

Today

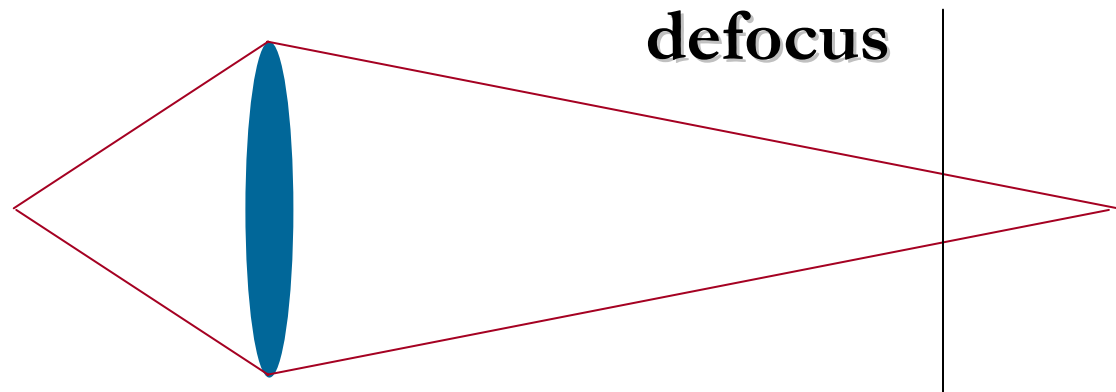
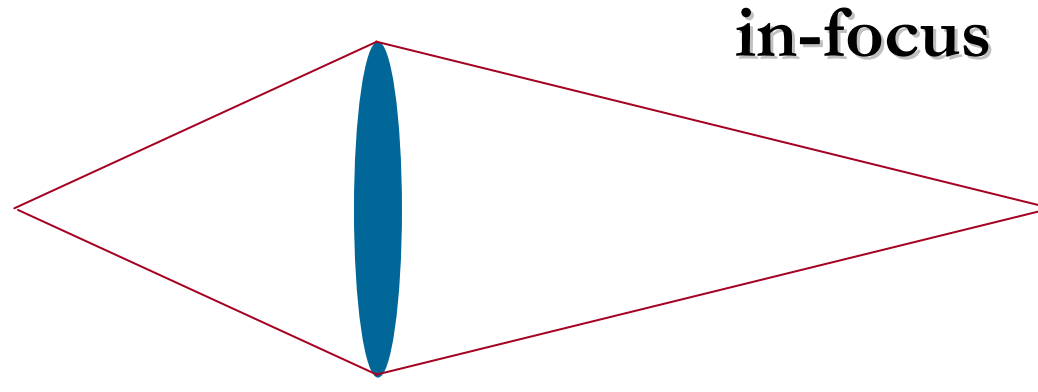
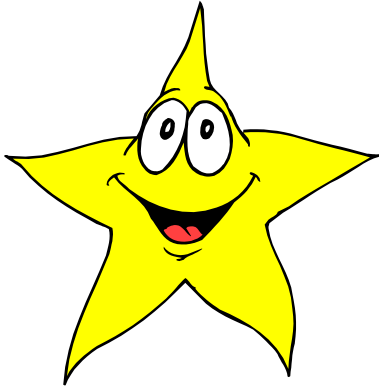
- Defocus
- Deconvolution / inverse filters

Defocus

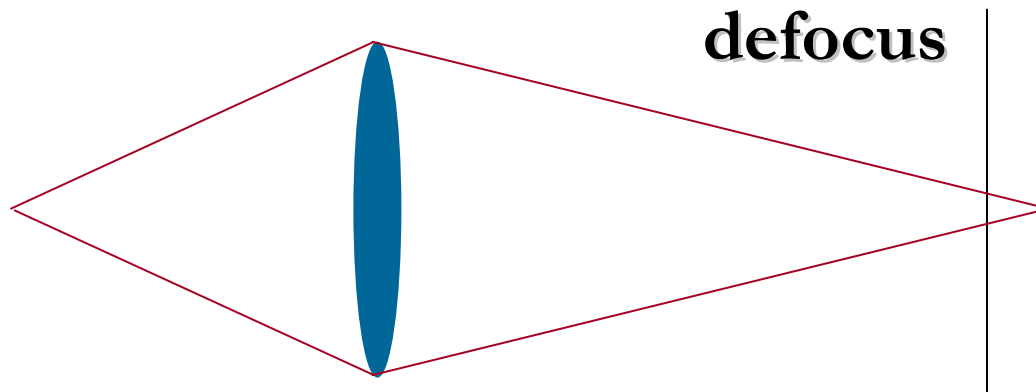
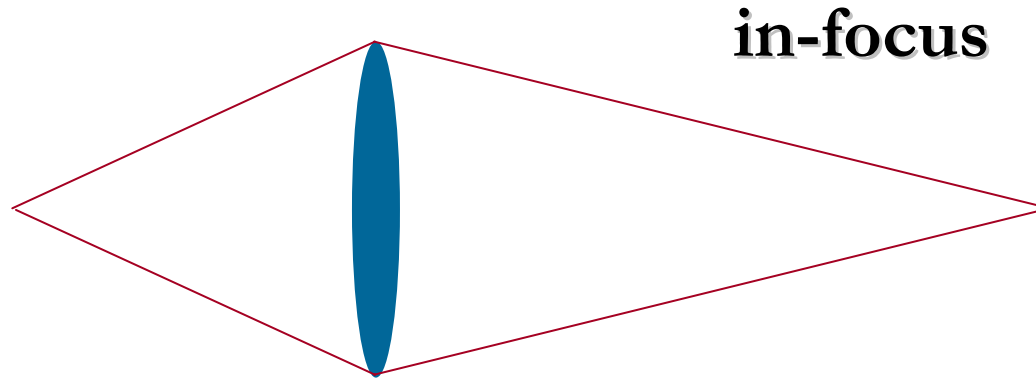
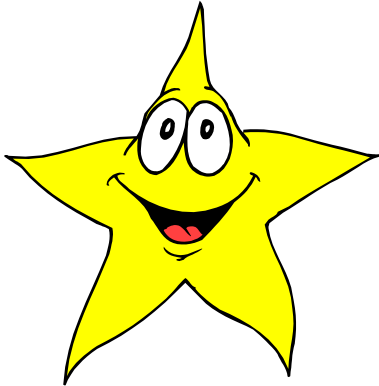


