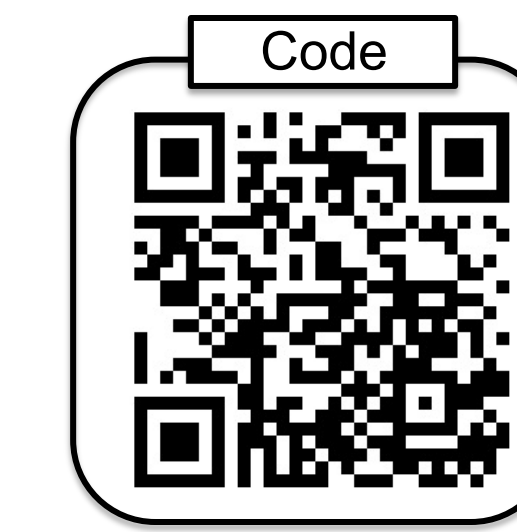




# Seeing in Extra Darkness Using a **Deep-Red Flash**

Jinhui Xiong<sup>1\*</sup>, Jian Wang<sup>2\*</sup>, Wolfgang Heidrich<sup>1</sup>, Shree Nayar<sup>2</sup>  
<sup>1</sup>KAUST, <sup>2</sup>Snap Research (\* denotes equal contribution)



[Code] [github.com/vccimaging/Deep-Red-Flash](https://github.com/vccimaging/Deep-Red-Flash)  
 [Paper] [vccimaging.org/Publications/Xiong2021Seeing/Xiong2021Seeing.pdf](https://vccimaging.org/Publications/Xiong2021Seeing/Xiong2021Seeing.pdf)

## Motivation

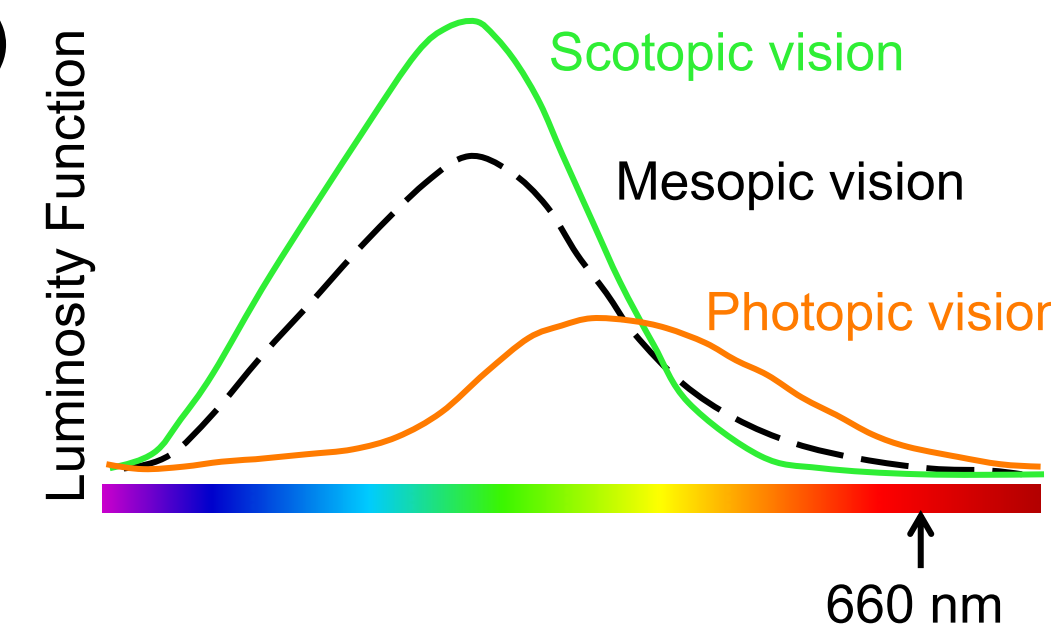
### Existing approaches for low-light imaging:

- No-flash: burst photography, data driven (deep-learning based)  
Fail when camera raw data suffers from poor signal-to-noise ratio. They still **need adequate illumination**. Difficult for low-light video reconstruction.
- Flash-based: white flash, invisible flash (like near-infrared (NIR))
  - White flash **dazzles** human eyes, not user-friendly.
  - RGB cameras do not have sensitivity to the invisible spectrum, thus **an additional camera** for NIR sensing is required [1].

