

# Fast model of space-variant blurring and its application to deconvolution in astronomy

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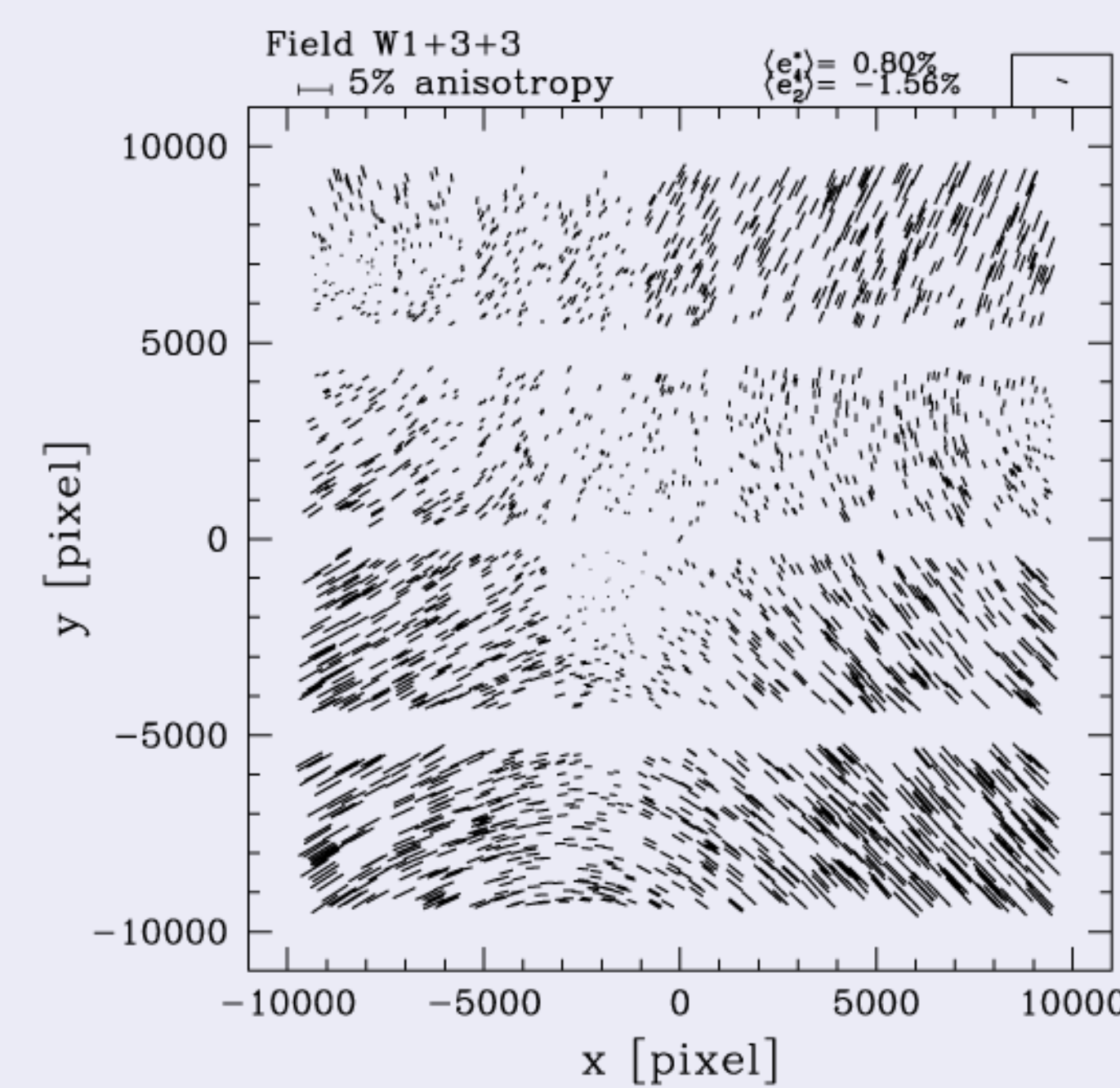
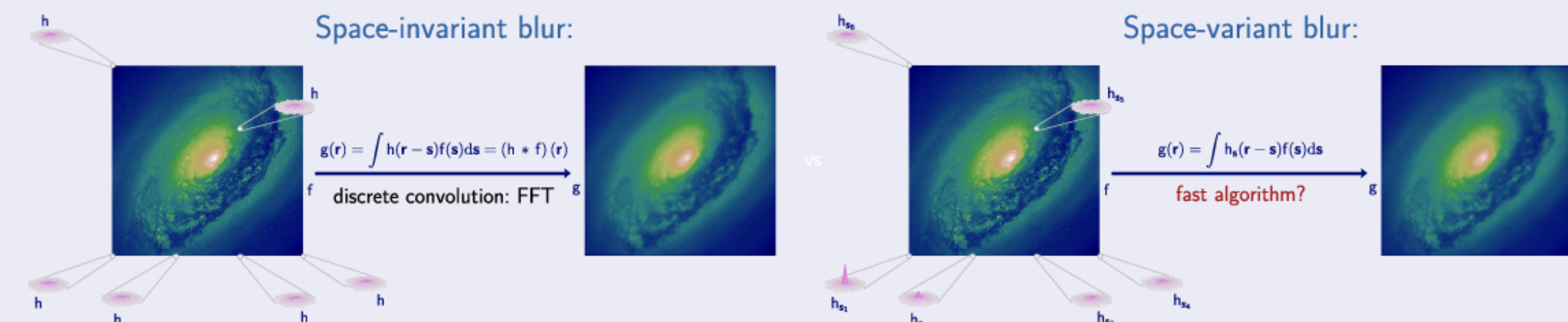
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## Rationale

