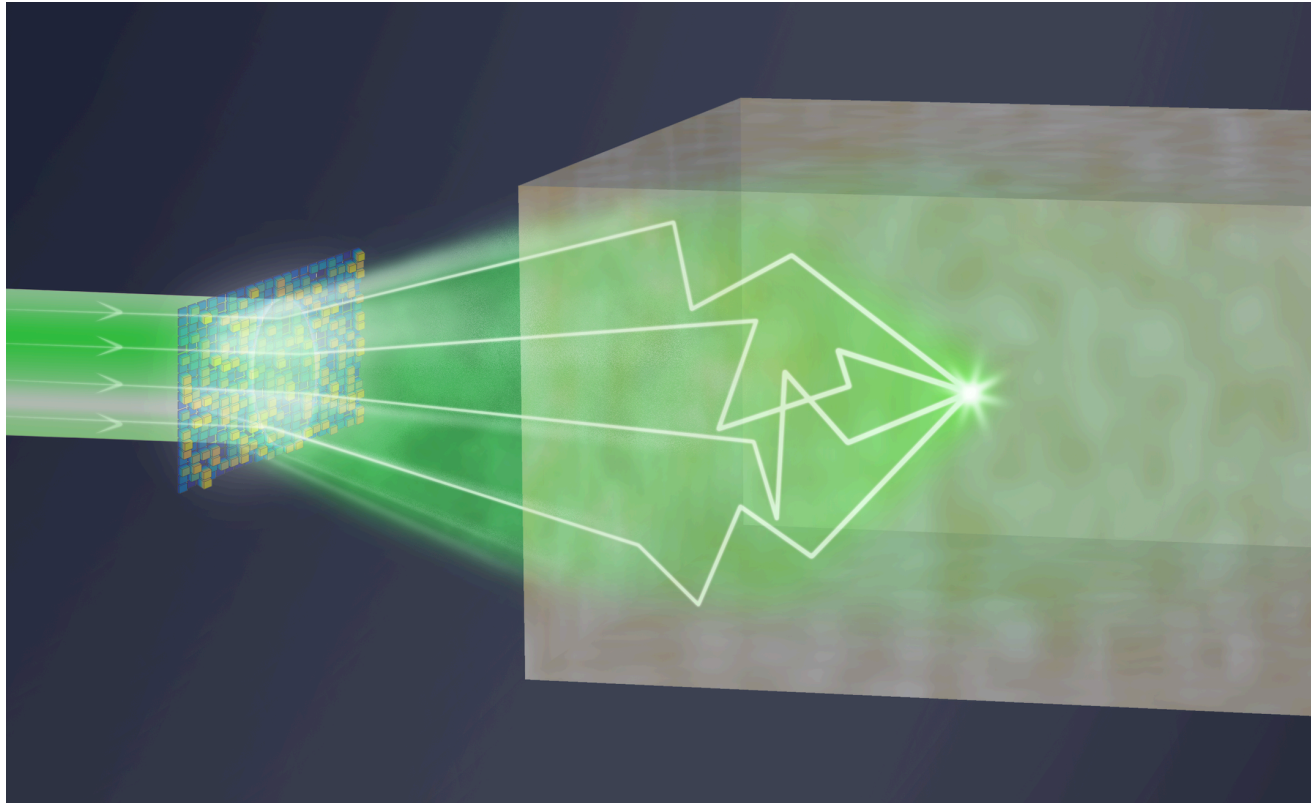


Memory effect correlations in random scattering media over space, angle and time



Roarke Horstmeyer

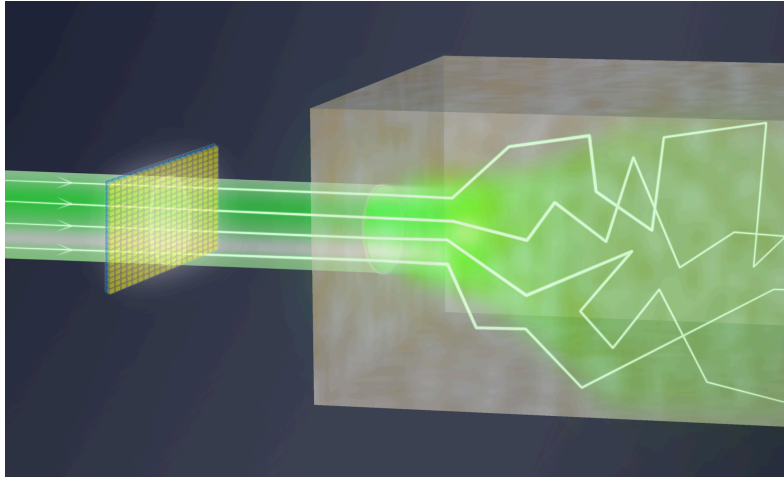
Charité Medical School, Humboldt University of Berlin

ICERM Waves and Imaging in Random Media

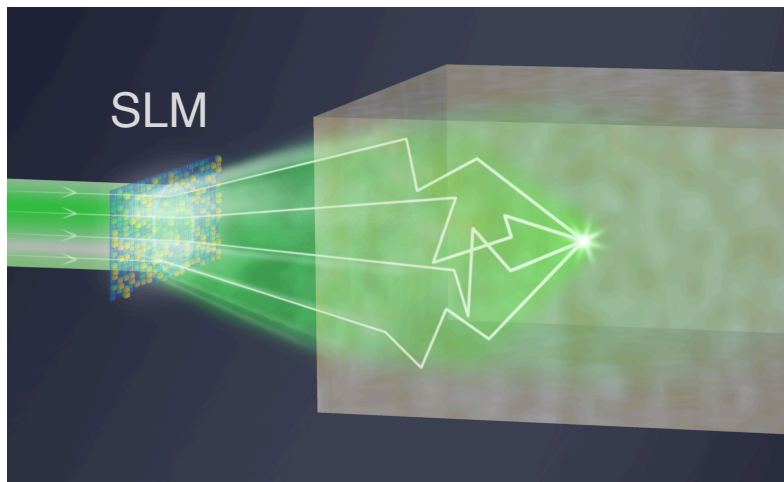
September 26, 2017

Challenge: controlling light deep within tissue

Light randomly scatters within tissue

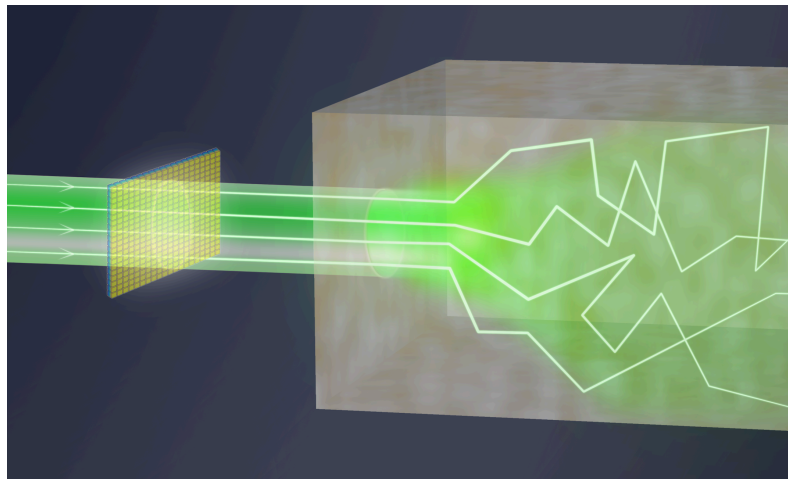


Wavefront-shaping: "undo" scattering

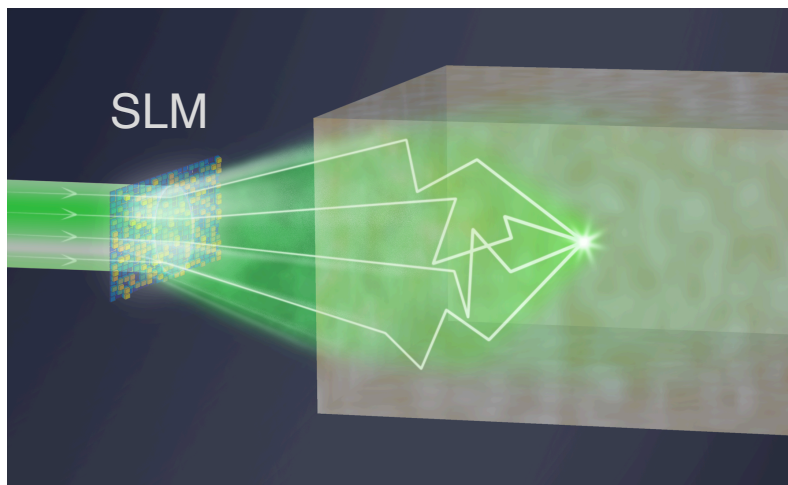


Challenge: controlling light deep within tissue

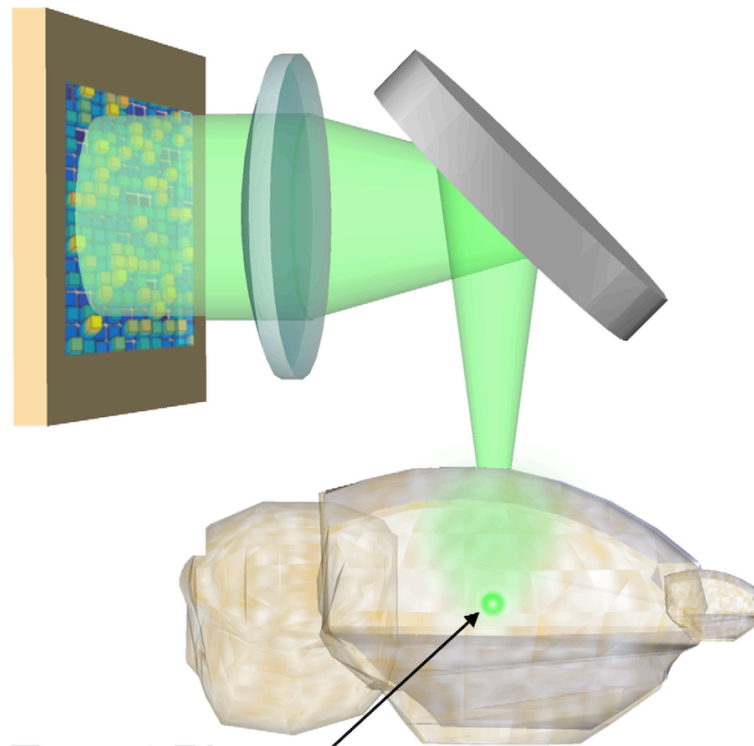
Light randomly scatters within tissue



Wavefront-shaping: "undo" scattering



SLM

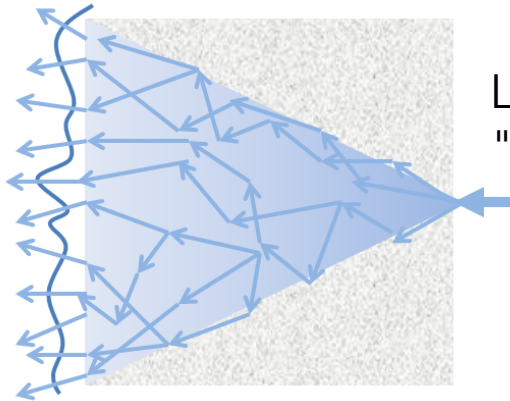


Target Plane

How do we form a focus deep within tissue?

