



Realistic Refocusing

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Digital refocusing

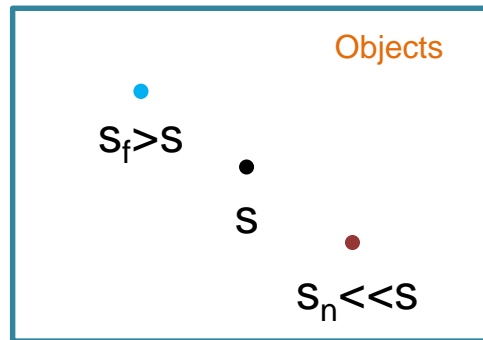
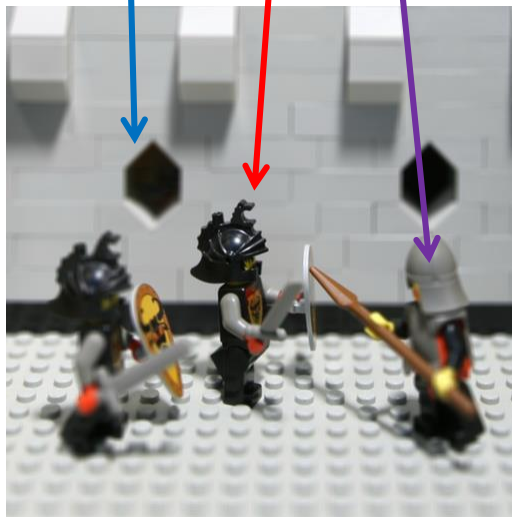
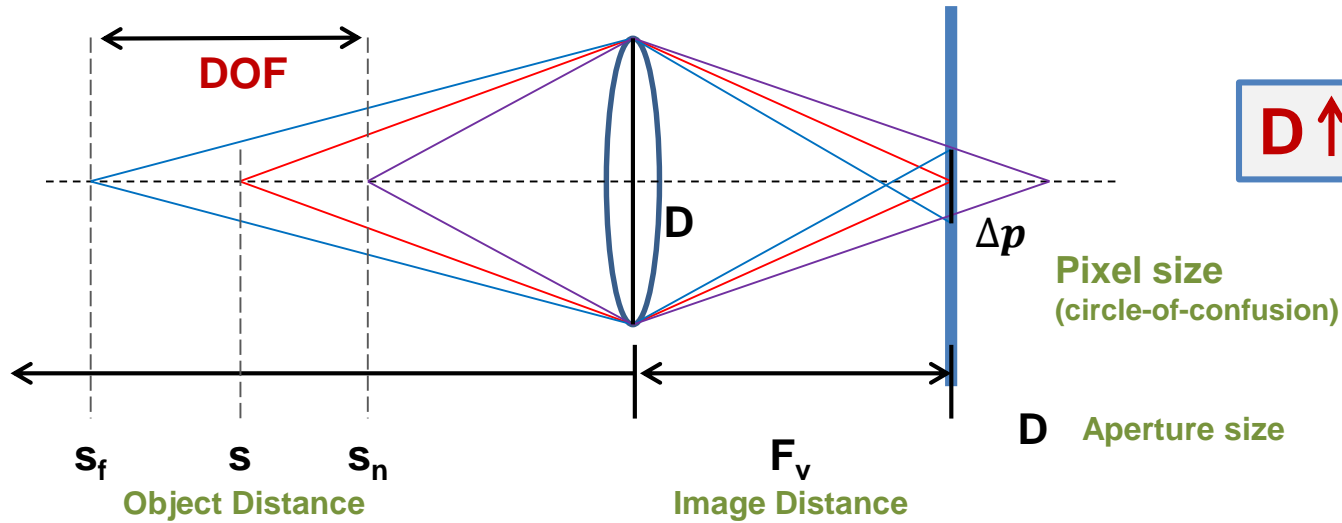
- Provide the depth-of-field effect after capturing pictures
 - Adjustable focal plane, aperture size, aperture shape, ...