In many applications, the point spread function (PSF) varies spatially. This is the case in wide-field imaging in astronomy, due to optical aberrations of the instrument, or imperfect correction of adaptive optics systems away from the reference stars.

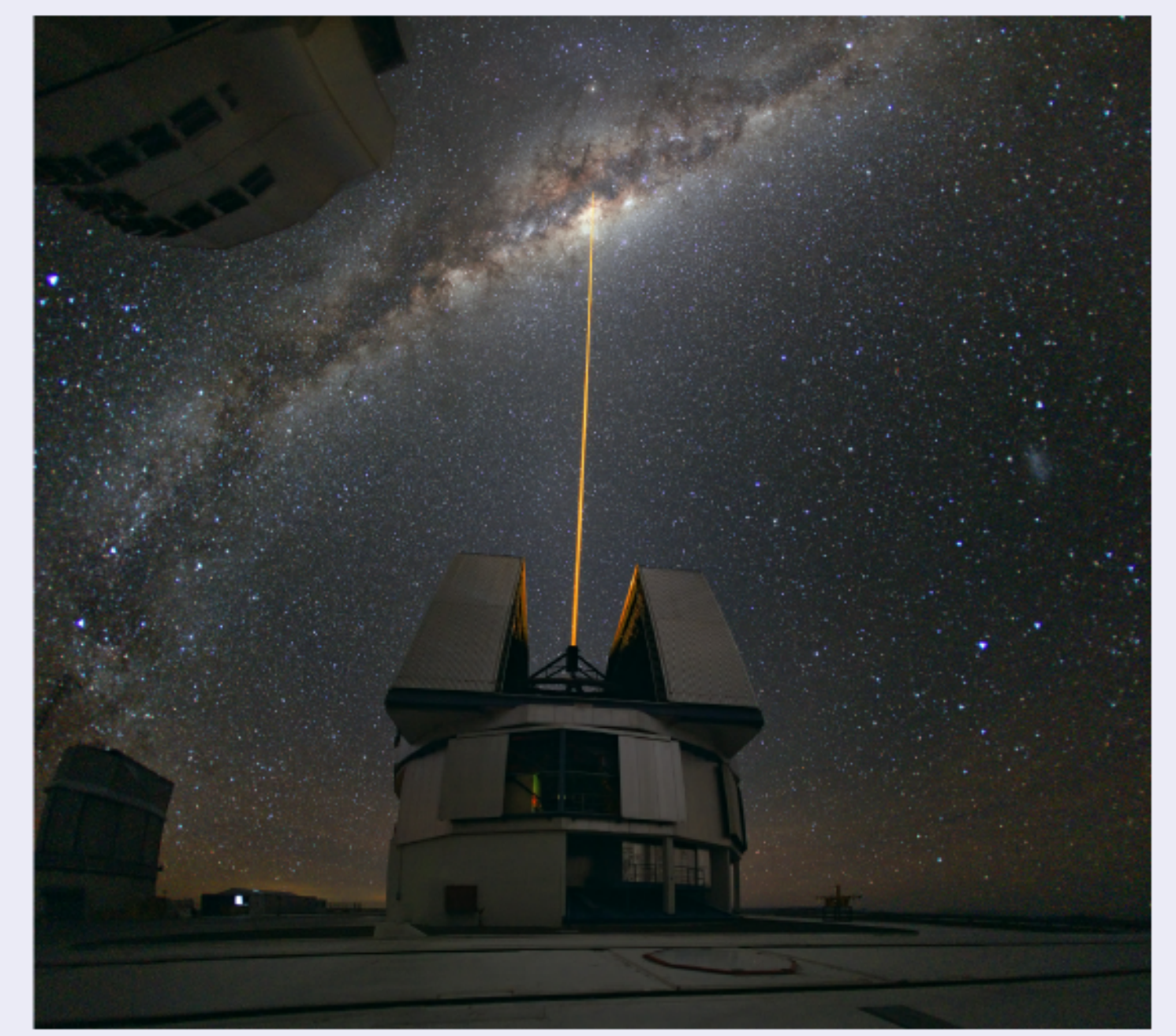
PSF are also often shift-variant in microscopy (e.g., in confocal microscopy, the PSF widens with depth).

