# Deblurring Low-light Images with Light Streaks

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#### Introduction

#### Background

Most recent approaches rely on salient image features such as edges for blur kernel estimation, however in low-light images the amount of salient image features that can be extracted is often limited. Furthermore, low-light images often have gone through heavy in camera non-linear tone mapping, which breaks the linear blur model that most approaches assume.

#### What we do

In this work, we propose a new deblurring framework that properly uses light streaks as an additional cue for blur kernel estimation. We extend the widely-used linear blur model by explicitly modeling point light sources and light streaks, resulting in a non-linear model that more accurately describes the formation of low-light images that contain light streaks. We then formulate a kernel estimation energy function that takes into account light streaks as well as other image structures.

# Light Streak Detection







# **Algorithms**

#### Blur Kernel Estimation using Light Streaks

$$B^{p} = \sum c\left(\hat{P}_{i}\right) = \sum c\left(K * D_{i} + N\right) \tag{1}$$

$$f_{K}(K) = \sum_{x \in M^{r}} |\partial_{h}B(x) - (K * P_{h})(x)|^{2}$$

$$+ \sum_{x \in M^{r}} |\partial_{v}B(x) - (K * P_{v})(x)|^{2} + \lambda ||K||_{1}$$

$$+ \mu \sum_{P_{i} \in \mathbb{P}} \sum_{x \in P_{i}} \left| (D_{i} * K)(x) - \hat{P}_{i}(x) \right|^{2}$$

$$(2)$$

# Algorithms

#### Blur Kernel Estimation using Light Streaks

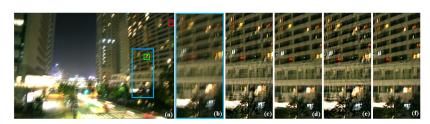
$$f_{D_i}(t_i, r_i) = \left\| D_i(t_i, r_i) * K - \hat{P}_i \right\|^2 + \left\| D_i(t_i, r_i) - I_i \right\|^2$$
(3)

$$f_{I}(I) = \sum_{i} \mu \|D_{i} - I_{i}\|^{2} + \sum_{x} |B(x) - c(K * I)(x)|^{2}$$

$$+ \gamma \sum_{x} (|\partial_{h} I(x)|^{\alpha} + |\partial_{v} I(x)|^{\alpha})$$
(4)

# **Experiments**

A comparison with Hua and Low's approach. The red box indicates our selected light streak patch and the green box is a manually selected patch. (a) Input image; (b) cropped regions from (a); (c) & (e) cropped results by Hua and Low [8], using the red and green light streak patches, respectively; (d) & (f) cropped results by our method. Please refer to the supplementary material for complete results.



# **Experiments**

Comparisons with state-of-the-art methods on real examples. (a)(f) Input image; (b)(g) cropped regions from (a) and (f); (h) cropped results by Cho and Lee; (c)(i) cropped results by Krishnan et al.; (d)(j) cropped results by Hua and Low; (e)(k) cropped results of our approach. Please refer to the supplementary material for complete results.



# **Experiments**

Comparisons on synthetic examples. (a) Input image with ground truth kernel; (b) cropped region from (a); (c)-(g) cropped results by Cho and Lee, Levin et al. , Krishnan et al. , Xu et al. and our approach, respectively. Please refer to the supplementary material for complete results.



### **Further**

# Ongoing Optimization

• cnn ?

#### References

 Zhe Hu, Sunghyun Cho Deblurring Low-light Images with Light Streaks