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Focus in classical imaging

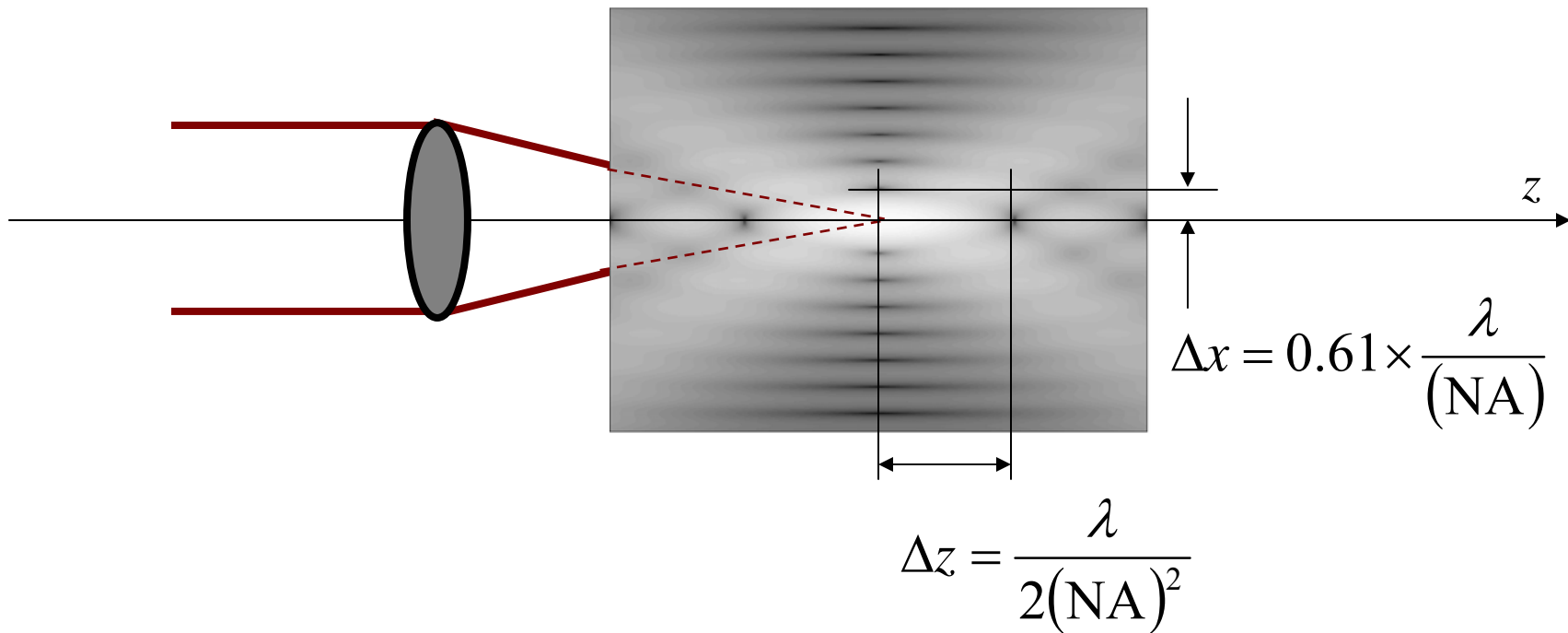


Focus in classical imaging

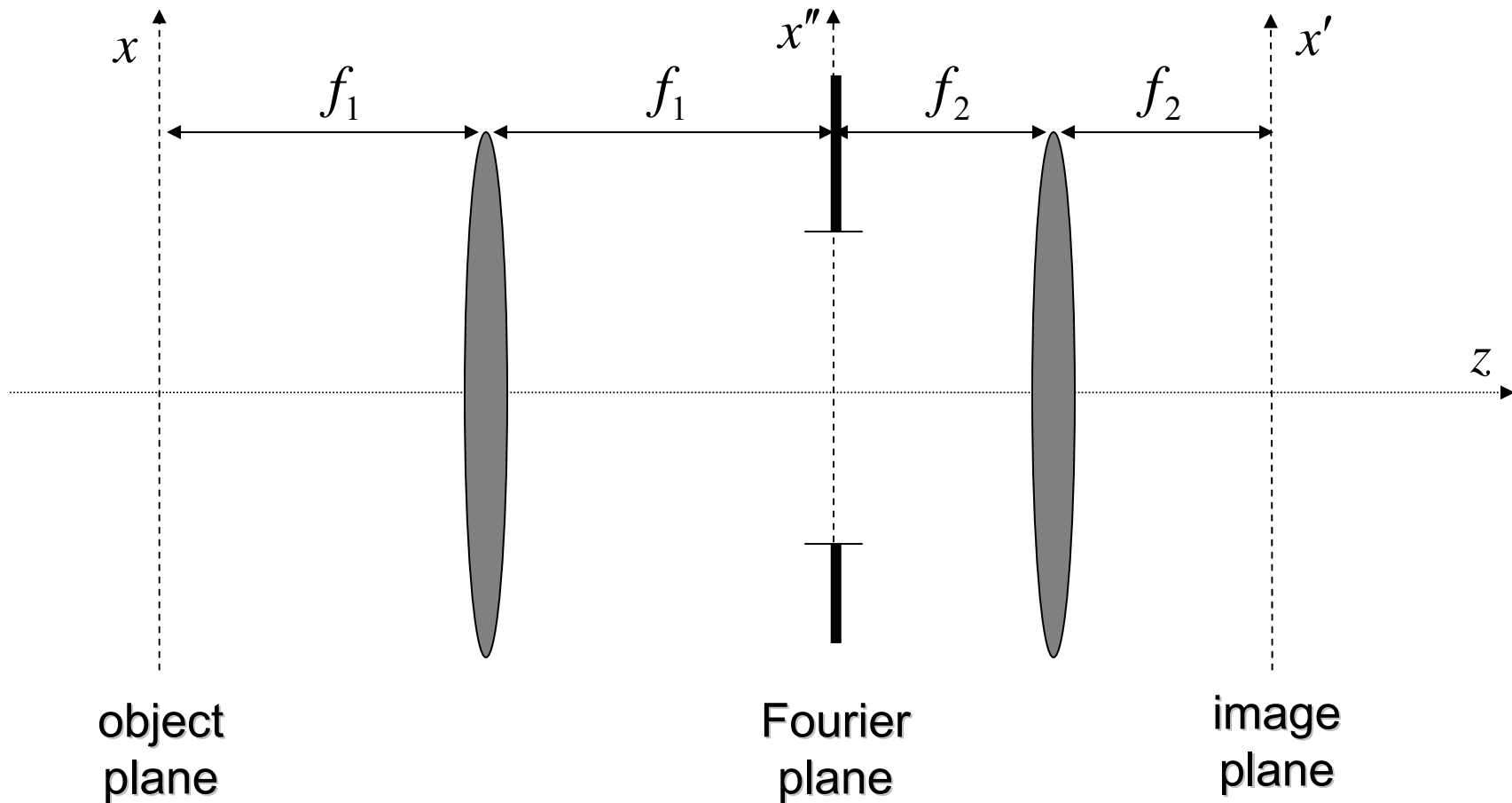


Intensity distribution near the focus of an ideal lens

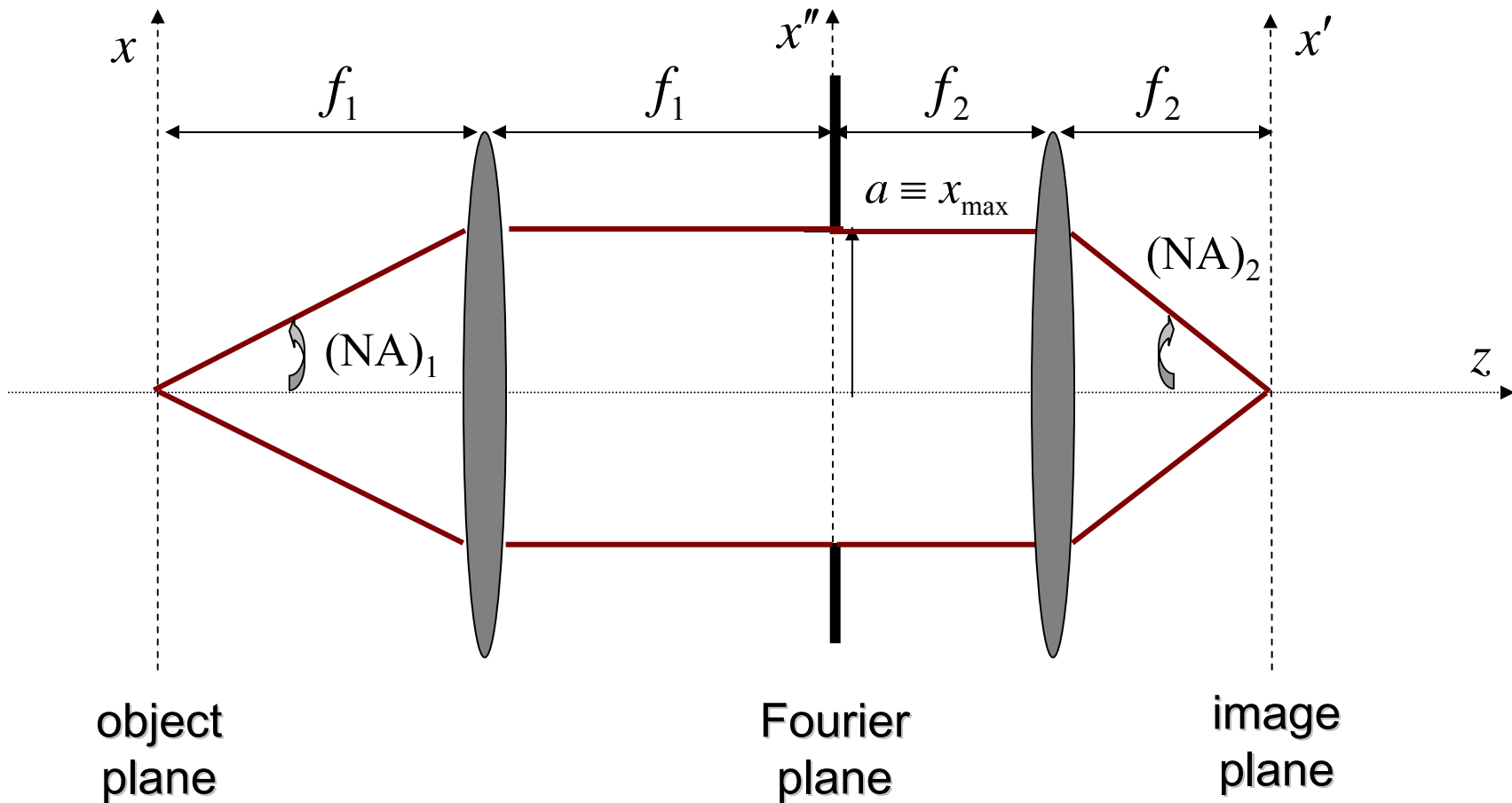
(rotationally symmetric wrt z axis)