Fast models of space-variant blurring are essential for iterative deblurring.



PSF anisotropy across MegaCam field at the Canada-France Hawaii telescope

source: Hoekstra et al., The Astrophysical Journal, 647 :116, 2006

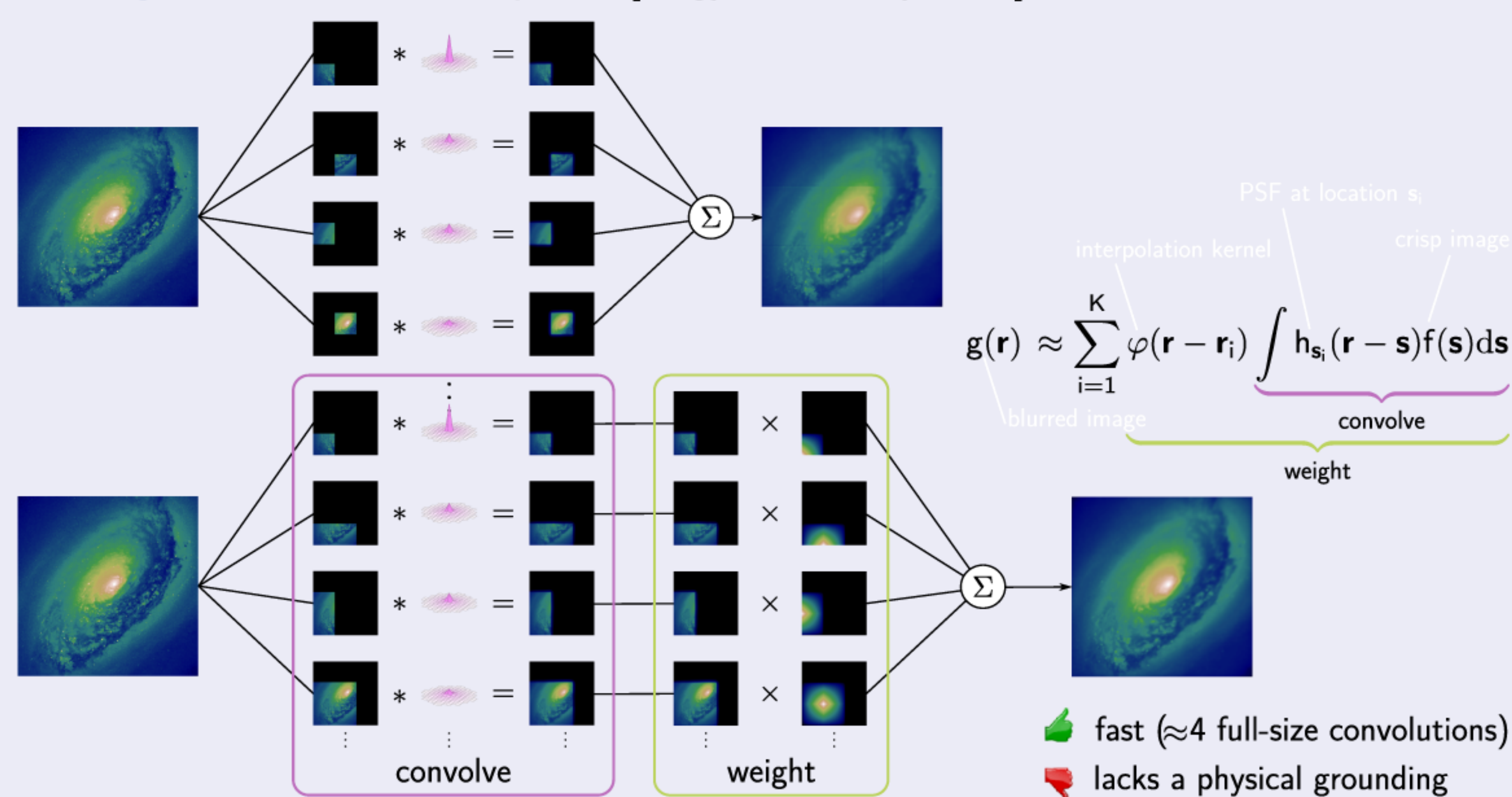


A LASER star used as reference in the adaptive optics system at the VLT (Chile)

