

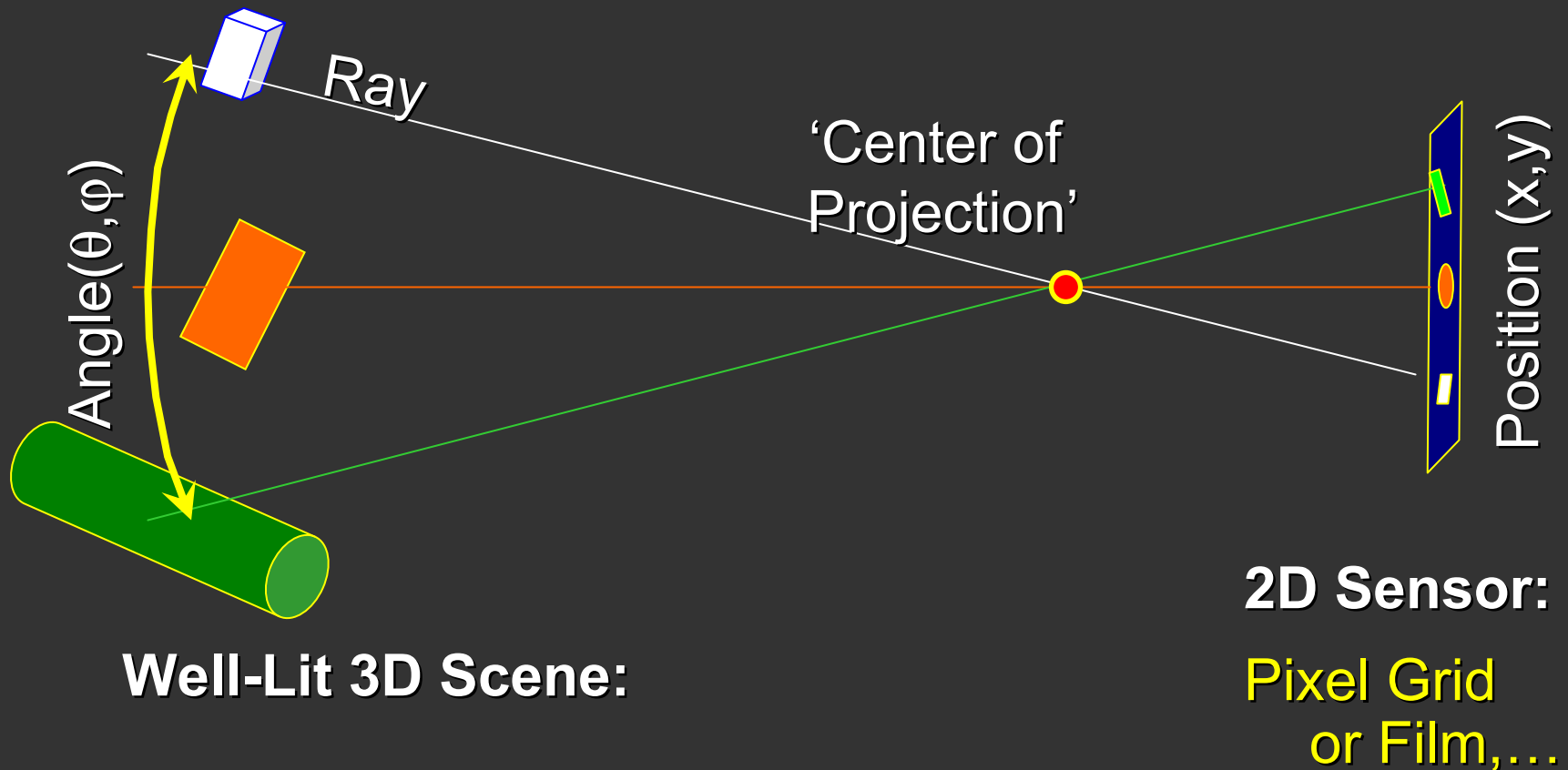
Improving Film-Like Photography

aka,

Epsilon Photography

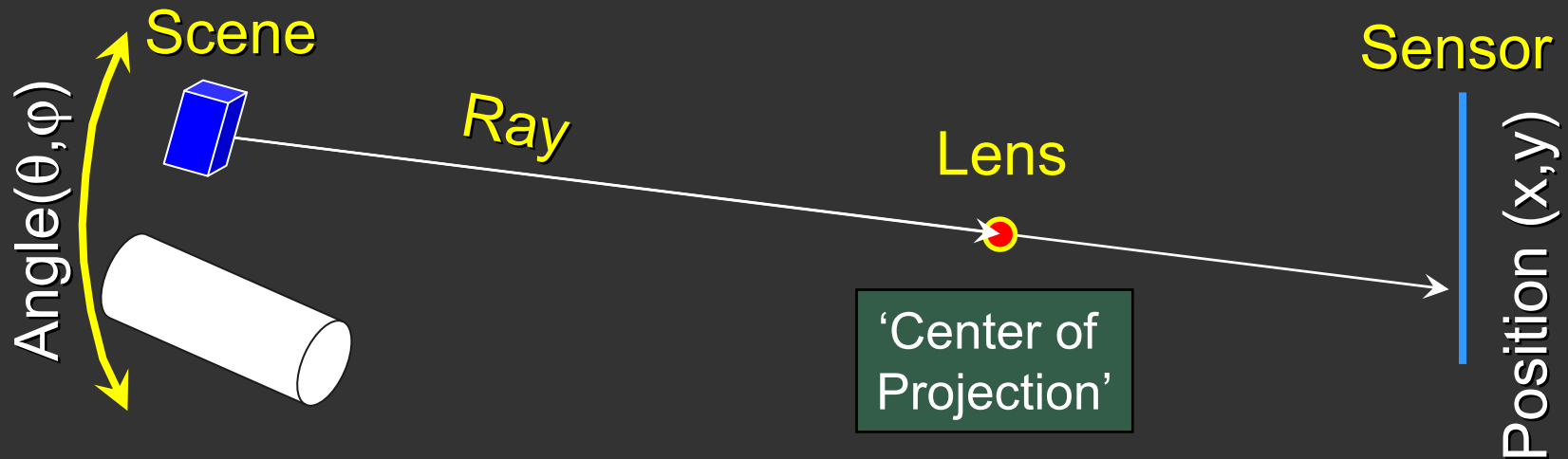
Ankit Mohan

Film-like Optics: Imaging Intuition



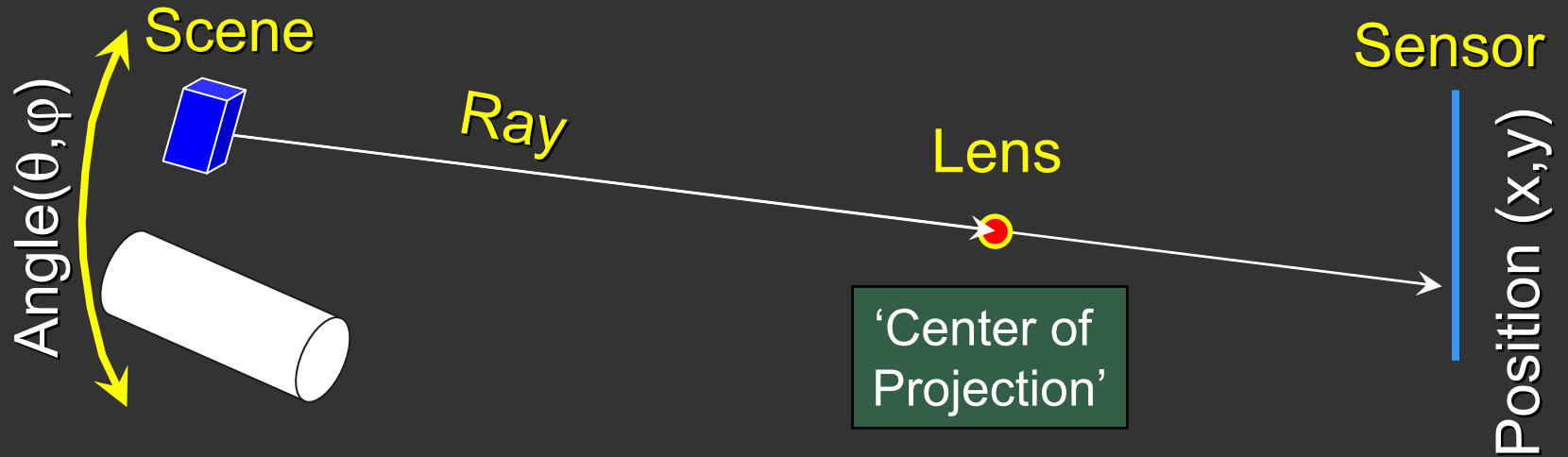
'Pinhole' Model: Rays copy scene onto 'film'

Film-like Optics: Imaging Intuition

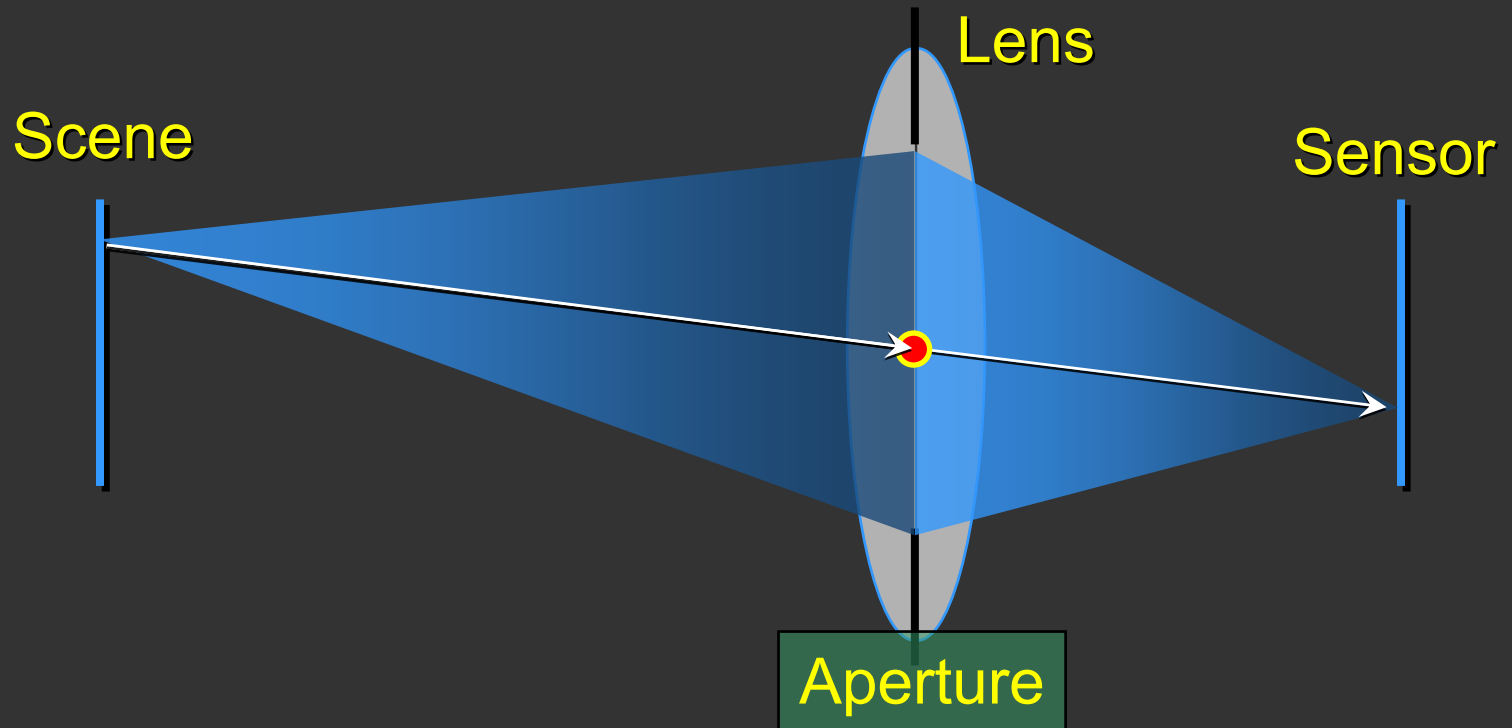


'Pinhole' Model: Rays copy scene onto 'film'

Not *One Ray*, but a *Bundle of Rays*

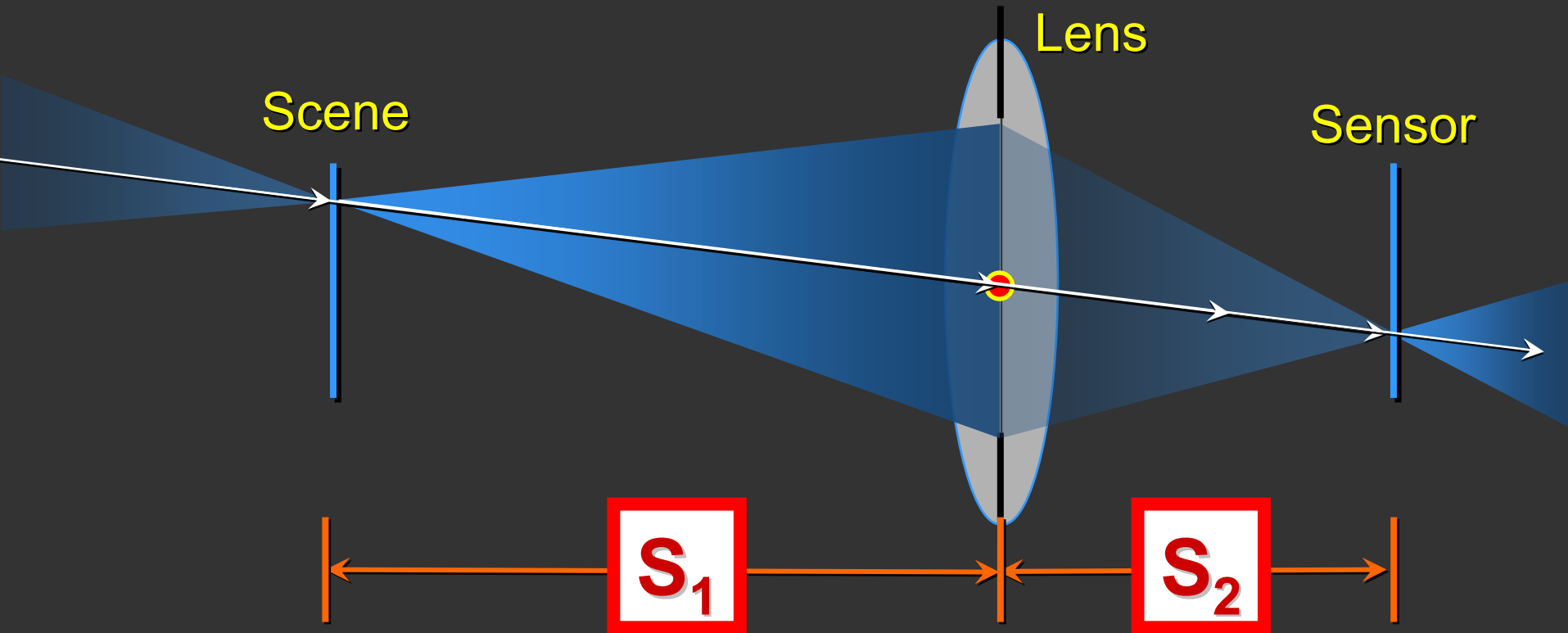


Not *One* Ray, but a *Bundle* of Rays



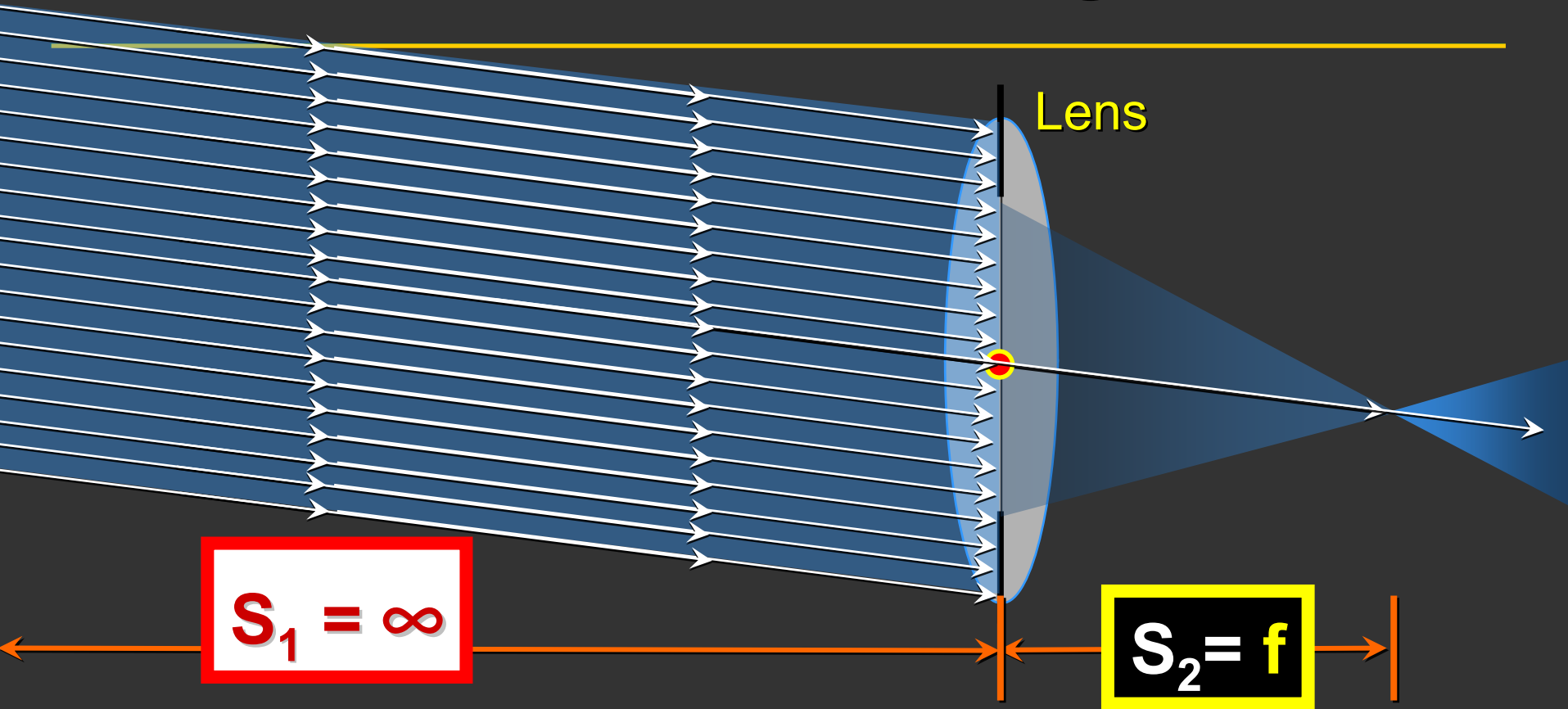
- (BUT Ray model *isn't* perfect: ignores diffraction)
- Lens, aperture, and diffraction sets the point-spread-function (PSF)
(How? See: Goodman, J.W. 'An Introduction to Fourier Optics' 1968)

Review: Lens Measurements



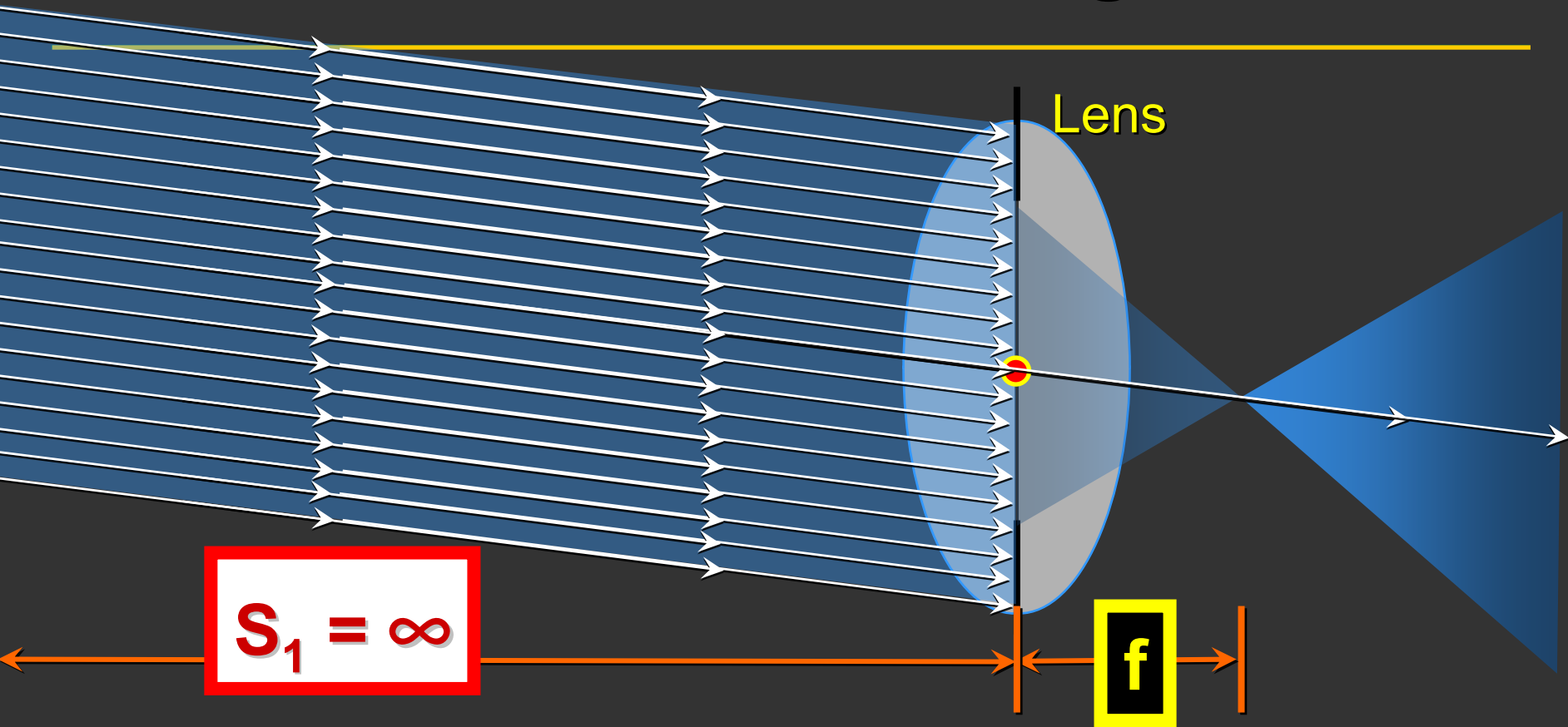
- How do we compute S_1 and S_2 for a lens?
- What is the 'Ray-Bending Strength' for a lens?