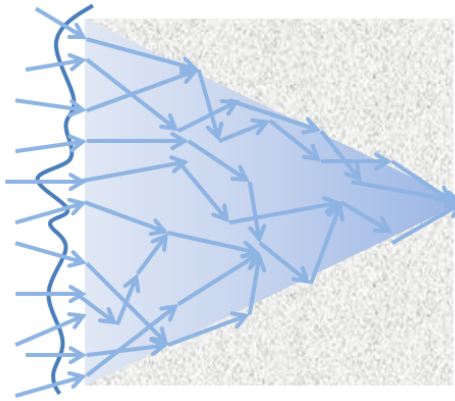
Technique #1: Optical Phase Conjugation

Scattered wavefront



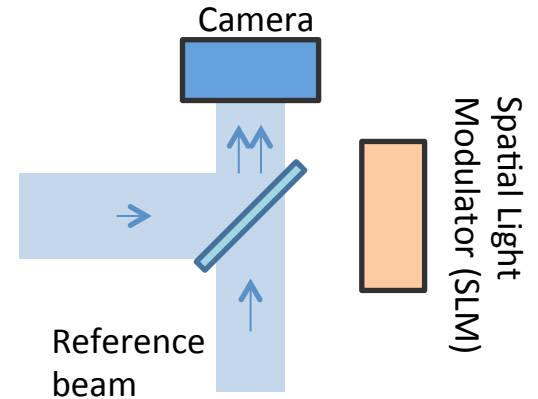
Light from "guidestar"

Phase conjugate wave

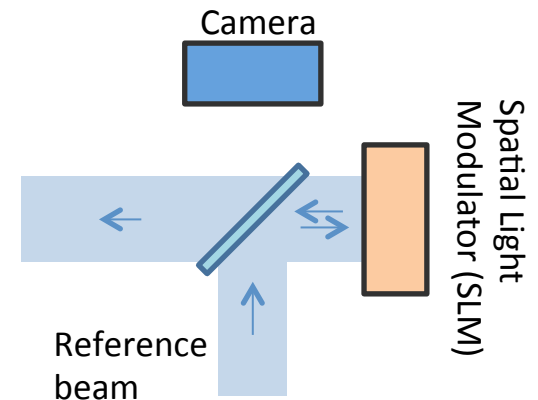


Light returns to guidestar location

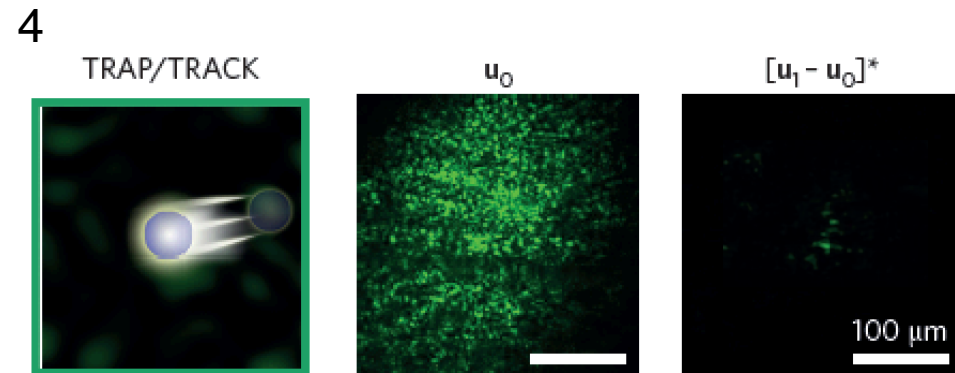
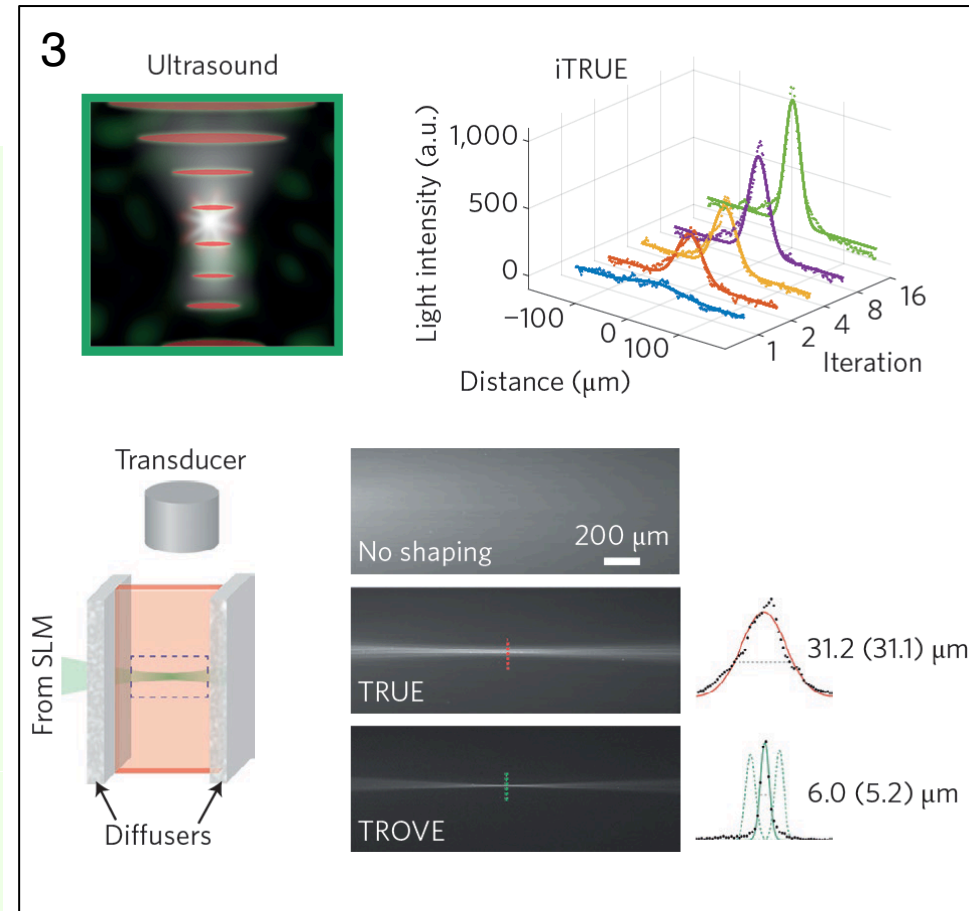
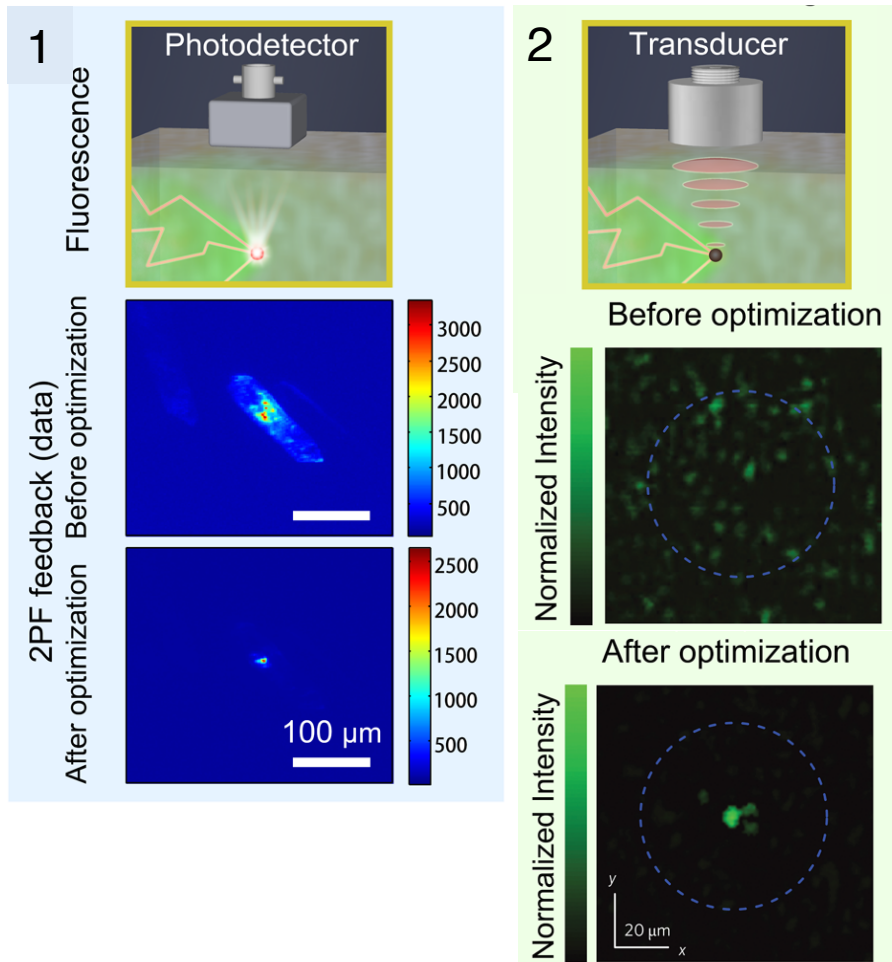
DOPC recording