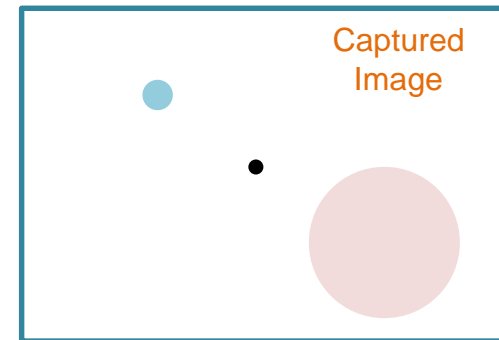
More pictures on <https://pictures.lytro.com/>

Ref: http://www.ee.nthu.edu.tw/chaotsung/sparse_lf_refocus/
http://web.ee.nthu.edu.tw/files/14-1030-79438_r2471-1.php

Depth of field (DOF)



Focused at s



DOF effect



[source: Nikon sample movie]

Bokeh



Ref: <http://howaboutorange.blogspot.tw/2011/05/photography-diy-how-to-make-your-own.html>

Computation and artifact

- Basic operation: Shift and average ([CGL](#))
 - Shift by disparities for each view
 - Average all shifted views as the refocused image

Hands-on webpage <http://lightfield.stanford.edu/lfs.html>

- Major artifact: Aliasing effect
 - Due to insufficient view sampling



→
Post-
processing





Outline

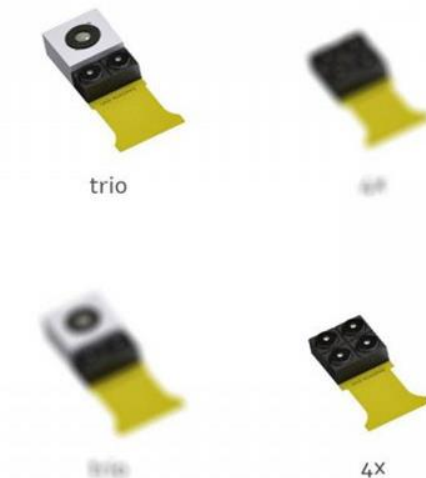
- Conventional refocusing methods
 - View interpolation for sparse light fields
 - Image blurring for single-view images
- Fast realistic refocusing for sparse light fields

Sparse light field

- Sparse view sampling
 - Large disparity between neighboring views
 - Typical hardware configuration: Camera array
 - Few views, large baseline (lower storage/higher resolution)
 - Examples:



Pelican Imaging



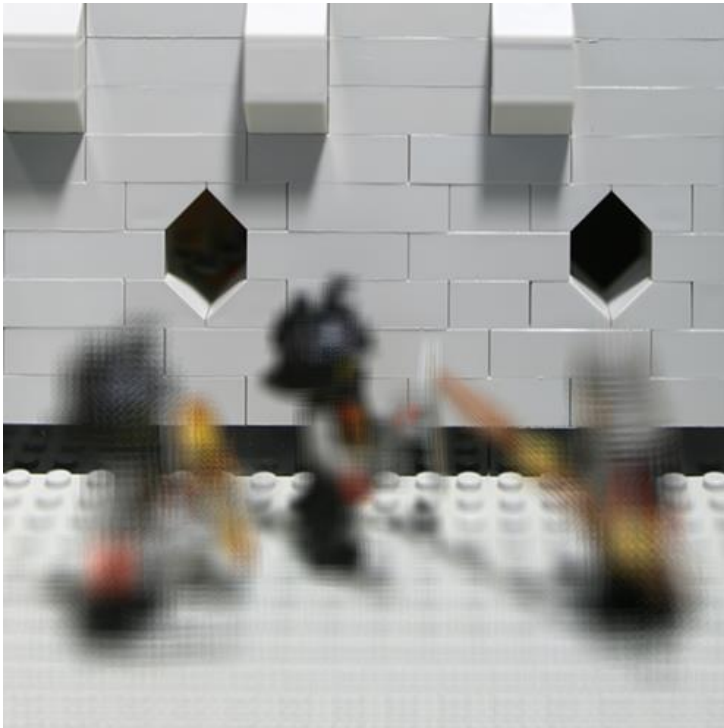
LinX
(acquired by Google)