## Our Solution

A **deep-red (660 nm)** flash is proposed for low-light photography and videography. The design of this flash is in the consideration of the human visual system.

**Photopic vision** (cones) and **scotopic vision** (rods) are the vision of the eye under well-lit conditions (above 10 cd/m<sup>2</sup>) and low-light conditions (below 10<sup>-3</sup> cd/m<sup>2</sup>), respectively. A combination of cones and rods forms *mesopic vision*.



### Perceived Brightness

In extra dim conditions (around 10<sup>-2</sup> cd/m<sup>2</sup>), using white flash is over **two orders of magnitude brighter** than using the red flash as perceived by the human eye when the camera receives the same amount of signals.

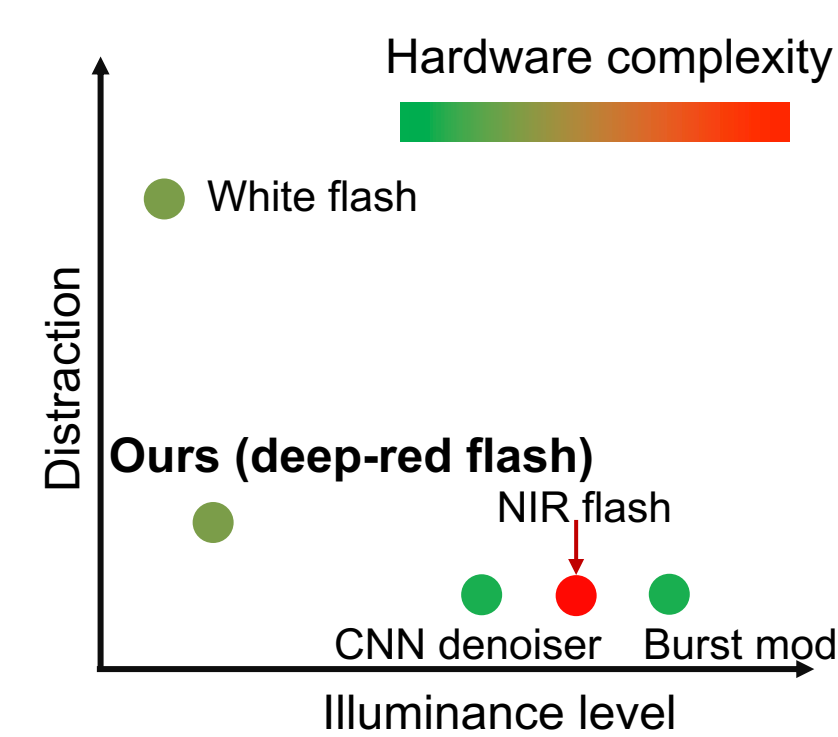
Luminance (cd/m <sup>2</sup> )	Brightness gain
0.005	1/353.47
0.01	1/338.45
0.05	1/25.22
0.1	1/15.98

### Night Vision

When exposed to light like a burst of white flash, the rods photobleach and lose their sensitivity to light [2]. Night vision is **preserved** using deep-red light.