DOPC playback

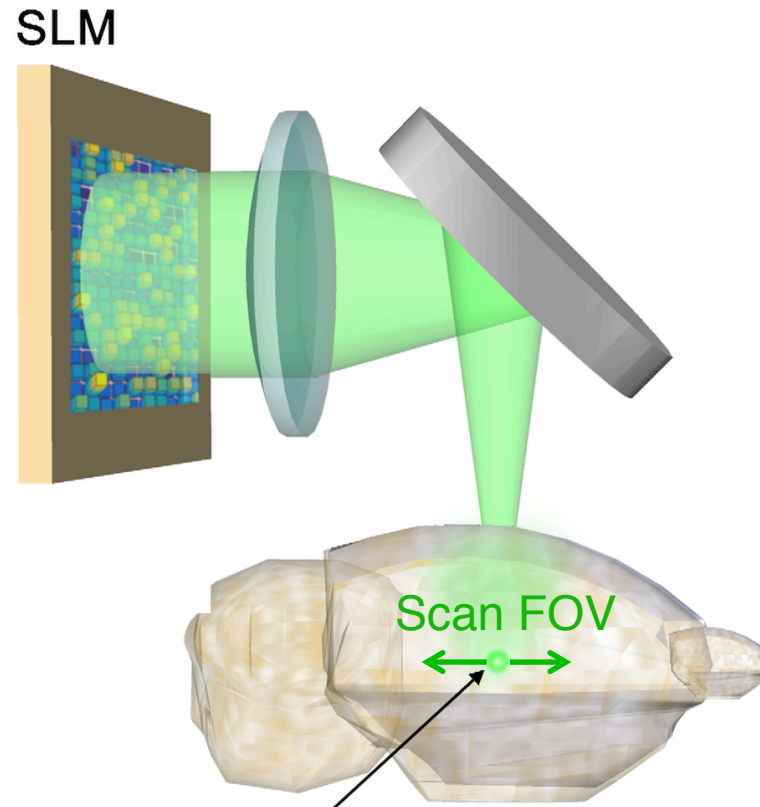


Guidestar examples



R. Horstmeyer et al., "Guidestar-assisted wavefront-shaping methods for focusing light into biological tissue", Nature Photon. (2015)

This talk: *efficiently scanning* focused light deep within tissue



Goal: want to scan focus around

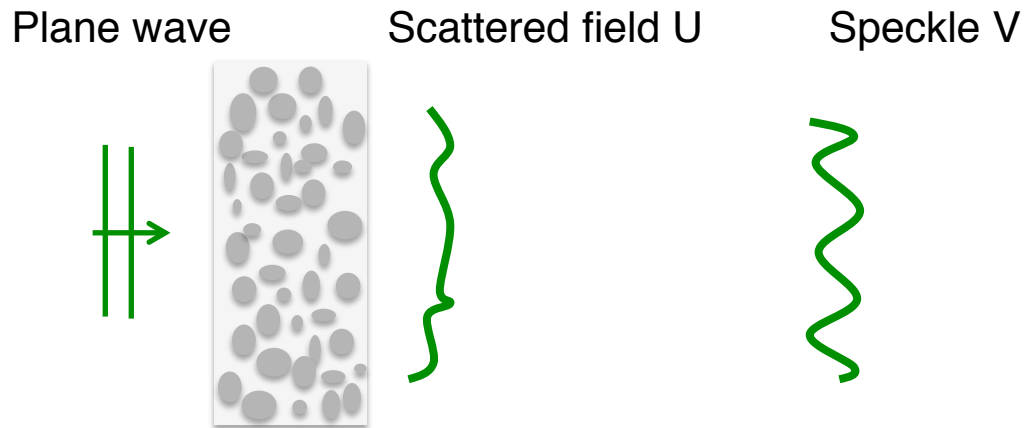
Equivalent: maximize FOV of imaging
with adaptive optics

Talk Outline

1. The optical memory effect
2. The "shift/shift" memory effect
3. The generalized memory effect
4. Experimental demo of maximized scanning
5. Scanning further with time-gated light

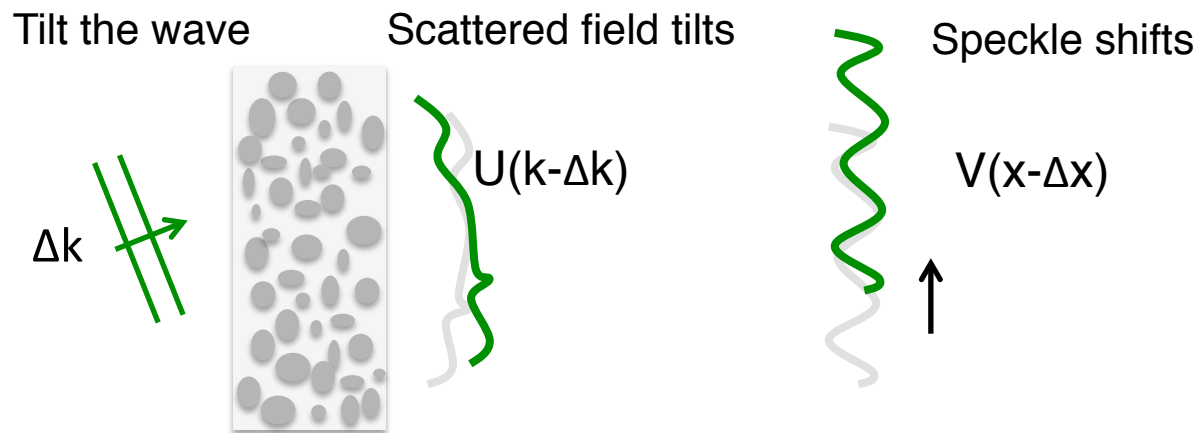
The optical memory effect

- Well-known scattering correlation
- Speckle at a distance shifts around but does not change shape



The optical memory effect

- Well-known scattering correlation
- Speckle at a distance shifts around but does not change shape



Application: Imaging "through" thin scattering layers

- J. Bertolotti et al., "Noninvasive imaging through opaque scattering layers," Nature (2012)
- O. Katz et al., "Noninvasive single shot imaging through opaque scattering layers and around corners," Nature Photon. (2014)
- X. Yang et al., "Imaging blood cells through scattering tissue using speckle scanning," Opt. Express (2014)

The optical memory effect

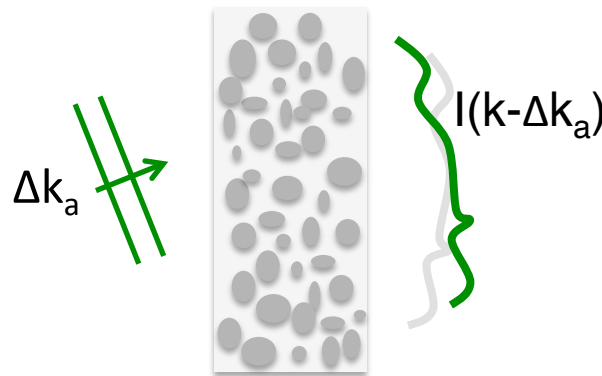
- Original approach¹ interested in *intensity-intensity* correlations:

$$C_I^{abab'} = \underbrace{C_I^{(1)}} + C_I^{(2)} + C_I^{(3)}$$

"Memory effect"



$$C_I^{(1)}(\Delta k) \propto (\Delta k L)^2 / \sinh^2(\Delta k L), \quad \Delta k_a = \Delta k_b$$



¹ S. Feng, C. Kane, P. A. Lee, and A. D. Stone, Phys. Rev. Lett. 61, 834 (1988).

The optical memory effect

- Original approach¹ interested in *intensity-intensity* correlations:

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$$C_I^{(1)}(\Delta k) \propto (\Delta k L)^2 / \sinh^2(\Delta k L), \quad \Delta k_a = \Delta k_b$$

- We will work with *field-field* correlations², the square root of $C_I^{(1)}$:

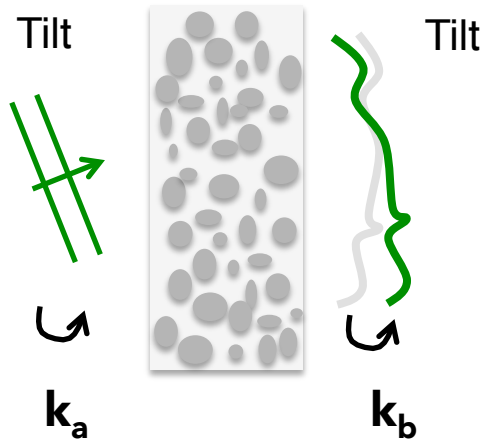
$$C_I^{(1)}(\mathbf{k}) = \underbrace{|\langle E(\mathbf{k}) E^*(\mathbf{k}) \rangle|^2}_{\text{Our primary interest}} = \underbrace{|C(\mathbf{k})|^2}$$

Our primary interest

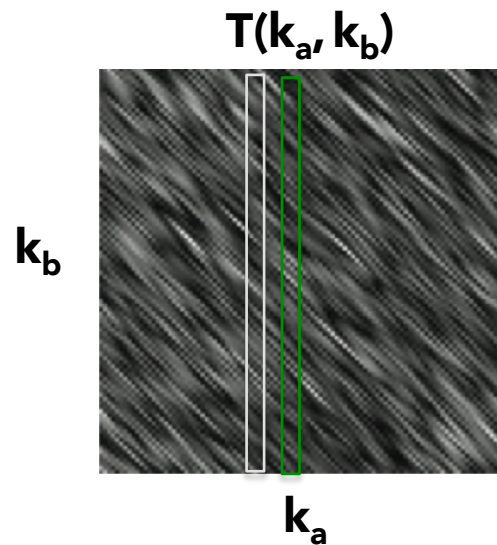
¹ S. Feng, C. Kane, P. A. Lee, and A. D. Stone, Phys. Rev. Lett. 61, 834 (1988).

² R. Berkovits, M. Kaveh and S. Feng, Phys. Rev. B 40, 737 (1989).