Back to the basics: 4F system



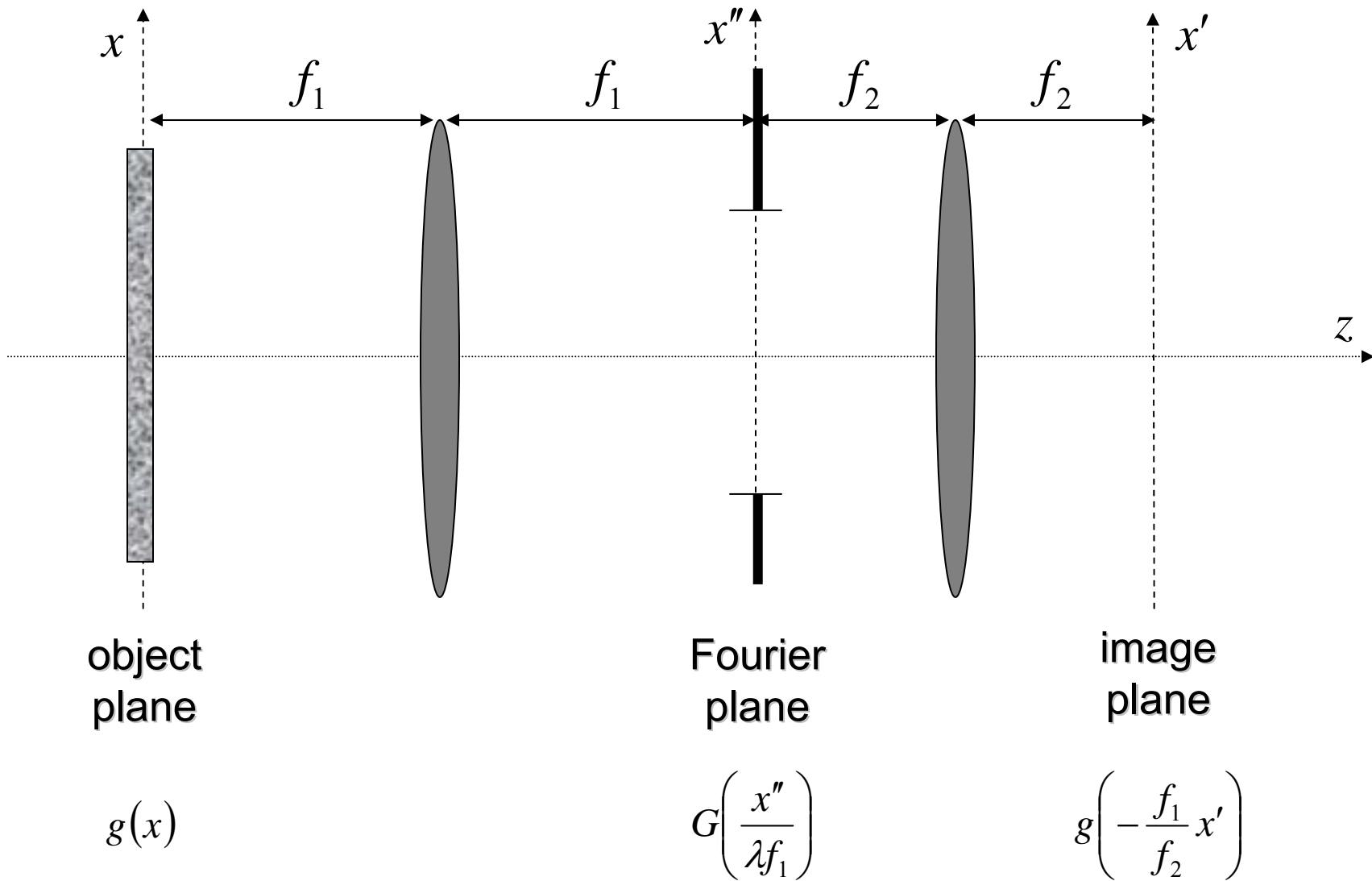
Back to the basics: 4F system



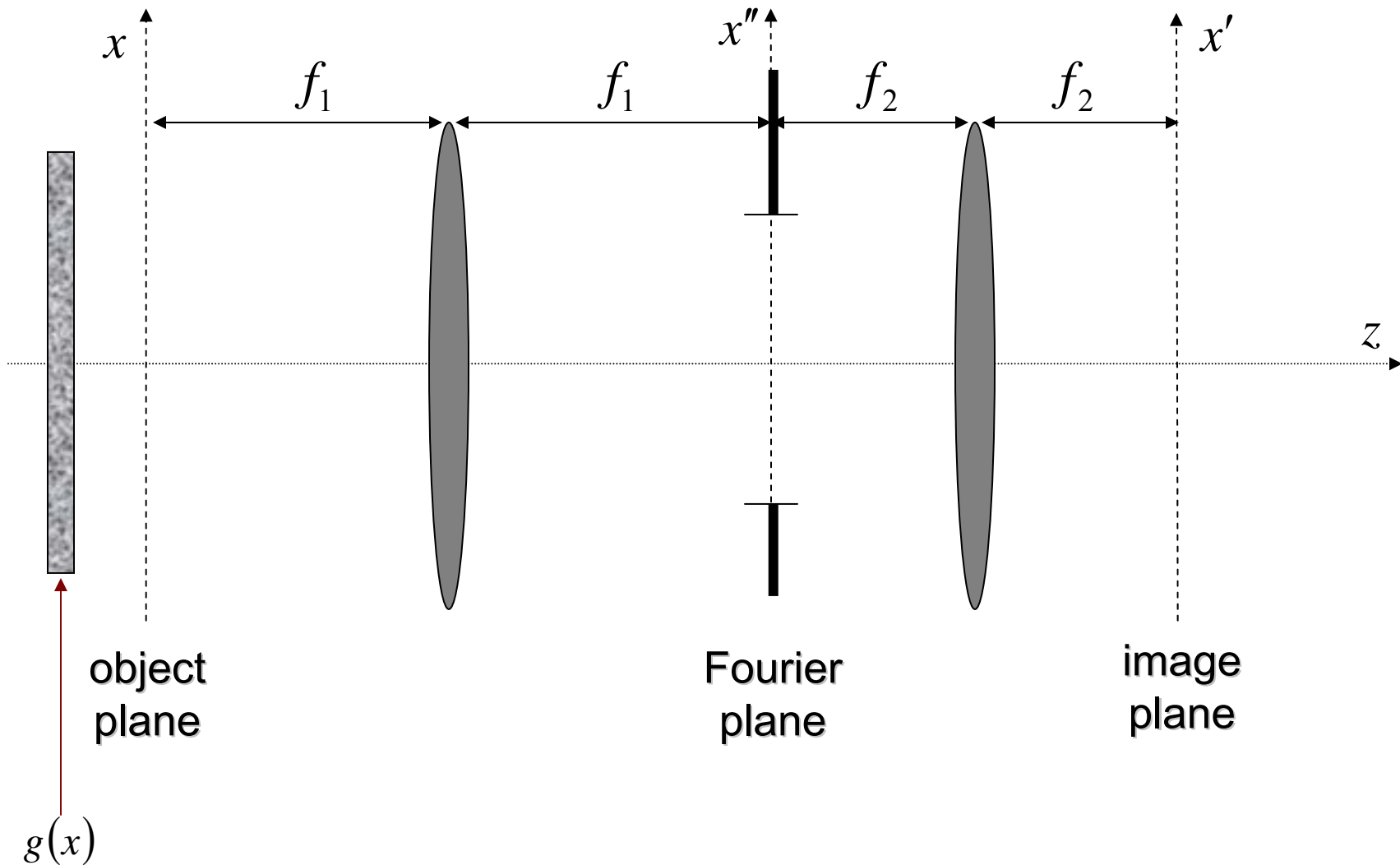
$$(NA)_1 = \frac{x_{\max}}{f_1}$$

$$(NA)_2 = \frac{x_{\max}}{f_2}$$

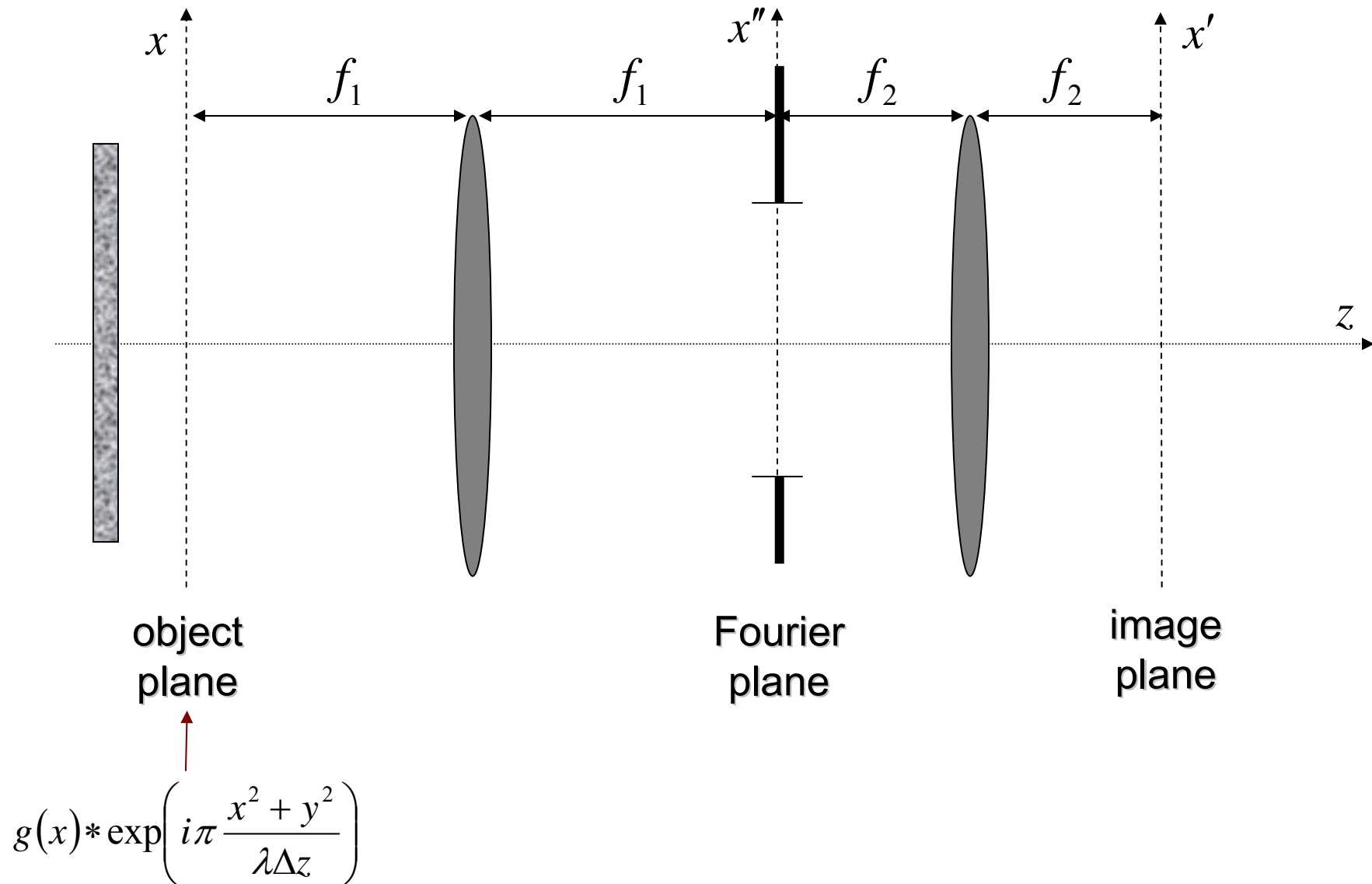
Back to the basics: 4F system



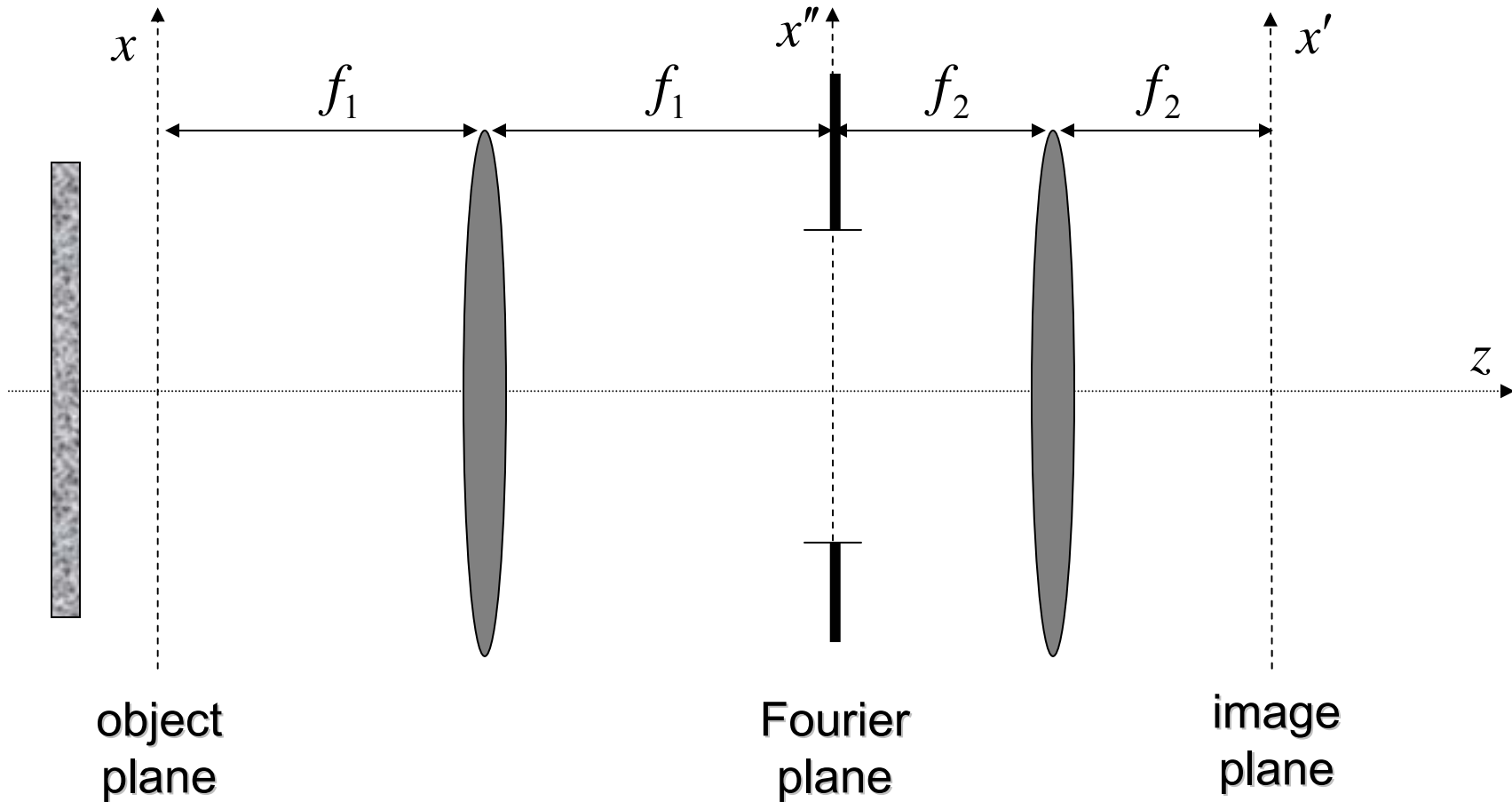
4F system with defocused input



4F system with defocused input

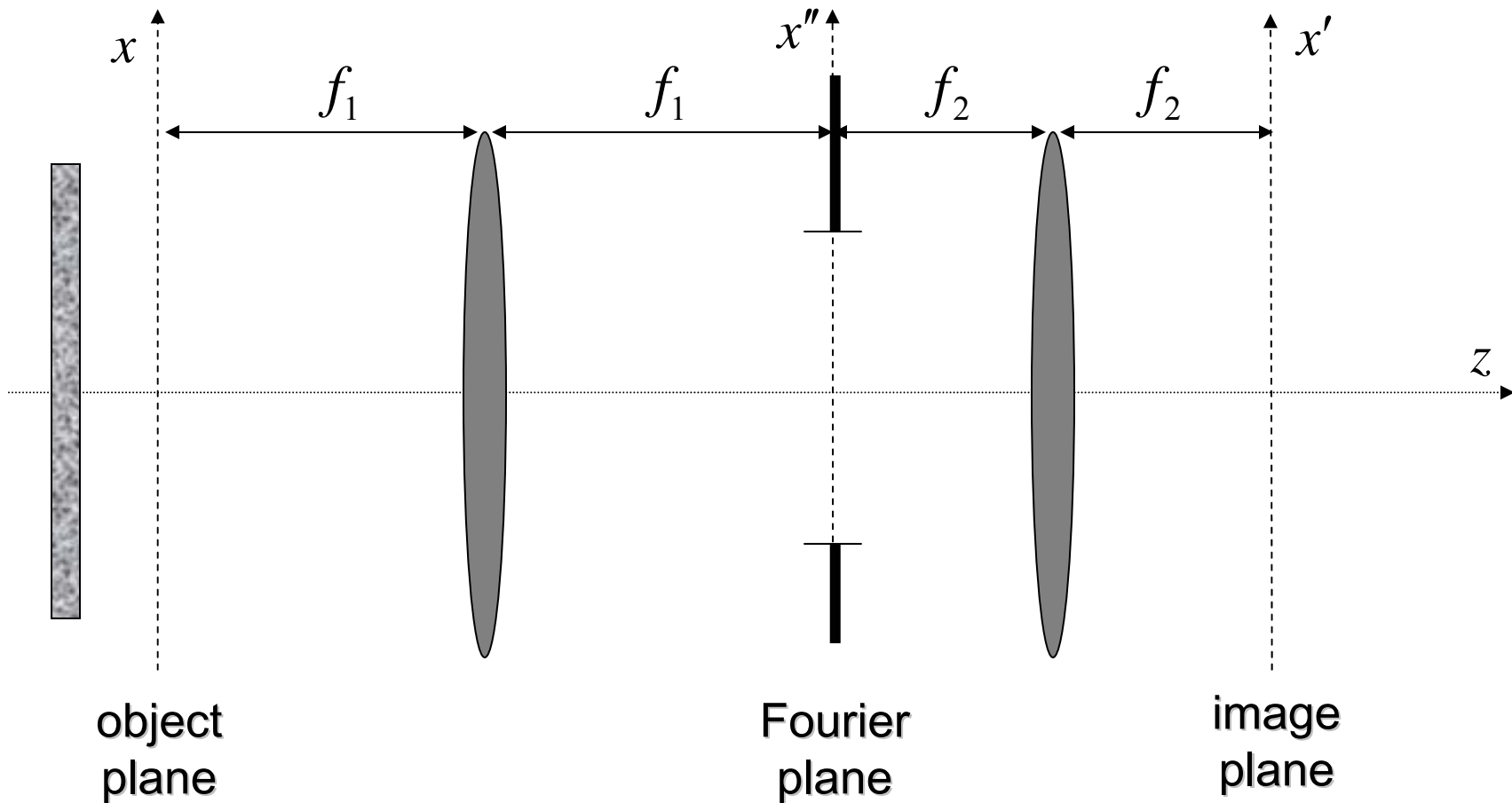


4F system with defocused input



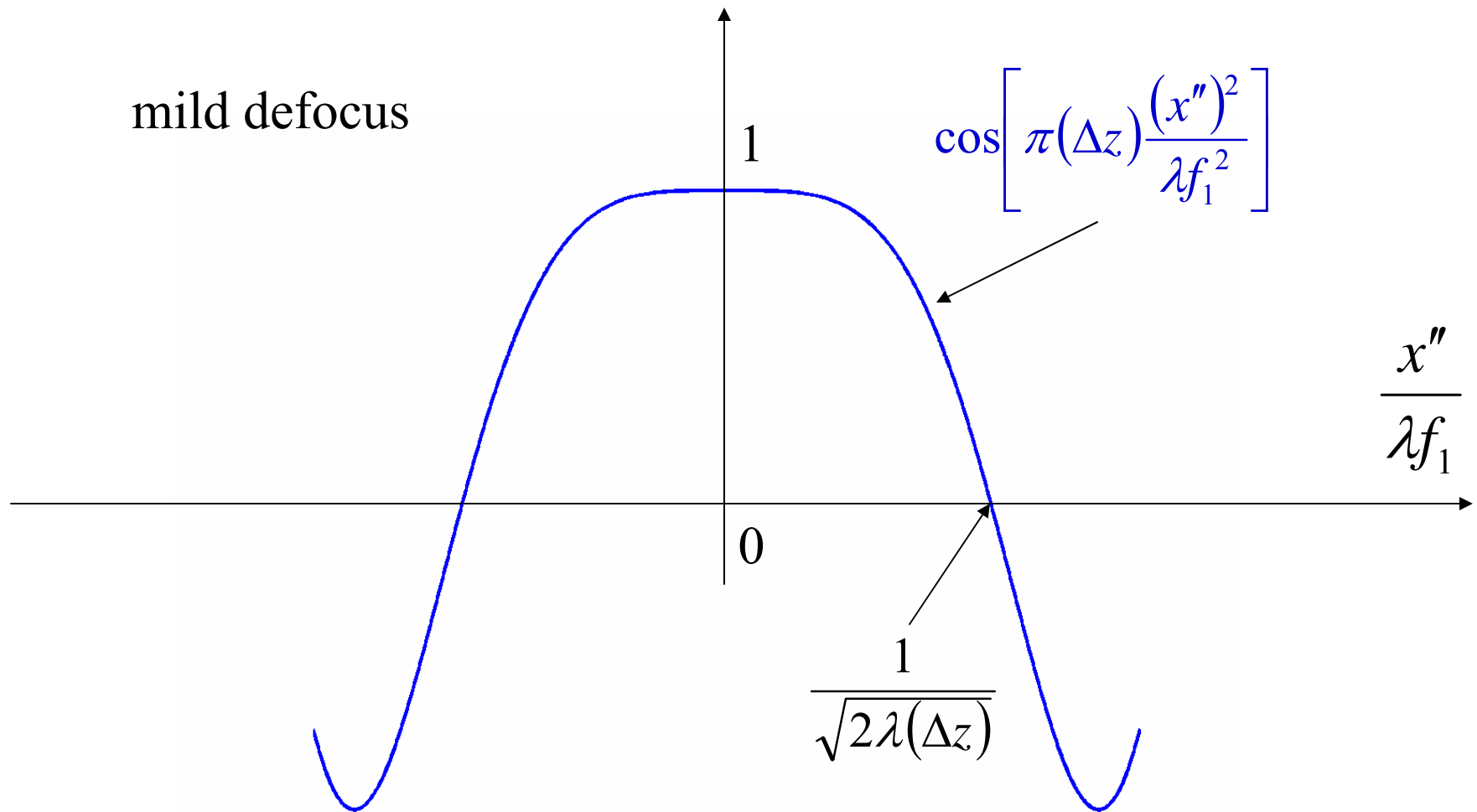
$$g(x) * \exp\left(i\pi \frac{x^2}{\lambda \Delta z}\right) \xrightarrow{\mathfrak{F}} G\left(\frac{x''}{\lambda f_1}\right) \cdot \exp\left[i\pi(\lambda \Delta z) \left(\frac{x''}{\lambda f_1}\right)^2\right]$$