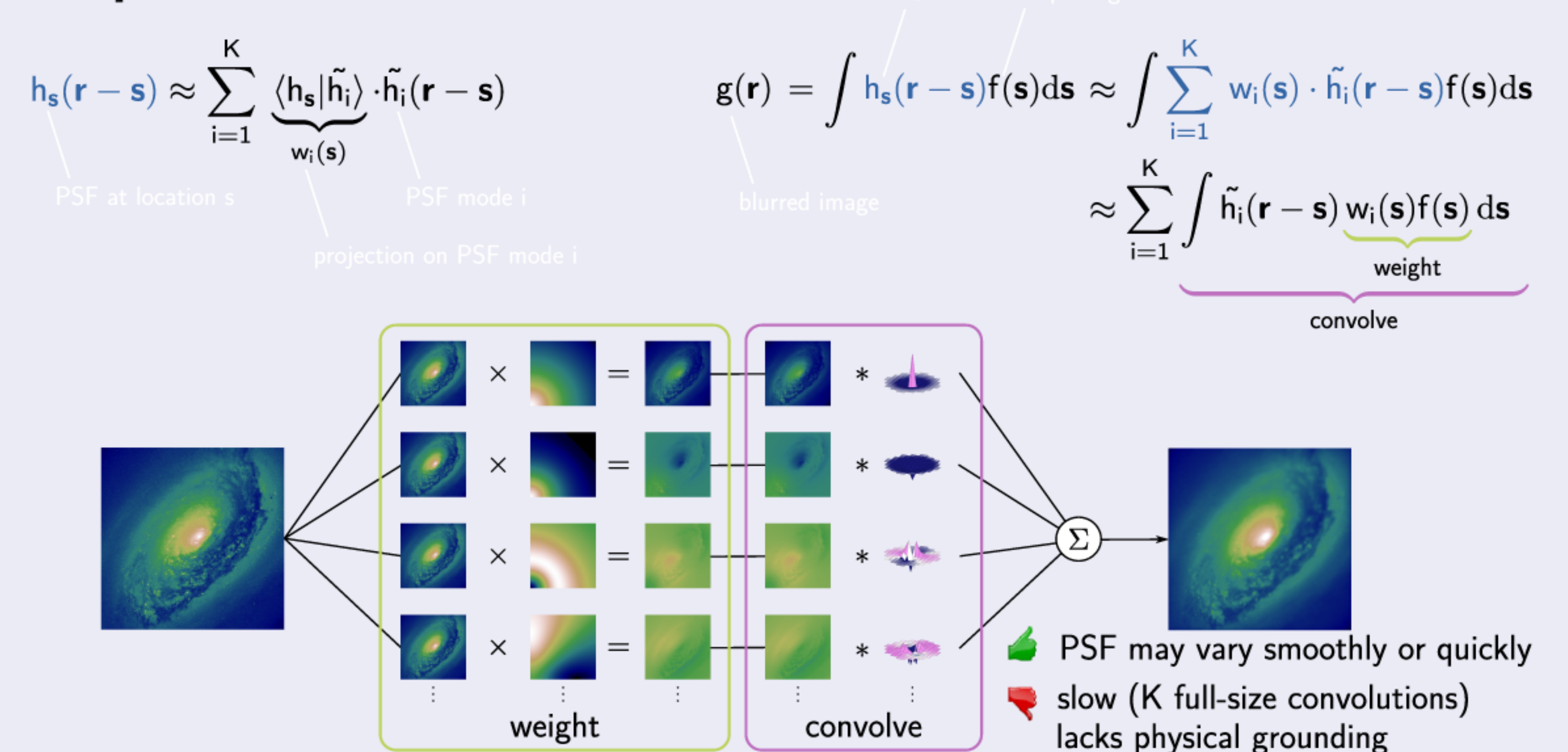
source: ESO

## Prior works

**Bloc processing:** convolve, then interpolate [Nagy & O'Leary 1998]

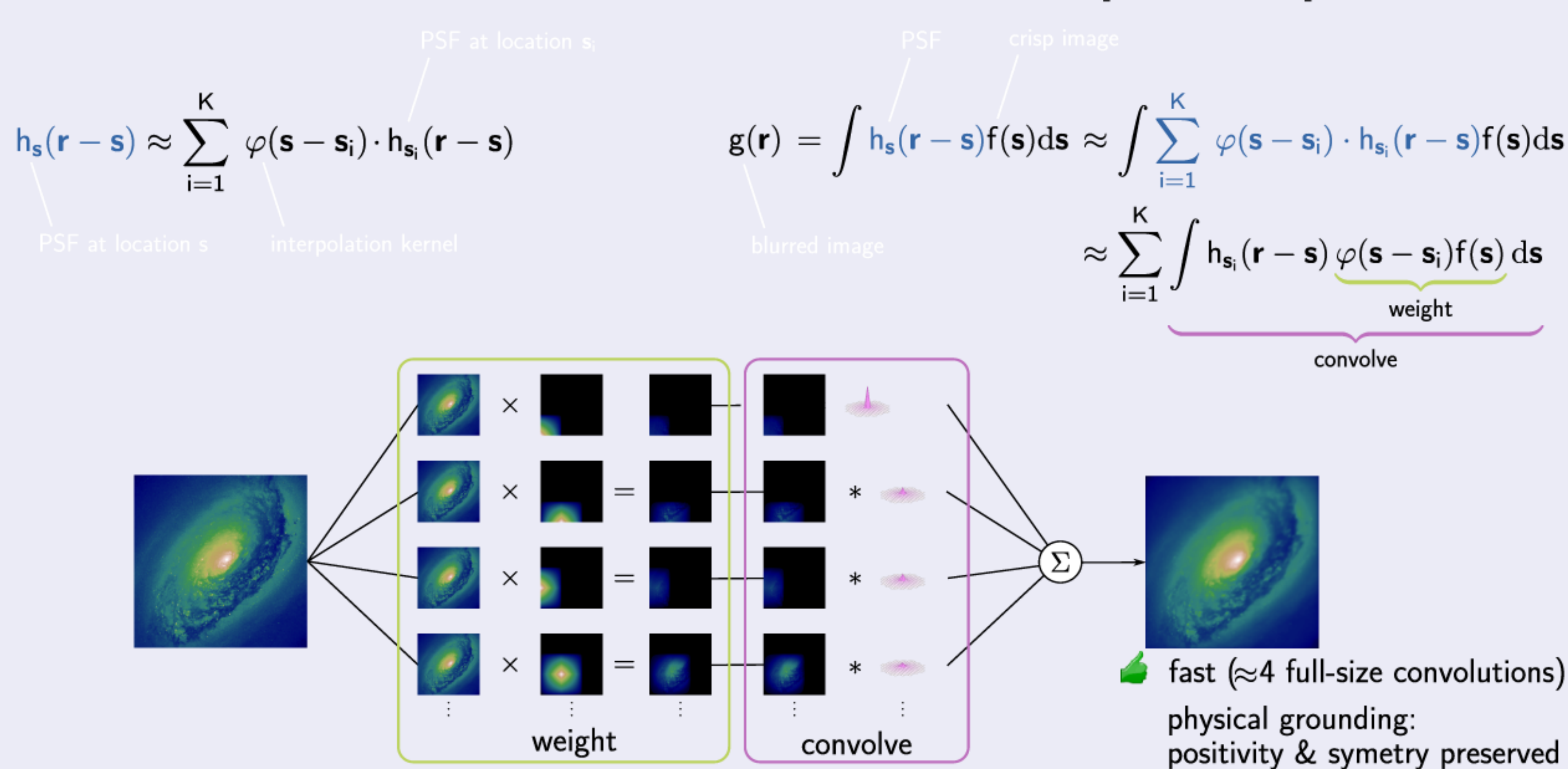


**PSF decomposition:** select the most significant PSF modes by PCA, weight spatially according to local PSF decompositions, then convolve by each mode [Flicker & Rigaut 2005]