Review: Focal Length f



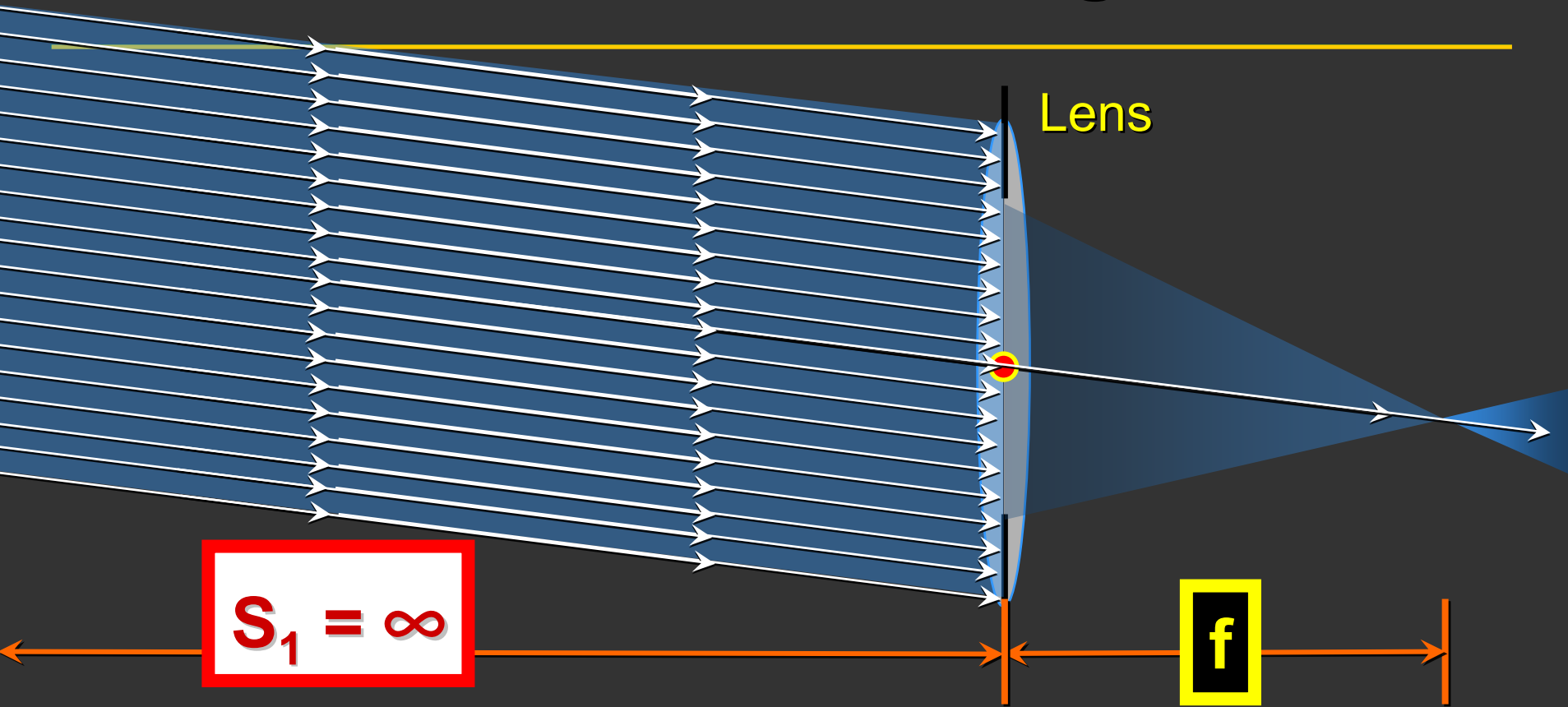
- Lens focal length f : where parallel rays converge

Review: Focal Length f



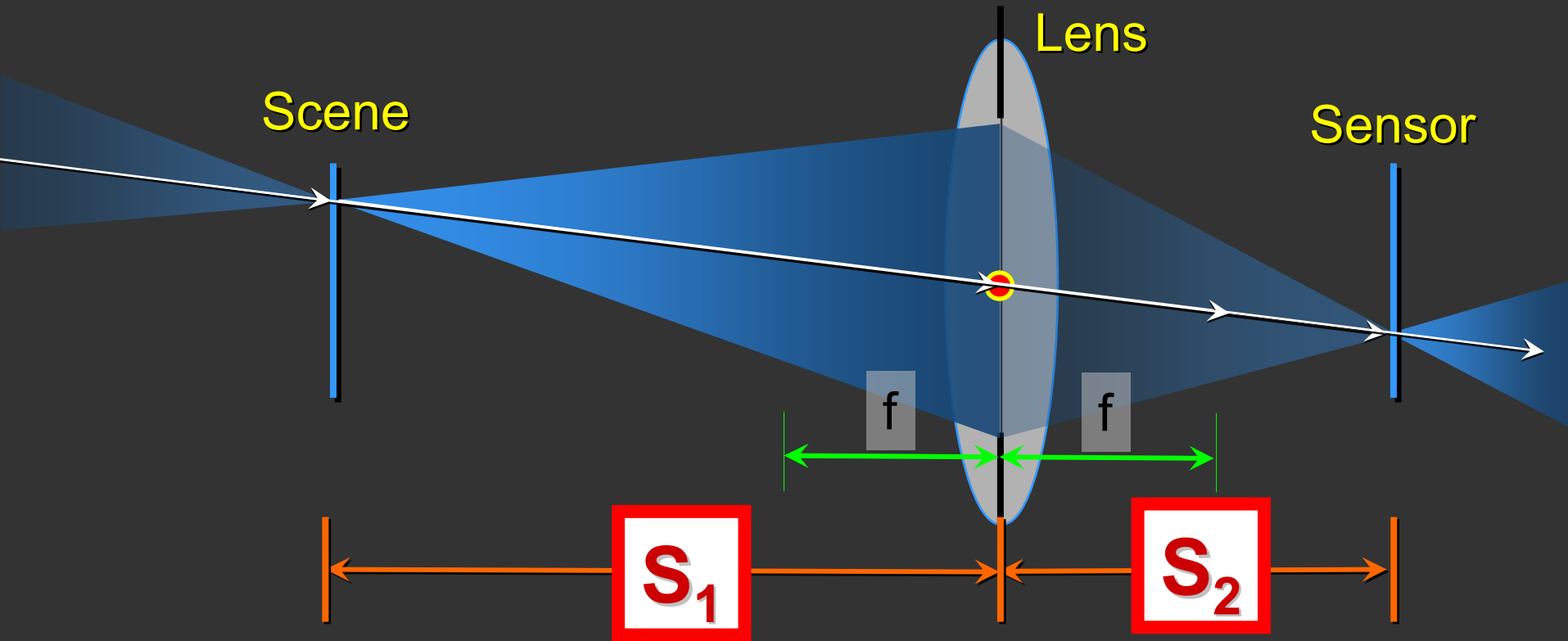
- Lens focal length f : where parallel rays converge
- smaller focal length: more ray-bending ability...

Review: Focal Length f



- Lens focal length f : where parallel rays converge
- greater focal length: less ray-bending ability...
- For flat glass; for air : $f = \infty$

Review: Thin Lens Law



• **Thin Lens Law:** in focus when:

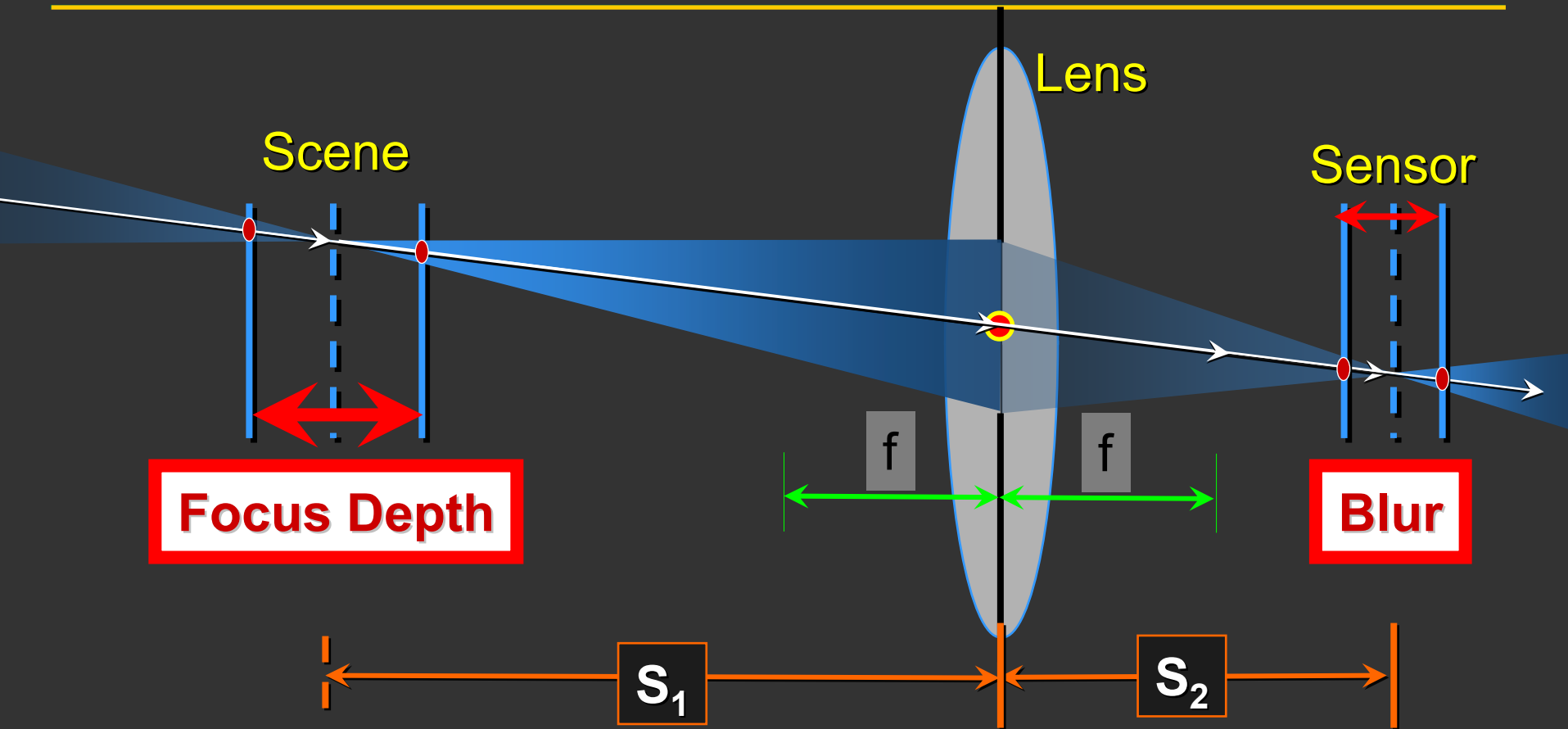
• Note that $S_1 \geq f$ and $S_2 \geq f$

$$\frac{1}{S_1} + \frac{1}{S_2} = \frac{1}{f}$$

Try it Live! Physlets...

<http://webphysics.davidson.edu/Applets/Optics/intro.html>

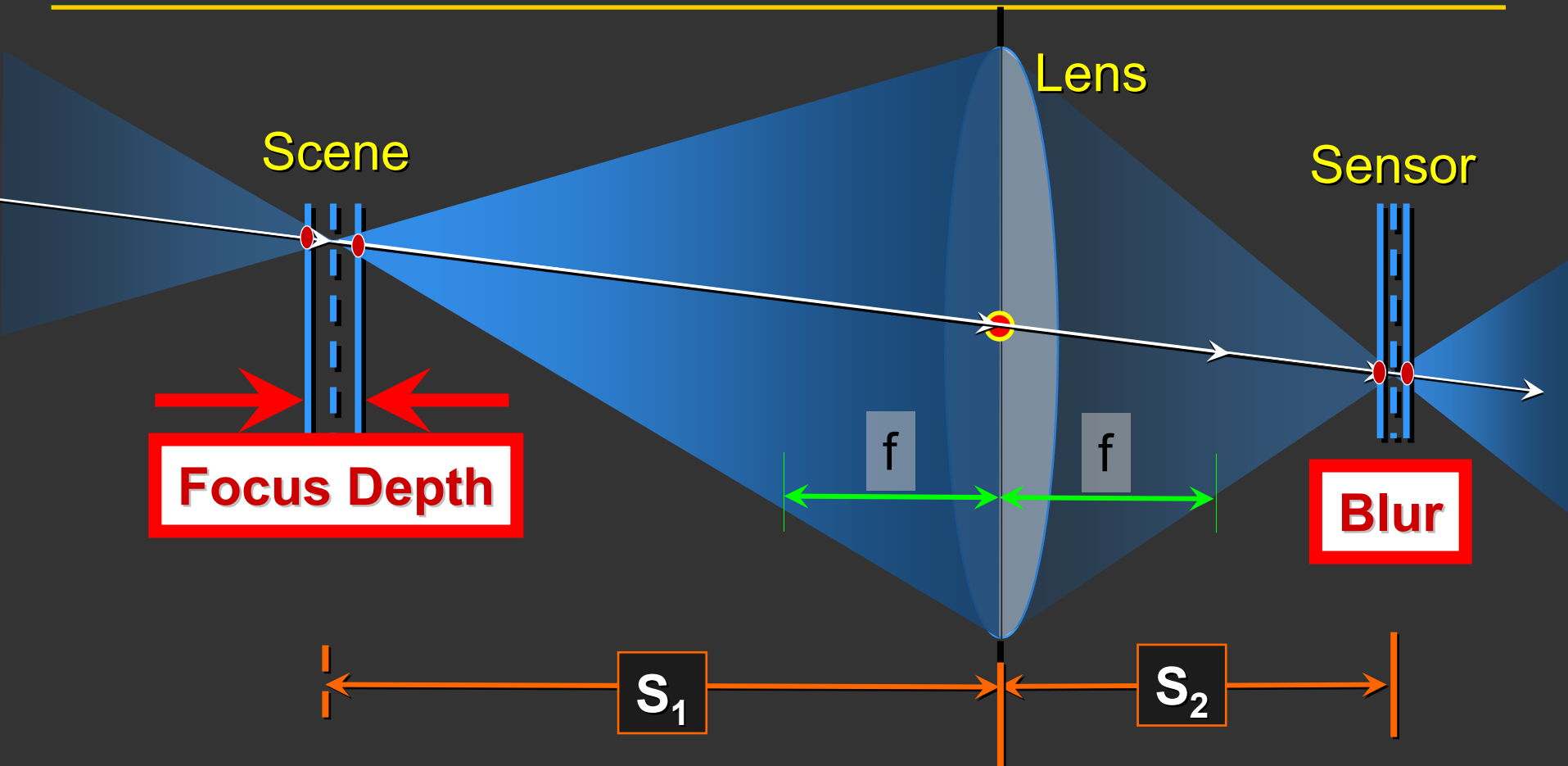
Aperture and Depth-Of-Focus:



For same focal length:

- Smaller **Aperture** → Larger focus depth, but less light

Aperture and Depth-Of-Focus:

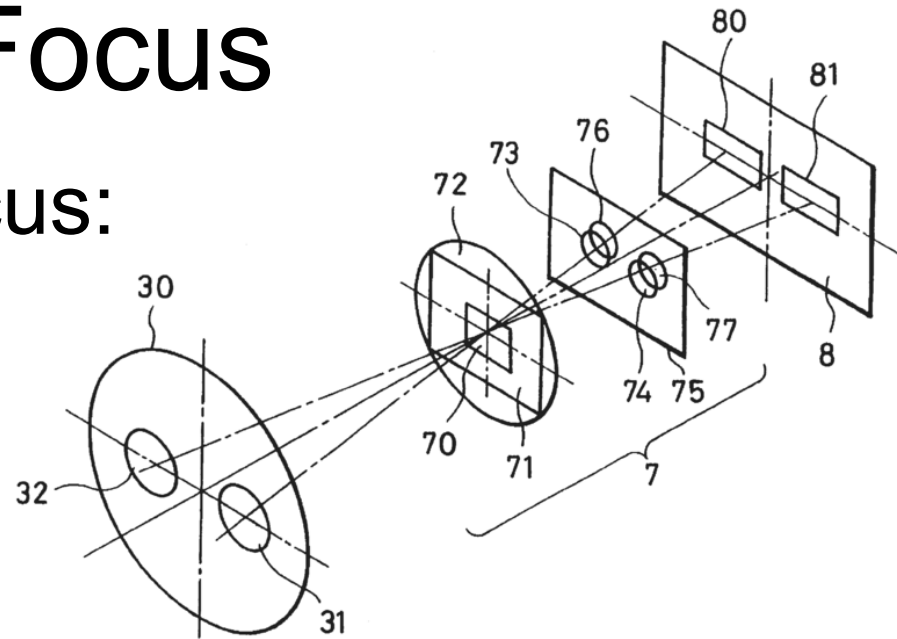


For same focal length:

- Larger **Aperture** → smaller focus depth, but more light

Auto-Focus

- Phase based autofocus:
Used in most SLR cameras.

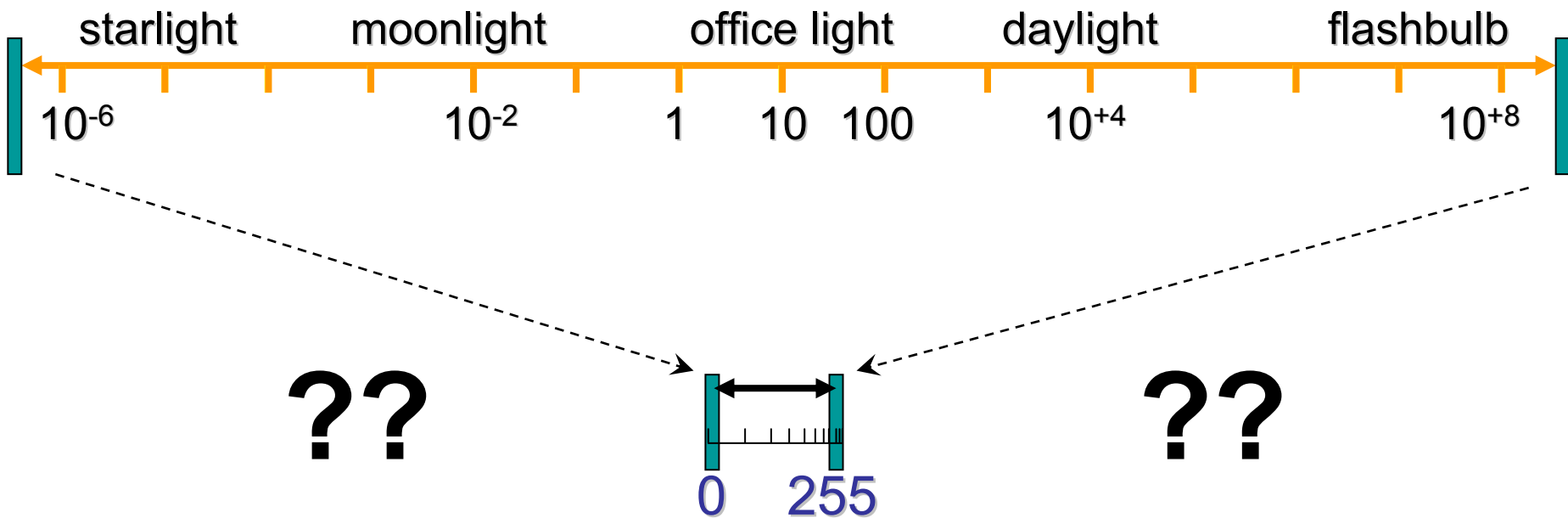


- Contrast based autofocus: Maximize image contrast in AF region; used in most digital compact cameras.
- Active autofocus: Ultrasonic and IR based; used in compact film cameras.