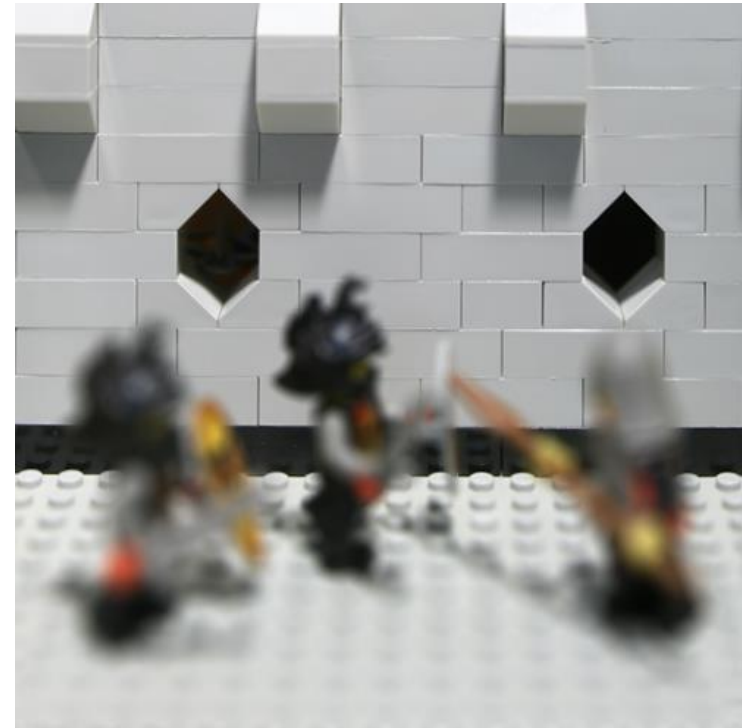
Light

View-interpolation-based refocusing

- Great quality by explicitly handling occlusion
- Complexity $O(C_{vi} \times \text{view number} \times \text{resolution})$
 - C_{vi} : complexity of view interpolation algorithm, e.g. morphing or high-quality view synthesis.



Direct shift-and-add



Interpolate 441(knight)/797(BG) views

Simplest refocusing: Single-image blurring

- Most popular so far for its efficiency
- Work for single-image systems
 - e.g. HTC M8, Google Camera
- Blur kernel radius $\propto |\Delta d|$