## Proposed fast approximations

**PSF interpolation:** weight with interpolation kernel, then convolve [Hirsch 2010]

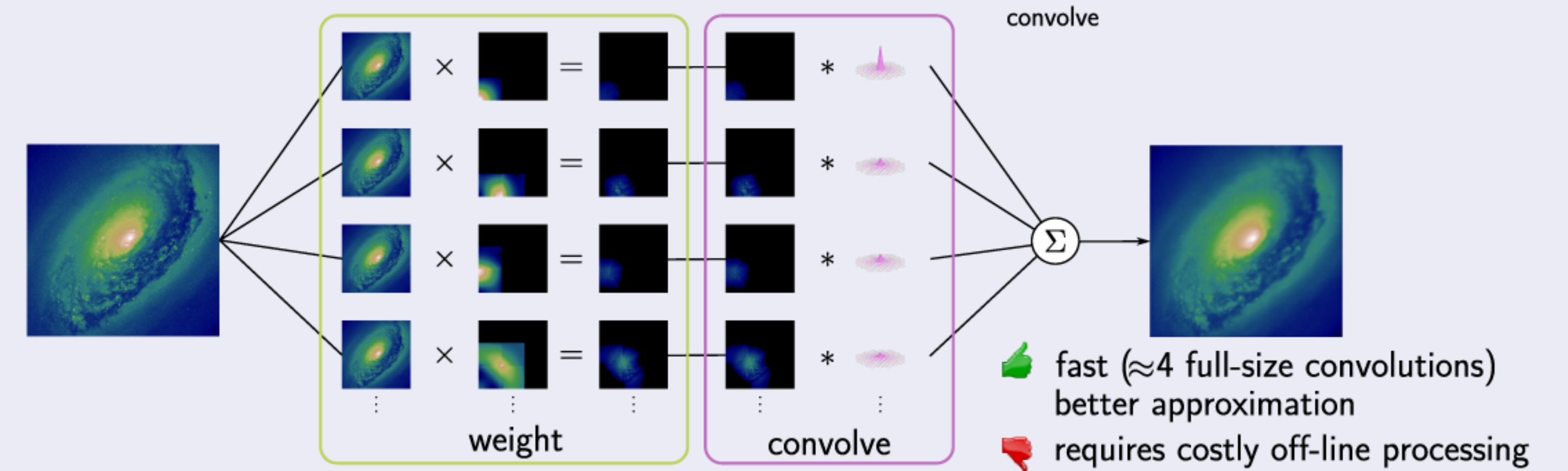


**Optimal localized approximation:** refine weights and PSF to minimize approximation error

$$\text{PSF approximation error: } \epsilon^2 = \iint \left[ h(r,s) - \sum_{i=1}^K \varphi_i(s-s_i) \cdot h_{s_i}(r-s) \right]^2 dr ds$$

Refine weights and convolution kernels to minimize PSF approximation error with localized weights and limited kernel size (alternating minimization).

$$(h_{s_i}^*, \varphi_i^*)_{i=1..K} = \arg \min_{h_{s_i}, \varphi_i} \epsilon^2 \quad g(r) \approx \sum_{i=1}^K \int h_{s_i}^*(r-s) \varphi_i^*(s-s_i) f(s) ds$$