Problem: Map Scene to Display

Domain of Human Vision:

from $\sim 10^{-6}$ to $\sim 10^{+8}$ cd/m²



Range of Typical Displays:

from ~ 1 to ~ 100 cd/m²

Dynamic Range Limits



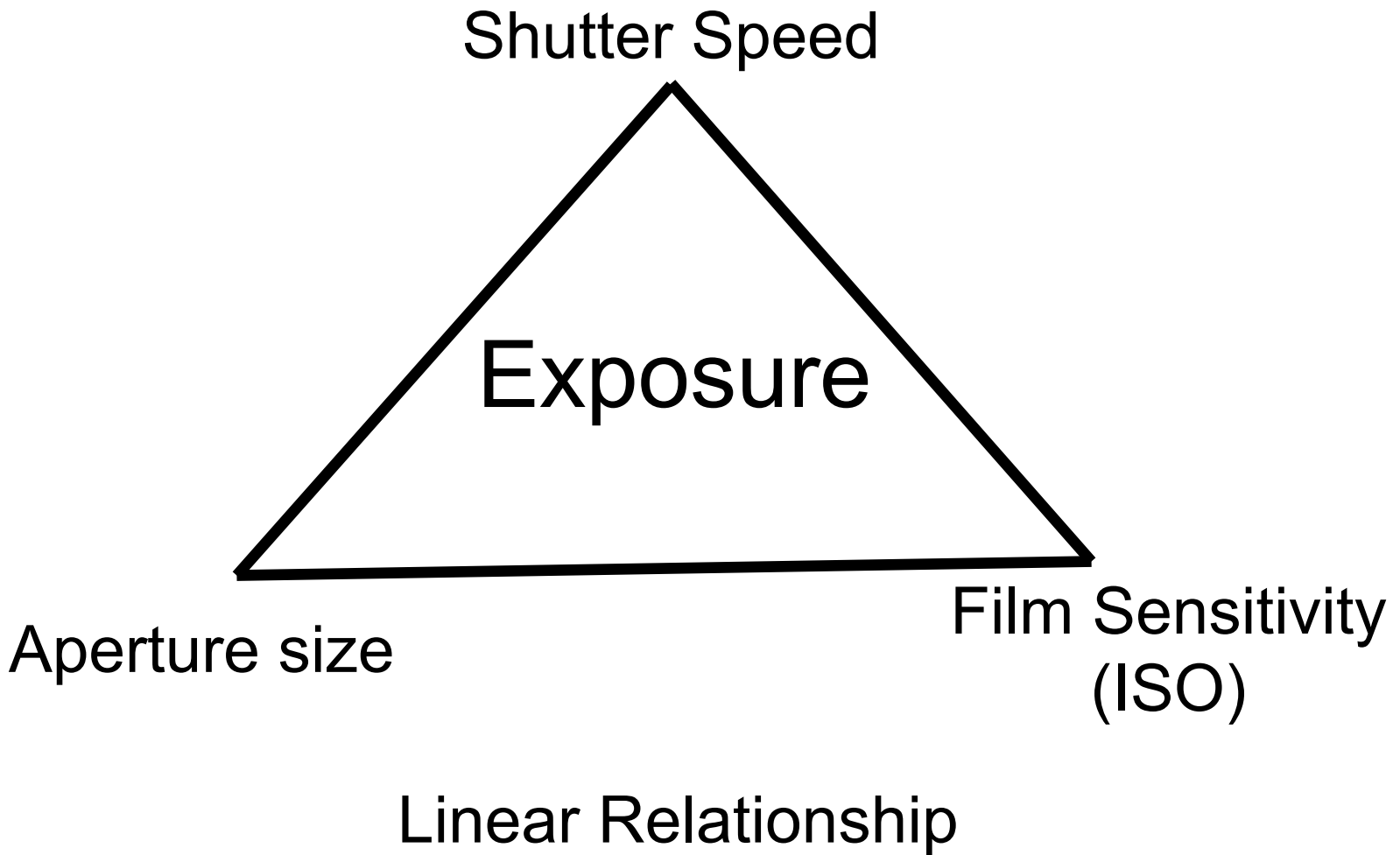
Under-Exposure

- Highlight details: Captured
- Shadow details: Lost



Over-Exposure

- Highlight details: Lost
- Shadow details: Captured



Auto-Exposure

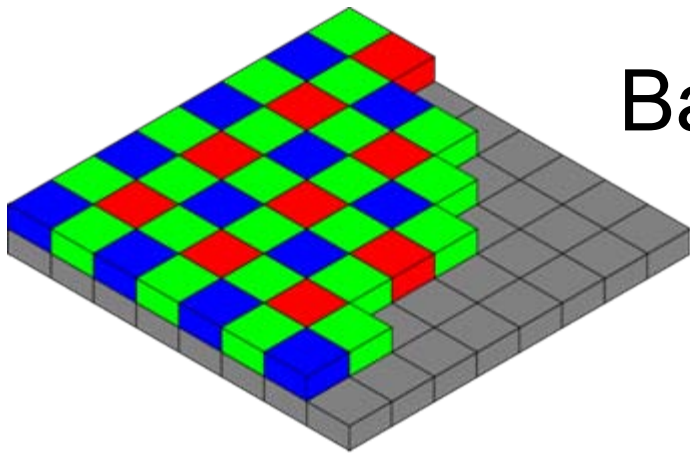
[Nikon Matrix Metering]

Images removed due to copyright restrictions.

Scanned product technical literature, similar to that presented at

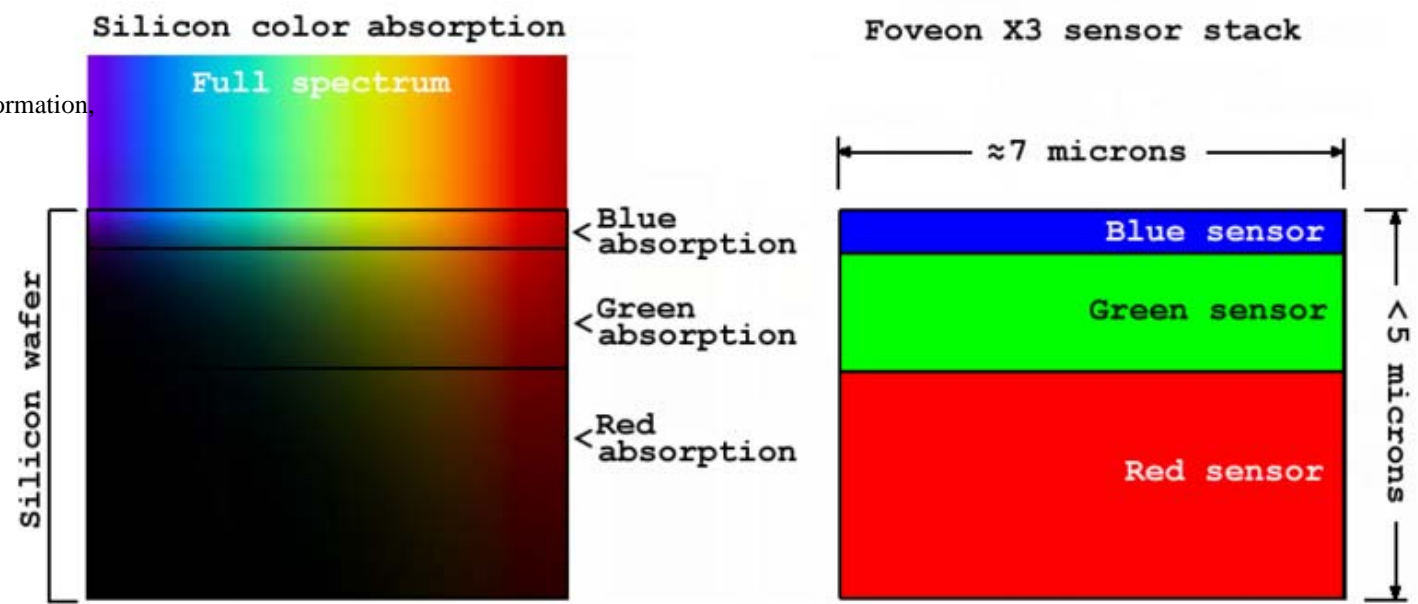
<http://www.mir.com.my/rb/photography/hardwares/classics/nikonf4/metering/index1.htm>

Color sensing in Digital Cameras



Bayer filter pattern

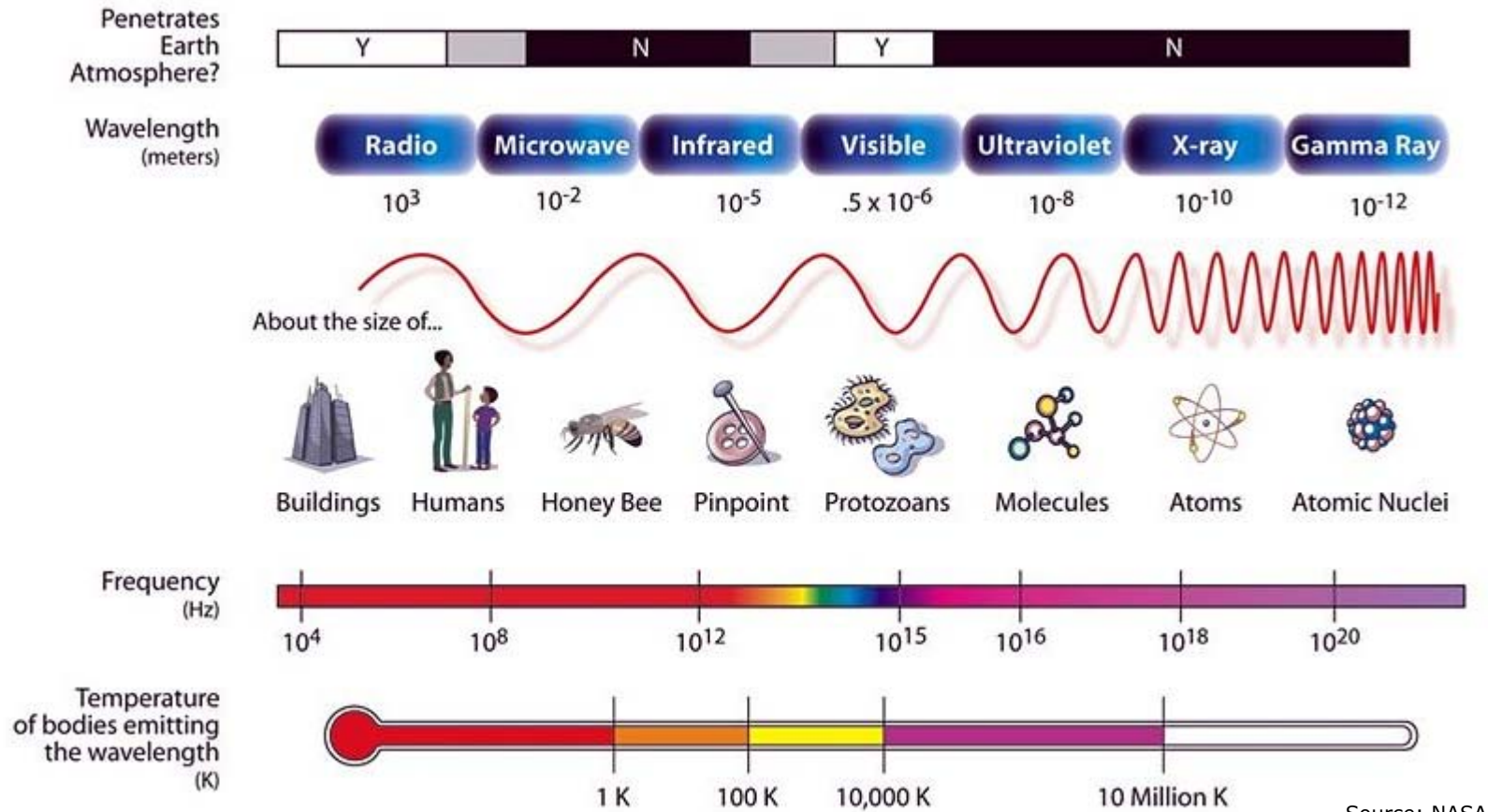
Foveon X3 sensor



Source: Wikipedia © Wikipedia
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see <http://ocw.mit.edu/fairuse>.

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license. For more information,
see <http://ocw.mit.edu/fairuse>.

Electromagnetic spectrum

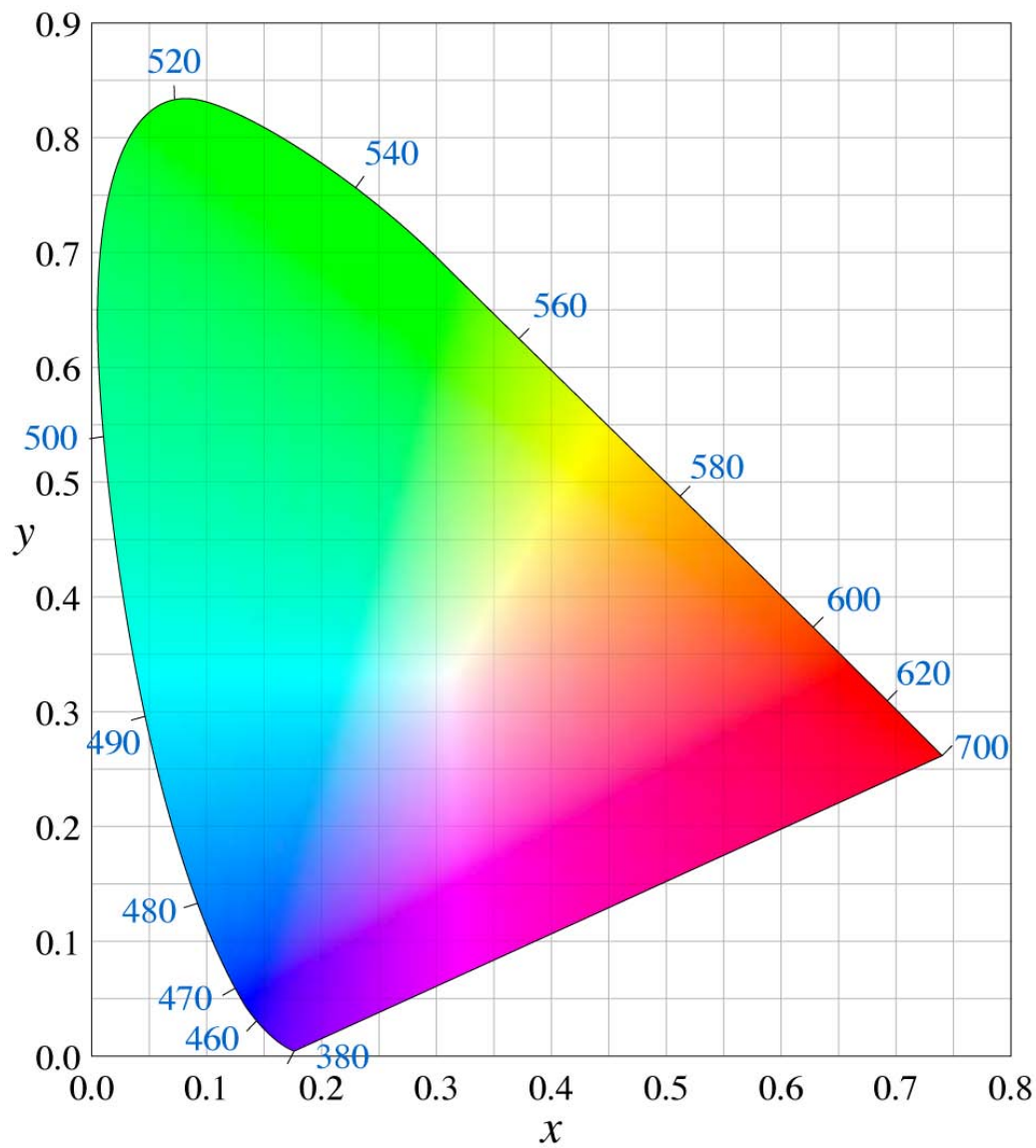


Source: NASA

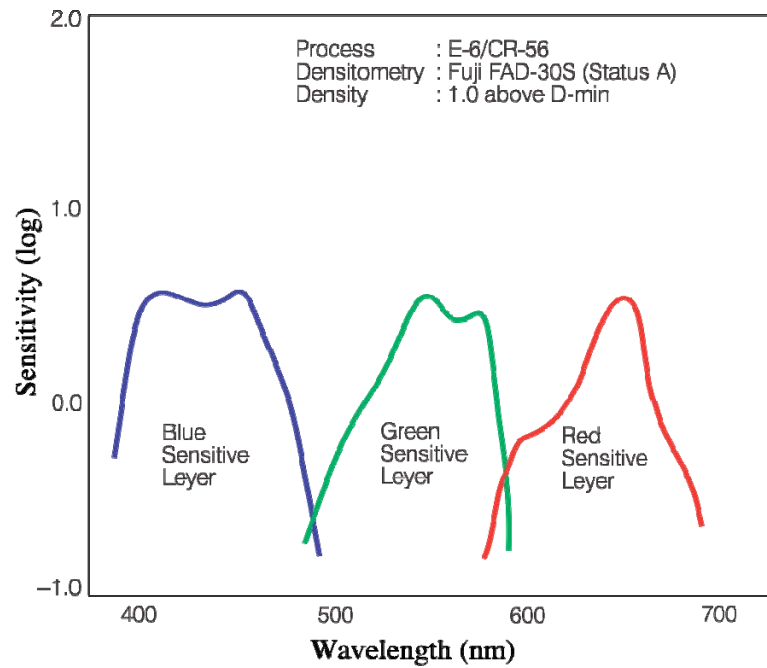
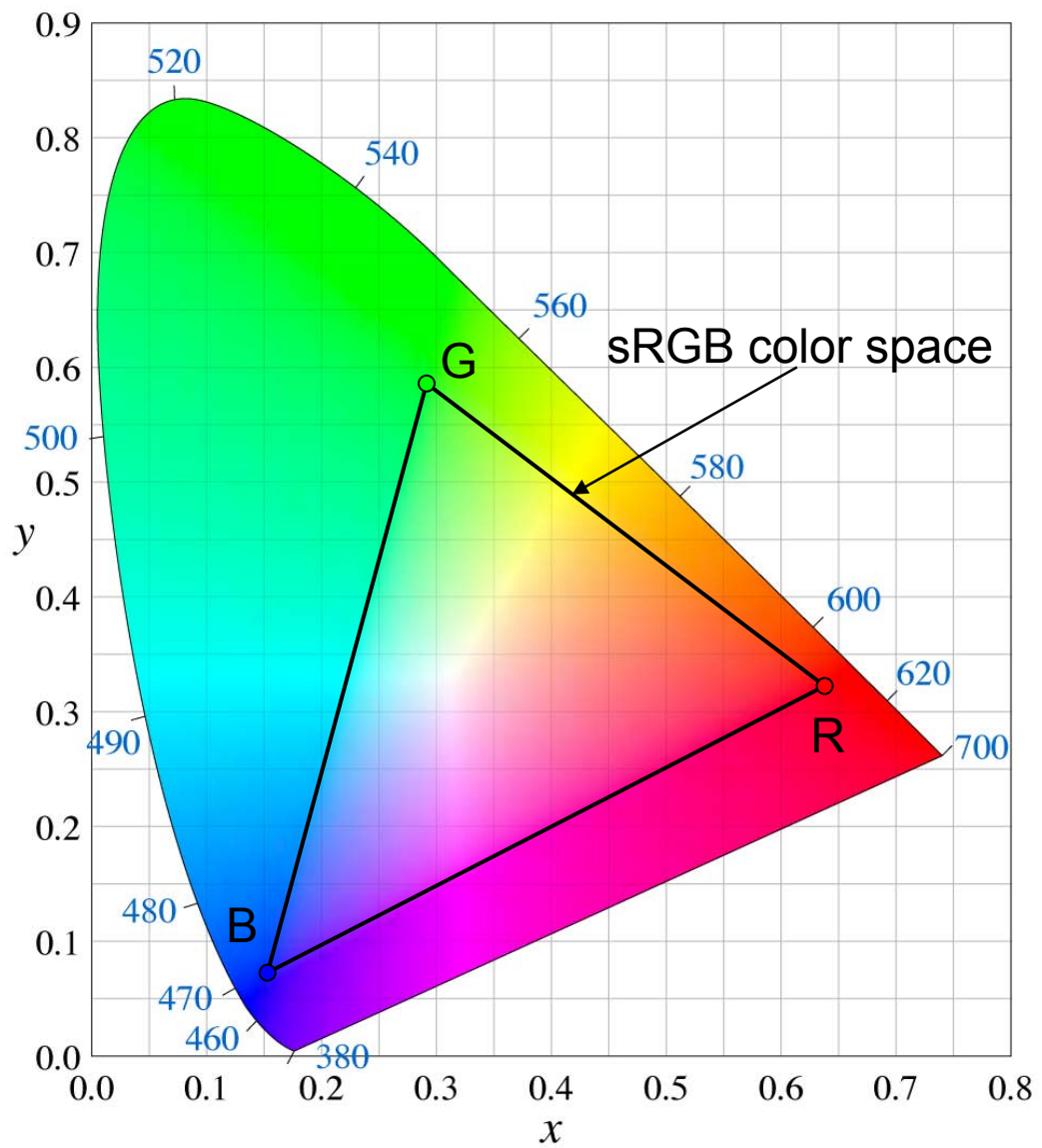
Visible Light: ~400-700 nm wavelength



CIE 1931 Chromaticity Diagram

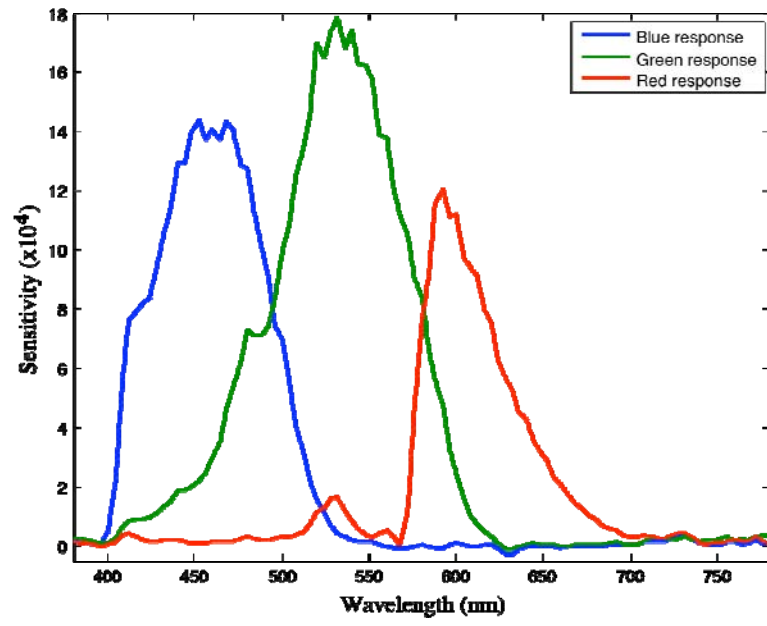


Three color primaries



Fuji Velvia 50 film

Nikon D70 camera



Epsilon Photography

Capture multiple photos, each with slightly different camera parameters.