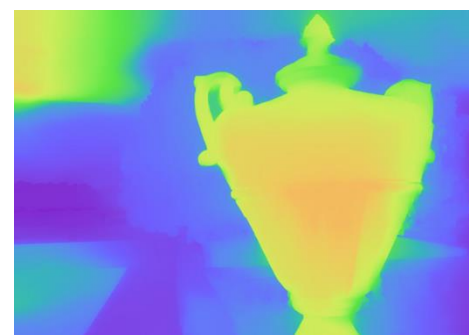
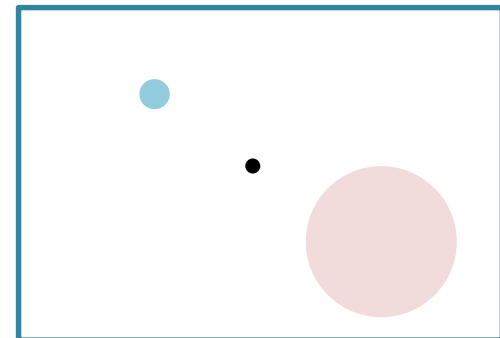
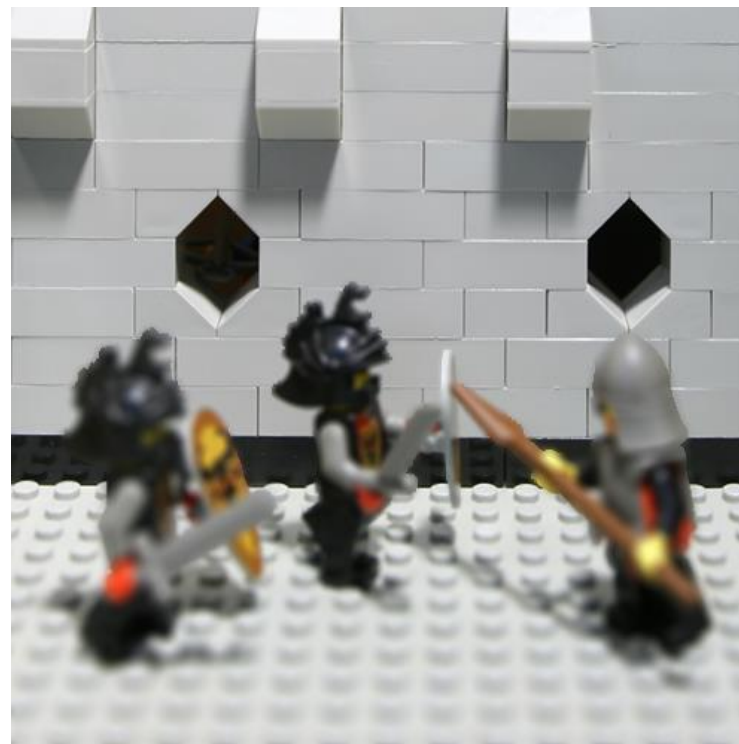


Fig : J. Barron, et. al., "Fast bilateral-space stereo for synthetic defocus," CVPR'15 (supple.).

Boundary issues

- Especially for large-aperture refocusing at background

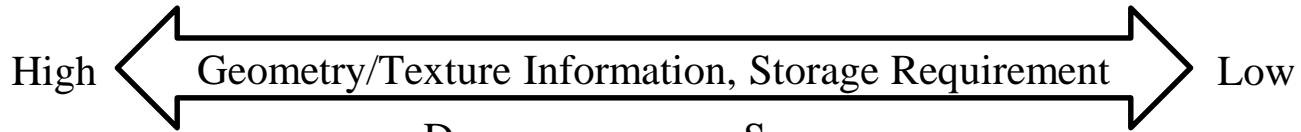
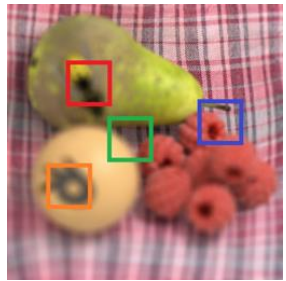