4F system with defocused input

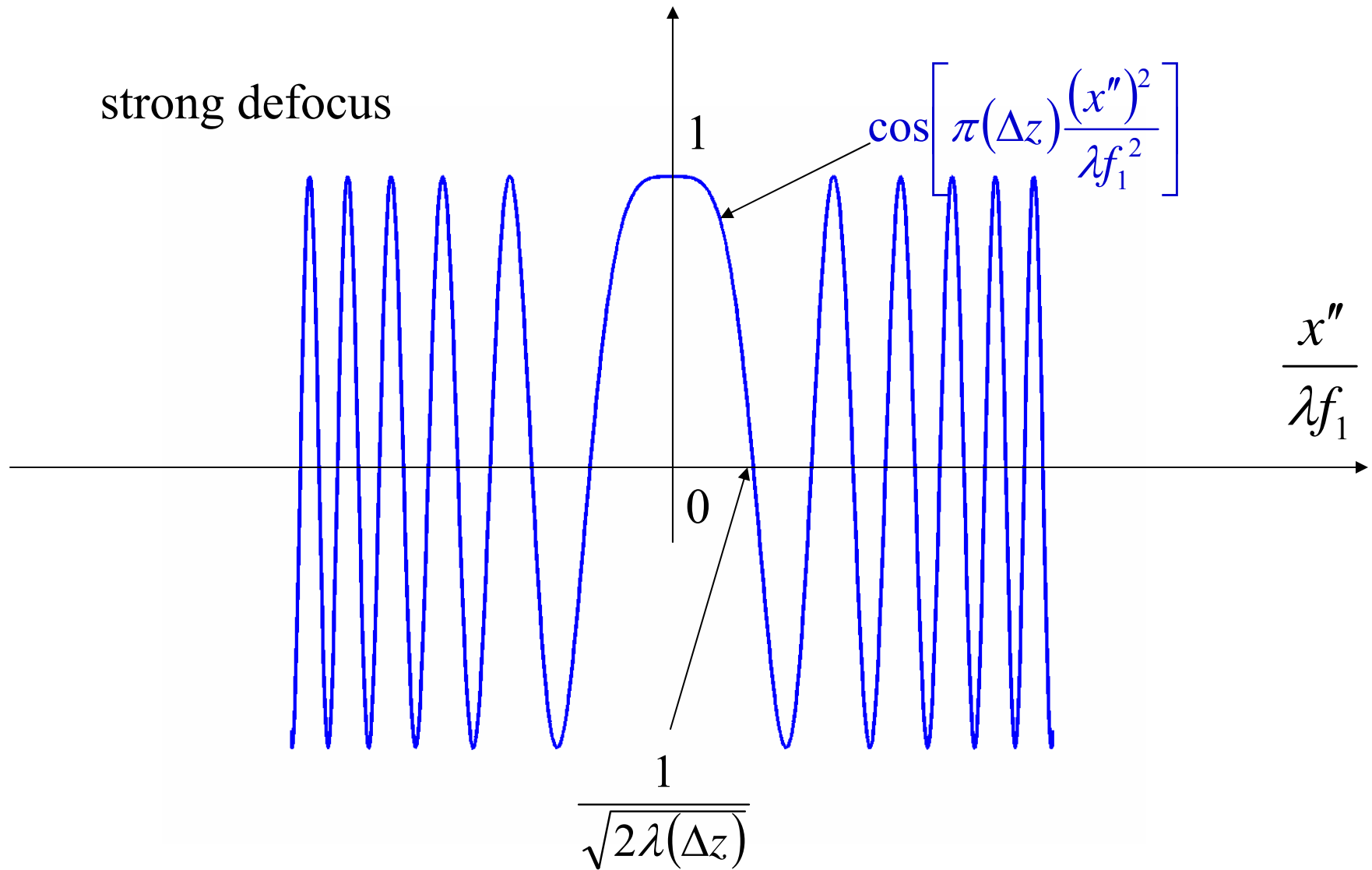


$$g(x) * \exp\left(i\pi \frac{x^2}{\lambda \Delta z}\right) \xrightarrow{\mathfrak{F}} G\left(\frac{x''}{\lambda f_1}\right) \cdot \exp\left[i\pi(\Delta z) \frac{(x'')^2}{\lambda f_1^2}\right]$$