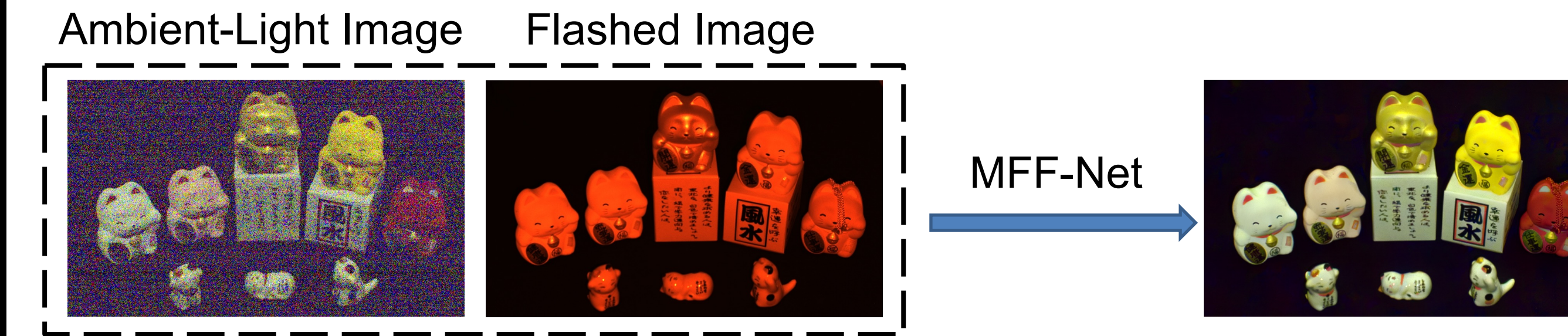
### Hardware

A **single RGB camera** is capable of capturing both red-flash and no-flash image pairs, unnecessary to use an extra camera.