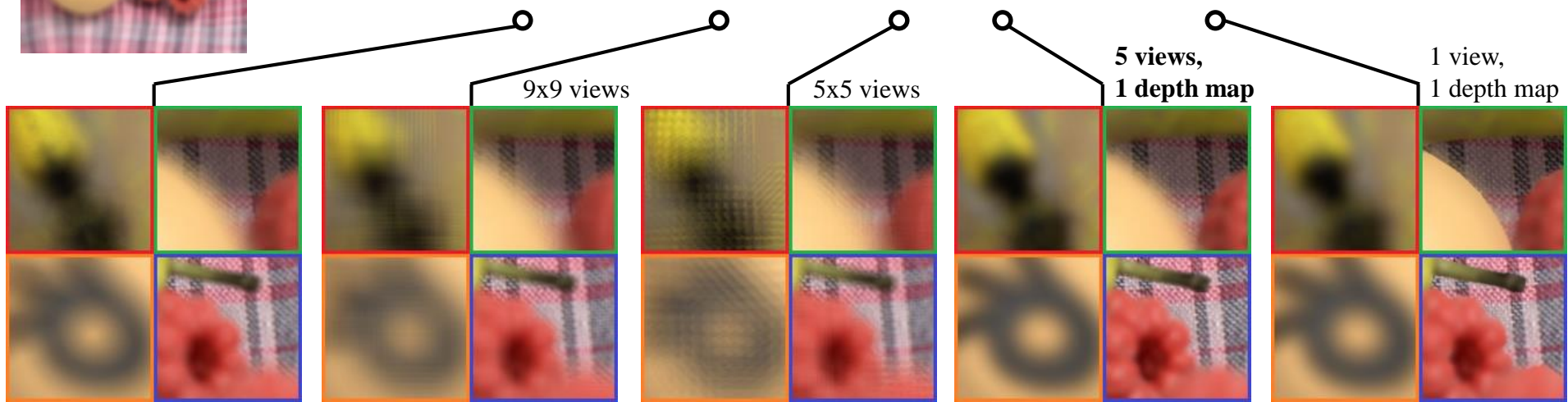
Outline

- Conventional refocusing methods
 - View interpolation for sparse light fields
 - Image blurring for single-view images
- **Fast realistic refocusing for sparse light fields**

Tradeoff of refocusing



3D Model Dense Light Field Sparse Light Field Single Image



TLFR
357.6 s

Direct refocusing
(slightly aliasing)
1.0 s

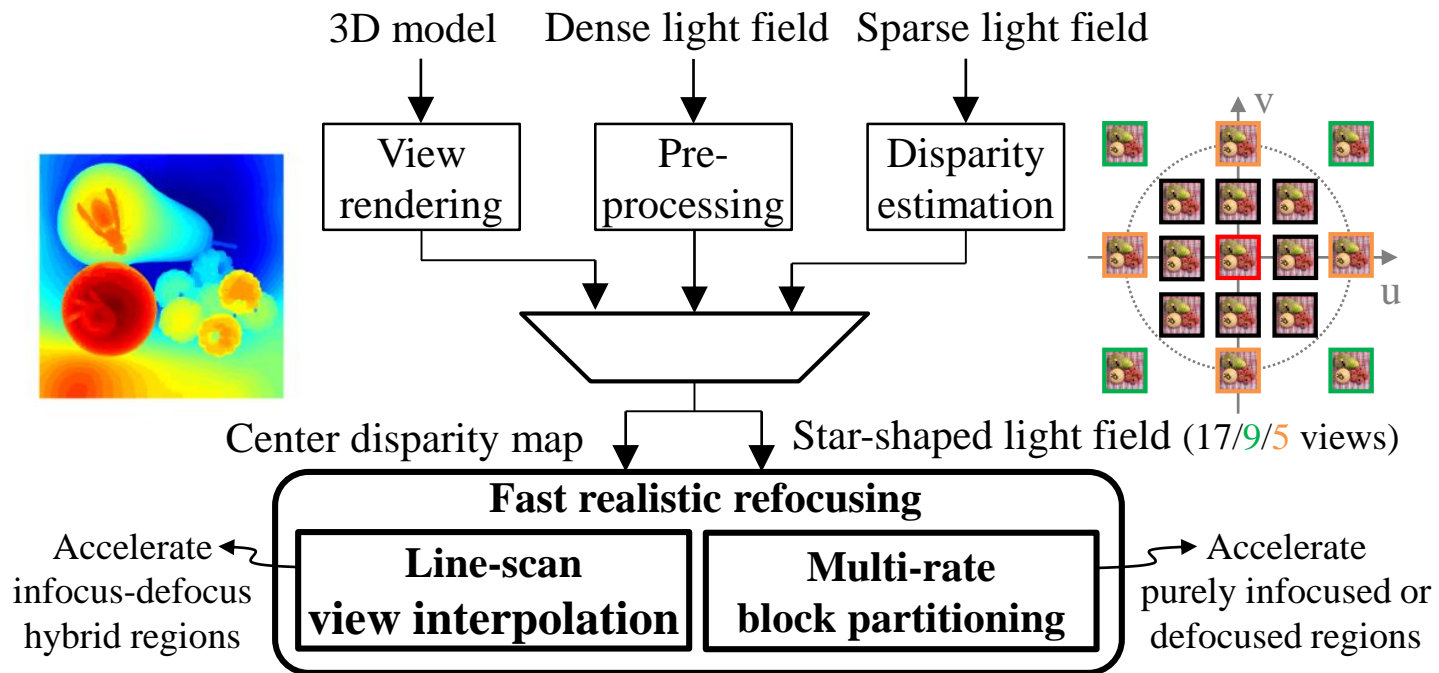
Direct refocusing
(seriously aliasing)
0.2 s