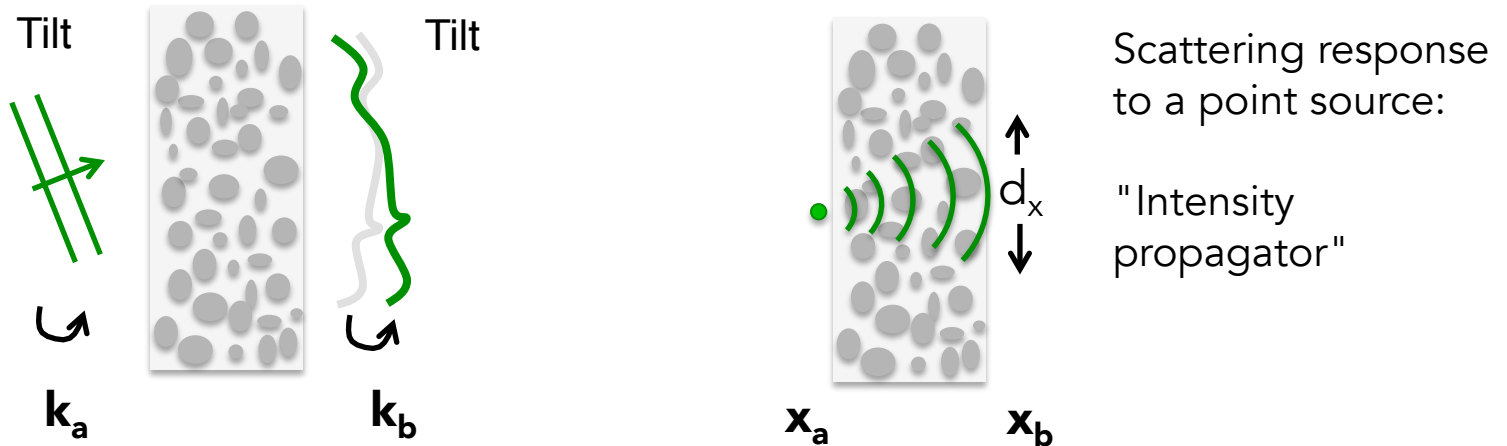
The optical memory effect



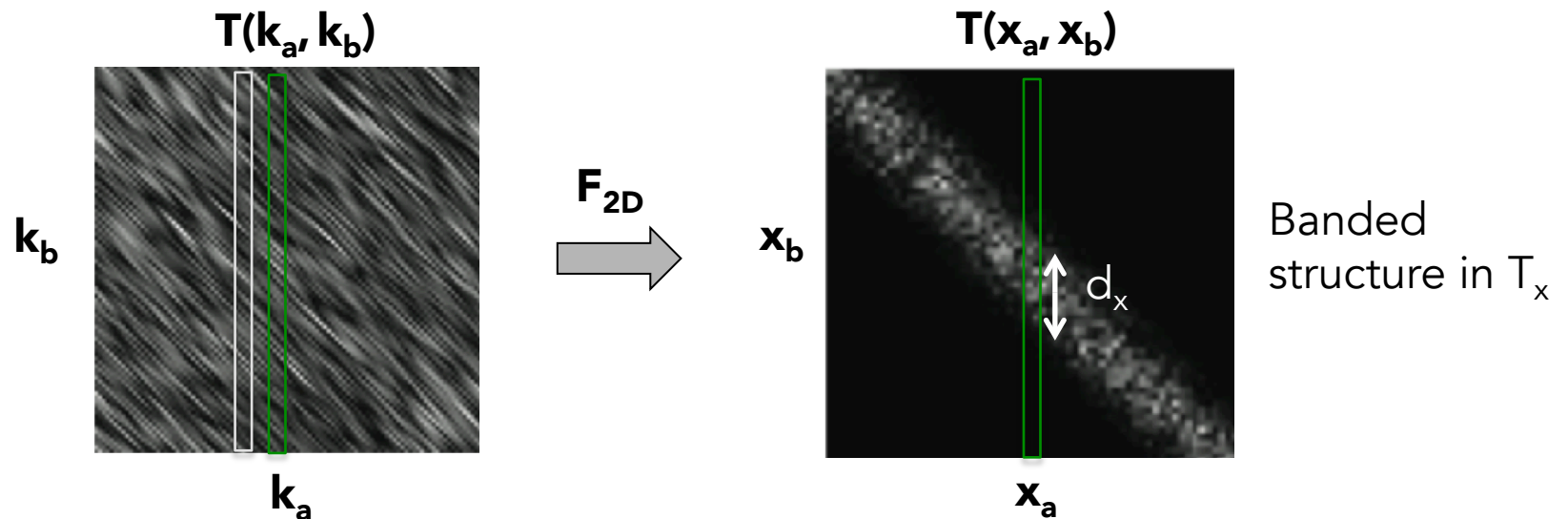
What does the memory effect look like within the transmission matrix?



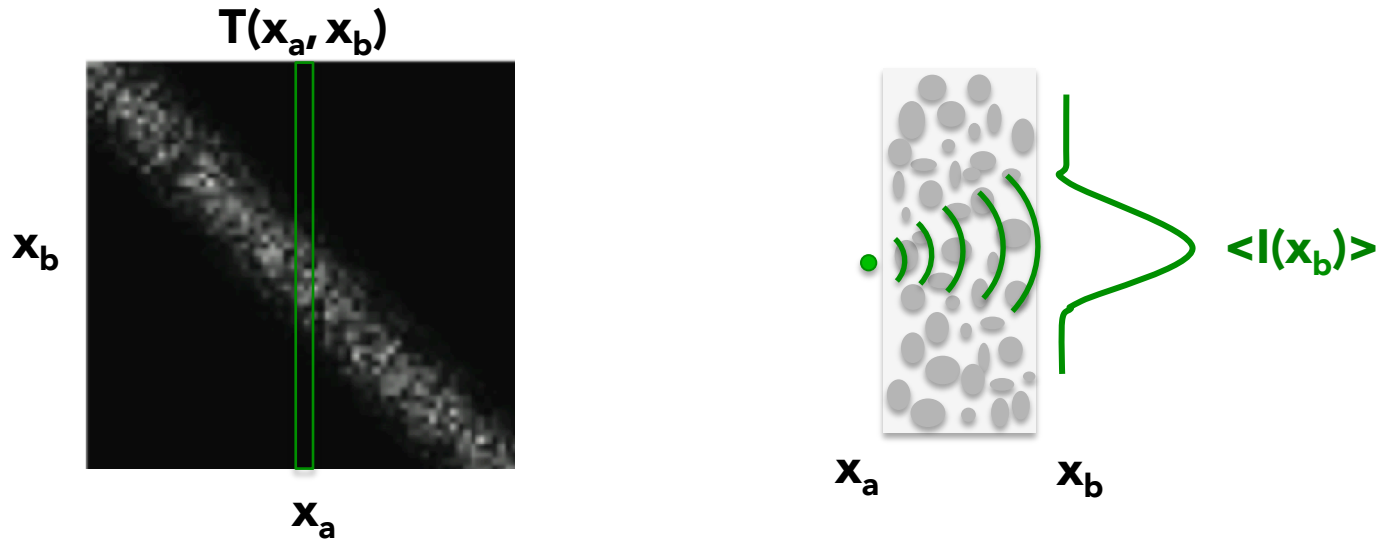
The optical memory effect



Visualization of the optical memory effect possible in \mathbf{k} and \mathbf{x} :



The optical memory effect: a simple derivation



Assume we know the average magnitude of transmission matrix:

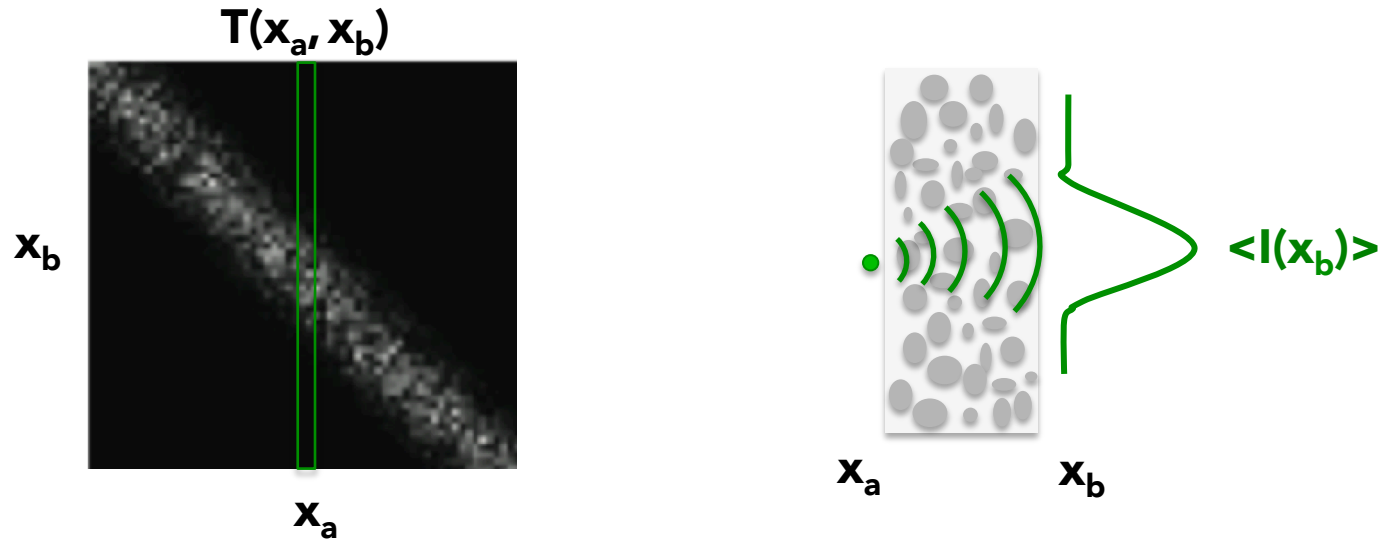
$$I(x_a, x_b) = \langle |T(x_a, x_b)|^2 \rangle$$

$$\mathcal{F}_{2D} [I(x_a, x_b)] = \sum_{k_a, k_b} \langle T(k_a, k_b) T^*(k_a - \Delta k_a, k_b - \Delta k_b) \rangle \propto C(\Delta k_a, \Delta k_b)$$

Assume average intensity response to point source is shift-invariant:

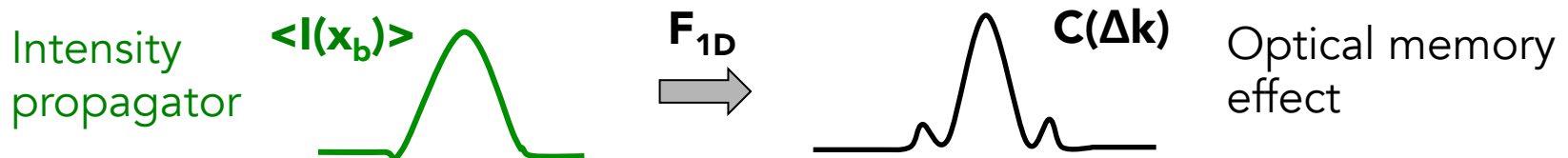
$$C(\Delta k_a - \Delta k_b) = C(\Delta k) \propto \mathcal{F}^{x_b \rightarrow \Delta k} [\langle I(x_b) \rangle]$$