- Exposure settings
- Spectrum/color settings
- Focus settings
- Camera position
- Scene illumination

Epsilon Photography

- epsilon over time (bracketing)
- epsilon over sensors (3CCD, SAMP, camera arrays)
- epsilon over pixels (bayer)
- epsilon over multiple axes

Epsilon over **time** (*Bracketing*)

Capture a sequence of images
(over time) with epsilon change in
parameters

High Dynamic Range (HDR) capture

- negative film = 250:1 (8 stops)
- paper prints = 50:1
- [Debevec97] = 250,000:1 (18 stops)
- Old idea; [Mann & Picard 1990]
hot topic at recent SIGGRAPHs

Images removed due to copyright restrictions.

Memorial Church photo sequence from Paul Debevec,

["Recovering High Dynamic Range Radiance Maps from Photographs."](#)

(SIGGRAPH 1997)

Epsilon over time (*Bracketing*)



Prokudin-Gorskii, Sergei Mikhailovich, 1863-1944, photographer. ``The Bukhara Emir'', Prints and Photographs Division, Library of Congress.

Epsilon over time (*Bracketing*)



Image courtesy of [shannonpatrick17](#) on Flickr.

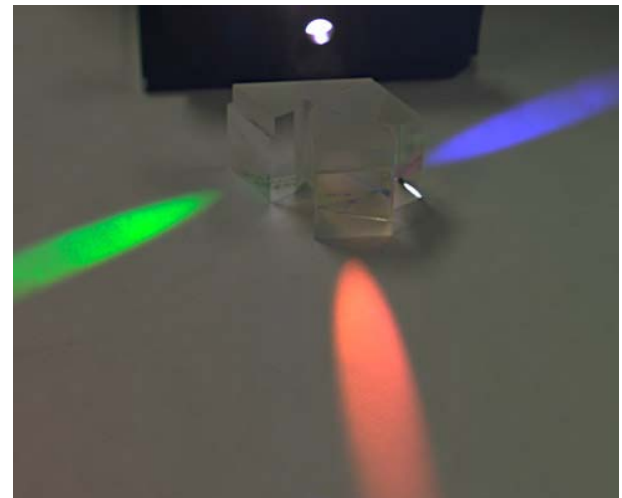
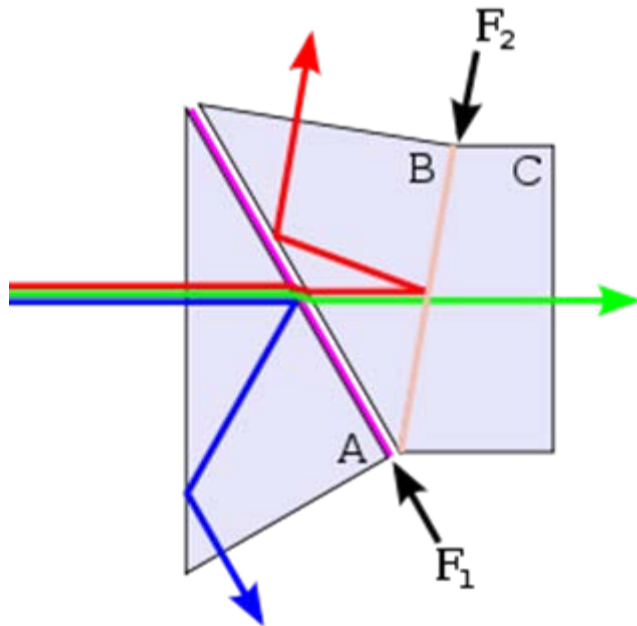
Color wheel used in DLP projectors

Epsilon over **sensors**

Capture a set of images (over different sensors or cameras) with epsilon change in parameters

Epsilon over sensors

3CCD imaging system for color capture



Left © Wikipedia User:Cburnett. Upper right © Wikipedia User:Xingbo.
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Epsilon over **sensors**

Single-Axis Multi-Parameter
(SAMP) Camera
[McGuire et al, 2005]

Multiple cameras at the
same virtual position

Images removed due to copyright restrictions.

Epsilon over sensors

Camera Arrays

Epsilon over
camera position

Image removed due to copyright restrictions.

64 tightly packed commodity CMOS
webcams, 30 Hz, scalable, real-time
[Yang, J. C. et al. "A Real-Time Distributed Light Field Camera."
Eurographics Workshop on Rendering (2002), pp. 1–10]

Epsilon over **sensors**

Stanford Camera Array [Wilburn et al, SIGGRAPH 2005]

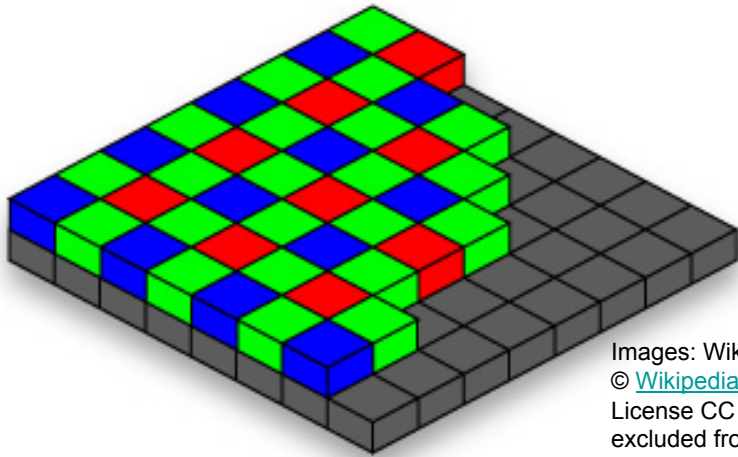
Photo of camera array removed due to copyright restrictions.
See "[High Performance Imaging Using Large Camera Arrays.](#)"

Epsilon over pixels

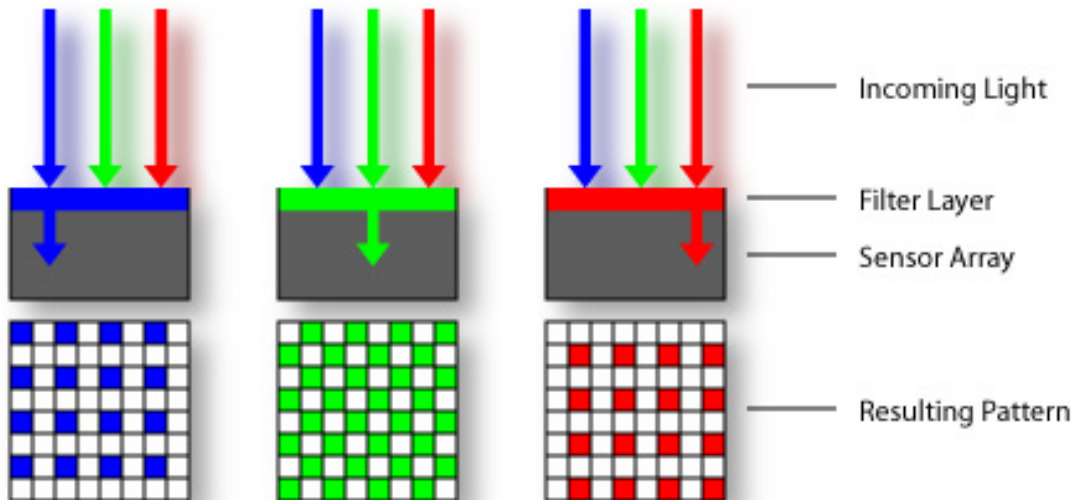
Capture images (over different pixels on the same sensor) with epsilon change in parameters

Epsilon over pixels

Bayer Mosaicing for color capture



Images: Wikipedia.
© [Wikipedia User:Cburnett](#).
License CC BY-SA. This content is excluded from our Creative Commons license. For more information, see <http://ocw.mit.edu/fairuse>.



Estimate RGB
at 'G' cells from
neighboring values

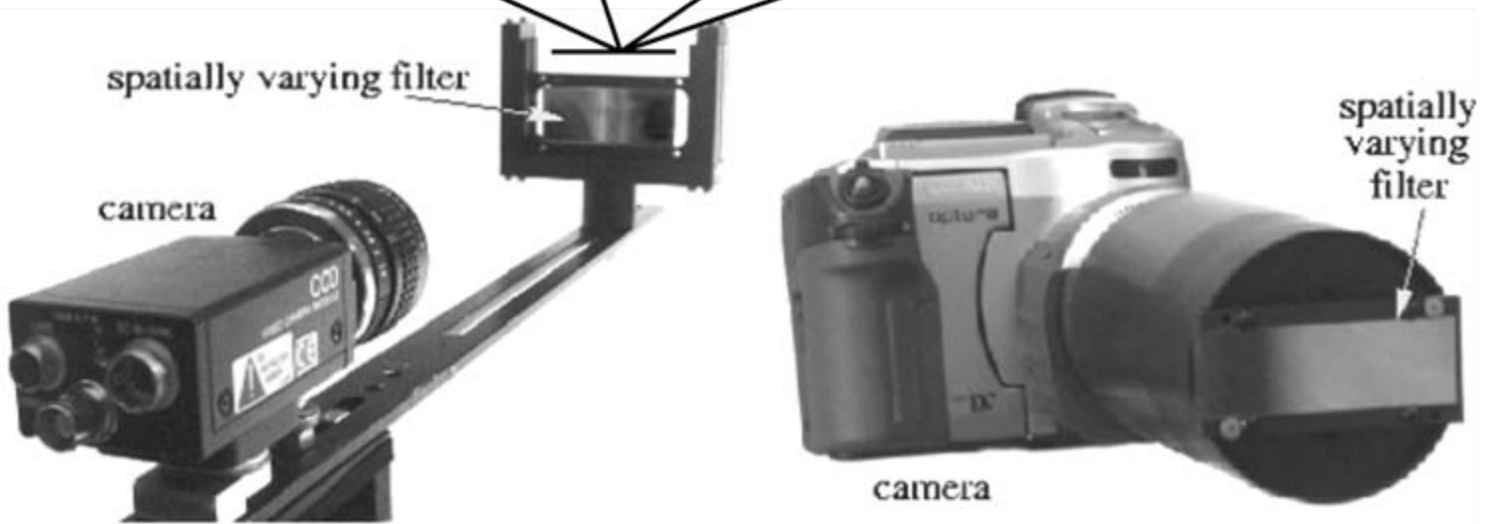
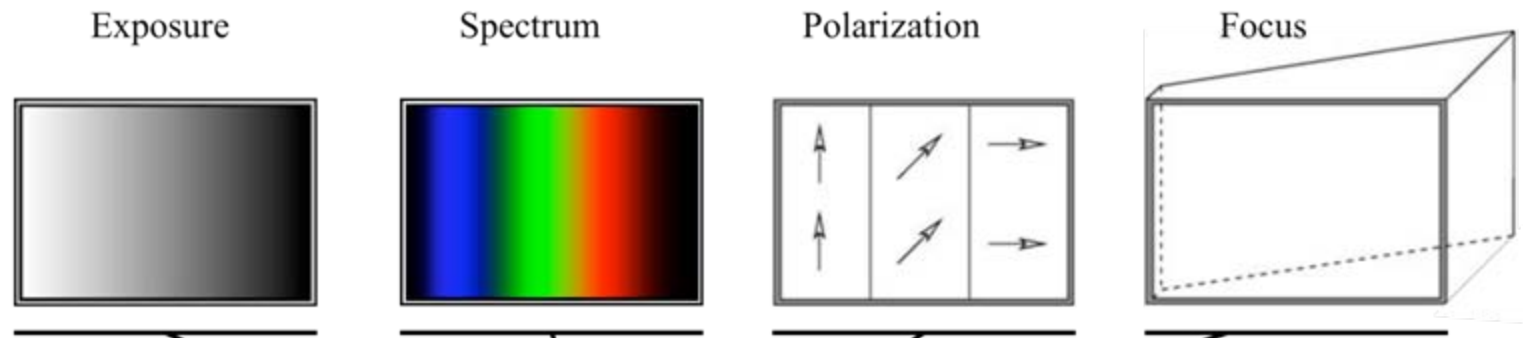


Epsilon over multiple axes

Image removed due to copyright restrictions.

Generalized Mosaicing

[Schechner and Nayar, ICCV 2001]



HDR From Multiple Measurements

Captured Images



Computed Image



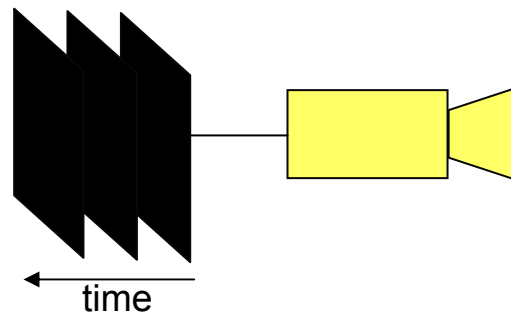
Mitsunaga, T. and S. Nayar. "Radiometric Self Calibration." CVPR 1999.

© 1999 IEEE. Courtesy of IEEE. Used with permission.

Ginosar et al 92, Burt & Kolczynski 93,
Madden 93, Tsai 94, Saito 95, Mann & Picard 95,
Debevec & Malik 97, Mitsunaga & Nayar 99,
Robertson et al. 99, Kang et al. 03

Sequential Exposure Change:

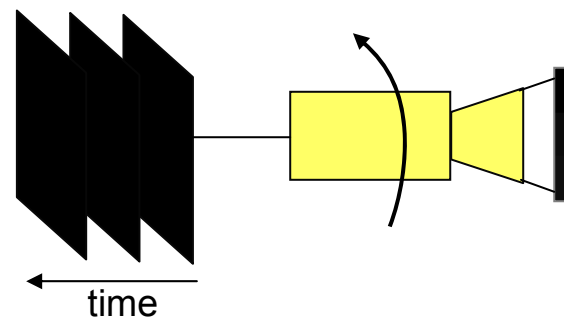
Ginosar et al 92, Burt & Kolczynski 93,
Madden 93, Tsai 94, Saito 95, Mann 95,
Debevec & Malik 97, Mitsunaga & Nayar 99,
Robertson et al. 99, Kang et al. 03



Mosaicing with Spatially Varying Filter:

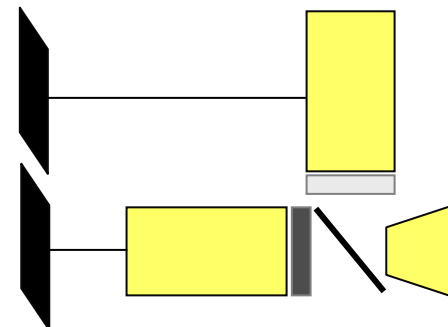
(Pan or move the camera)

Schechner and Nayar 01,
Aggarwal and Ahuja 01



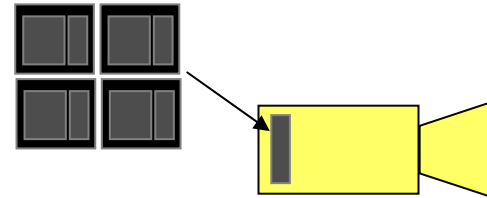
Multiple Image Detectors:

Doi et al. 86, Saito 95, Saito 96,
Kimura 98, Ikeda 98,
Aggarwal & Ahuja 01, ...



Multiple Sensor Elements in a Pixel:

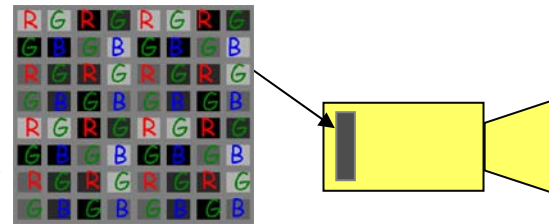
Handy 86, Wen 89, Murakoshi 94,
Konishi et al. 95, Hamazaki 96, Street 98



Assorted Pixels:

Generalized Bayer Grid:
Trade resolution for multiple exposure,color

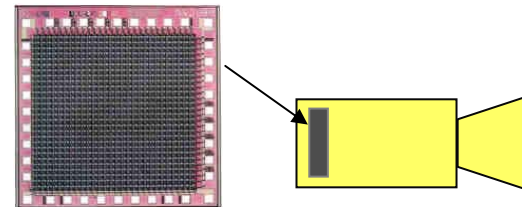
Nayar and Mitsunaga 00,
Nayar and Narasimhan 02



Computational Pixels:

(pixel sensivity set by its illumination)

Brajovic & Kanade 96,
Ginosar & Gnusin 97
Serafini & Sodini 00



Assorted Pixels [Nayar and Narsihman 03]

R	G	R	G	R	G	R	G
G	B	G	B	G	B	G	B
R	G	R	G	R	G	R	G
G	B	G	B	G	B	G	B
R	G	R	G	R	G	R	G
G	B	G	B	G	B	G	B
R	G	R	G	R	G	R	G
G	B	G	B	G	B	G	B

Bayer Grid

Interleaved color filters.

Lets interleave
OTHER assorted
measures too

‘De-mosaicking’ helps
preserve resolution...

Assorted Pixels [Nayar and Narsihman 03]



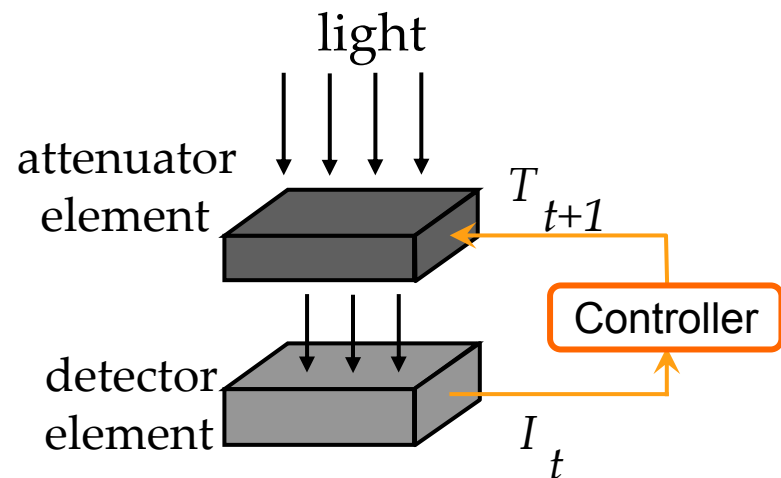
Digital Still Camera



Camera with Assorted Pixels

LCD Adaptive Light Attenuator

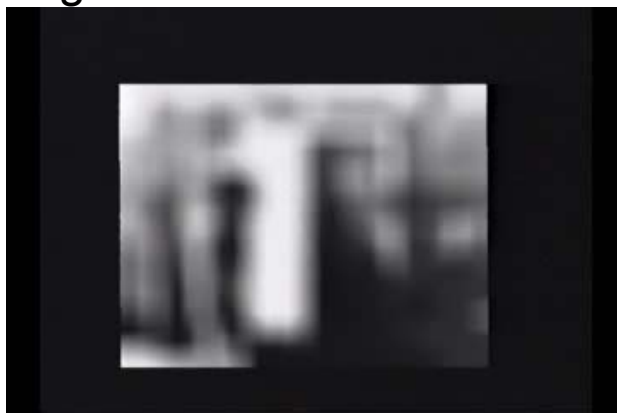
[Nayar and Branzoi, ICCV 2003]



Unprotected
8-bit Sensor
Output:



LCD Light Attenuator
limits image intensity
reaching 8-bit sensor



Attenuator-
Protected
8-bit Sensor
Output



High Dynamic Range (HDR) display

[Seetzen, Heidrich, et al, SIGGRAPH 2004]

Image removed due to copyright restrictions.

Schematic of HDR display with projector, LCD and optics; and photo of the working display.

See Figure 4 in Seetzen, H., et al. "High Dynamic Range Display Systems."

ACM Transactions on Graphics (Proceedings of SIGGRAPH 2004) 23, no. 3 (August 2004): 760-768.