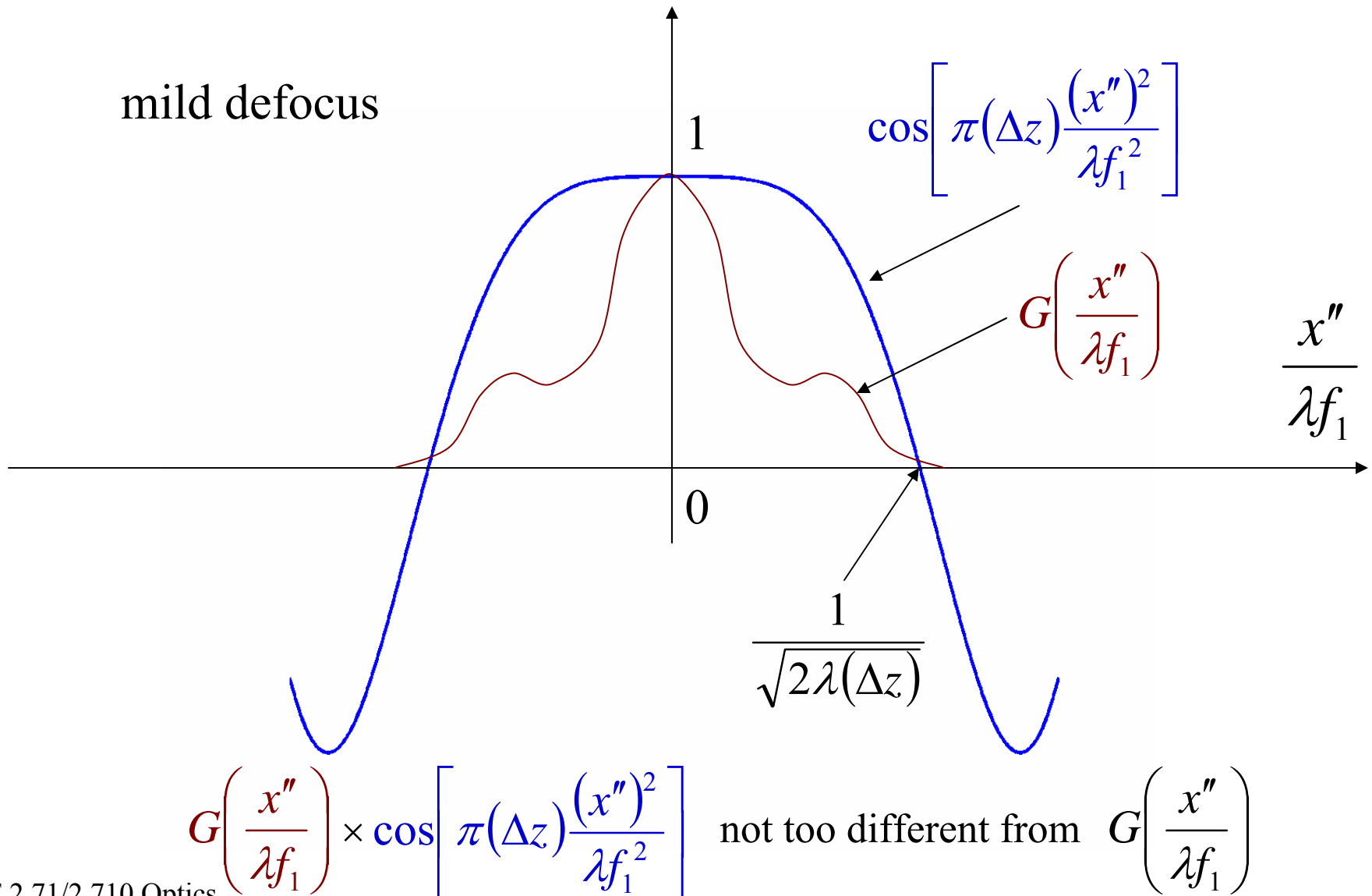
Effect of defocus on the Fourier plane



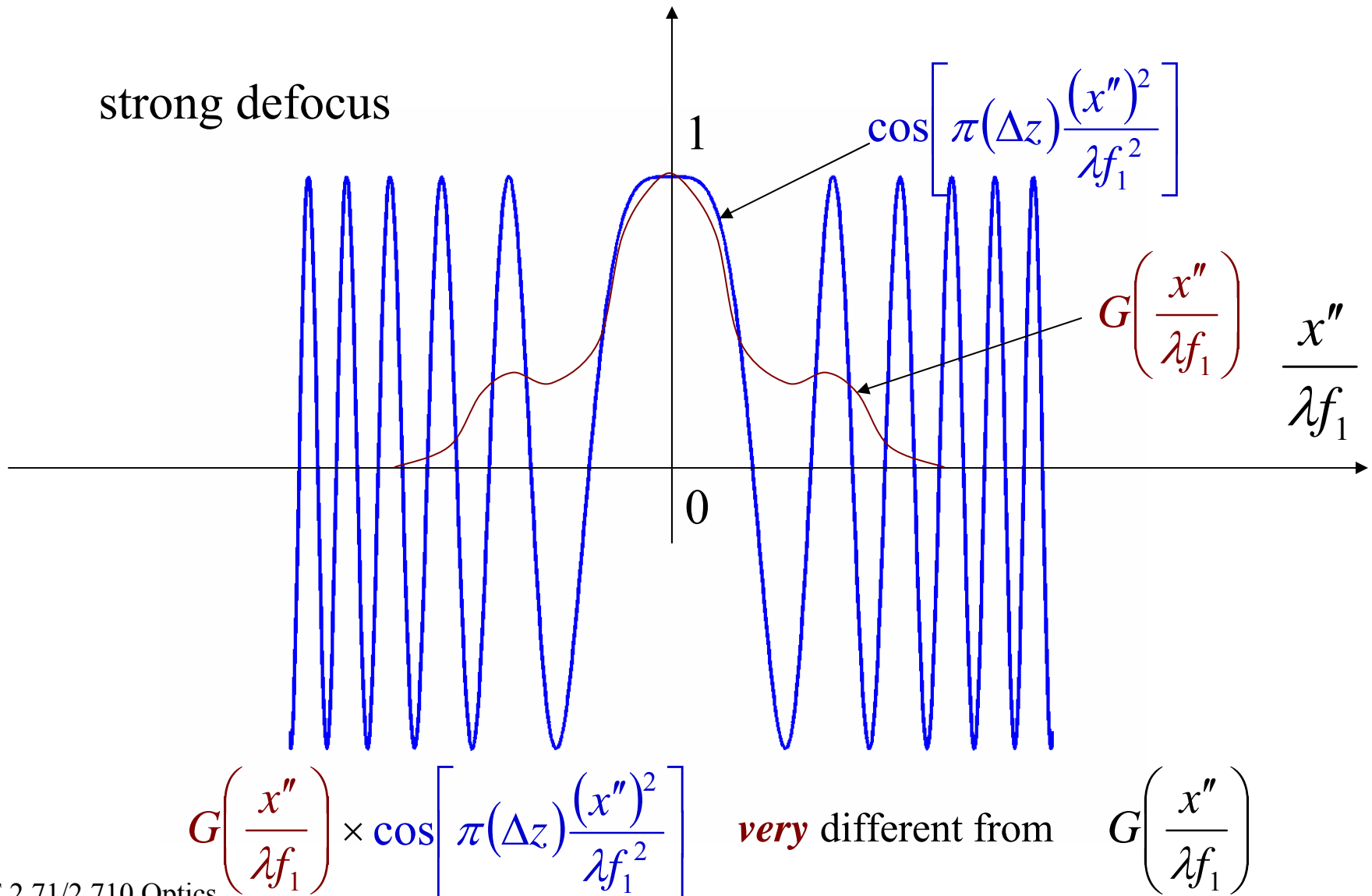
Effect of defocus on the Fourier plane



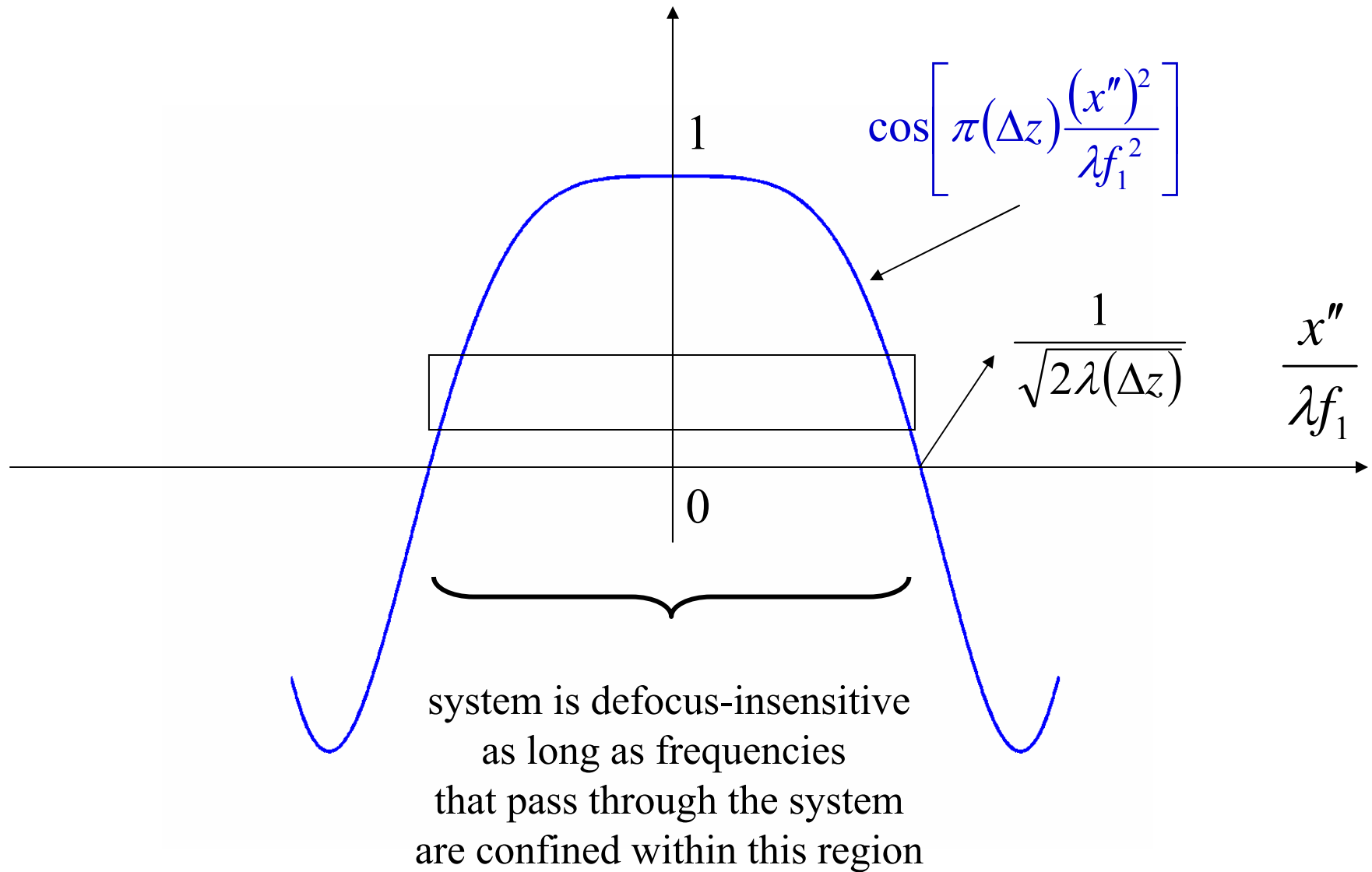
Effect of defocus on the Fourier plane



Effect of defocus on the Fourier plane



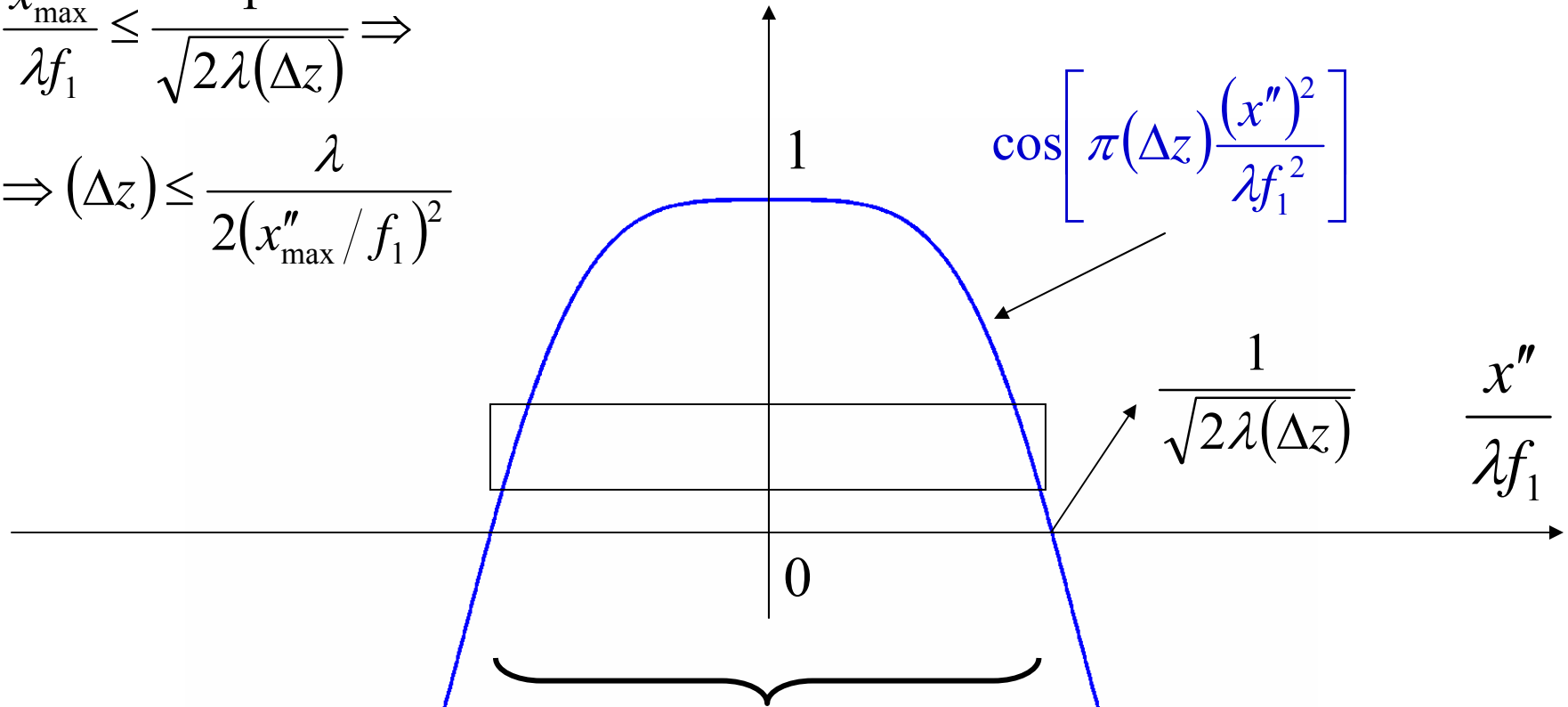
Depth of field



Depth of field

$$\frac{x''_{\max}}{\lambda f_1} \leq \frac{1}{\sqrt{2\lambda(\Delta z)}} \Rightarrow$$

$$\Rightarrow (\Delta z) \leq \frac{\lambda}{2(x''_{\max}/f_1)^2}$$



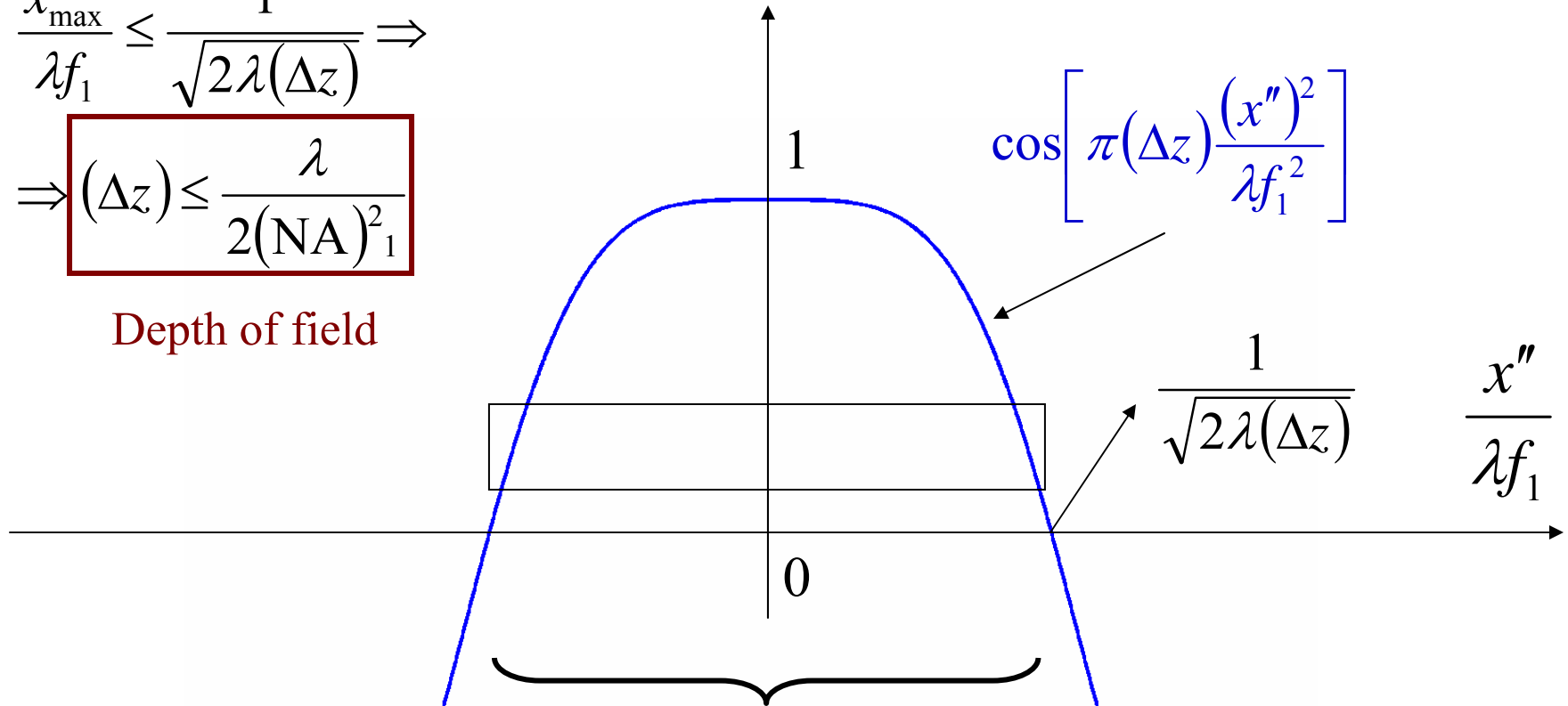
system is defocus-insensitive
as long as frequencies
that pass through the system
are confined within this region

Depth of field

$$\frac{x''_{\max}}{\lambda f_1} \leq \frac{1}{\sqrt{2\lambda(\Delta z)}} \Rightarrow$$

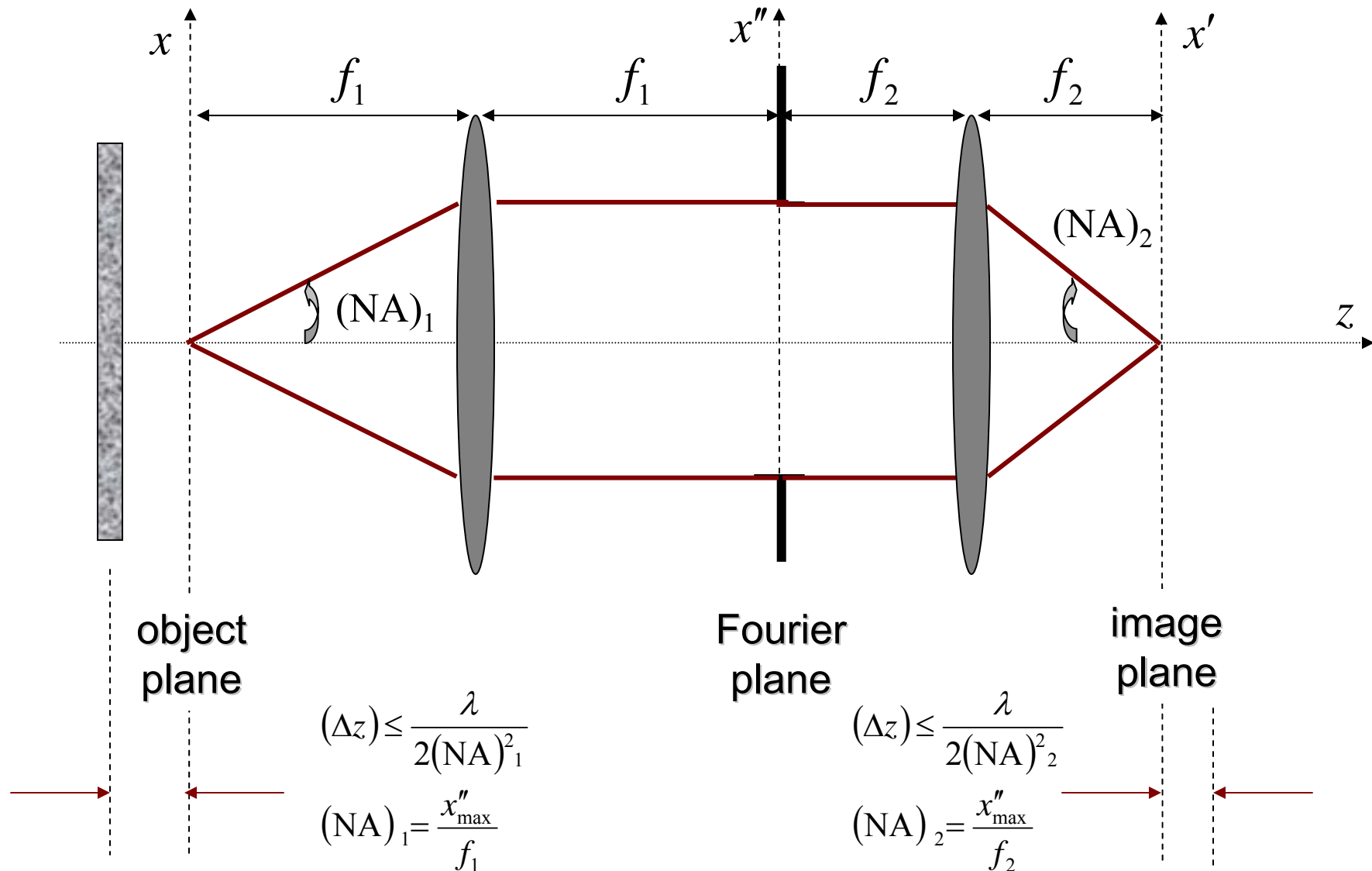
$$\Rightarrow (\Delta z) \leq \frac{\lambda}{2(\text{NA})^2_1}$$

Depth of field



system is defocus-insensitive
as long as (Δz) is small enough that
frequencies that pass through the system
can be confined within this region

Depth of field & Depth of focus



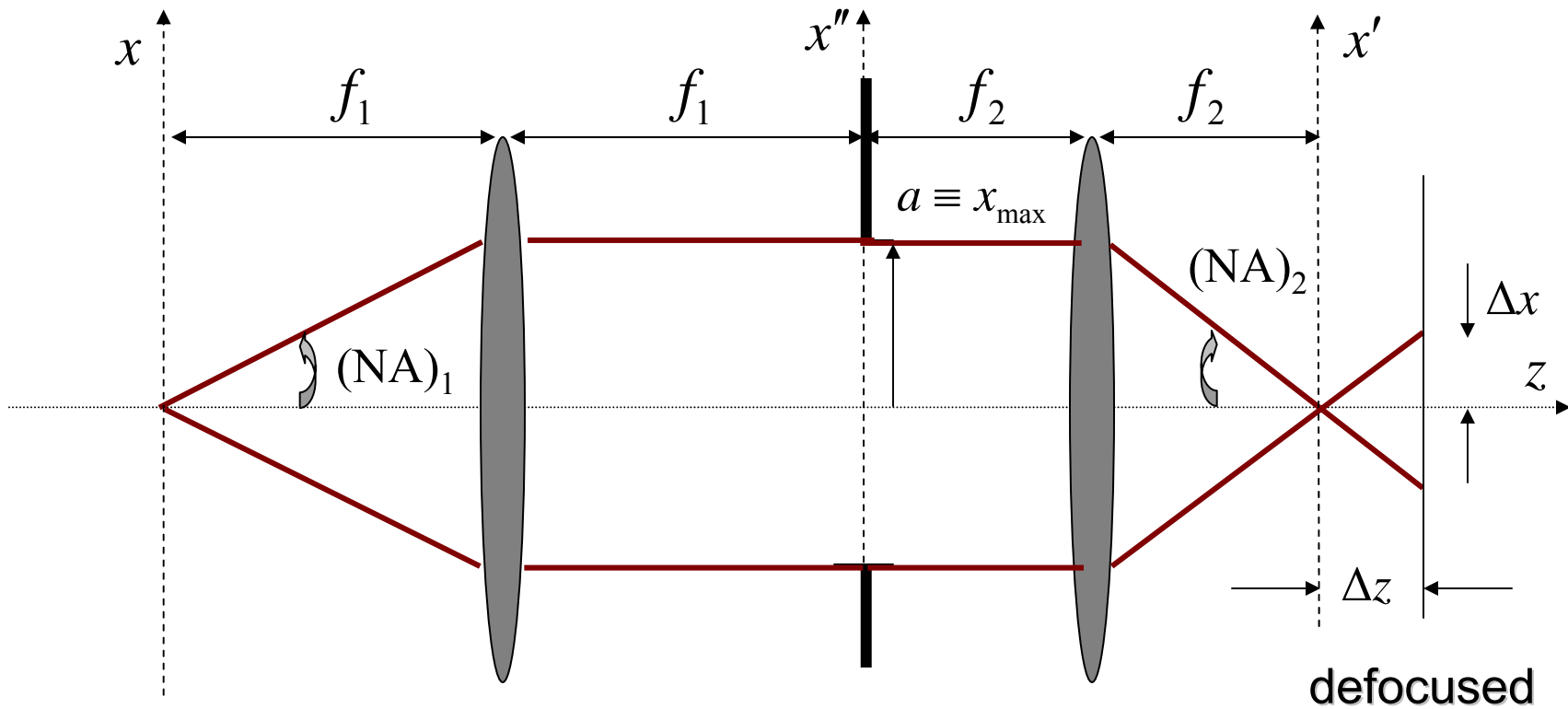
Depth of field

Depth of focus

NA trade – offs

- high NA
 - narrow PSF in the lateral direction (PSF width $\sim 1/\text{NA}$)
 - sharp lateral features
 - narrow PSF in longitudinal direction (PSF depth $\sim 1/\text{NA}^2$)
 - poor depth of field
- low NA
 - broad PSF in the lateral direction (PSF width $\sim 1/\text{NA}$)
 - blurred lateral features
 - broad PSF in longitudinal direction (PSF depth $\sim 1/\text{NA}^2$)
 - good depth of field