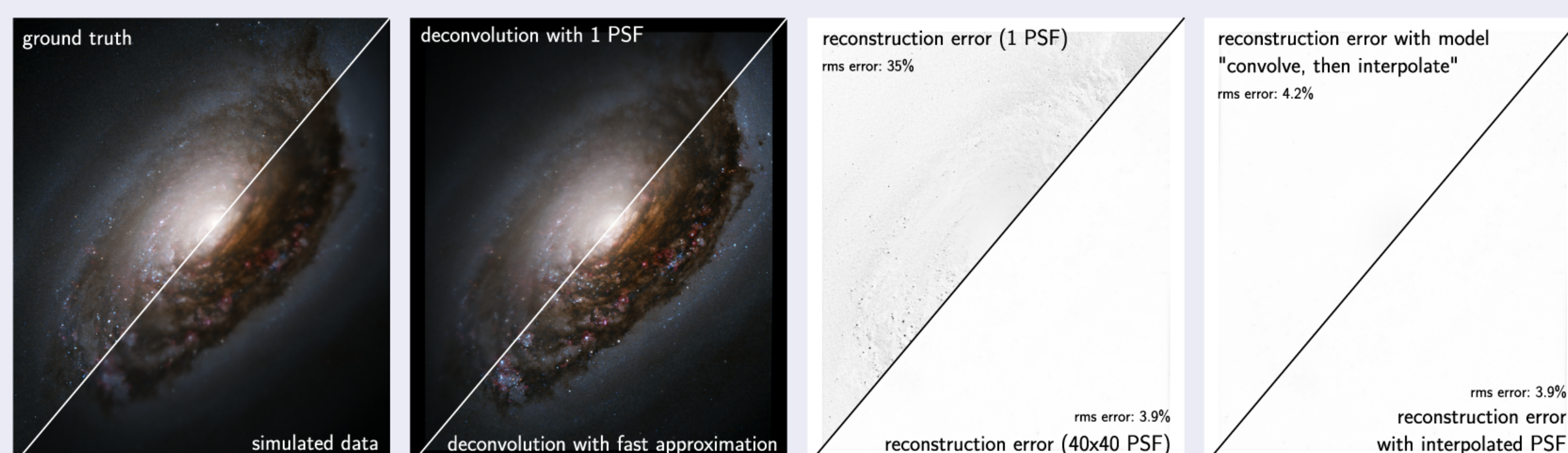
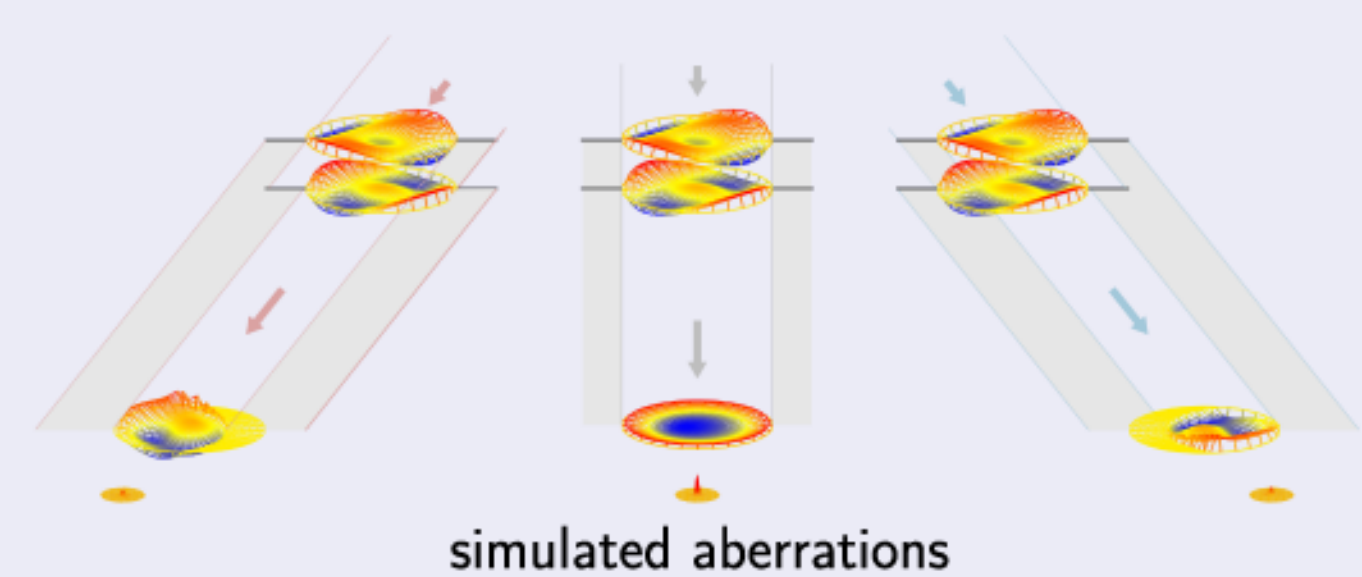