<http://citeseerx.ist.psu.edu/viewdoc/download?doi=10.1.1.128.1621&rep=rep1&type=pdf>

Focus: extending the depth of field

- Focal stacks - used in microscopy
- Light field cameras

FUSION: Best-Focus Distance

Source images



'Graph Cuts' Solution

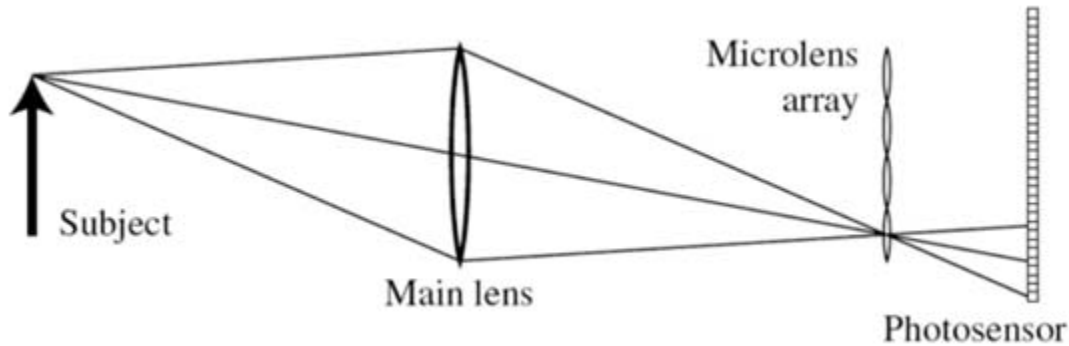


FUSION

Several slides removed due to copyright restrictions.
Sequence of photos of insect head, with progression of different focal points.
See "Extended depth-of-field" example at:
Agarwala, A., et al. "[Interactive Digital Photomontage.](#)"

Agarwala et al.,
Digital Photomontage
SIGGRAPH 2004

Focus: Light field camera



Light field
↓
focal stack
↓
extended DOF



Focus: shallow depth of field

Lots of glass; Heavy; Bulky; Expensive

Example photos removed due to copyright restrictions.

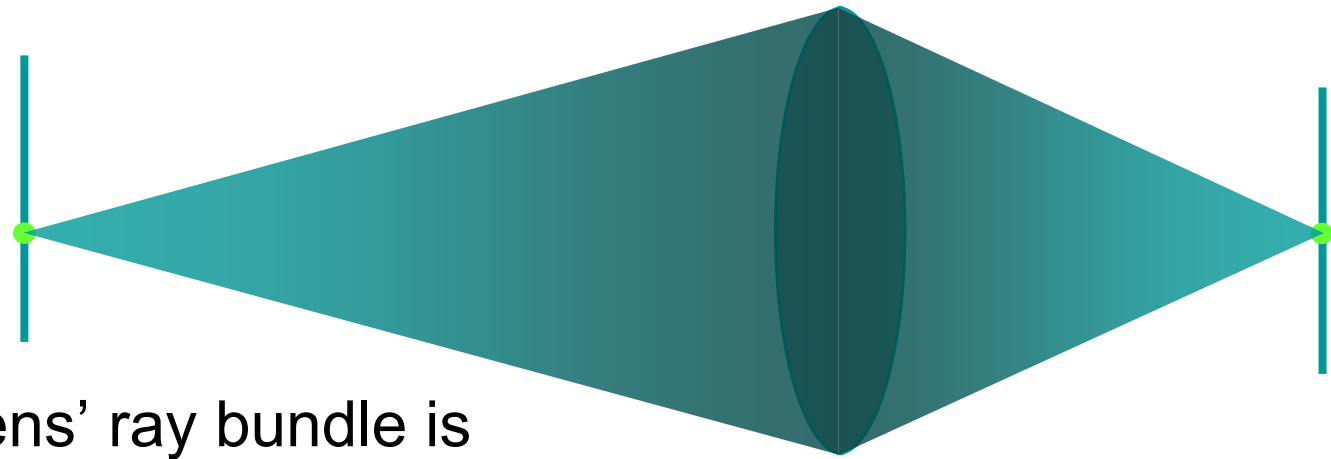
Defocus Magnification

[Bae and Durand 2007]

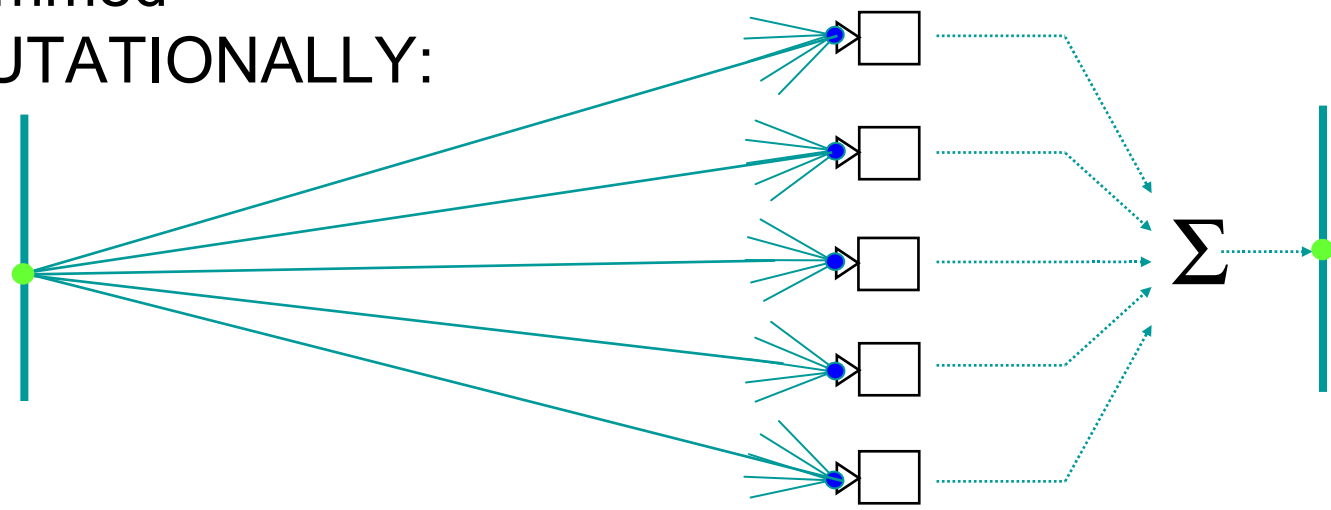
Images removed due to copyright restrictions.

See Figure 1 in Bae, S., and F. Durand. "Defocus Magnification."
Comput Graph Forum 26, no. 3 (2007): 571-579.

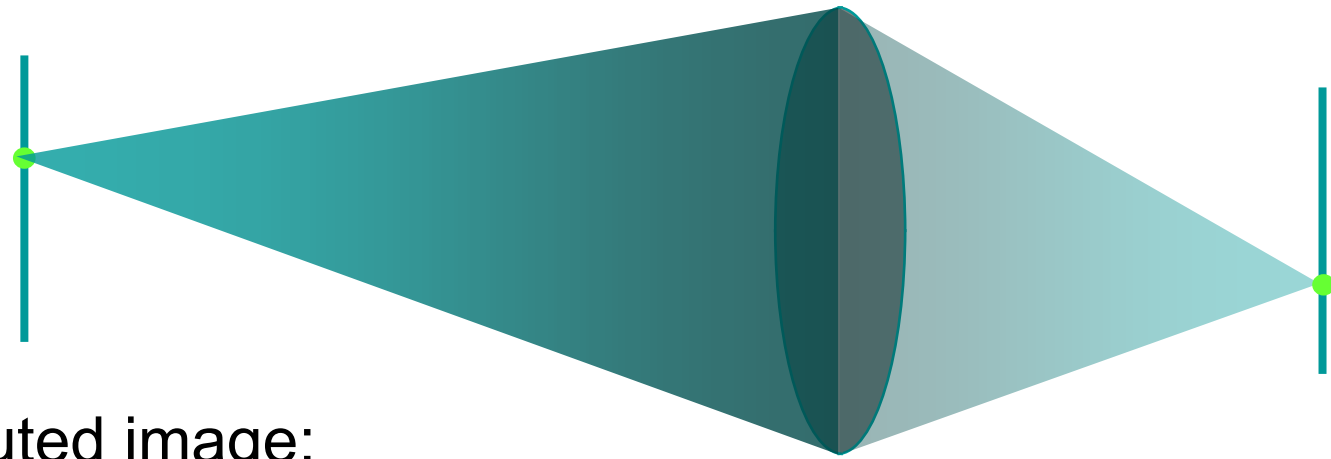
Synthetic aperture photography



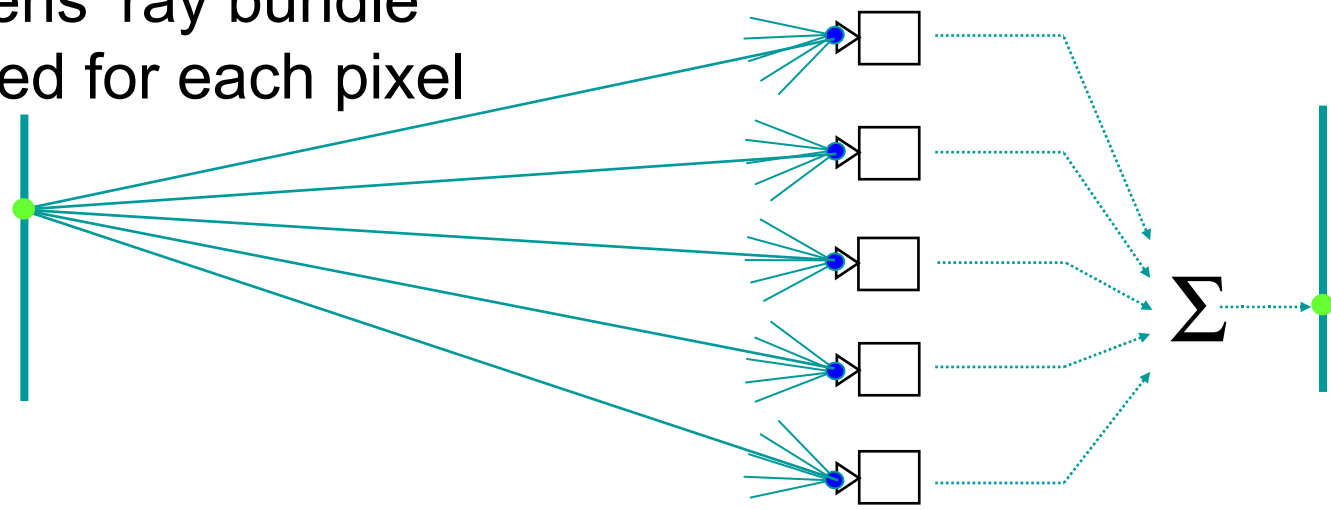
Huge lens' ray bundle is
now summed
COMPUTATIONALLY:



Synthetic aperture photography

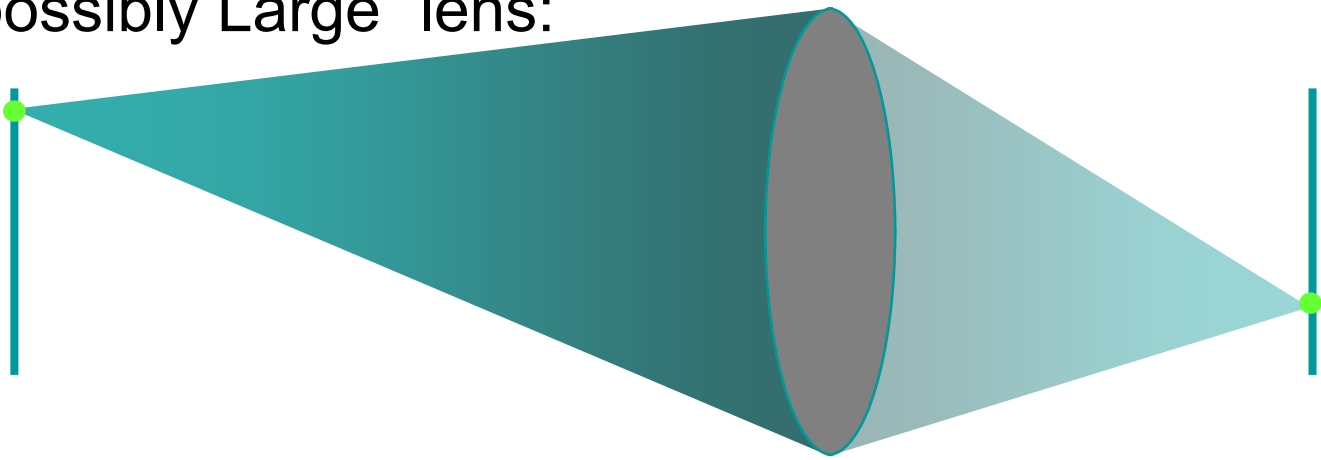


Computed image:
large lens' ray bundle
Summed for each pixel

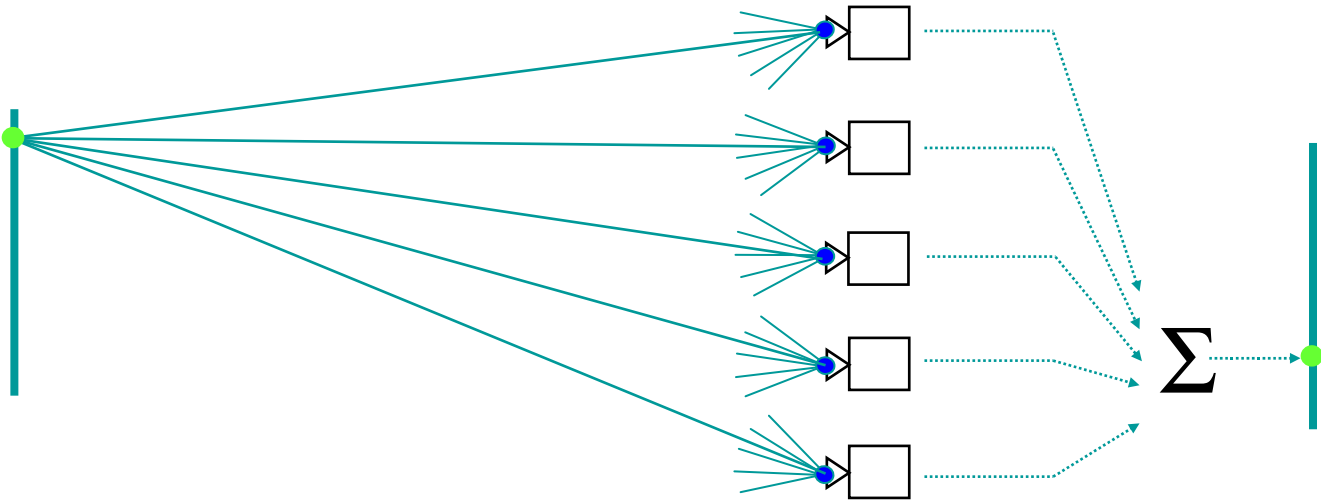


Synthetic aperture photography

“Impossibly Large” lens:

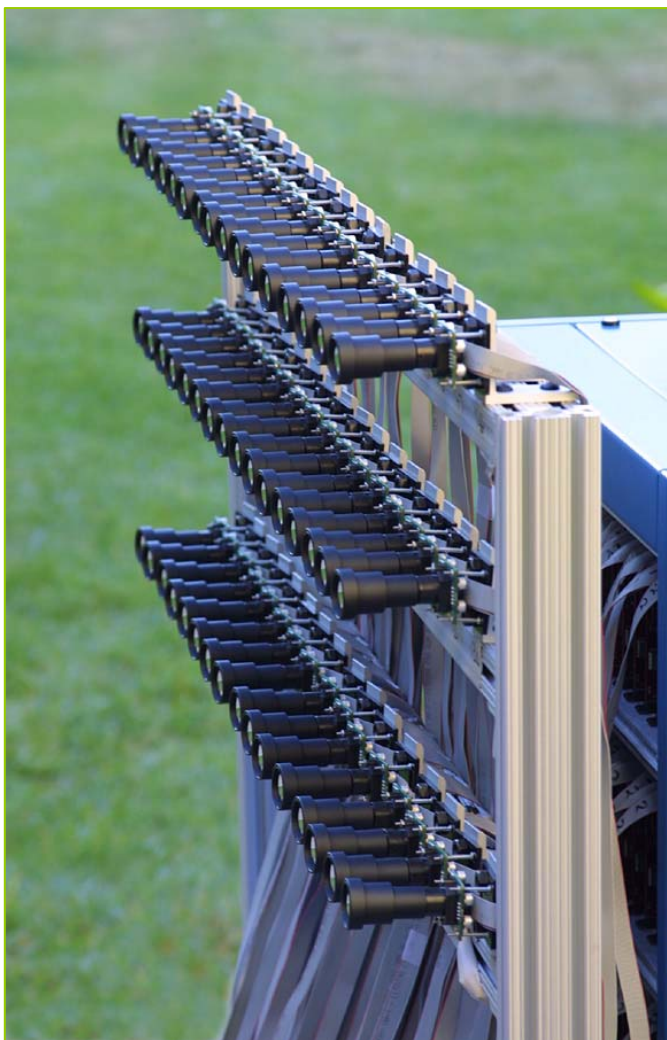


Lens gathers a bundle of rays for each image point...



Camera array gathers and sums the same sets of rays

Synthetic aperture photography



Camera array is far away from these bushes, yet it sees...

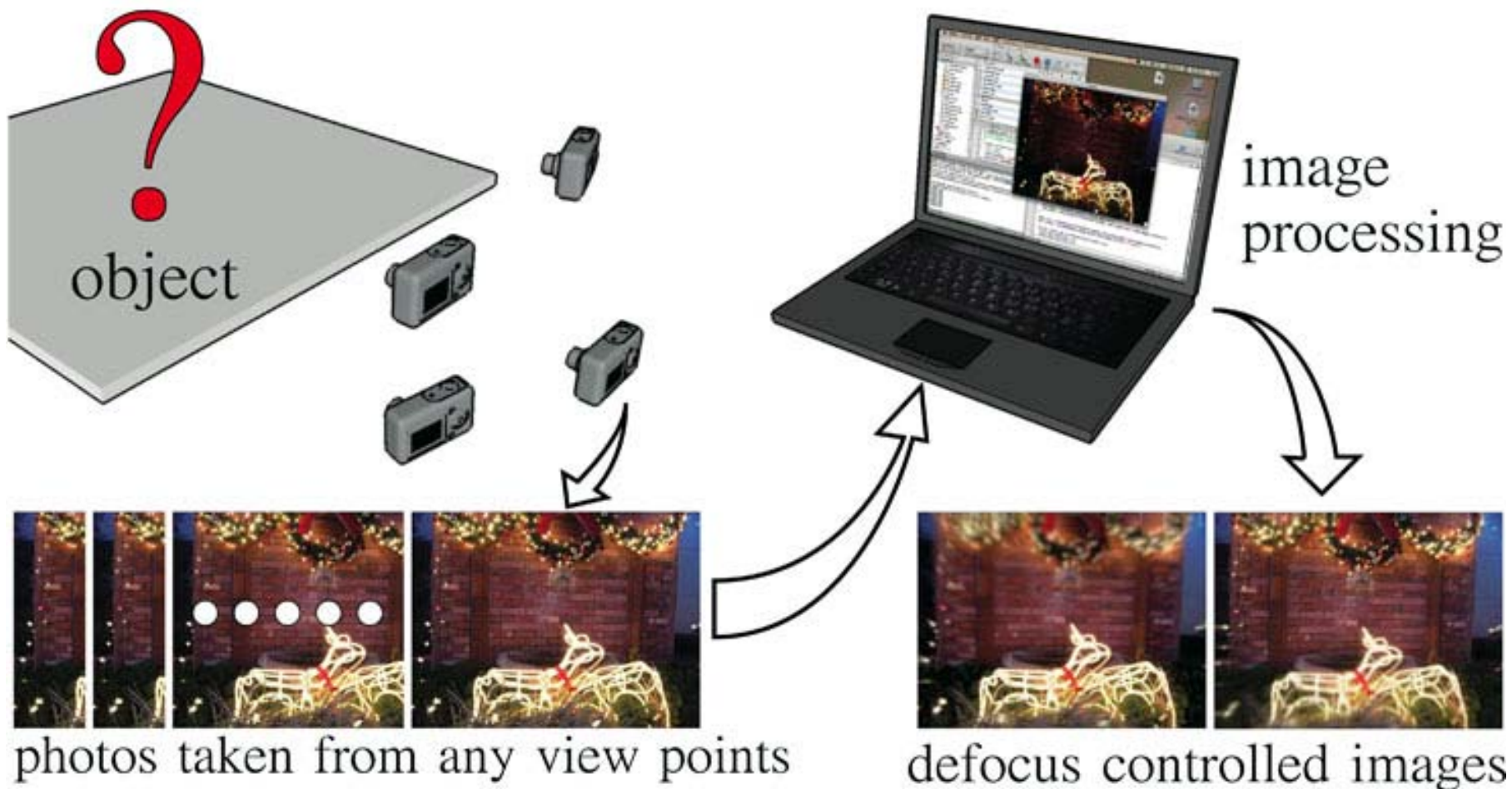
Focus Adjustment: Sum of Bundles

[Vaish et al. 2004]



Uncalibrated Synthetic Aperture

[Kusumoto, Hiura, Sato, CVPR 2009]



Uncalibrated Synthetic Aperture

[Kusumoto, Hiura, Sato, CVPR 2009]



Focus in front



Focus in back



Image Destabilization

[Mohan, Lanman et al. 2009]