Depth of focus: Geometrical Optics viewpoint



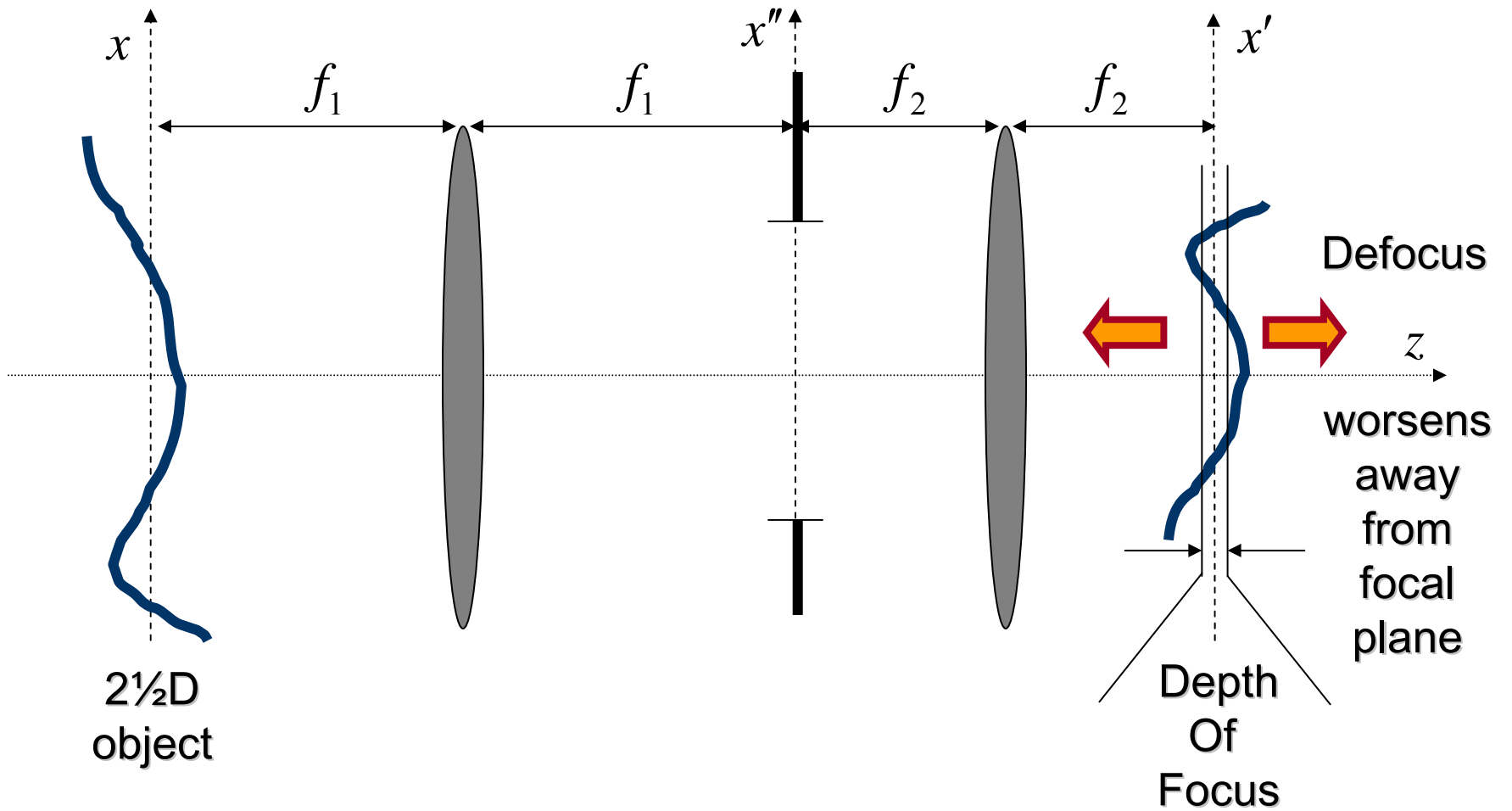
From similar triangles:
$$\Delta z = \frac{\Delta x}{(NA)_2}$$

Now require defocused spot \approx diffraction spot:
$$\Delta x \approx 0.61 \frac{\lambda}{(NA)_2}$$

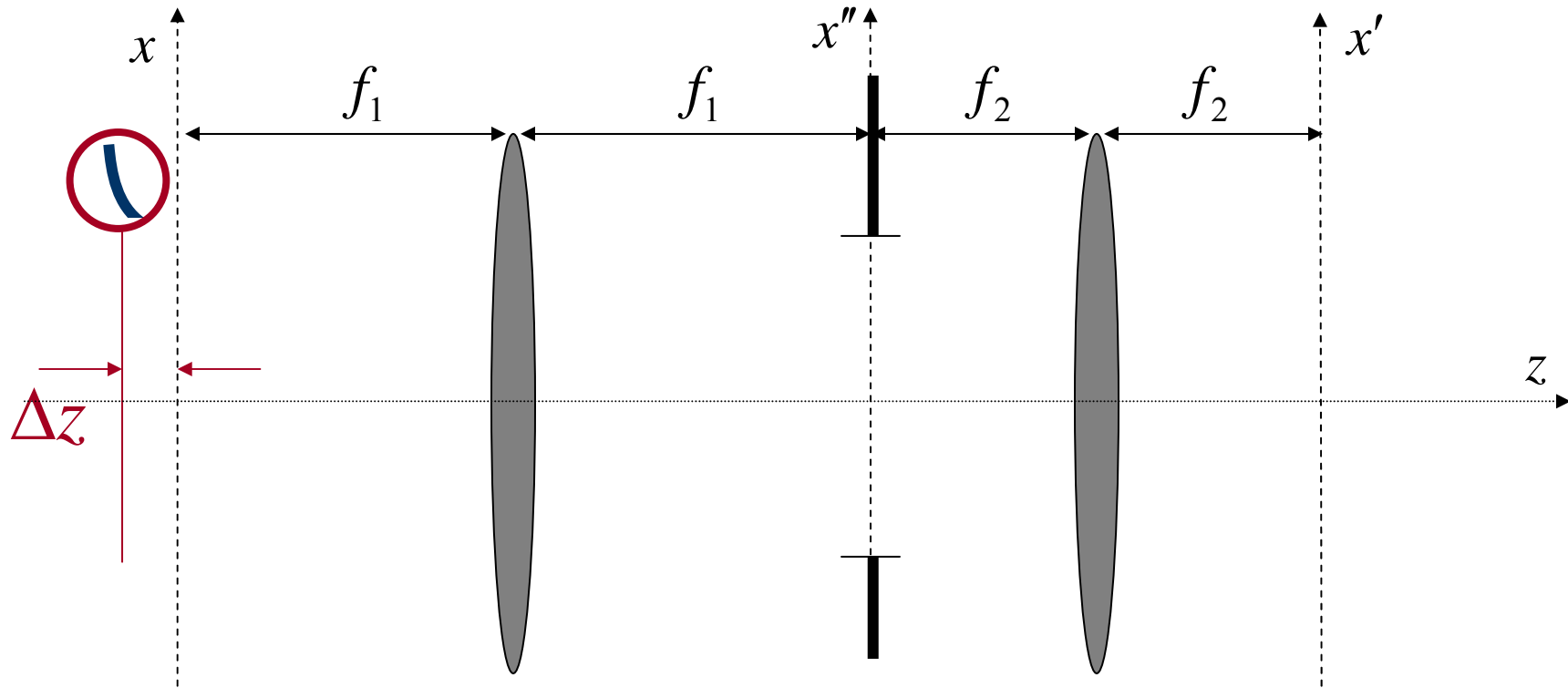
Therefore:
$$\Delta z \approx 0.61 \frac{\lambda}{(NA)_2^2}$$

Defocus and Deconvolution (Inverse filters)

Imaging a 2½D object

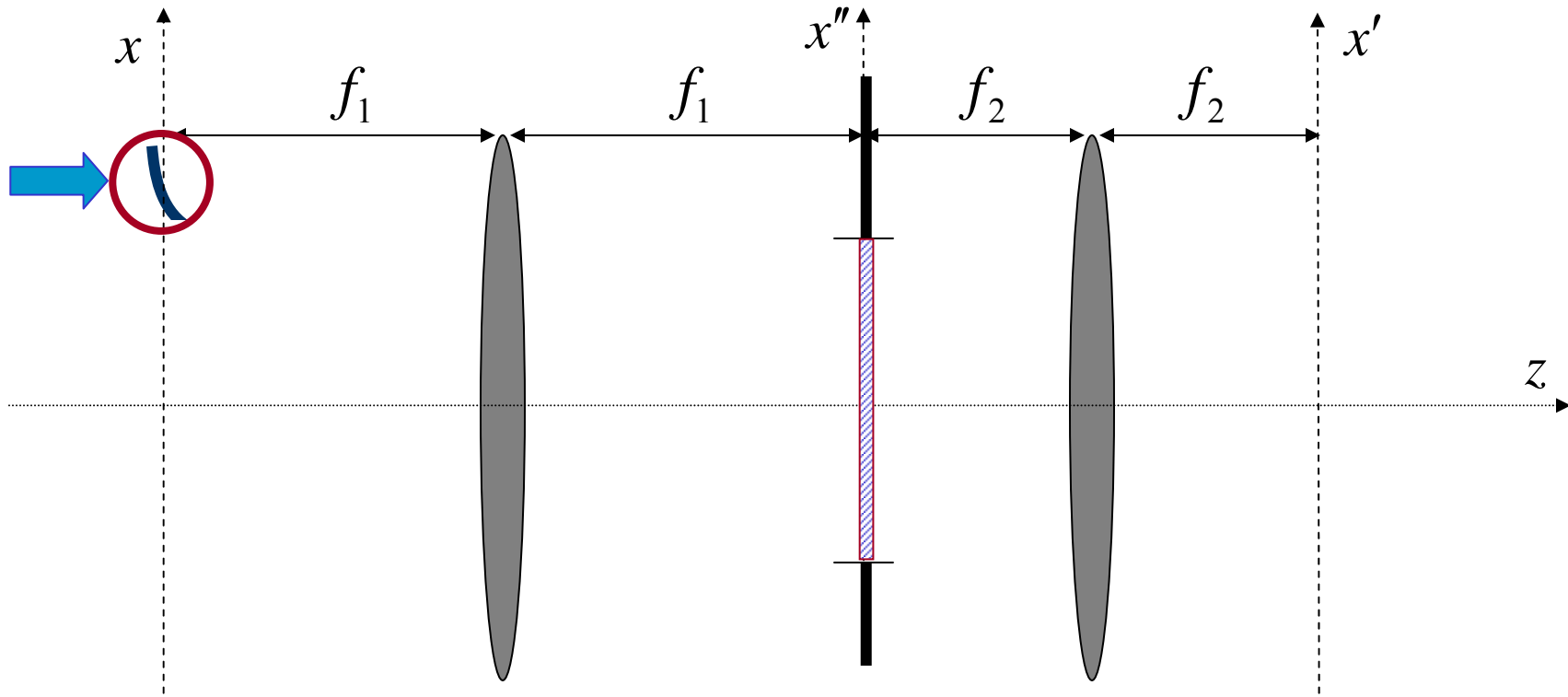


Imaging a 2^{1/2}D object



portion of object
defocused by Δz

Imaging a 2^{1/2}D object



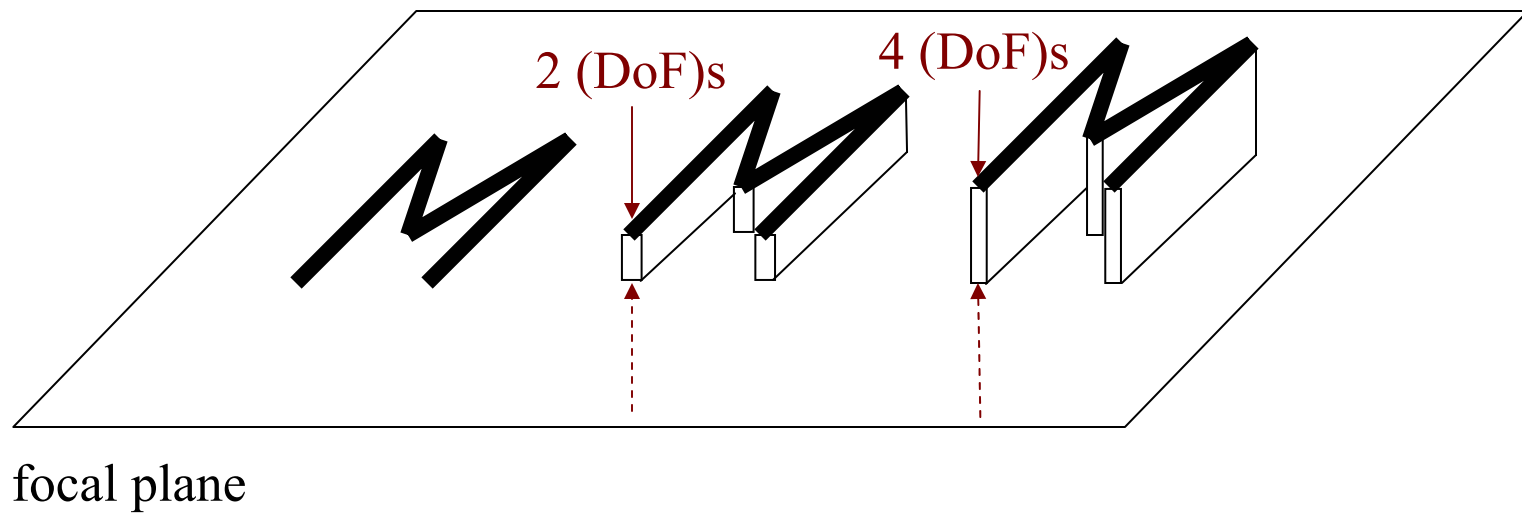
... is equivalent to same portion *in-focus* PLUS ...