The optical memory effect: a simple derivation



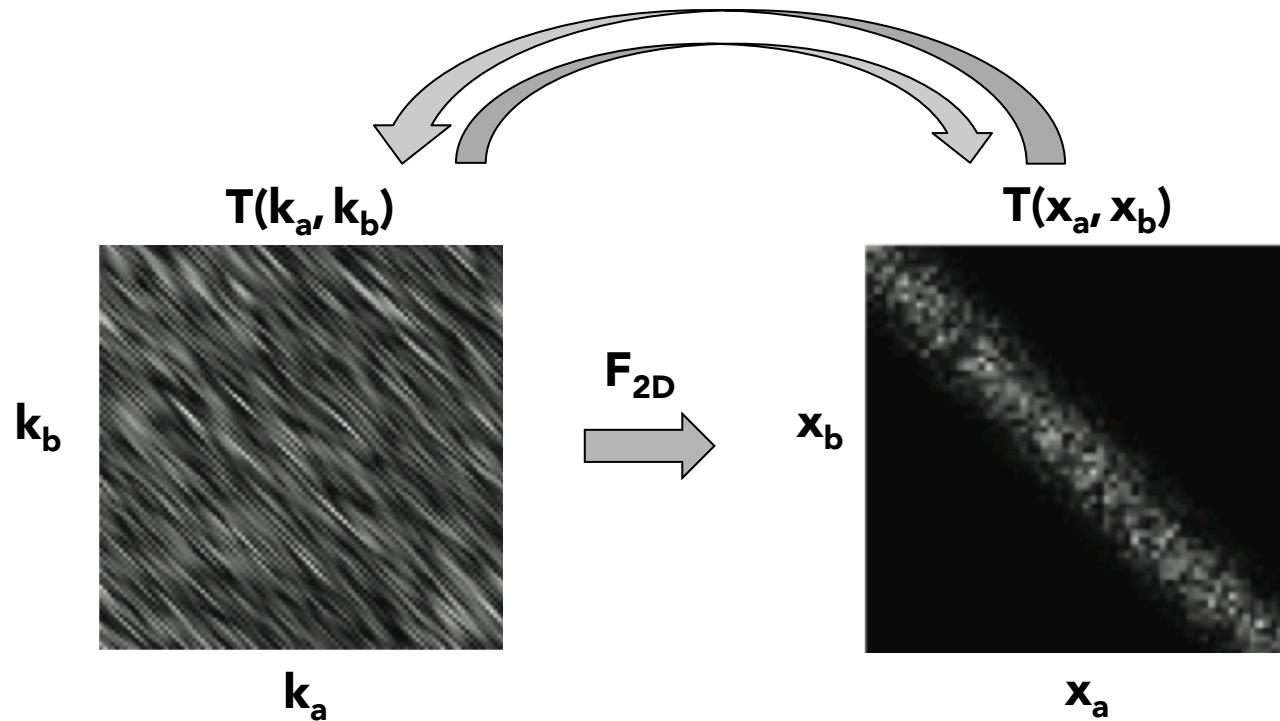
Recipe to measure the optical memory effect:

1. Put point source on input surface
2. Measure average intensity at output surface, $\langle I(x_b) \rangle$
3. Take Fourier transform to get $C(\Delta k)$

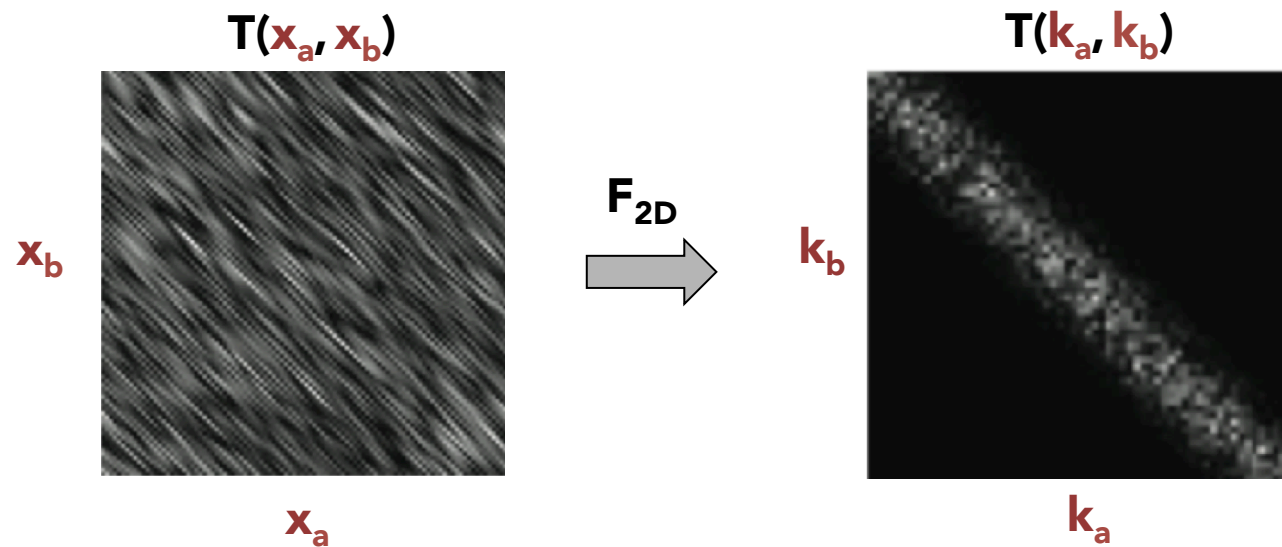


The shift/shift memory effect

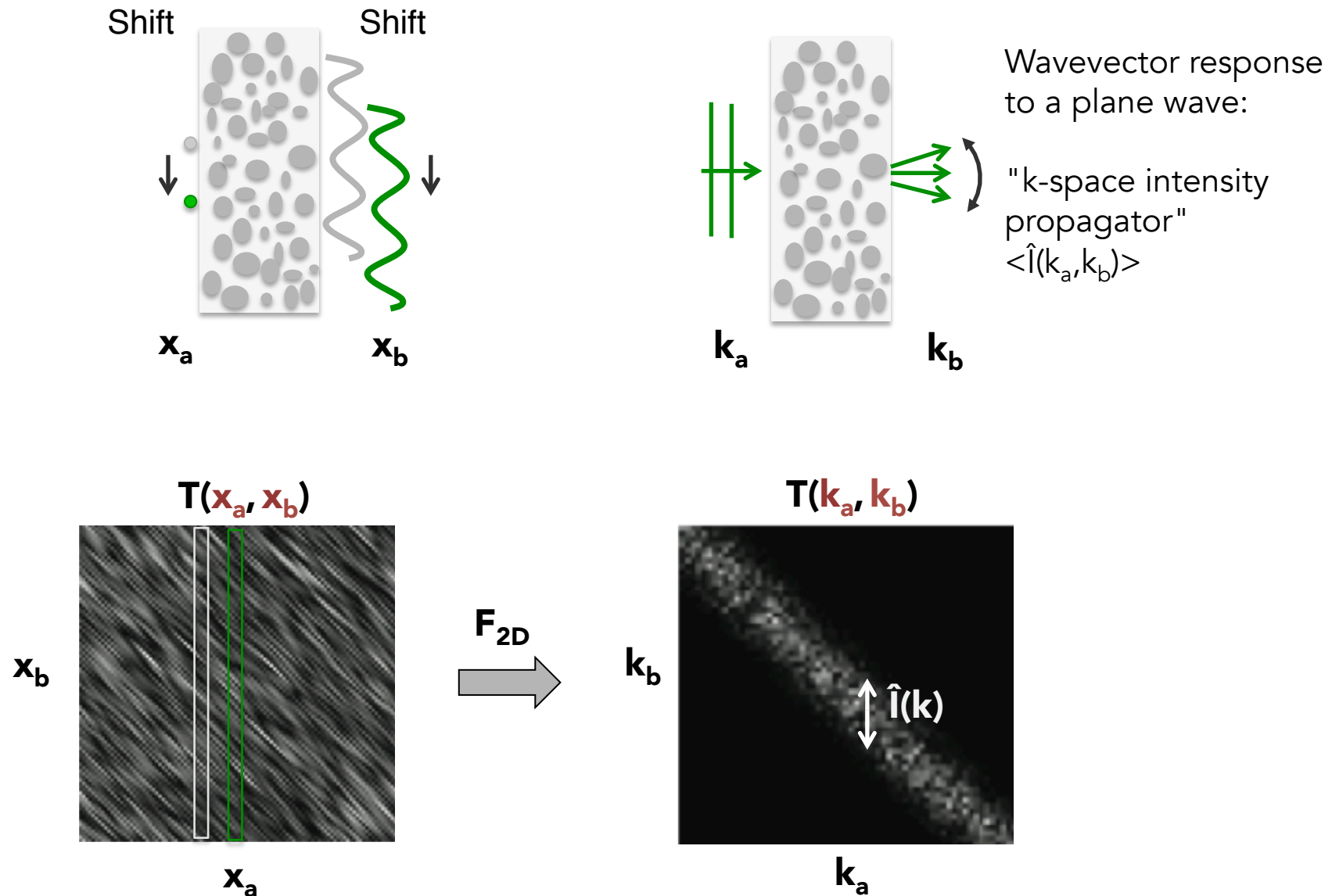
What happens if we switch x's and k's?