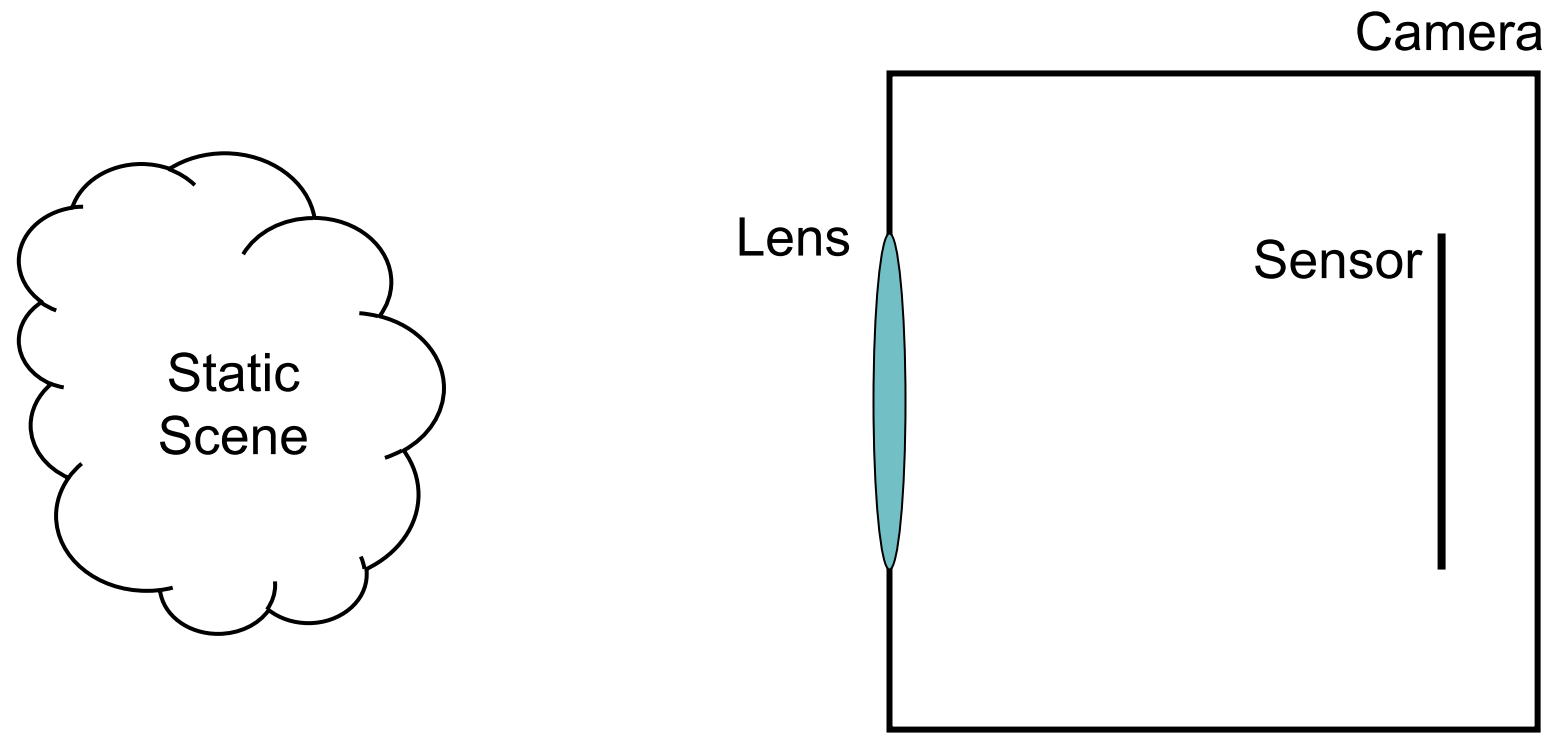
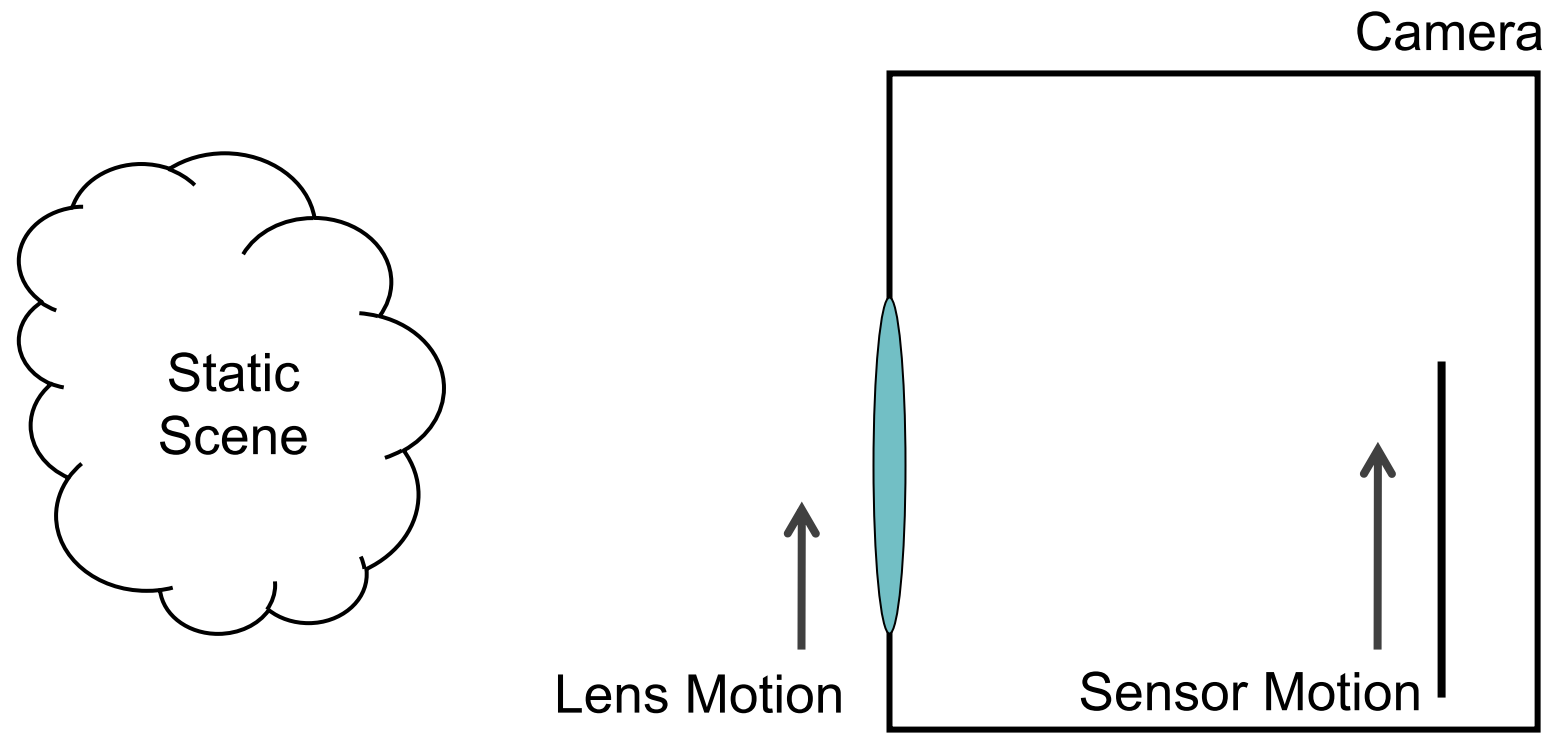


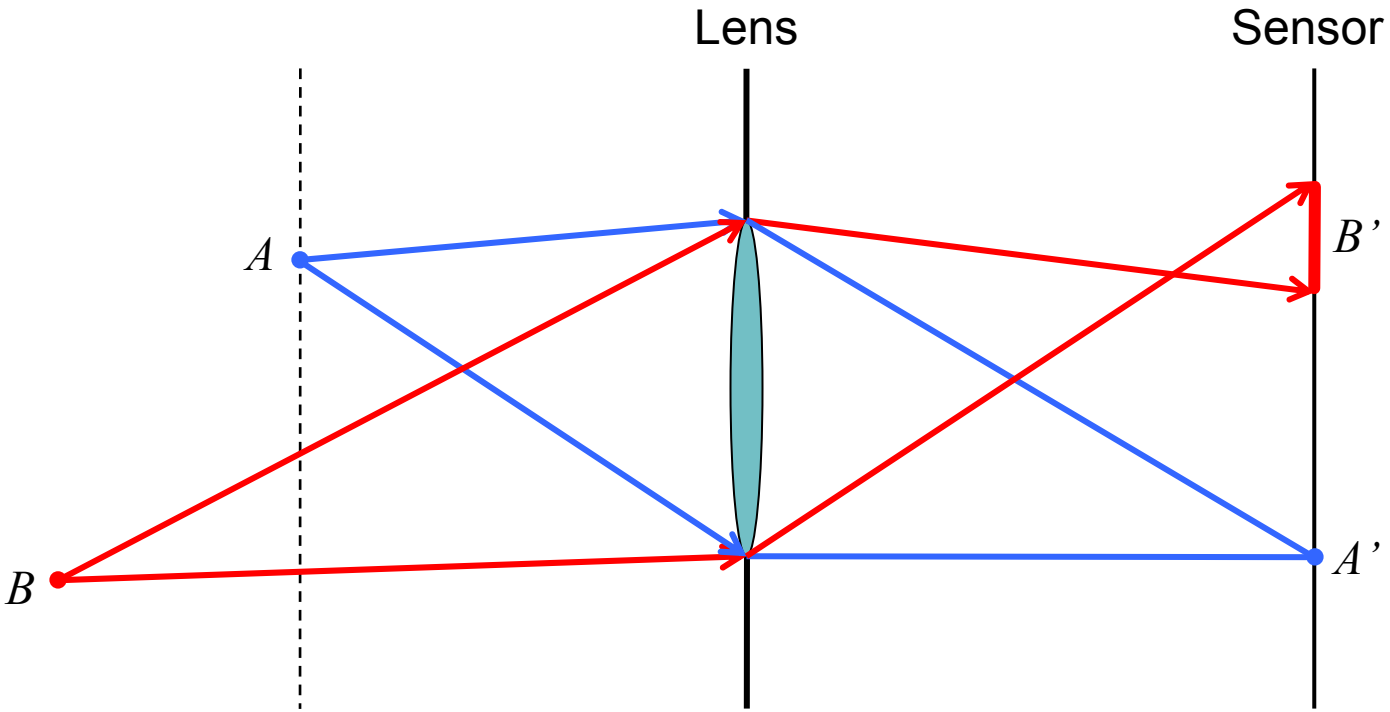


Image Destabilization

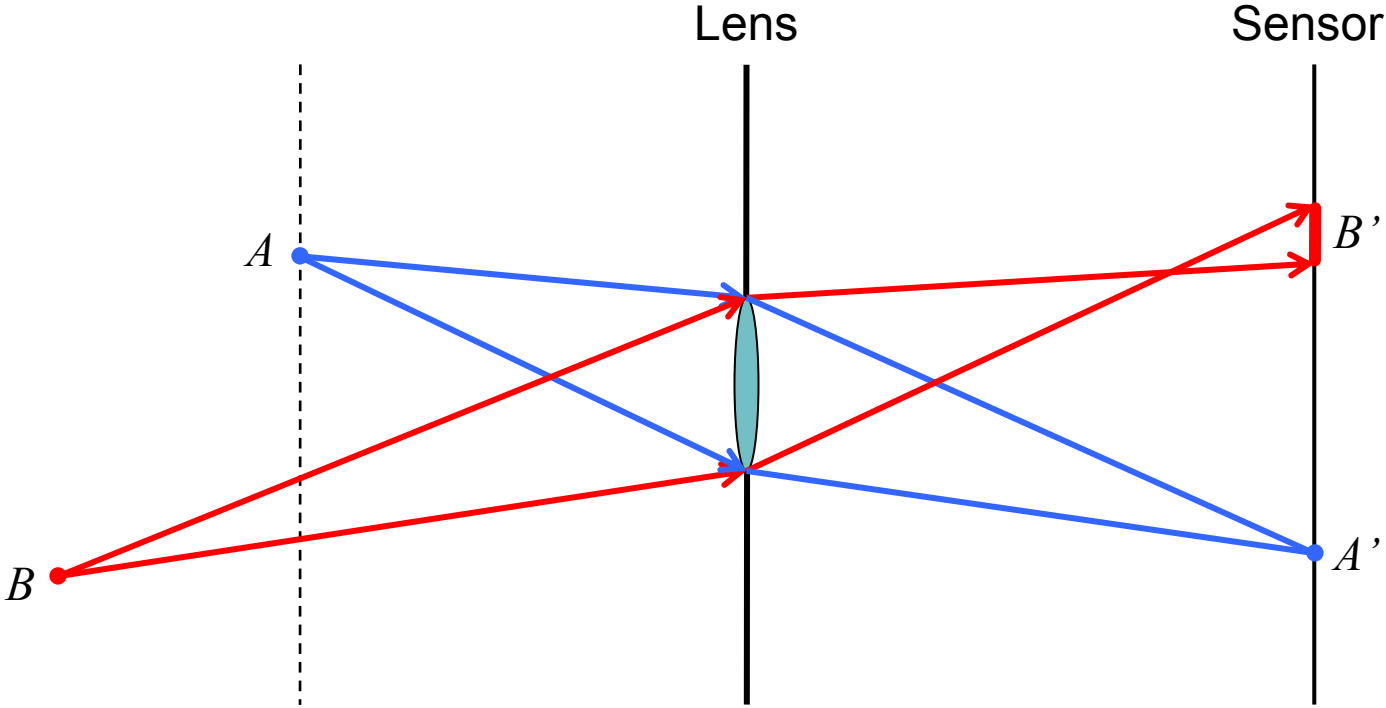
[Mohan, Lanman et al. 2009]



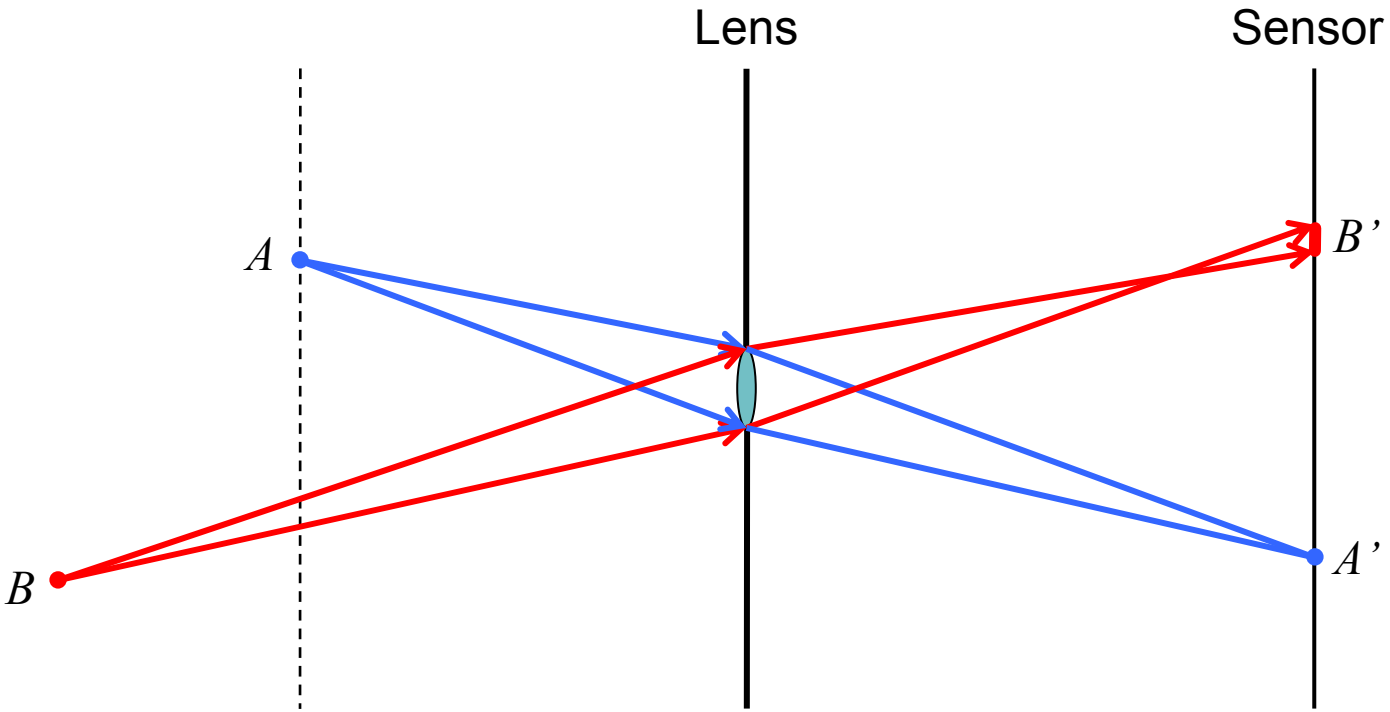
Lens based Focusing



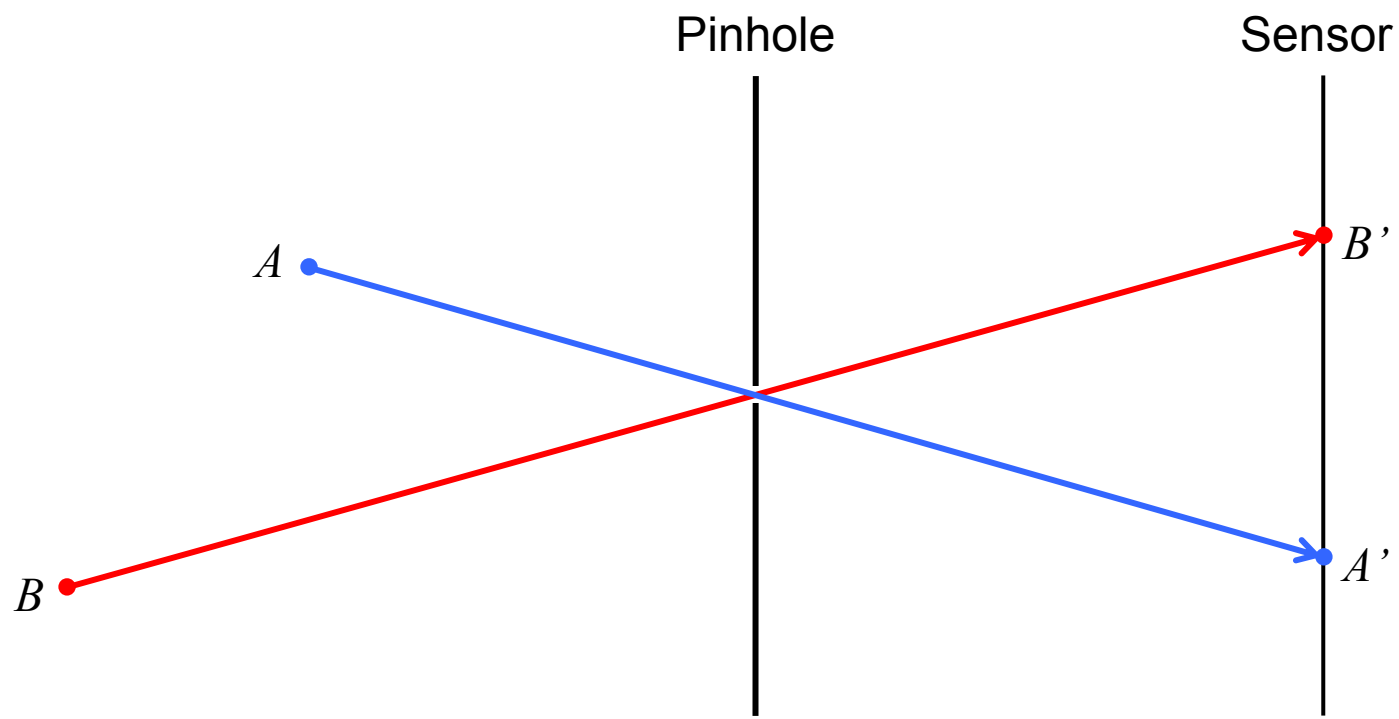
Lens based Focusing



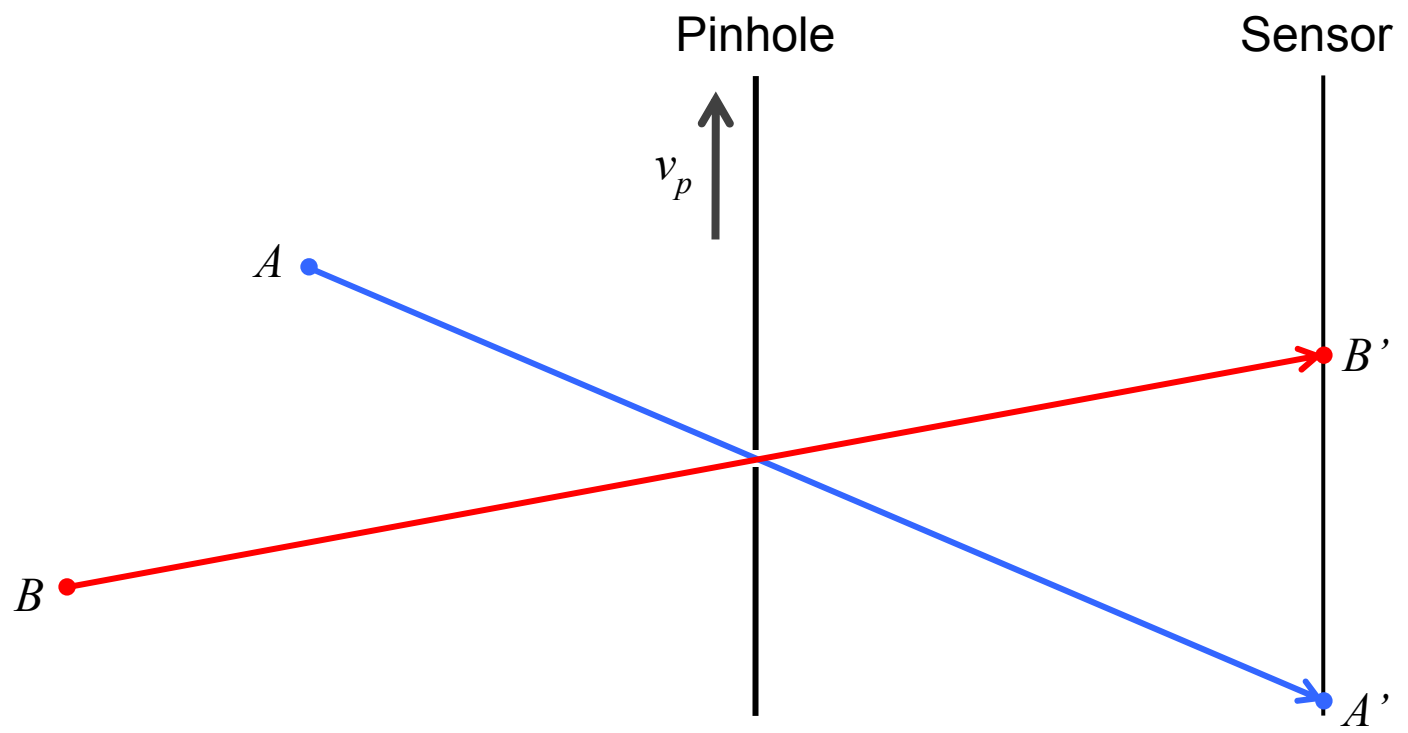
Smaller aperture \rightarrow Smaller defocus blur