... fictitious quadratic
phase mask
on the Fourier plane

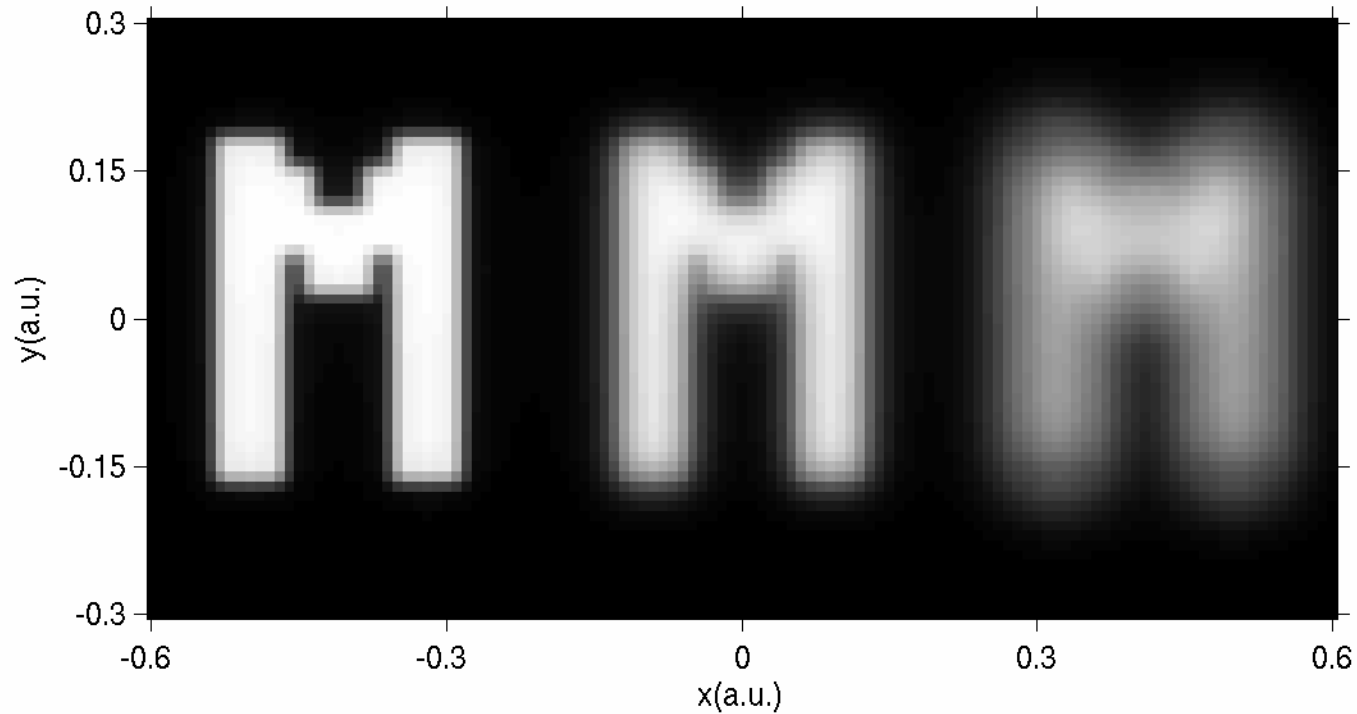
$$\exp\left\{-i2\pi\frac{(x''^2 + y''^2)\Delta z}{\lambda f_1^2}\right\}$$

(applied
locally)

Example



Raw image (collected by camera – noise-free)

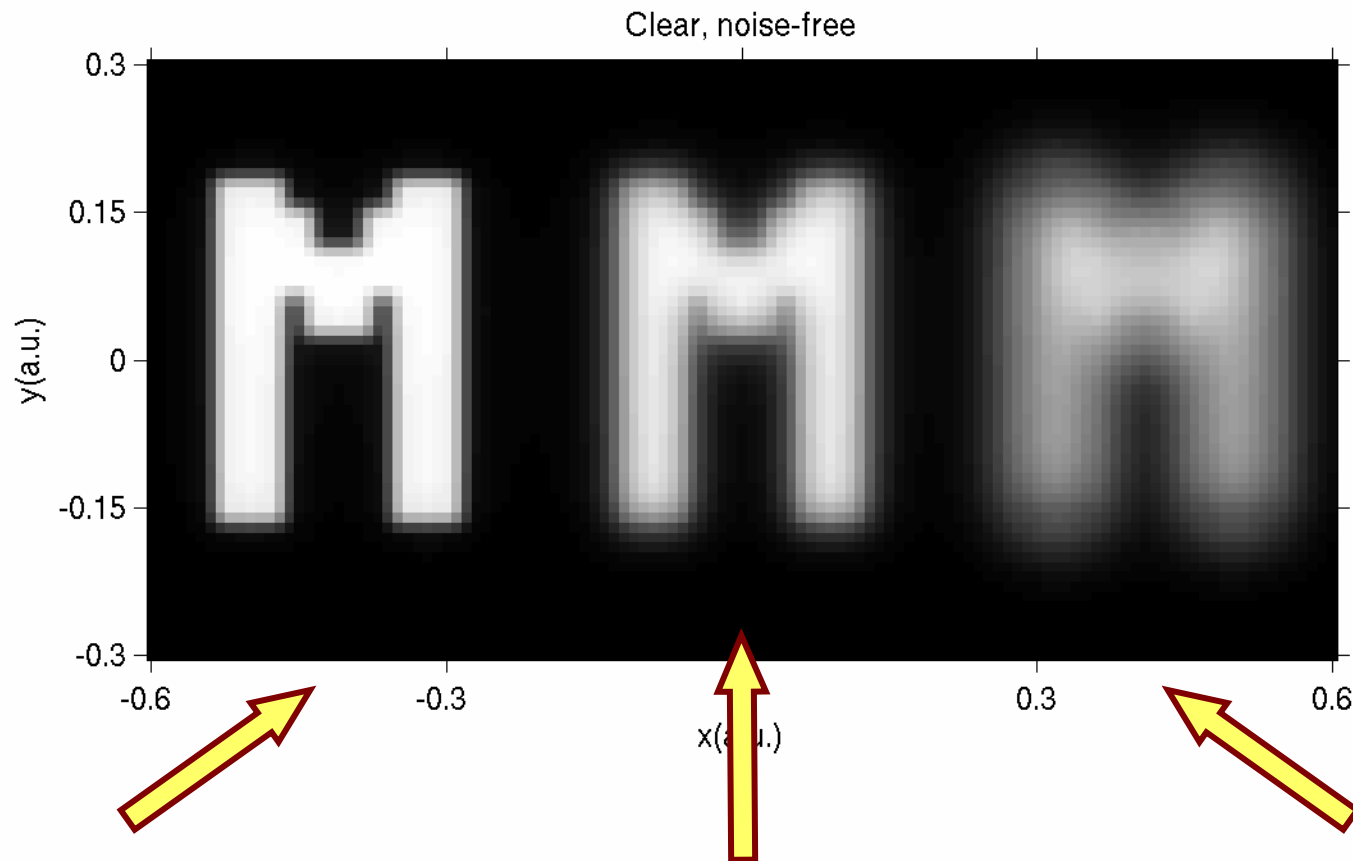


Distance between planes ≈ 2 Depths of Field

left-most “M” : image blurred by diffraction only

center and right-most “M”s : image blurred by diffraction and defocus

Raw image explanation: *convolution*

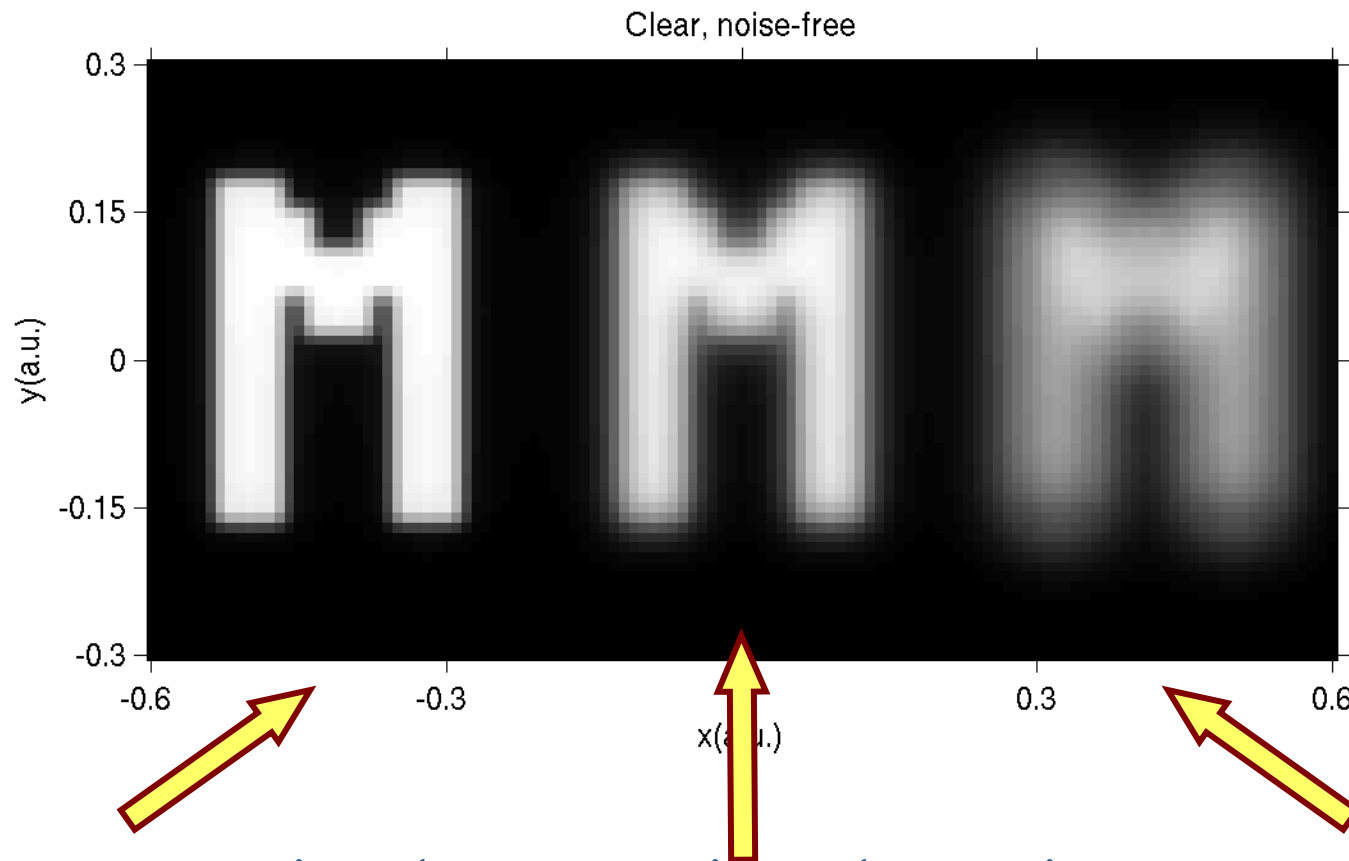


“M” convolved
with standard
diffraction PSF

“M” convolved
with diffraction PSF
and defocus

“M” convolved
with diffraction PSF
and more defocus

Raw image explanation: *Fourier domain*



in the Fourier domain ...

$$\mathfrak{F}\{\text{"M"}\} \times H_{\text{diffraction}}$$

$$\mathfrak{F}\{\text{"M"}\} \times H_{\text{diffraction}}$$

$$\mathfrak{F}\{\text{"M"}\} \times H_{\text{diffraction}}$$

$$\times H_{\text{defocus}} (2\text{DoF})$$

$$\times H_{\text{defocus}} (4\text{DoF})$$

Can diffraction and defocus be “undone” ?

- Effect of optical system (expressed in the Fourier plane):

$$\mathfrak{F}\{ "M" \} \times H_{\text{system}} \quad \text{where} \quad H_{\text{system}} = H_{\text{diffraction}} \times H_{\text{defocus}}$$

- To undo the optical effect, multiply by the “inverse transfer function”

$$\left(\mathfrak{F}\{ "M" \} \times H_{\text{system}} \right) \times \frac{1}{H_{\text{system}}} = \mathfrak{F}\{ "M" \} !!!$$

Can diffraction and defocus be “undone” ?