Block-Based Multi-Rate View Interpolation
1.6 s

Image blurring
(boundary artifact)
3.0 s

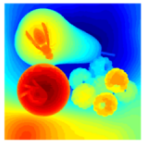
Proposed system

- High-speed and high-quality refocusing with few views
- Ideas for areas of different characteristics
 - Infocused: less view interpolation is required => block-based flow
 - Defocused: refocused at subsampled domain => multi-rate mode
 - Hybrid*: fast view interpolation to handle occlusion



System flow of block-based multi-rate view interpolation

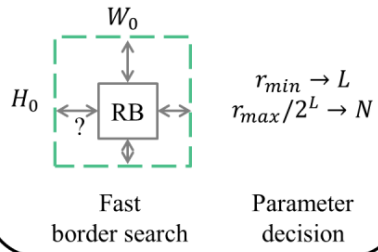
Center Disparity Map



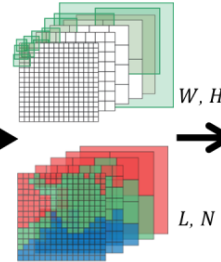
Target disparity and aperture size

$$d_t, u_t$$

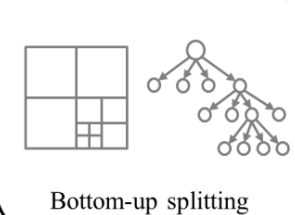
Variable-Size Block Analysis



Variable-size block information



Timing-Based Quadtree Partitioning



Quadtree block partition



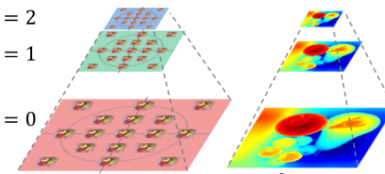
Light-field pyramid

$L = 2$

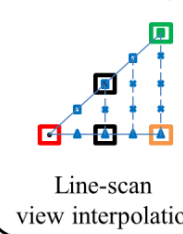
$L = 1$

$L = 0$

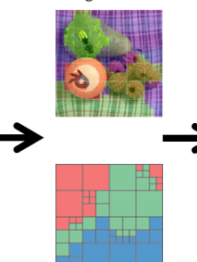
Disparity pyramid



Block-Based Refocusing



Upsampling with G_U if $L > 0$

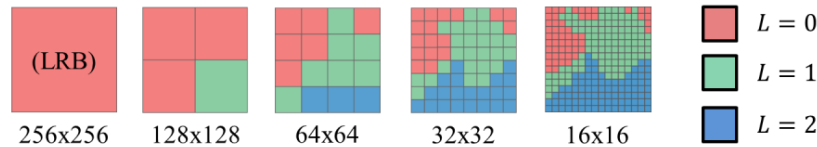


Refocused image



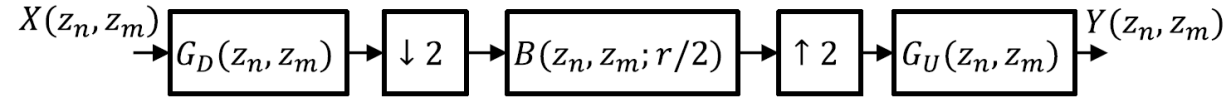
Layer-Dependent Deblurring

Five possible sizes of refocusing blocks (RB)