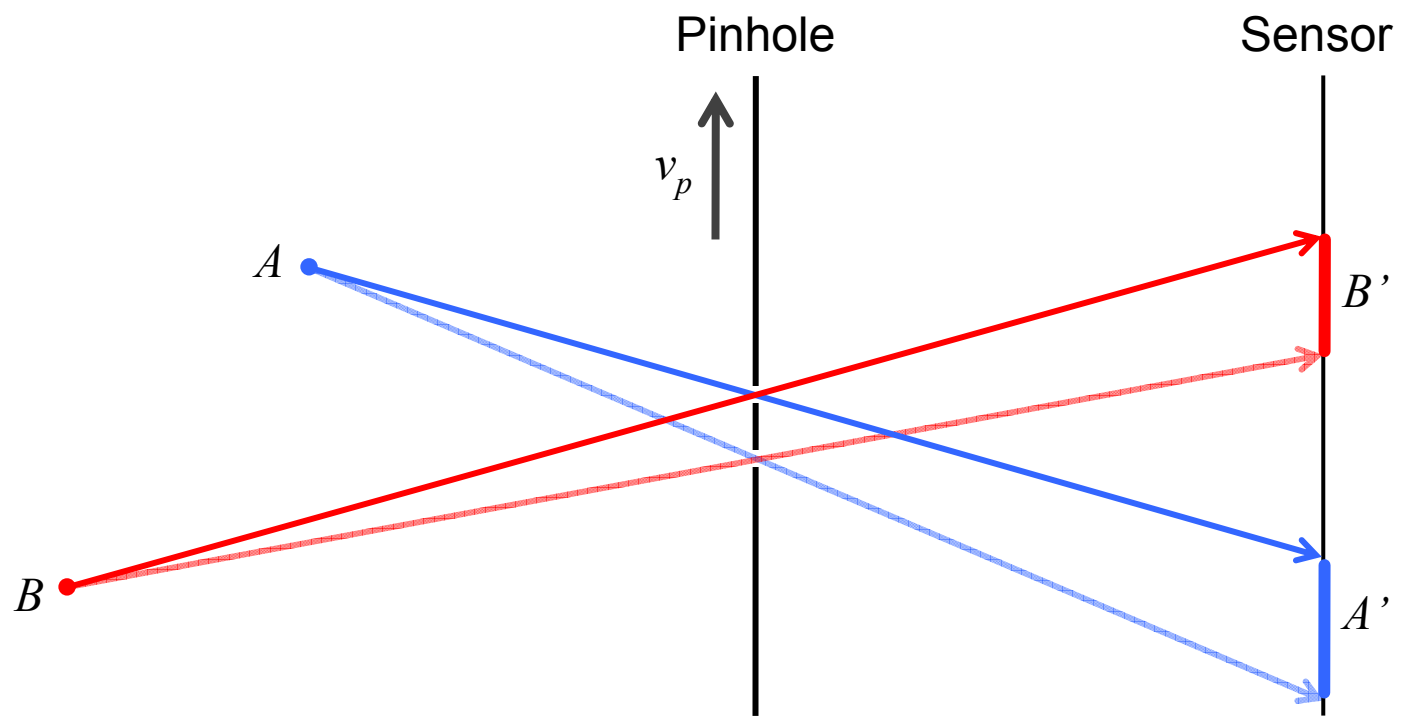
Pinhole: All In-Focus



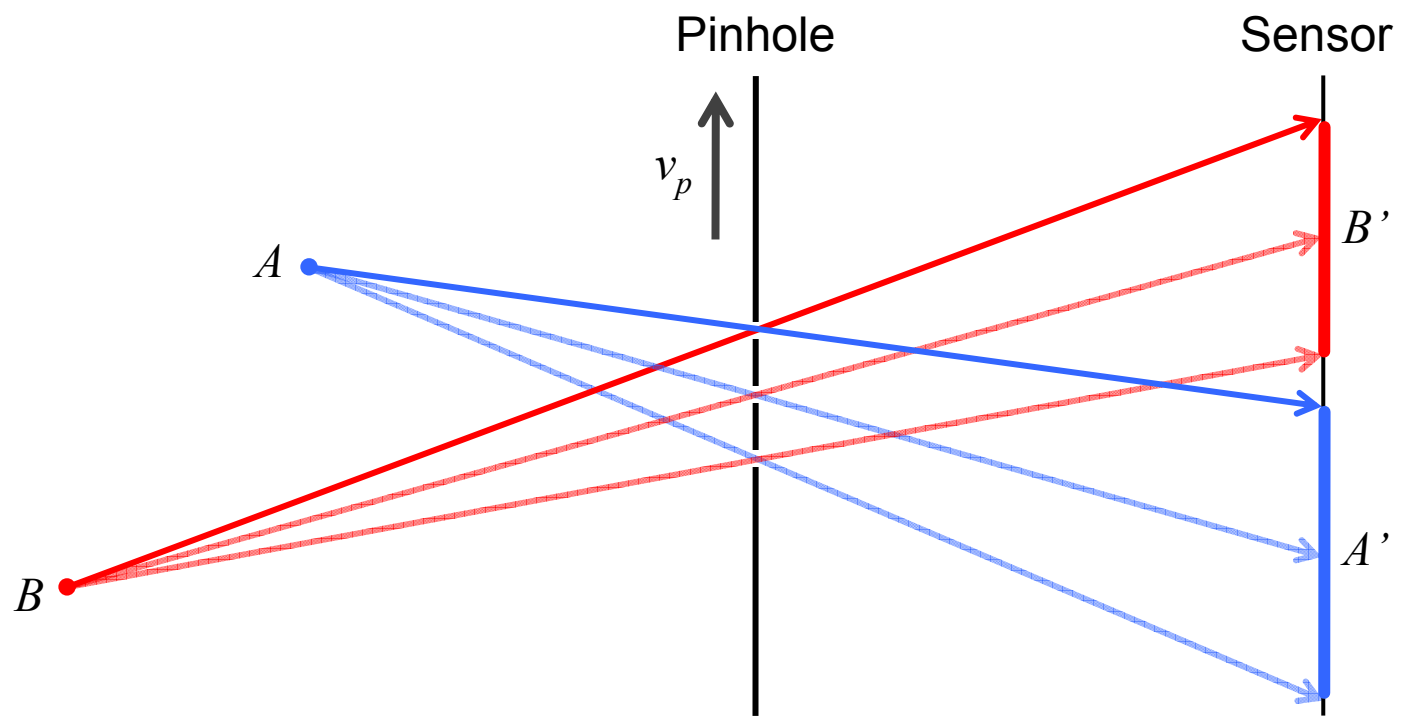
Shifting Pinhole



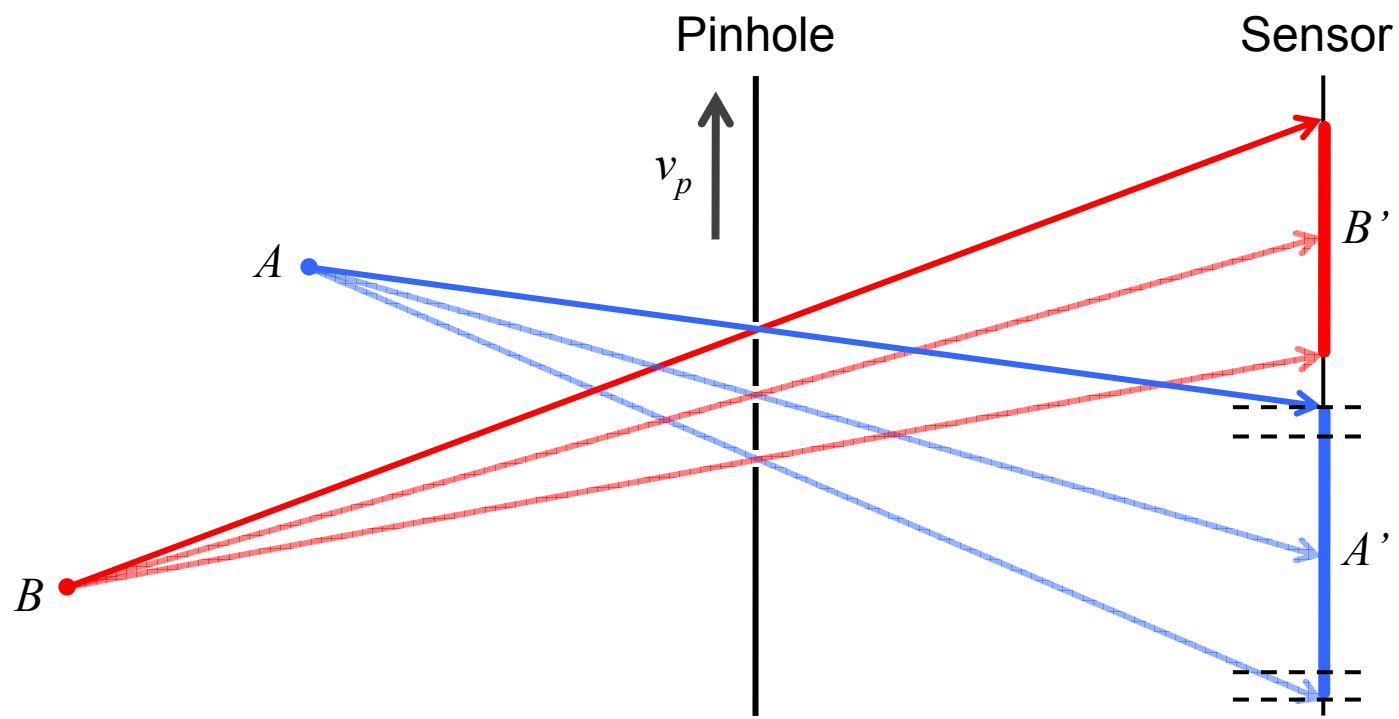
Shifting Pinhole



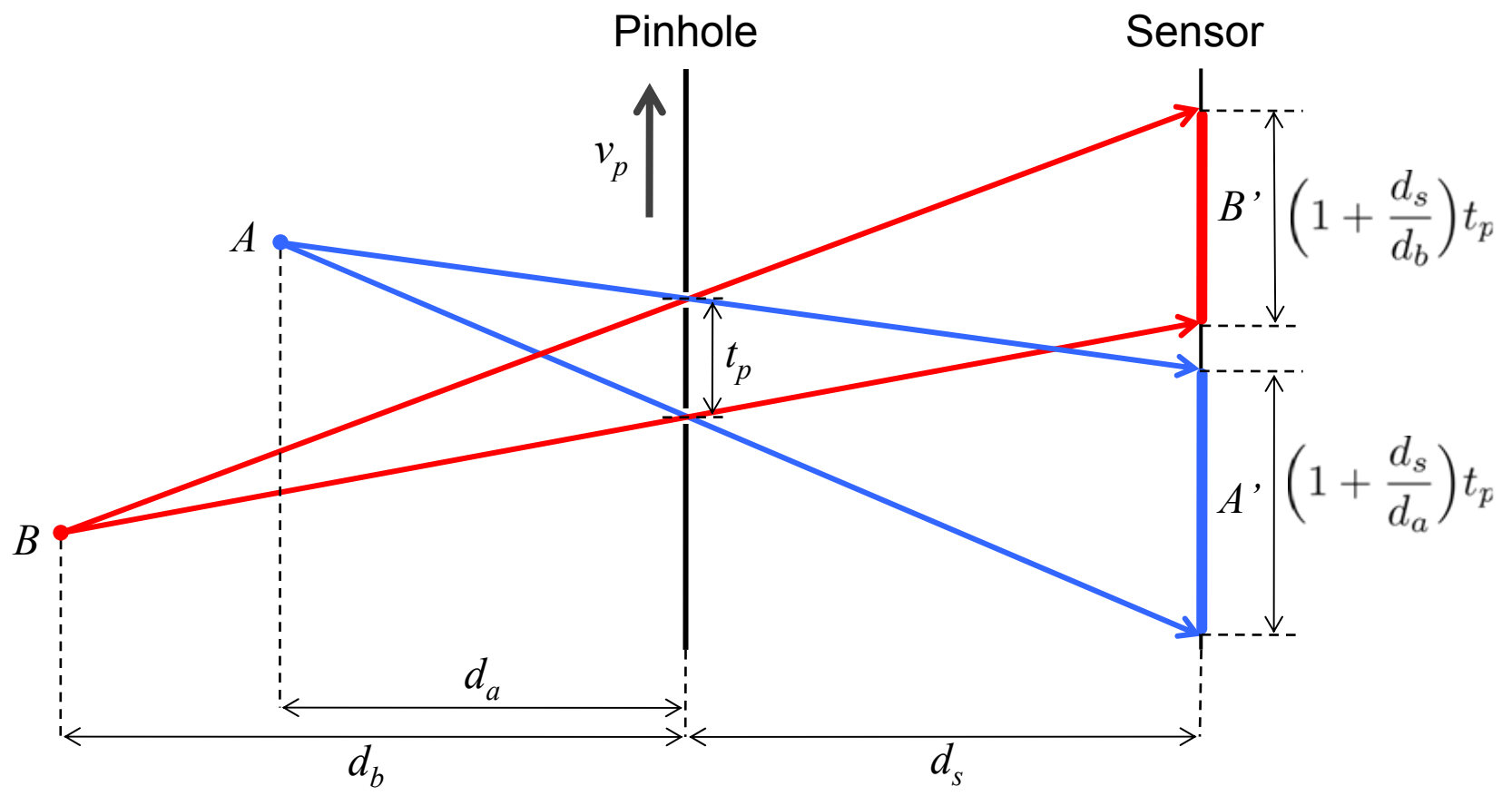
Shifting Pinhole



Shifting Pinhole

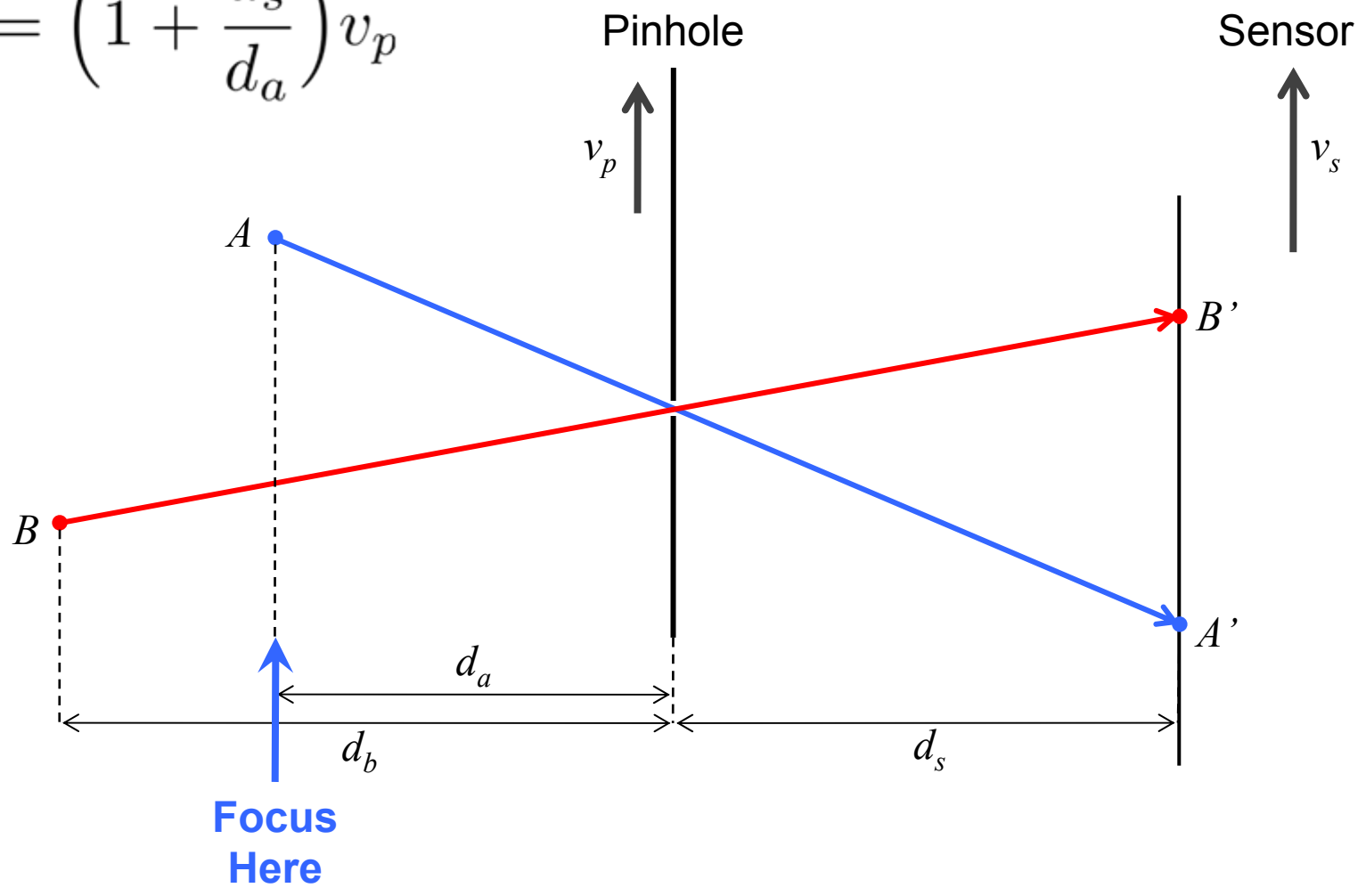


Shifting Pinhole



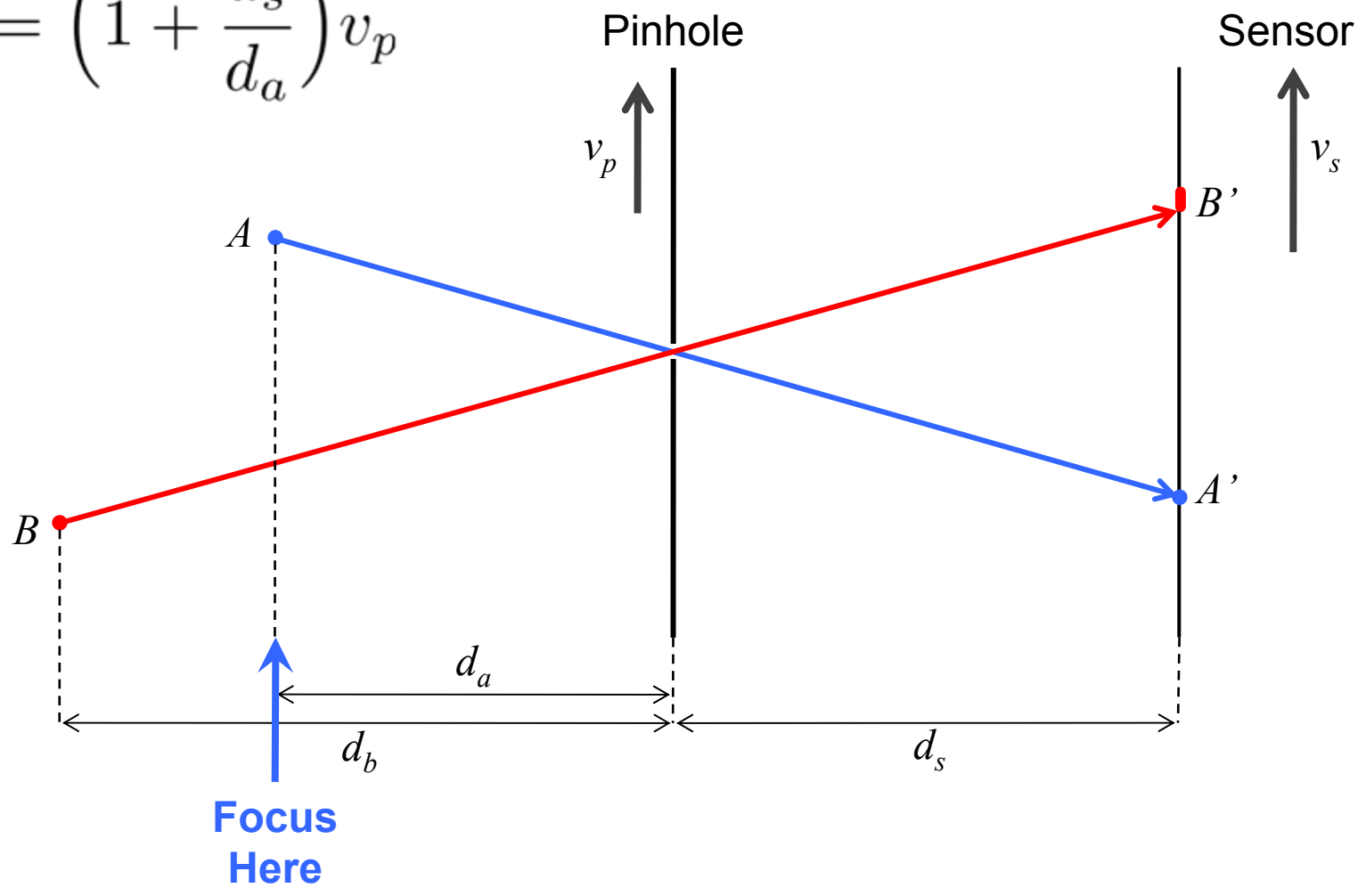
Shifting Pinhole and Sensor

$$v_s = \left(1 + \frac{d_s}{d_a}\right)v_p$$



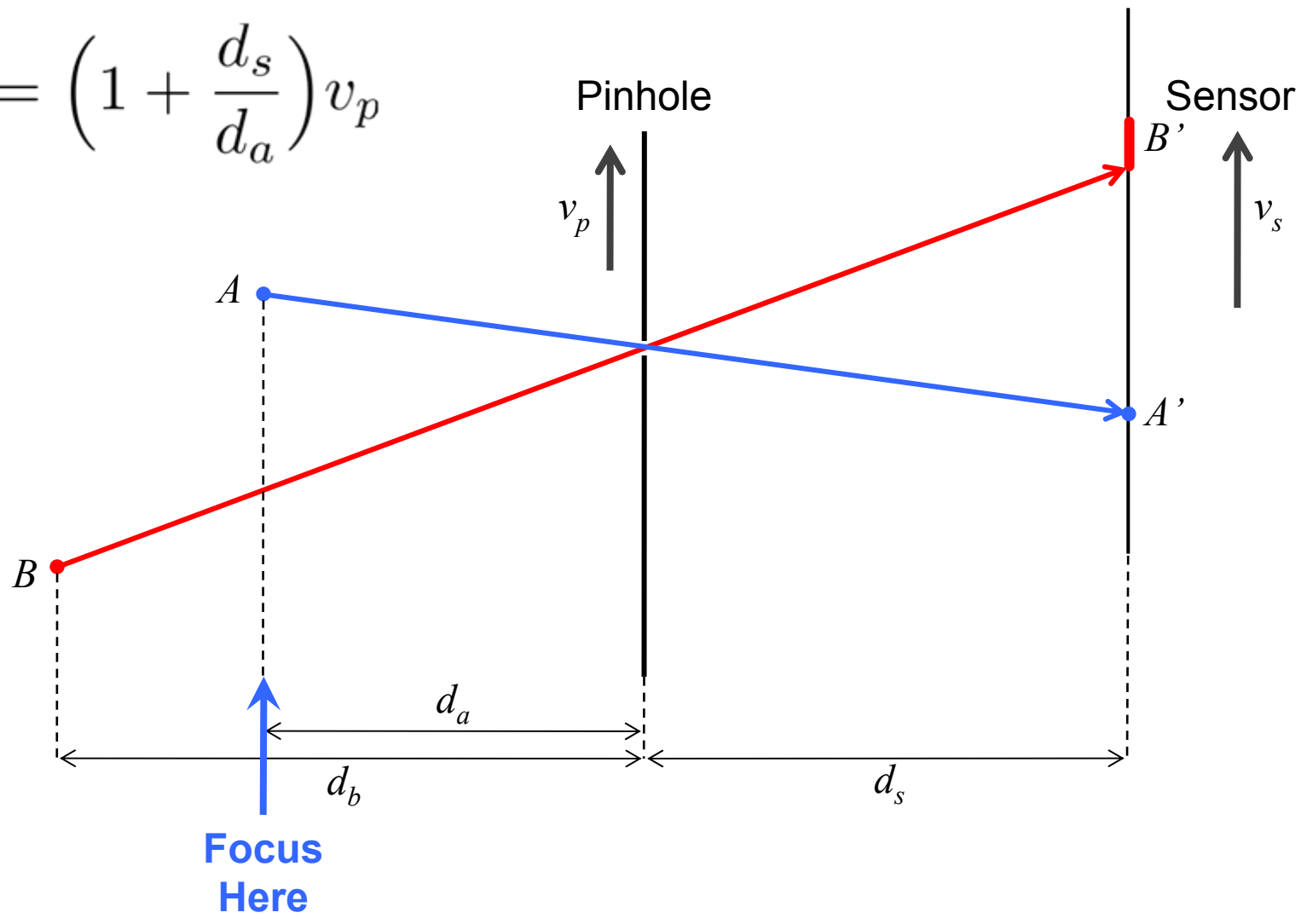
Shifting Pinhole and Sensor

$$v_s = \left(1 + \frac{d_s}{d_a}\right)v_p$$



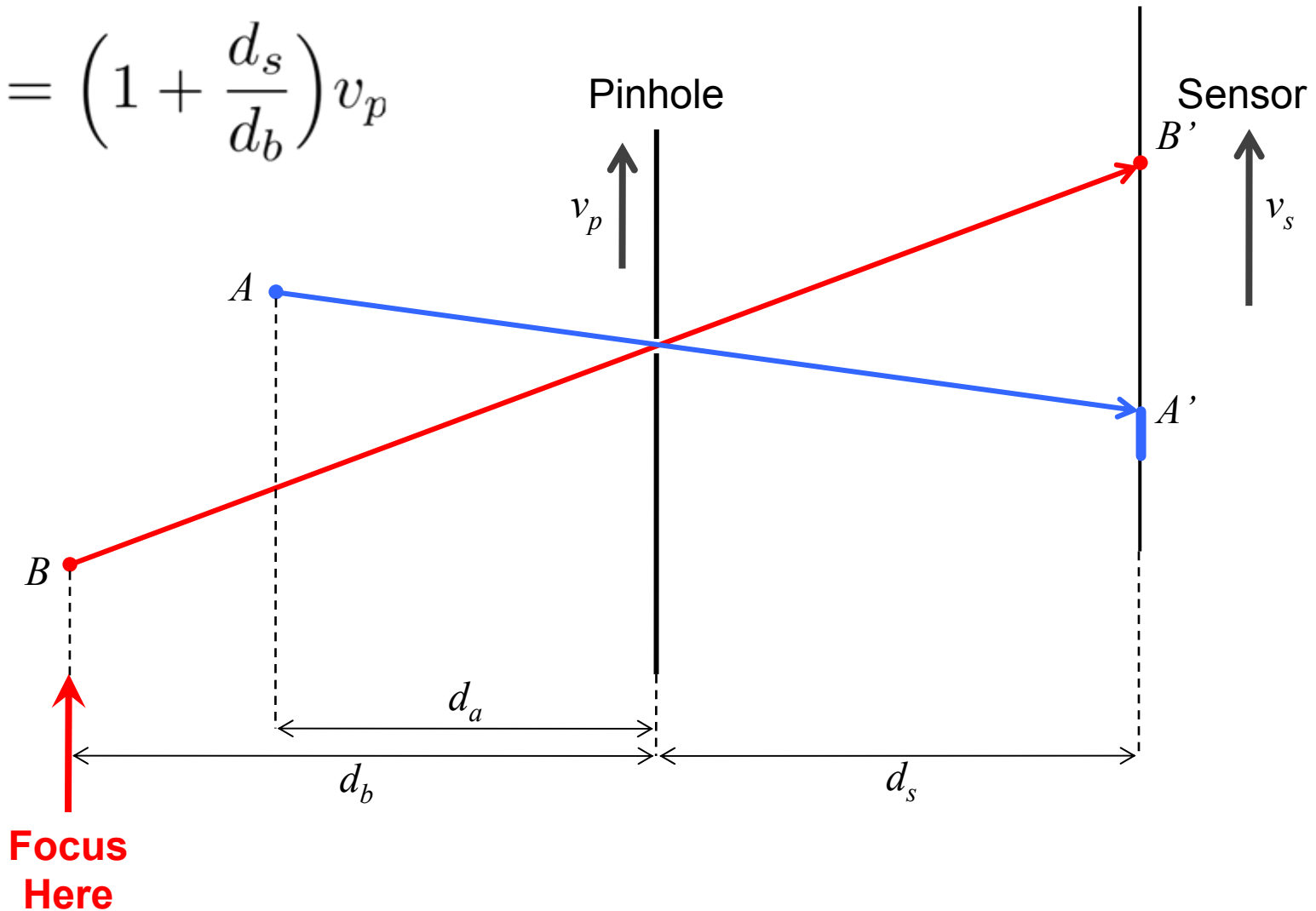
Shifting Pinhole and Sensor

$$v_s = \left(1 + \frac{d_s}{d_a}\right)v_p$$



Shifting Pinhole and Sensor

$$v_s = \left(1 + \frac{d_s}{d_b}\right)v_p$$



A Lens in Time!

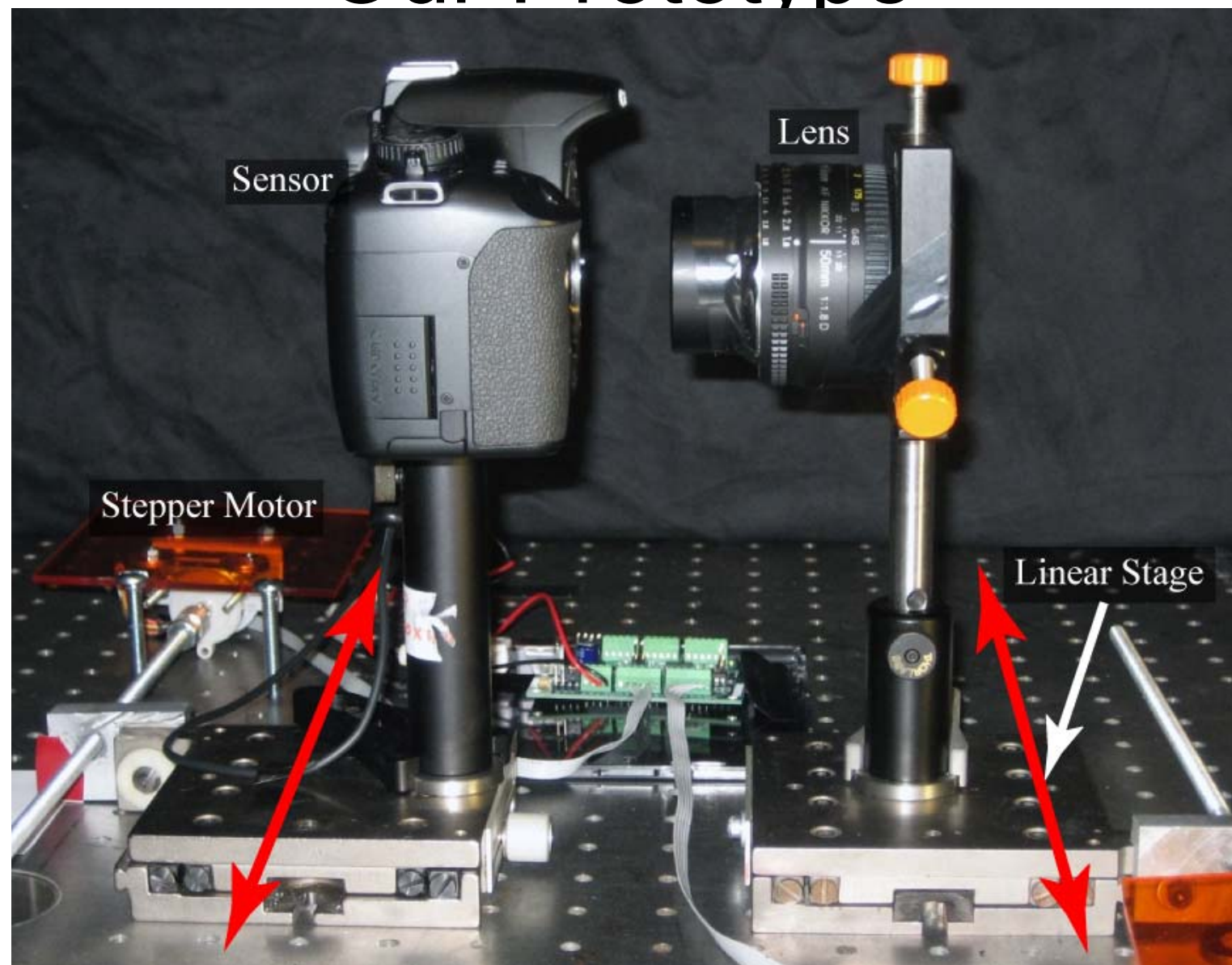
Lens Equation: $\frac{1}{f_P} = \frac{1}{u} + \frac{1}{v}$

Virtual Focal Length: $f_P = \left(\frac{v_p}{v_s}\right) d_s$

Virtual F-Number: $N_P = \left(\frac{v_p}{v_s}\right) \left(\frac{d_s}{t_p}\right)$

Analogous to *shift and sum* based
Light field re-focusing.

Our Prototype



Adjusting the Focus Plane



all-in-focus pinhole image

Defocus Exaggeration



destabilization simulates a reduced f-number

Large apertures with tiny lenses?

Benefits

- No *time* or *light* inefficiency wrt cheap cameras
- Exploits unused area around the lens
- Compact design
- With near-pinhole apertures (mobile phones) many possibilities



Photo courtesy of Wikipedia User: Lipton_sale.

Limitations

- Coordinated mechanical movement required
 - Diffraction (due to small aperture) cannot be eliminated
- [Zhang and Levoy, tomorrow]
[Our group: augmented LF for wave analysis]
- Scene motion during exposure



Figure by MIT OpenCourseWare.

Increasing Spatial Resolution

- Superresolution
- Panoramas over time
- Panoramas over sensors

Capturing Gigapixel Images

[Kopf et al, SIGGRAPH 2007]

Image removed due to copyright restrictions.

See Fig. 4b in Kopf, J., et al. "[Capturing and Viewing Gigapixel Images.](#)"

Proceedings of SIGGRAPH 2007.



3,600,000,000 Pixels

Created from about 800 8 MegaPixel Images

Capturing Gigapixel Images

[Kopf et al, 2007]

Image removed due to copyright restrictions.