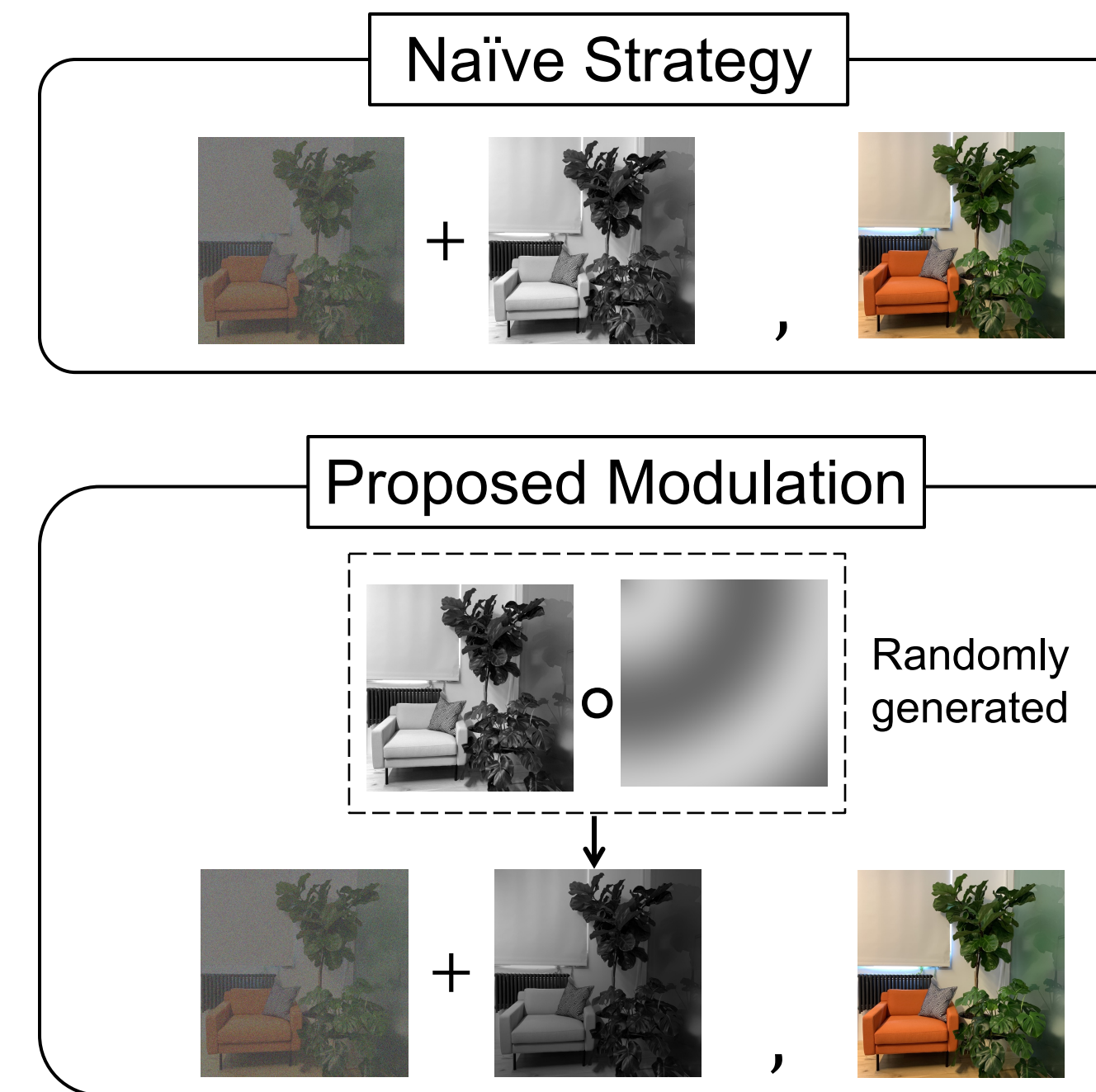
## Photography

We trained a neural network, named as *mesopic flash fusion* network (MFF-Net), to fuse the ambient-light image and the flashed image.



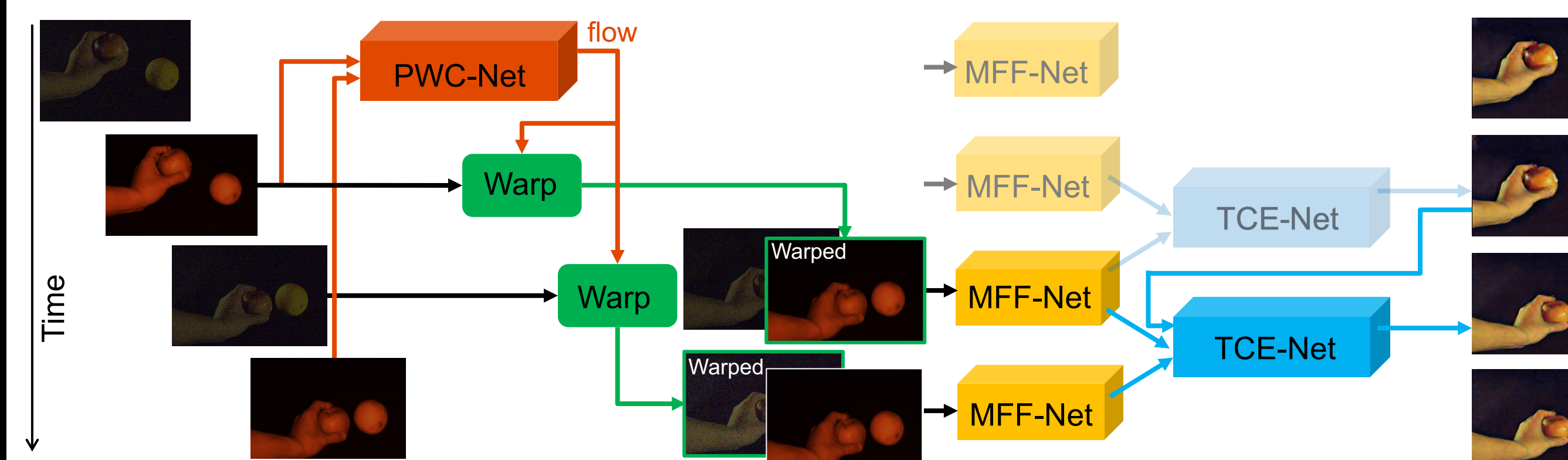
### Training Data Generation

A low-frequency sinusoidal function with random period, amplitude and phase is applied as a **modulator** during training. Applying this **modulation function** to the flashed image decorrelates the intensity in the flashed and output images, while still retaining their edge correlation. This helps the network learn to **exploit the edges rather than rely on the intensity** in the flashed image.