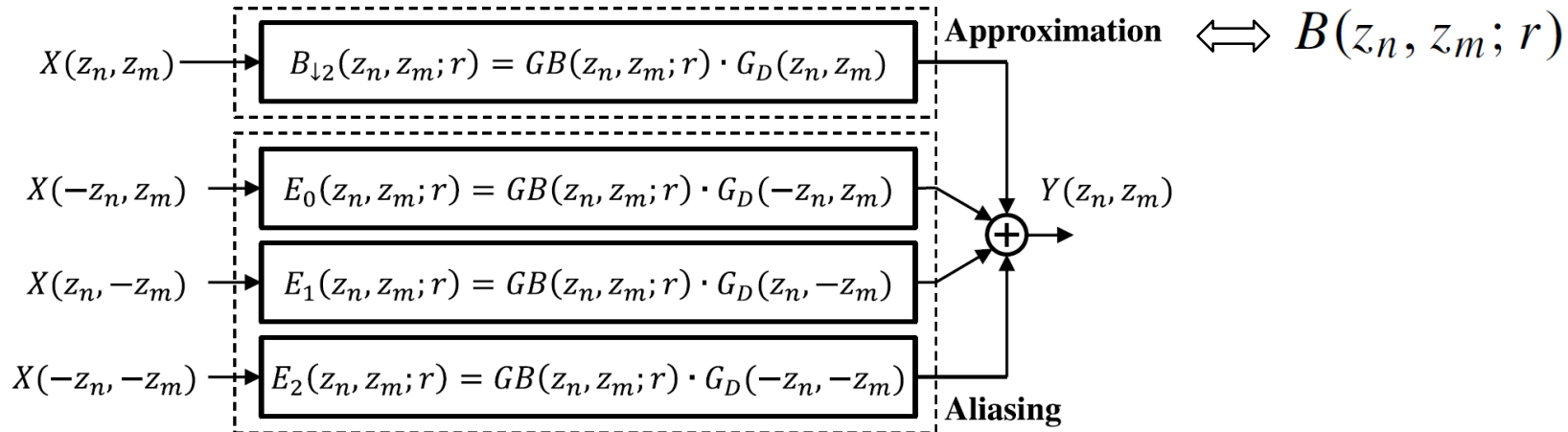




Rule of subsample-by-two refocusing



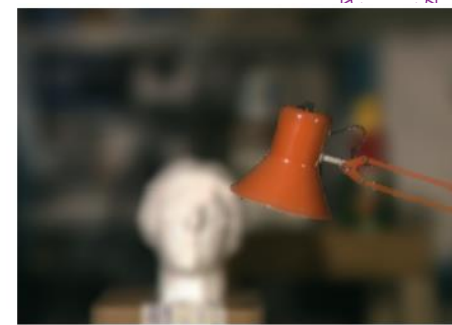
$$\equiv [GB \triangleq \frac{1}{4} G_U(z_n, z_m) B(z_n^2, z_m^2; r/2)]$$



Blur radius			Approx. error	Aliasing energy
r	β_D	θ	$SSE_{\downarrow 2}$	SSE_a
2.0	0.00	0.19π	4.3×10^{-3}	1.4×10^{-3}
2.5	0.61	0.26π	1.6×10^{-3}	7.4×10^{-4}
3.0	1.28	0.26π	6.7×10^{-4}	1.4×10^{-4}
3.5	1.44	0.27π	3.0×10^{-4}	5.3×10^{-5}
4.0	1.49	0.28π	1.3×10^{-4}	3.0×10^{-5}

$$L = \begin{cases} 2, & r_{min}/2 \geq 3 \\ 1, & 3 \leq r_{min} < 6 \\ 0, & \text{otherwise} \end{cases}$$