See Fig. 4b in Kopf, J., et al. "[Capturing and Viewing Gigapixel Images.](#)"

Proceedings of SIGGRAPH 2007.

150 degrees

“Normal” perspective projections cause distortions.

Capturing Gigapixel Images

[Kopf et al, 2007]




100X variation in Radiance

High Dynamic Range

A tiled camera array


Photo removed due to copyright restrictions.
See
<http://graphics.stanford.edu/projects/array/images/tiled-side-view-cessh.jpg>
(Figure 1a in Wilburn, B., et al. SIGGRAPH 2005)

- 12×8 array of VGA cameras
- abutted: 7680×3840 pixels
- overlapped 50%: half of this
- total field of view = 29° wide
- (seamless mosaicing isn't hard)
- cameras individually metered
- Approx same center-of-proj.



Tiled panoramic image (before geometric or color calibration)

Photo removed due to copyright restrictions.



Tiled panoramic image (after geometric or color calibration)

Photo removed due to copyright restrictions.



Three images removed due to copyright restrictions.
Similar to Fig. 6 and 7 in Wilburn, B., et al.
[“High Performance Imaging Using Large Camera Arrays.”](#) *Proceedings of SIGGRAPH 2005.*

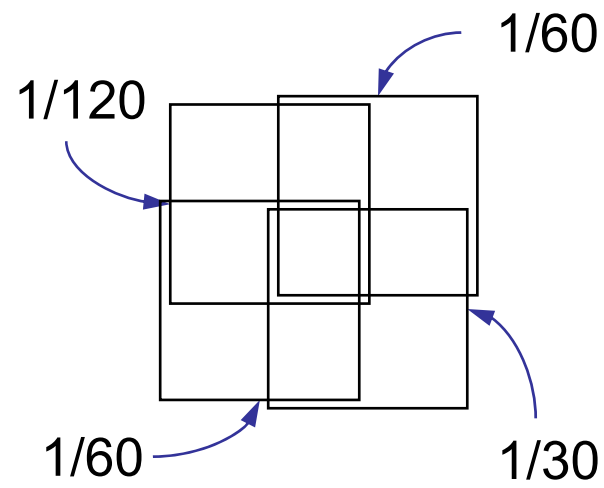
same exposure in all cameras

1/60	1/60
1/60	1/60

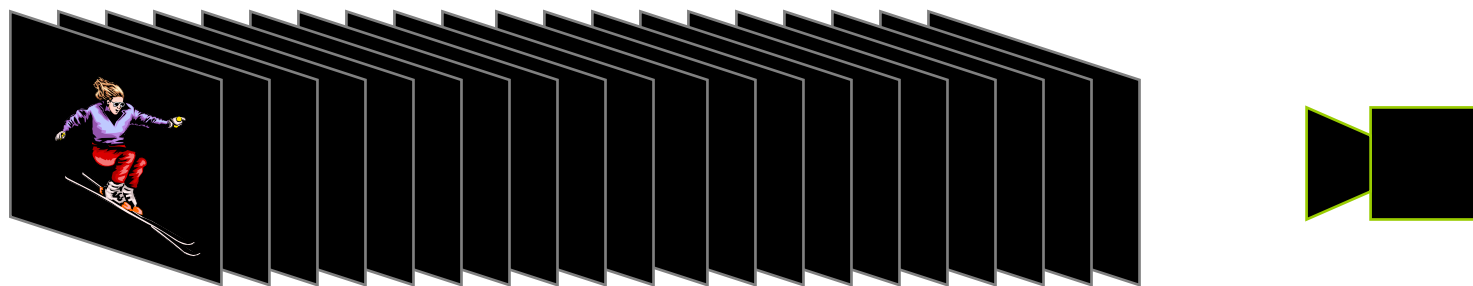
individually metered

1/120	1/60
1/60	1/30

same and overlapped 50%



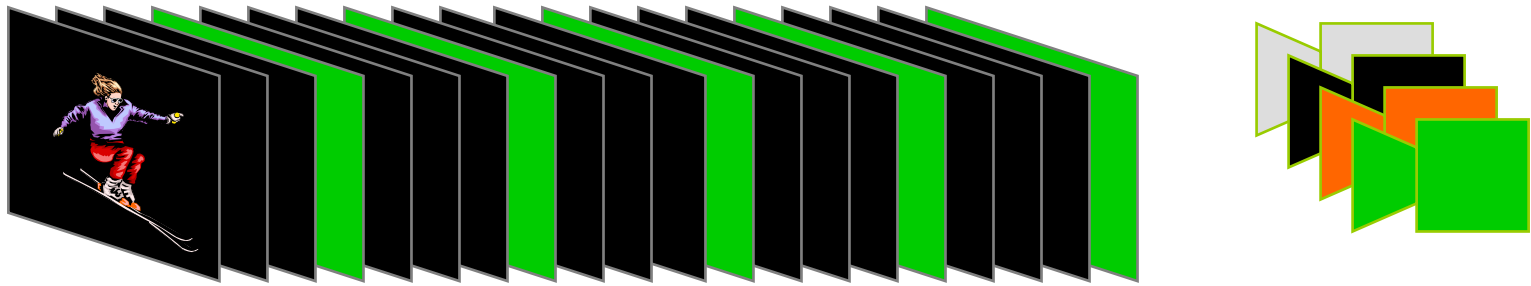
Increasing Temporal Resolution



Say you want 120 frame per second (fps) video.

- You could get one camera that runs at 120 fps
- Or...

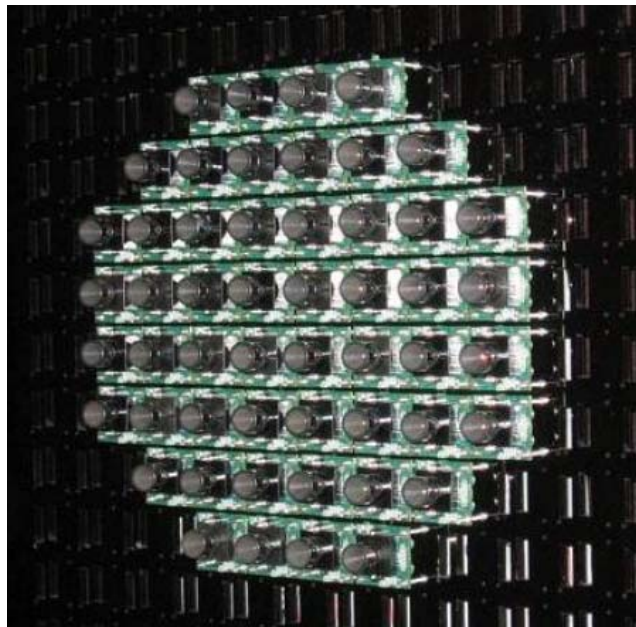
Increasing Temporal Resolution



Say you want 120 frame per second (fps) video.

- You could get one camera that runs at 120 fps
- Or... get 4 cameras running at 30 fps.

Increasing Temporal Resolution



High Speed Video Using a Dense Camera Array [Wilburn et al, CVPR 2004]

1560fps video of popping balloon



Epsilon Photography

Modify ...

- Exposure settings
- Spectrum/color settings
- Focus settings
- Camera position
- Scene illumination

... over ...

- time (bracketing)
- sensors (SAMP, camera arrays)
- pixels (bayer)

MIT OpenCourseWare
<http://ocw.mit.edu>

MAS.531 Computational Camera and Photography
Fall 2009

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