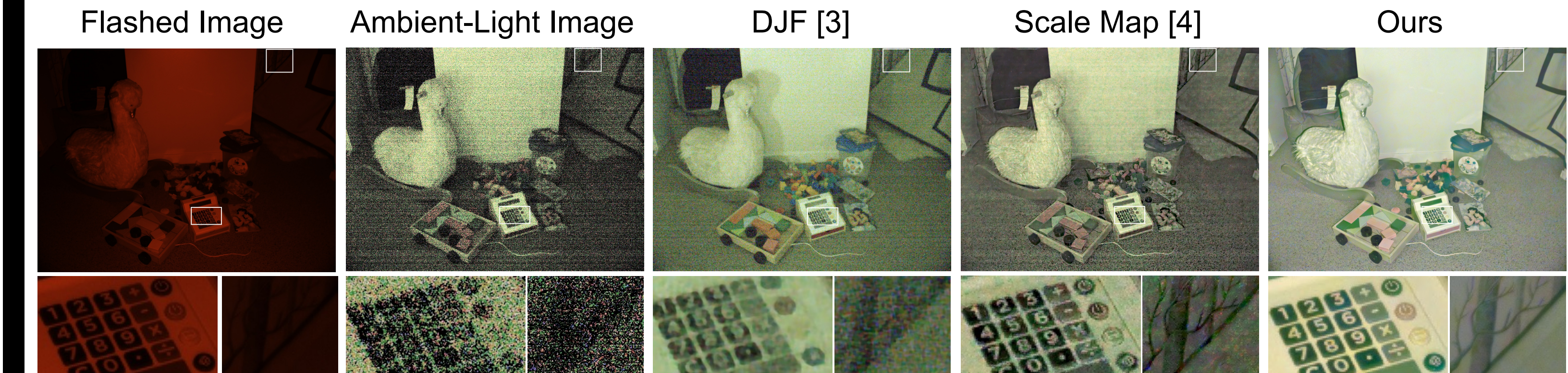
## Videography

The input for videography is a sequence of interlaced ambient-light (no-flash) and flashed image pairs. We propose an effective pipeline for video reconstruction, which yields **robust image alignment** in the dark while **preserving the original frame rate**.