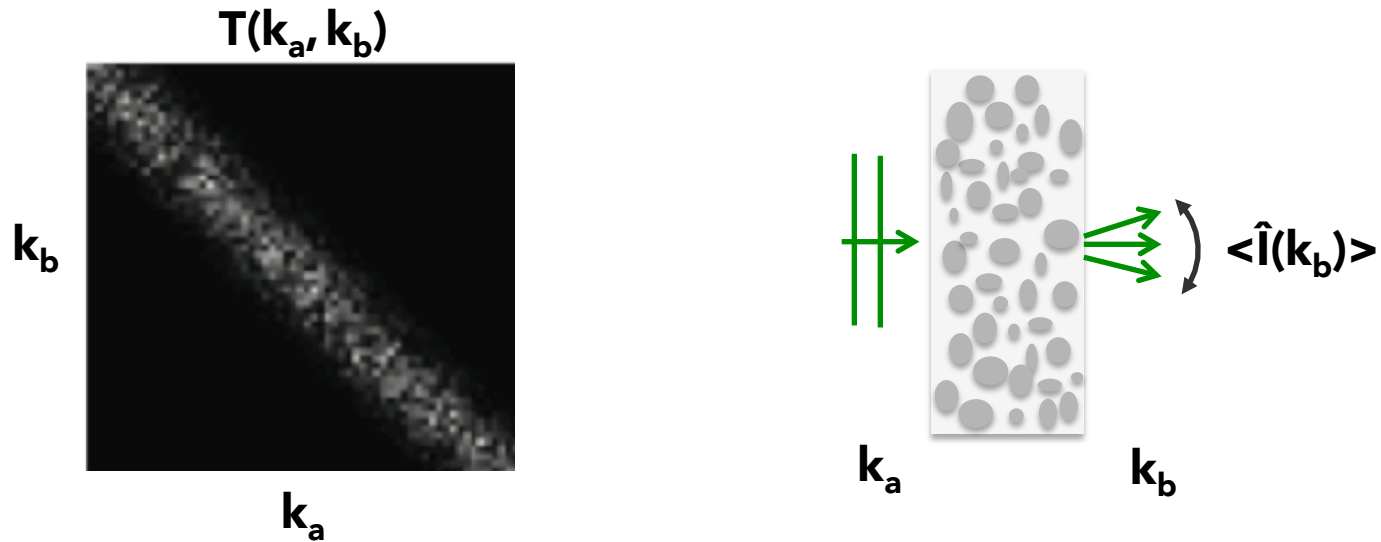
The shift/shift memory effect



The shift/shift memory effect: the Fourier dual

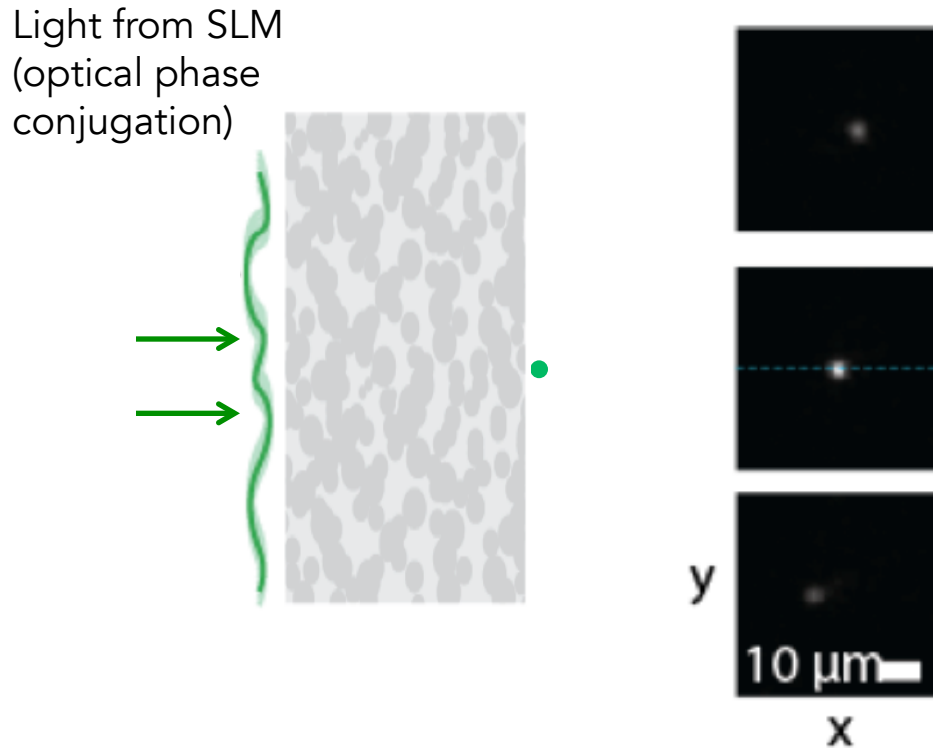


The shift/shift memory effect: the Fourier dual



- Identical derivation, x 's and k 's swapped
- Recipe to measure the shift/shift memory effect:
 1. Shine plane wave on input surface
 2. Measure average wavevector spread at output
 3. Take its Fourier transform to get spatial correlation $C(\Delta x)$
- Focus and scan within anisotropic material (e.g., tissue $g \sim 0.92$ - 0.98)

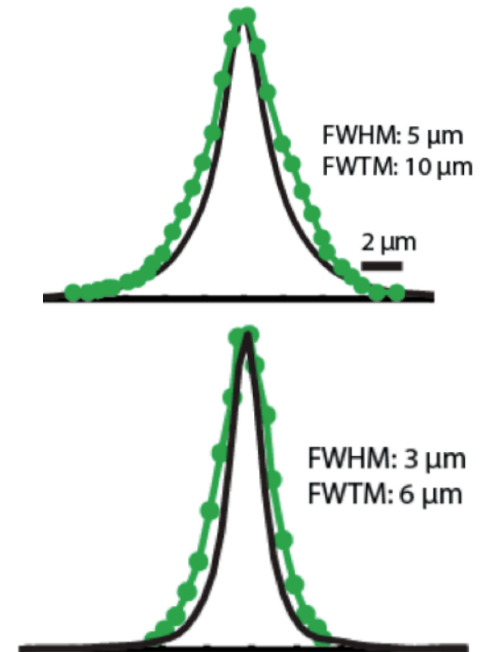
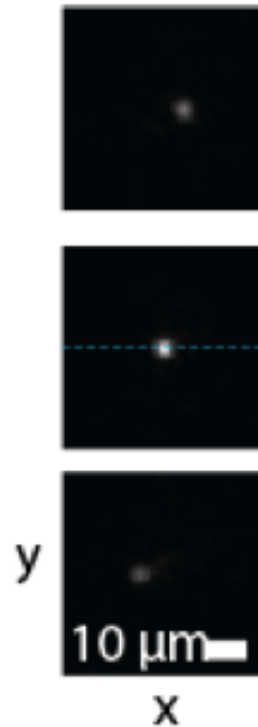
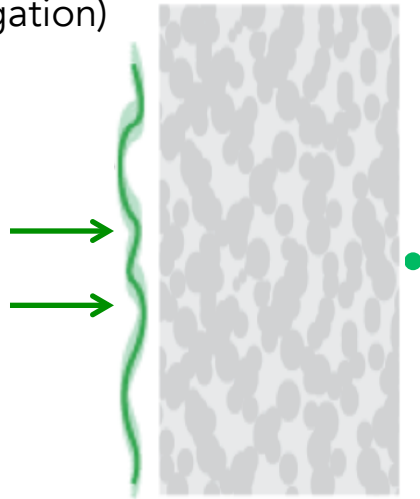
Experimental demo of shift/shift memory effect



B. Judkewitz, R. Horstmeyer et al., "Translation correlations in anisotropically scattering media,"
Nature Physics (2015)

Experimental demo of shift/shift memory effect

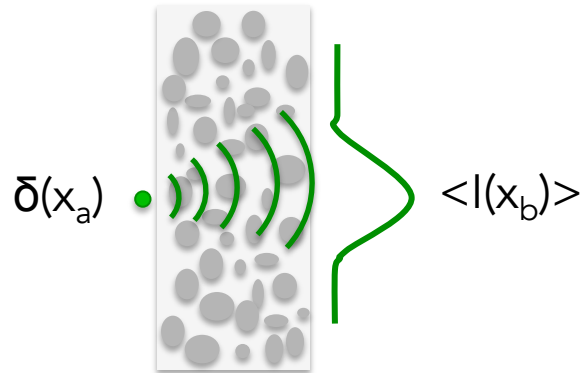
Light from SLM
(optical phase
conjugation)



Green curve: focus intensity
Black curve: FT plane wave response

The tilt/tilt and shift/shift memory effects

Tilt/tilt correlation

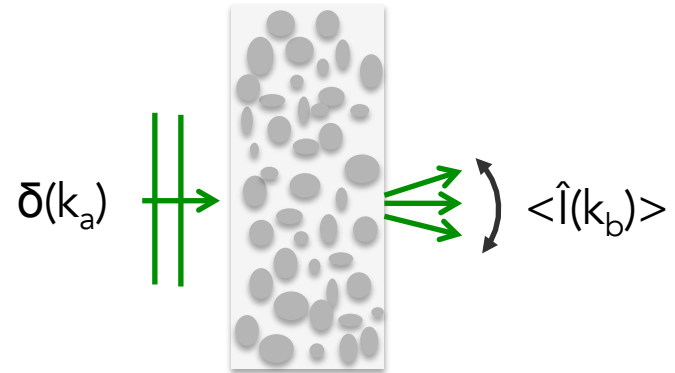


Spatial impulse response



Scanning in k

Shift/shift correlation



k-space impulse response

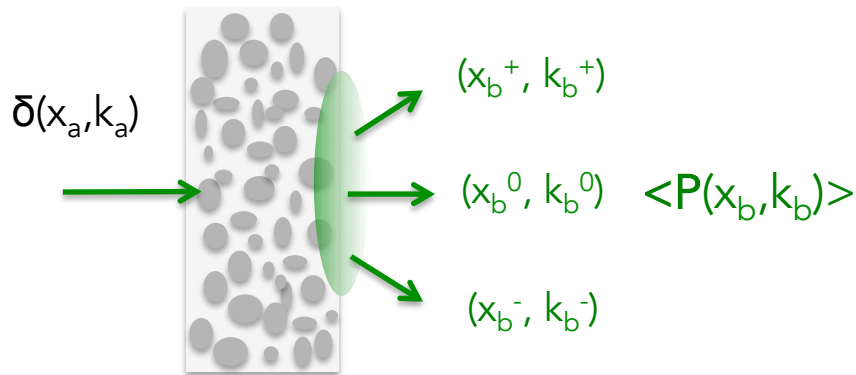


Scanning in x

How are these two effects connected?

The generalized memory effect: combining tilts and shifts

New input: "single ray"*

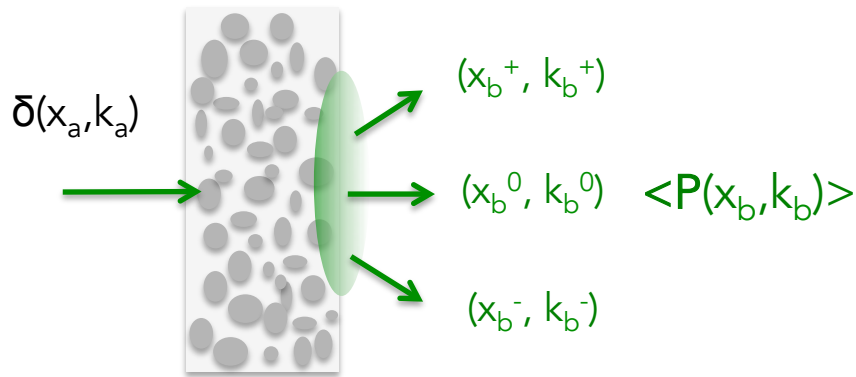


*Actually defined via the Wigner distribution, paper has math details:

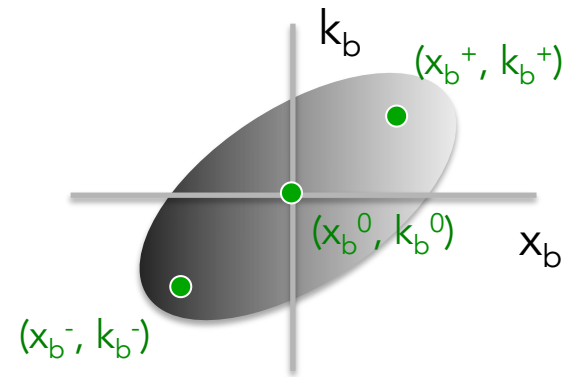
G. Osnabrugge, R. Horstmeyer et al, "The generalized optical memory effect," Optica (2017)