## Results

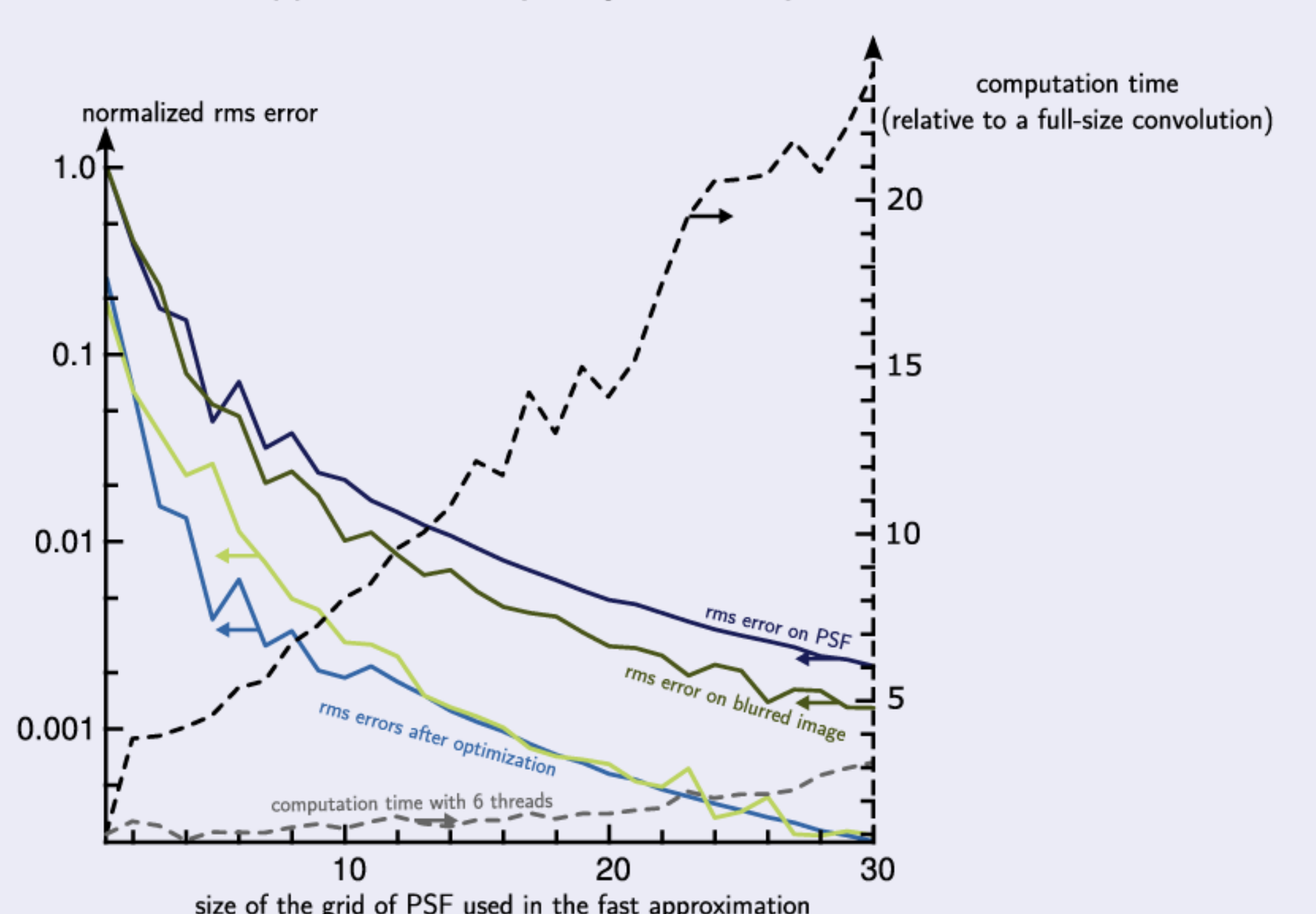
Simulated blur: optical aberrations

defocus, spherical aberrations, tilt, vignetting

restoration: MAP with smoothed total variation



Tradeoff between approximation quality and computational cost



[Nagy & O'Leary1998] J.G. Nagy and D.P. O'Leary, "Restoring Images Degraded by Spatially Variant Blur," SIAM J. Sci. Comp., vol. 19, pp. 1063, 1998.

[Flicker & Rigaut 2005] R. Flicker and F. J Rigaut, "Anisoplanatic deconvolution of adaptive optics images.," J Opt Soc Am A, vol. 22, no. 3, pp.504–513, Mar 2005.

[Hirsch et al. 2010] M. Hirsch, S. Sra, B. Scholkopf, and S. Harmeling, "Efficient filter flow for space-variant multiframe blind deconvolution," in IEEE Comp. Vis. Pattern Recogn., 2010, pp. 607–614.

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