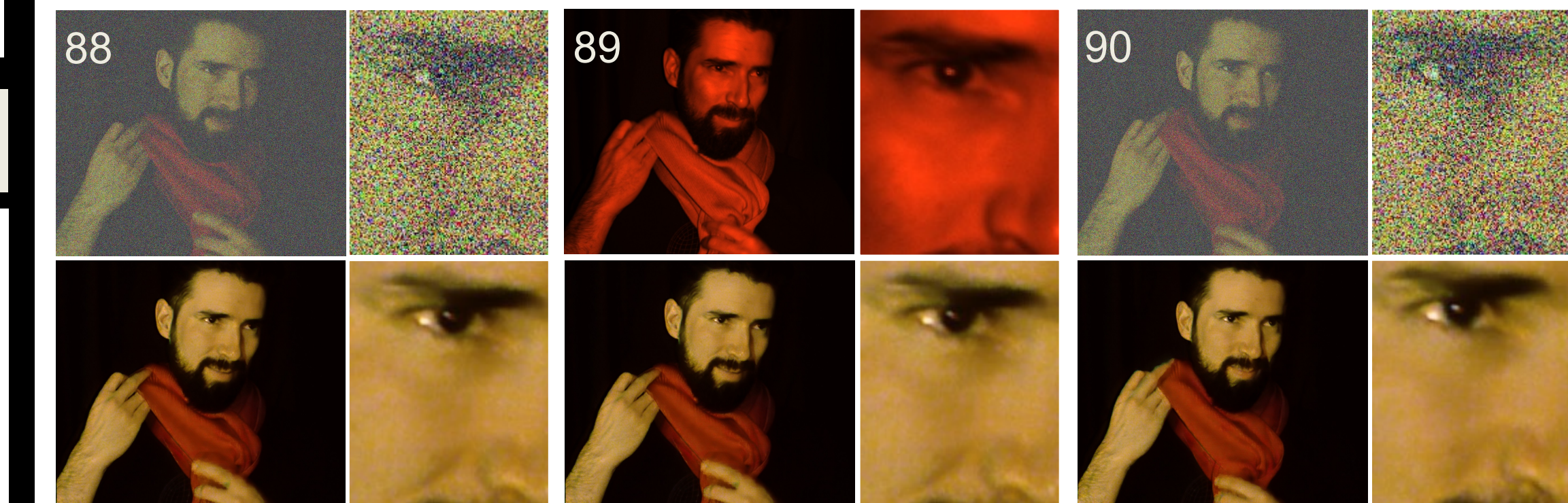
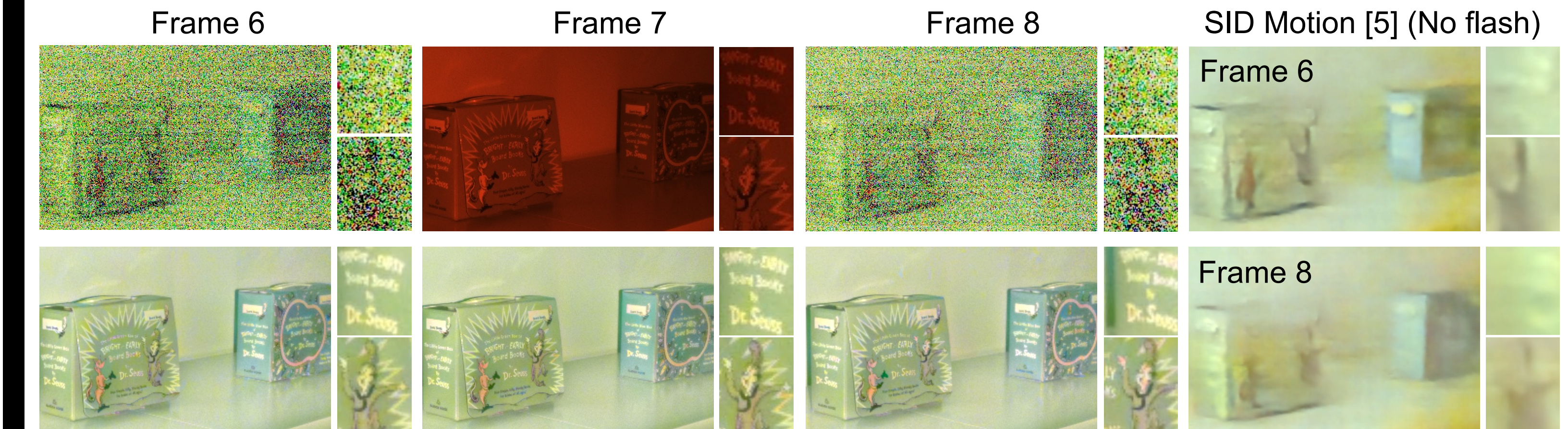
## Results

### Compared to alternative guided filtering methods:



The compared methods fail to retrieve fine image details in the rather challenging situation, whereas our method produces clean outputs with fine image features recovered.

### Video reconstruction:



In extra dim environments, which are beyond the capability of no-flash methods, it is essential to use flashes to capture interested scene details. A flash can easily boost the light level by 100~1000X.

## References

- [1] Jian Wang, et al. "Stereoscopic dark flash for low-light photography". In ICCP, 2019.
- [2] Mathew Alpern. "Effect of a bright light flash on dark adaptation of human rods". In Nature, 1971.
- [3] Yijun Li, et al. "Joint image filtering with deep convolutional networks". In PAMI, 2019.
- [4] Xiaoyong Shen, et al. "Multispectral joint image restoration via optimizing a scale map". In PAMI, 2015.
- [5] Chen Chen, et al. "Seeing motion in the dark". In ICCV, 2019.