The generalized memory effect: combining tilts and shifts

New input: "single ray"*



Space-angle response $\langle P(x_b, k_b) \rangle$



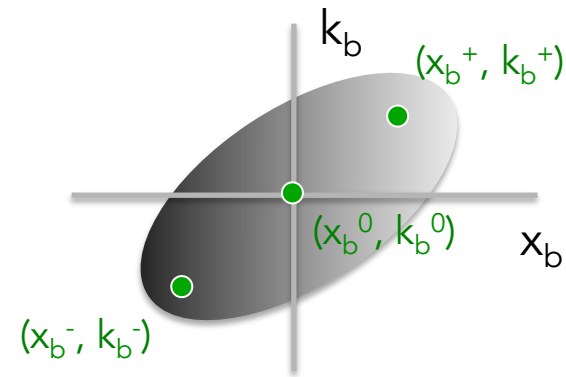
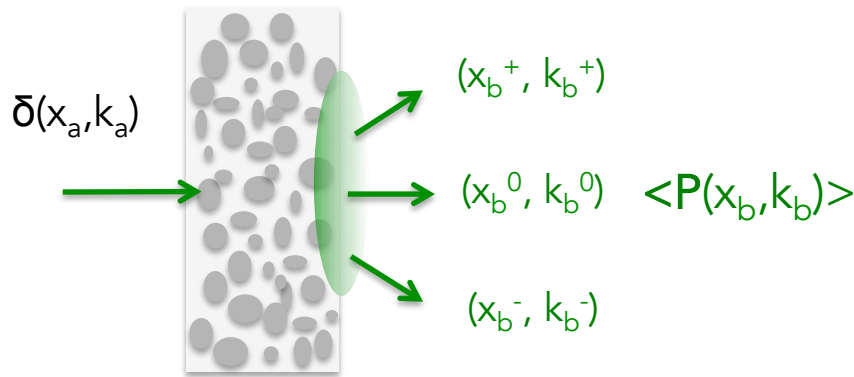
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G. Osnabrugge, R. Horstmeyer et al, "The generalized optical memory effect," Optica (2017)

The generalized memory effect: combining tilts and shifts

New input: "single ray"

Space-angle response $\langle P(x_b, k_b) \rangle$



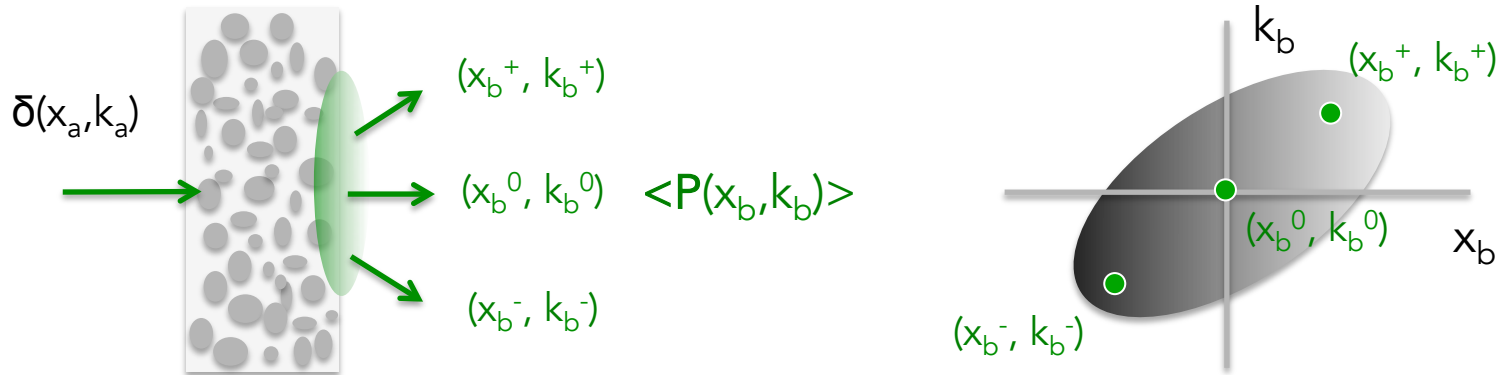
2D Fourier transform of space-angle response gives tilt/shift correlation:

$$\mathcal{F}_{2D} [\langle P(x_b, k_b) \rangle] \propto C(\Delta k, \Delta x)$$

The generalized memory effect: combining tilts and shifts

New input: "single ray"

Space-angle response $\langle P(x_b, k_b) \rangle$



2D Fourier transform of space-angle response gives tilt/shift correlation:

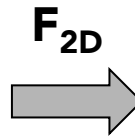
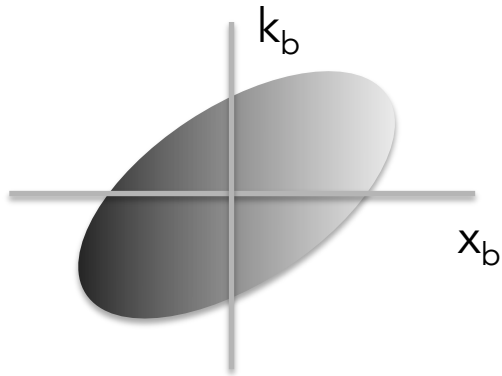
$$\mathcal{F}_{2D} [\langle P(x_b, k_b) \rangle] \propto C(\Delta k, \Delta x)$$

4D Fourier transform used when scattering is not tilt/shift invariant:

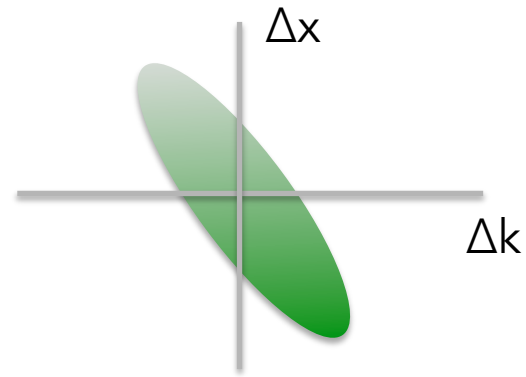
$$\mathcal{F}_{4D} [\langle P(x_a, k_a, x_b, k_b) \rangle] \propto C(\Delta k_a, \Delta x_a, \Delta k_b, \Delta x_b)$$

The generalized memory effect: is it important?

Space-angle response $\langle P(x_b, k_b) \rangle$



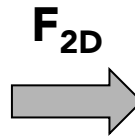
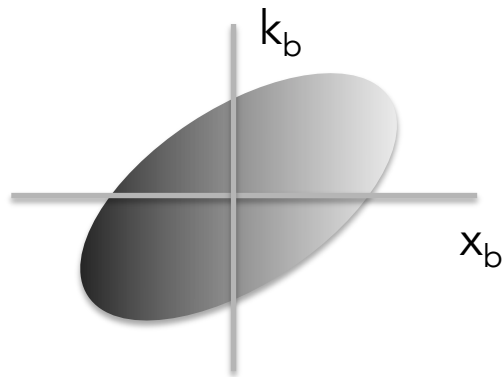
Tilt/shift correlations $C(\Delta k, \Delta x)$



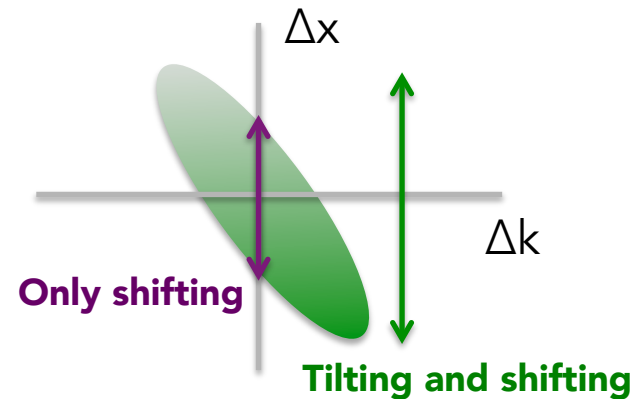
- Tilting and shifting correlations generally not independent

The generalized memory effect: is it important?