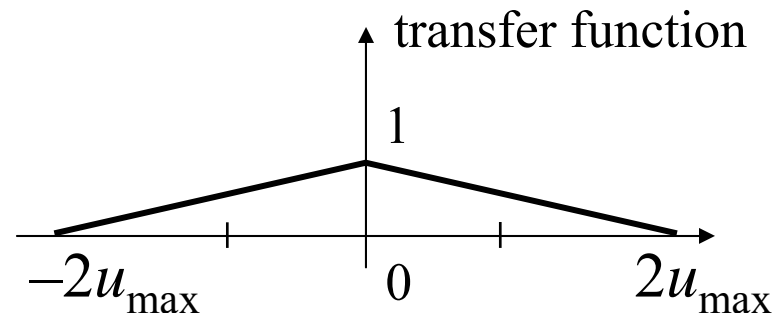
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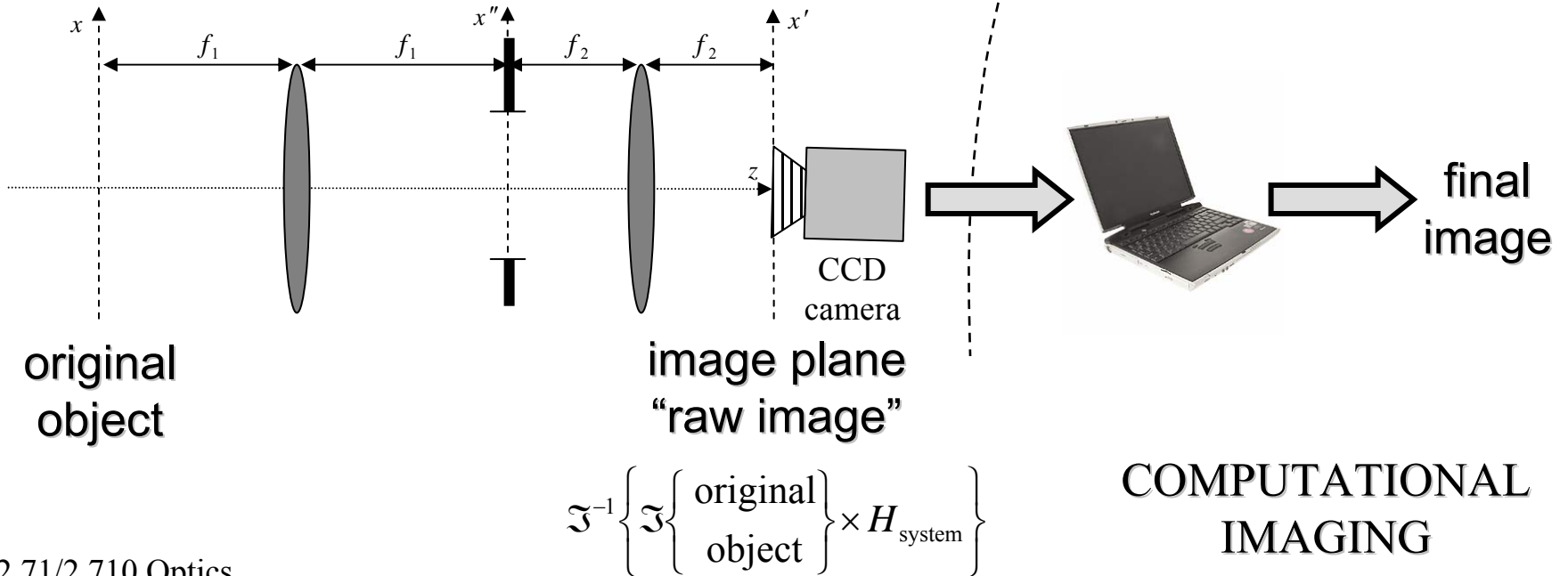
$$\left(\mathfrak{F}\{ "M" \} \times H_{\text{system}} \right) \times \frac{1}{H_{\text{system}}} = \mathfrak{F}\{ "M" \} !!!$$

- Problems
 - Transfer function goes to zero outside the system pass-band
 - Inverse transfer function will multiply the FT of the noise as well as the FT of the original signal



Solution: Tikhonov regularization

$$\mathfrak{F}\left\{\begin{matrix} \text{final} \\ \text{image} \end{matrix}\right\} = \underbrace{\left(\mathfrak{F}\left\{\begin{matrix} \text{original} \\ \text{object} \end{matrix}\right\} \times H_{\text{system}} \right)}_{\text{“raw image”} \\ \text{(formed by the optics)}} \times \underbrace{\frac{H_{\text{system}}^*}{\mu + |H_{\text{system}}|^2}}_{\text{post-processing} \\ \text{ (“inverse filter”)}}$$



On Tikhonov regularization

$$\mathfrak{F}\left\{\begin{array}{l} \text{final} \\ \text{image} \end{array}\right\} = \left(\mathfrak{F}\left\{\begin{array}{l} \text{original} \\ \text{object} \end{array}\right\} \times H_{\text{system}} \right) \times \frac{H_{\text{system}}^*}{\mu + |H_{\text{system}}|^2}$$

- μ is the “regularizer” or “regularization parameter”
- choice of μ : depends on the noise and signal energy
- for Gaussian noise *and* image statistics, optimum μ is

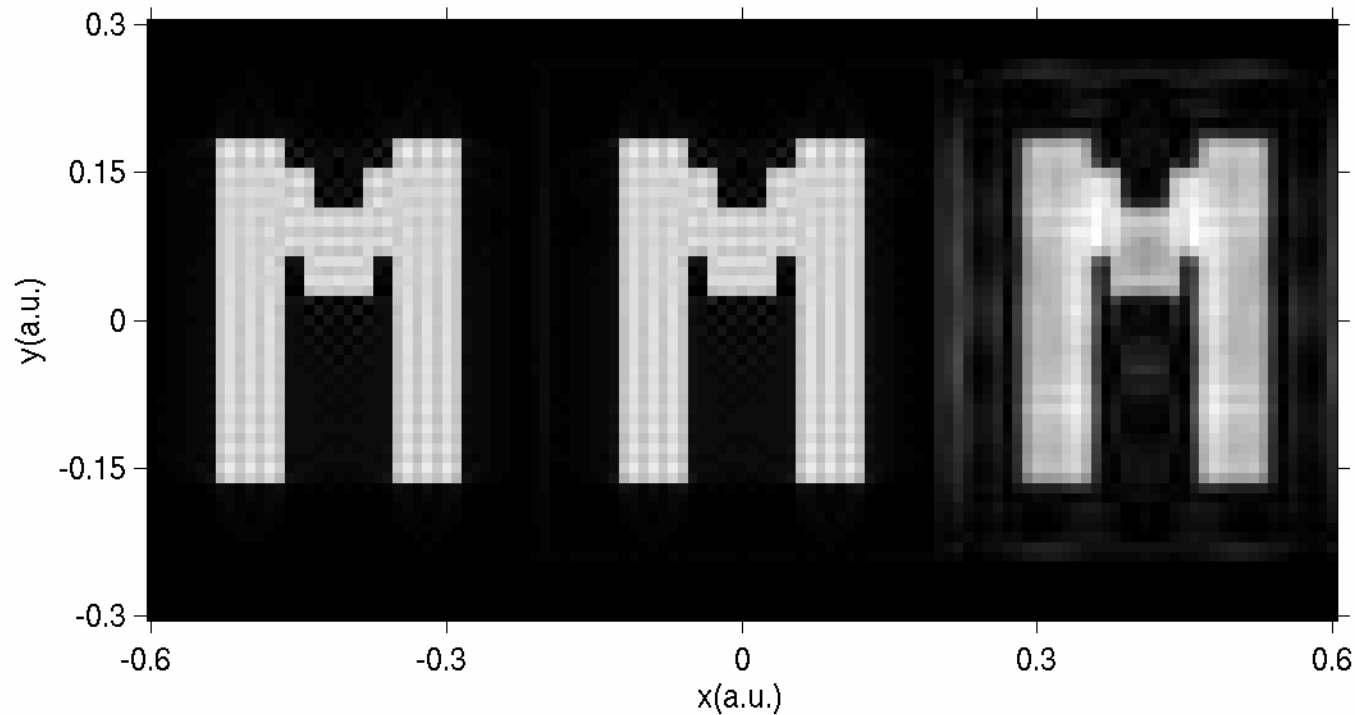
$$\mu_{\text{optimum}} = \frac{1}{\text{SNR}_{\text{power}}}$$

“Wiener filter”

- More generally, the optimal inverse filters are nonlinear and/or probabilistic (e.g. maximum likelihood inversion)
- For more details: 2.717

Deconvolution: diffraction *and* defocus

noise free

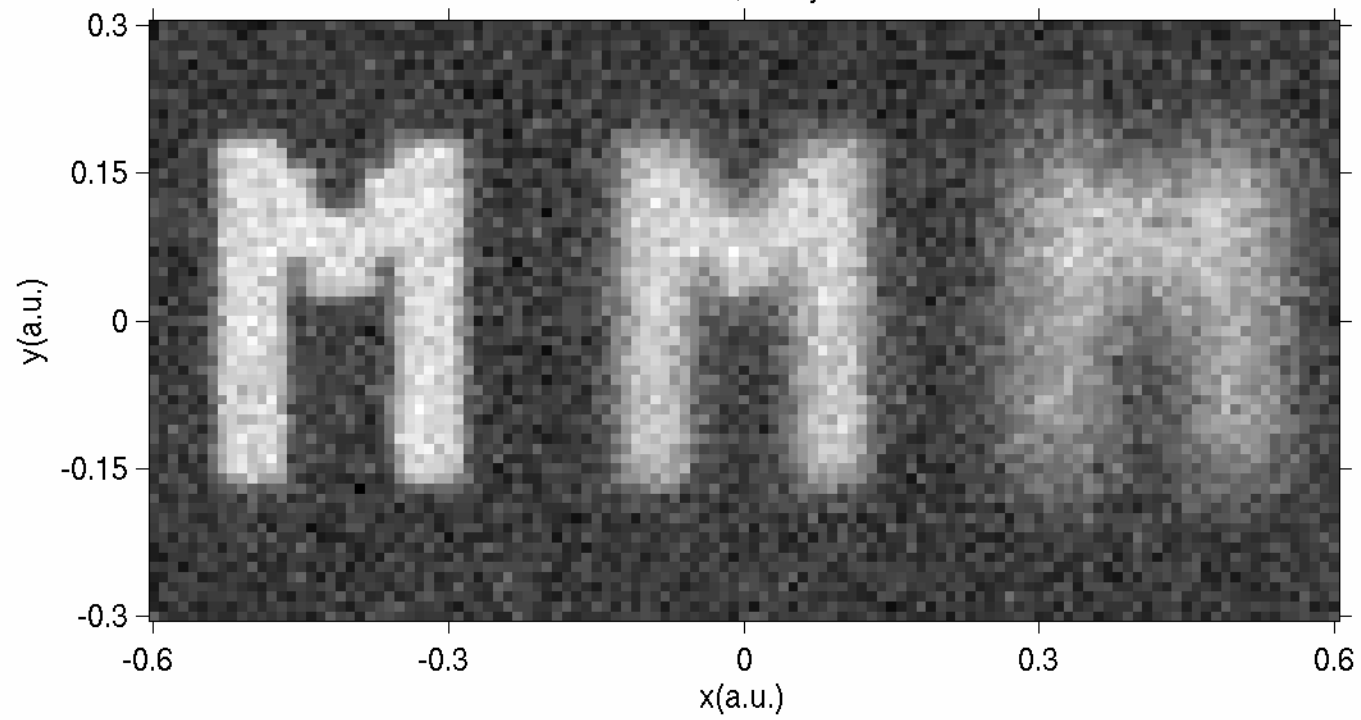


Deconvolution using Tikhonov regularized inverse filter
Utilized *a priori* knowledge of depth of each digit (alternatively,
needs depth-from defocus algorithm)

Artifacts due primarily to numerical errors getting amplified
by the inverse filter (despite regularization)

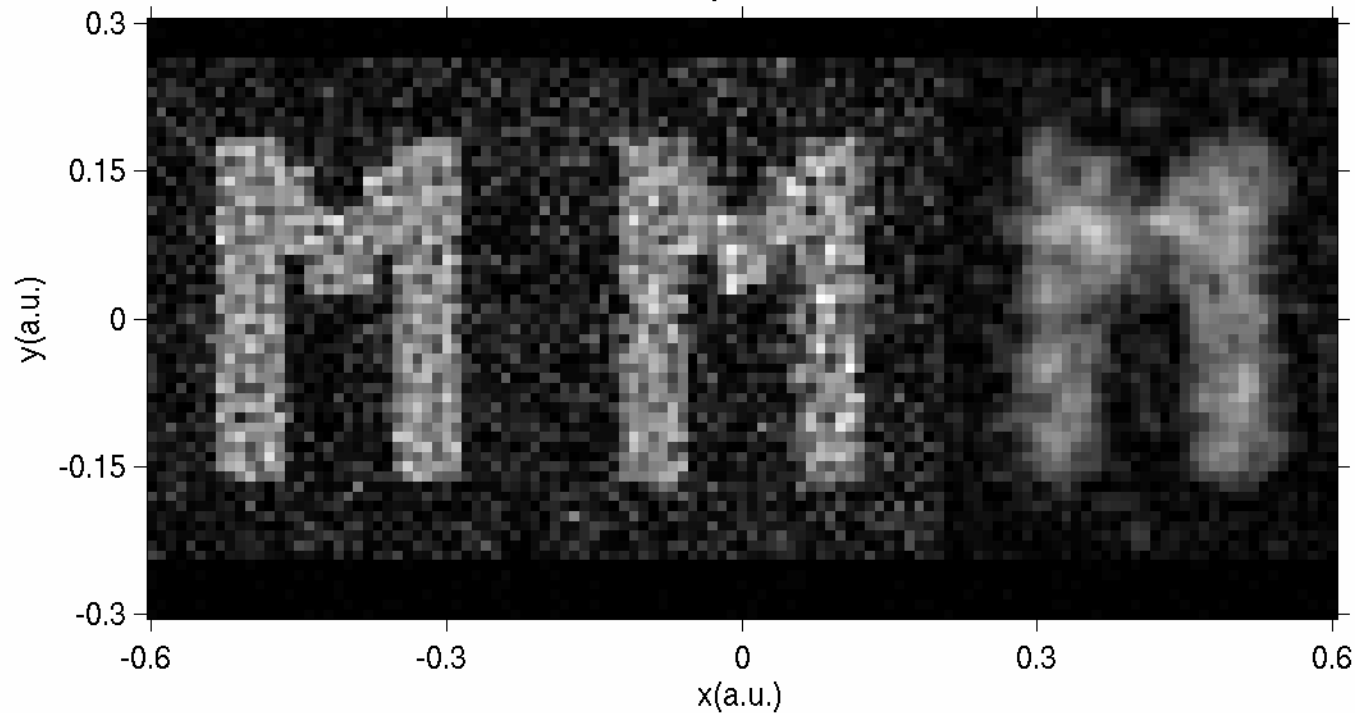
Noisy raw image

SNR=10



Deconvolution in the presence of noise

SNR=10



Deconvolution using Wiener filter (i.e. Tikhonov with $\mu=1/\text{SNR}$)

Noise is destructive away from focus (4DOFs)

Utilized *a priori* knowledge of depth of each digit

Artifacts due primarily to noise getting amplified by the inverse filter