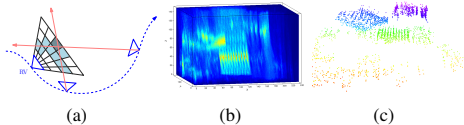


Figure 1: Events are back-projected into rays (a), which are counted in a ray density DSI (b), from which a semi-dense 3D reconstruction of the scene edges is extracted by detecting local maxima (c).

We solve the EMVS problem in a similar way to the Space-Sweep approach for MVS [2], showing how sparsity can be leveraged to esti-

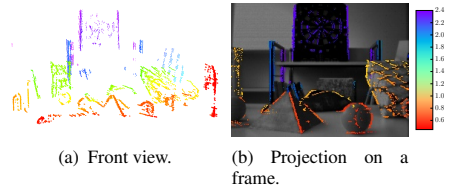


Figure 2: Reconstruction of a desk scene with objects of different shapes that cause occlusions. Depth is colored from red (close) to blue (far).

mate 3D structures without the need for explicit data association or photometric information.

The Event-based Space-Sweep Method consists of three steps:

- Events are back-projected according to the viewpoint of the camera. Each event produces a viewing ray (Fig. 1(a)).
- Rays are counted on a discretized volume containing the 3D scene, yielding a DSI (Fig. 1(b)) that measures the spatial density of rays.
- Scene points are detected in the regions of high ray-density. The location and value of local maxima of the DSI provide the depth and confidence of reconstructed 3D points, respectively. The most confident values yield a semi-dense depth map or point cloud (Fig. 1(c))

Results. Our algorithm produces accurate 3D reconstructions (relative depth errors $< 5\%$) in the presence of high dynamic range (HDR) illumination and/or high-speed motions that cannot be handled by standard cameras, in spite of the low spatial resolution of the sensor [1] and the high amount of noise typical of event cameras.

Multimedia Material. A supplemental video for this work is available on the authors' webpage: <http://rpg.ifi.uzh.ch>

- [1] C. Brandli et al. A 240x180 130dB 3us latency global shutter spatiotemporal vision sensor. *IEEE J. of Solid-State Circuits*, 2014.
- [2] R. T. Collins. A space-sweep approach to true multi-image matching. In *IEEE CVPR*, 1996.