Background and Motivation	Prior Work	Proposed method	Results	Summary

## Focal Sweep for Large Aperture Time-of-flight Cameras

#### September 27, 2016

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#### 1 Background and Motivation

- Continuous-wave ToF imaging
- Defocus blur in ToF cameras

## 2 Prior Work

#### 3 Proposed method

- Focal sweep technique
- System Overview
- Image capture and deblurring method

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 Continuous-wave
 ToF imaging

 Working principle

• Captures depth by measuring phase delay of an optical signal:

$$z_p = \frac{c\tau_p}{2} = \frac{c\phi_p}{4\pi f_M}$$

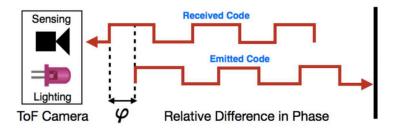


Figure: ToF working principle (Source: A. Kadambi, ICCV 2015 tutorial)

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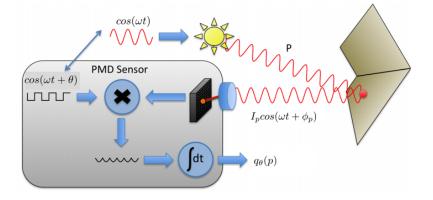


Figure: Continuous-wave ToF sensing (Adapted from Heide et al, 2013)

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- Emitted signal:  $cos(\omega t)$
- Received signal:  $a_p cos(\omega t + \phi) + \beta$
- Cross-correlation:

$$q(\theta, p) = \frac{a_p}{2}\cos(\theta + \phi) + \beta$$

- Four such correlation measurements, called quadrature channels, q<sub>i</sub>(p); i = {0, 1, 2, 3} captured with four different values of θ = i<sup>π</sup>/<sub>2</sub>; i = {0, 1, 2, 3}
- Using the quadrature measurements q<sub>i</sub>(p), the depth and amplitude can be computed as

$$z_{p} = \tan^{-1} \left( \frac{q_{1}(p) - q_{3}(p)}{q_{0}(p) - q_{2}(p)} \right) \frac{c}{4f\pi}$$
$$a_{p} = \sqrt{(q_{0}(p) - q_{2}(p))^{2} + (q_{1}(p) - q_{3}(p))^{2}}$$
(1)

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# Background and Motivation Continuous-wave ToF imaging Defocus blur in ToF cameras

#### 2 Prior Work

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Defocus blur in T	oF cameras			

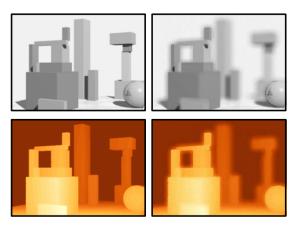
- Poor light throughput
  - Active light source intensity limited safety and power restrictions
  - Exposure duration should be small Motion blur
- Large numerical aperture lenses to capture more light
- Side-effect: Defocus blur and limited depth of field
- Blurry quadrature measurements:  $y_i(p) = K(z_p) * q_i(p)$ , where  $K(z_p)$  is the depth-dependent PSF

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 Defocus blur in ToF cameras
 Illustration
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a) Ground truth

b) Conventional ToF

Figure: Illustration of defocus blur in amplitude and depth images captured with ToF camera with f/1.4 lens and sensor pixel size  $45 \mu m$ 

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Prior work				

- Godbaz et al, 2010
  - Coded aperture for stable deconvolution
  - Gaussian derivative prior for quadrature channels
  - Employ spatially-varying iterative deconvolution technique for deblurring
- Xiao et al., 2015
  - Use image-formation model to address defocus blur
  - Instead of deconvolution, directly estimate latent amplitude and depth from degraded quadrature measurements
  - Three unknowns: depth-dependent PSF, all-in-focus amplitude and all-in-focus depth map
  - ADMM (Alternating Direction Method of Multipliers) used to solve for all-in-focus amplitude and depth map