Subjective quality comparison



TLFR

Block-based, SSLF-17

Block-based, SSLF-5

Image blurring



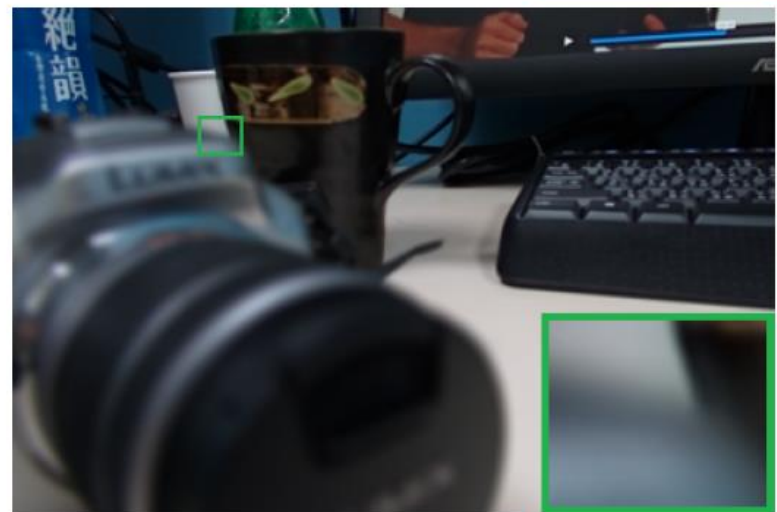
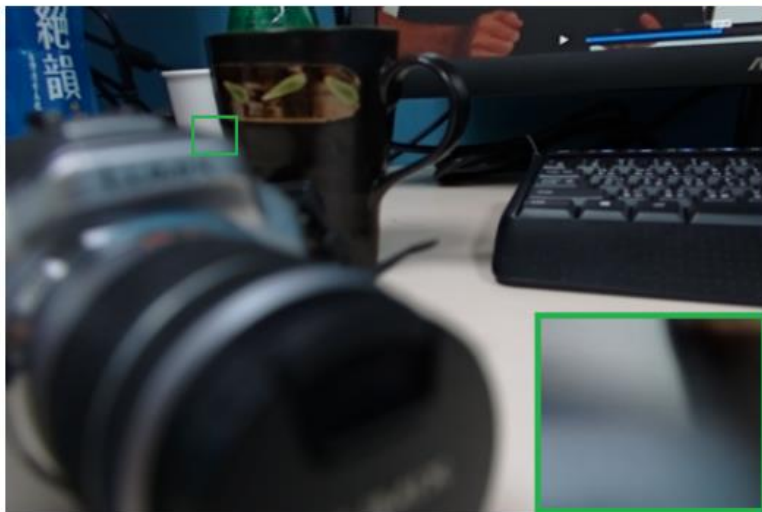
GF2, 18-mm, f/4.3 (FG)

Block-based, $u_t = 0.43$ (FG)

GF2, 18-mm, f/4.3 (BG)

Block-based, $u_t = 0.43$ (BG)

Subjective quality comparison



Lytro Desktop, $f/2$

Block-based, $u_t = 1$

Subjective quality comparison

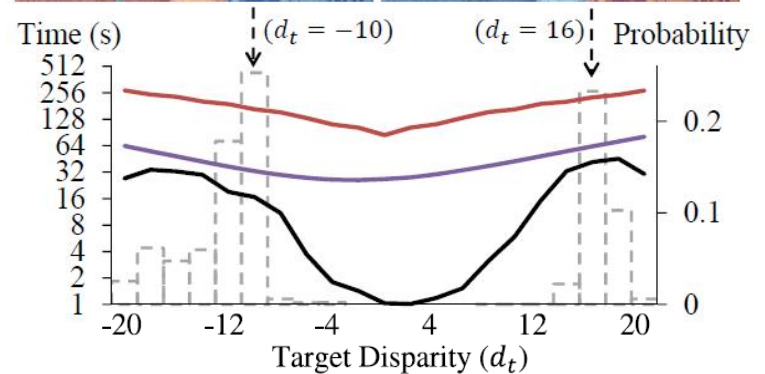


Lytro Desktop, $f/2$

Block-based, $u_t = 1$

Speed comparison

Scene-dependent performance;
could be faster than blurring (due to multi-rate modes)



- L=0
- L=1
- L=2