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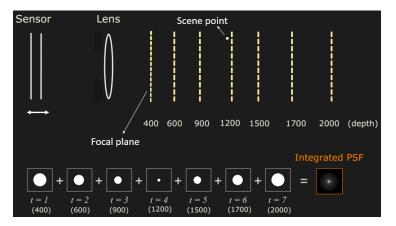
- Focal sweep technique
- System Overview
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Background and Motivation	Prior Work O	Proposed method	Results 000	Summary O
Focal sweep tech	nique			

- Distance between lens and sensor varied at constant rate during exposure
- Resultant blurred image has a depth-independent PSF
- Hence, by estimating a single PSF and using non-blind deconvolution techniques, a sharp all-in-focus image can be obtained

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Figure: Illustration of focal sweep technique and how it leads to depth-invariant blur [Source: Nagahara et al., 2010]

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Overview				

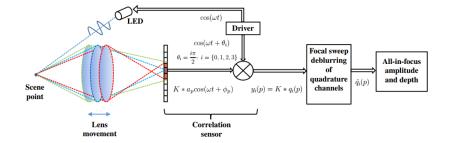


Figure: Overview of the proposed method

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- Each quadrature channel is captured by sweeping the focus over the scene depth range
- This results in a depth-invariant blur in the ToF quadrature measurements
- Obtain the two independent channels from the blurry quadrature measurements:  $h_{re} = \frac{(y_0 y_2)}{2}$  and  $h_{im} = \frac{(y_1 y_3)}{2}$
- *h<sub>re</sub>* and *h<sub>im</sub>* are also blurred versions of corresponding sharp channels blurred by the same depth-invariant PSF:

$$h_{re} = K * X_{re}; \ h_{im} = K * X_{im}$$
  
 $X_{re} = a \cos(\phi); \ X_{im} = a \sin(\phi)$ 

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• Sharp channels  $\widehat{X_{re}}$  and  $\widehat{X_{im}}$  estimated using non-blind deconvolution with TV regularisation prior:

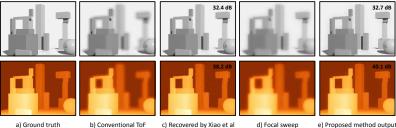
$$\widehat{X_{re}} = \operatorname{argmin}_{X_{re}} ||h_{re} - K * X_{re}||^2 + \lambda ||X_{re}||_{TV},$$

and similarly for  $\widehat{X_{im}}$ .

• All-in-focus amplitude and depth map obtained from Equation 1 by appropriate substitution of  $\widehat{X_{re}}$  for  $q_0 - q_2$  and  $\widehat{X_{im}}$  for  $q_1 - q_3$ 

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Background and Motivation	Prior Work O	Proposed method	Results ●00	Summary O
Simulated scene				



a) Ground truth

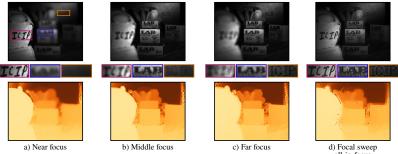
c) Recovered by Xiao et al

d) Focal sweep

e) Proposed method output

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Real scene				



Individual images captured with a standard ToF camera

d) Focal sweep all-in-focus

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Post-capture refo	cusing and	tilted DOF		

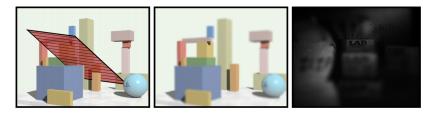


Figure: Left: Ground truth. Middle: Refocused scene along red plane. Right: Refocused real scene

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Conclusions and F	uture Work	K		

- Novel methodology for extending DOF in ToF imaging using focal sweep
- Simple recovery algorithm using non-blind deconvolution enabling real-time operation and straightforward scale-up for future generation ToF cameras
- Future work:
  - Better priors than TV norm regularization for ToF quadrature measurements?
  - Novel view synthesis and other applications using ToF focal stack

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