Space-angle response $\langle P(x_b, k_b) \rangle$

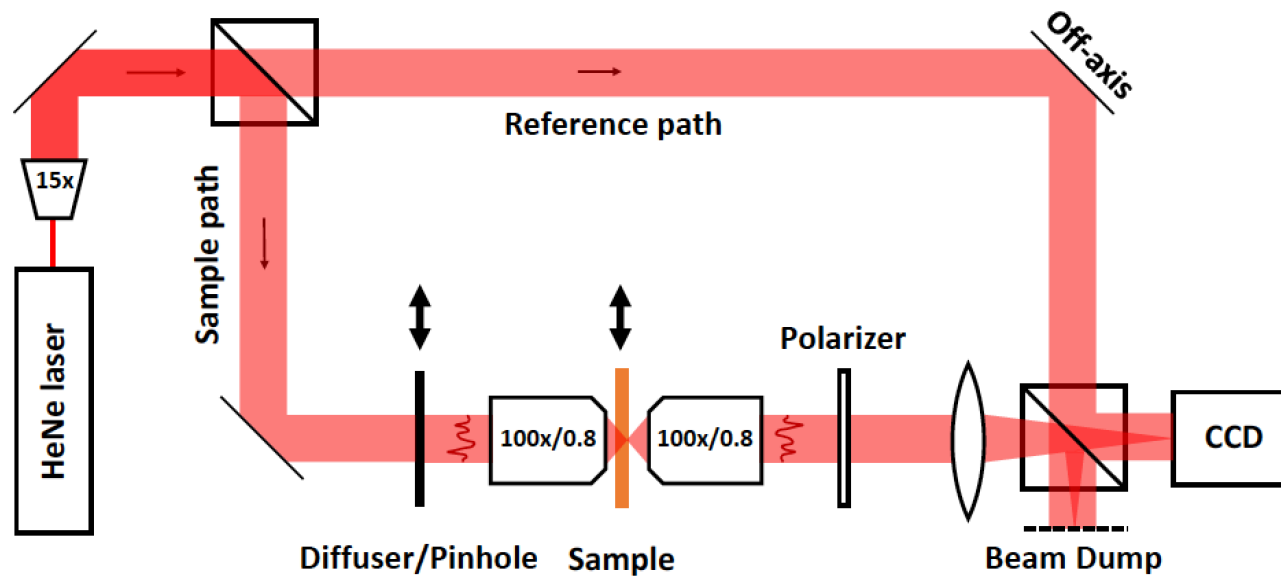


Tilt/shift correlations $C(\Delta k, \Delta x)$



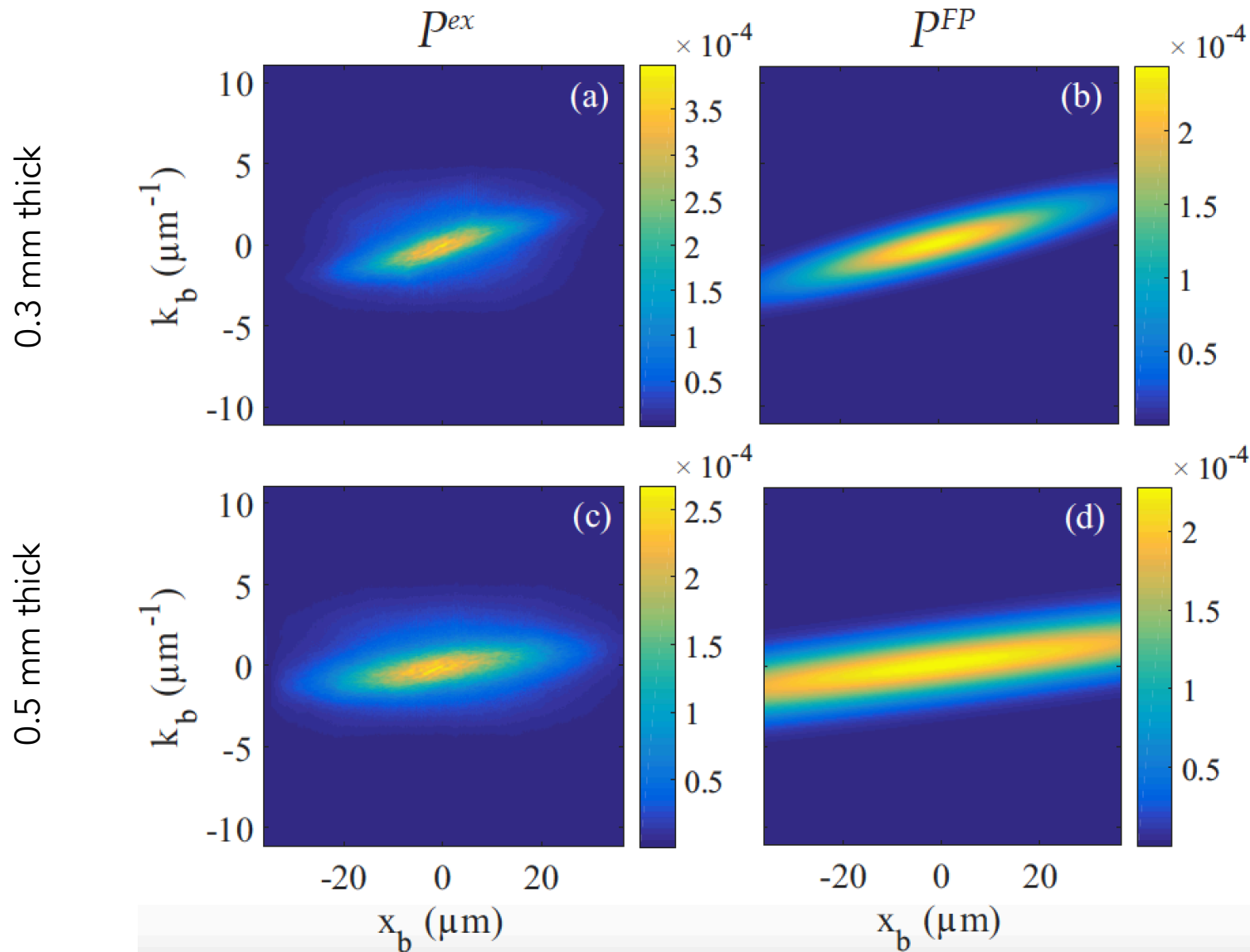
- Tilting and shifting correlations generally not independent
- Optimal tilt and shift combo can achieve larger scan range

Experimental setup

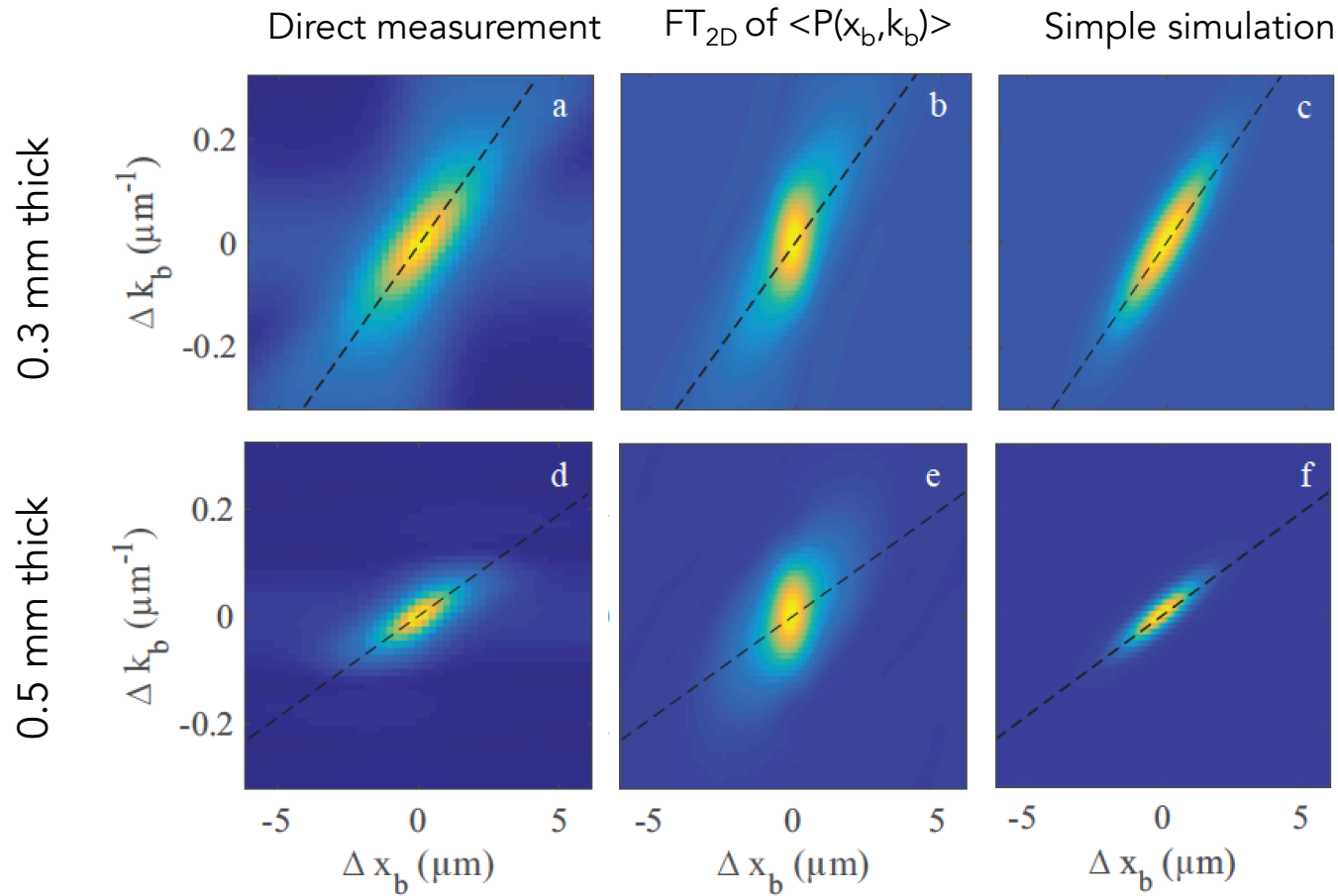


- Two experiments:
 1. Pencil beam response, $\langle P(x_b, k_b) \rangle$
 2. Shift/tilt correlation function (shift both diffuser & sample)
- Tissue phantom samples (5 μm spheres in agar, $g=0.97$, 0.3 mm – 1 mm thick)

Average space-angle scattering response to pencil beam



Directly measured shift/tilt correlations



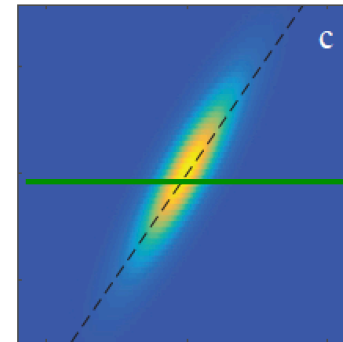
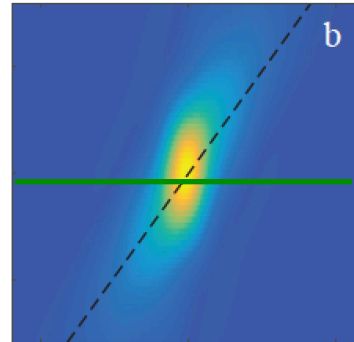
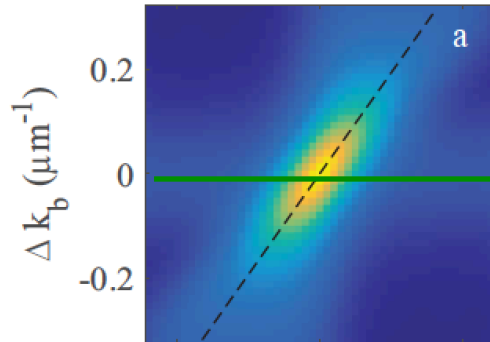
Directly measured shift/tilt correlations

0.3 mm thick

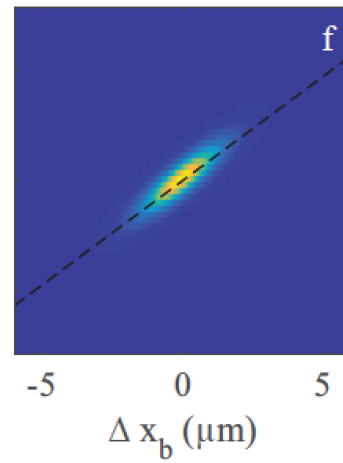
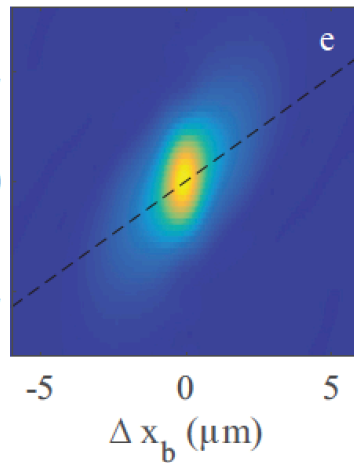
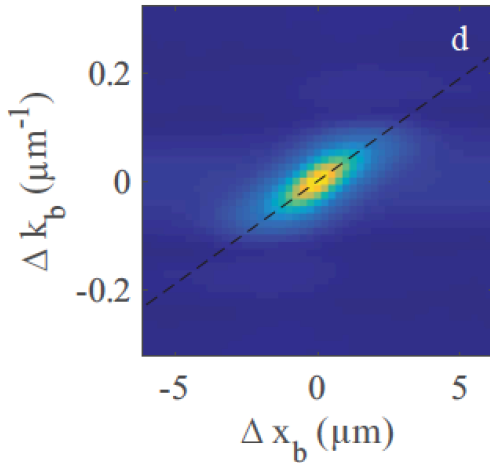
Direct measurement

FT_{2D} of $\langle P(x_b, k_b) \rangle$

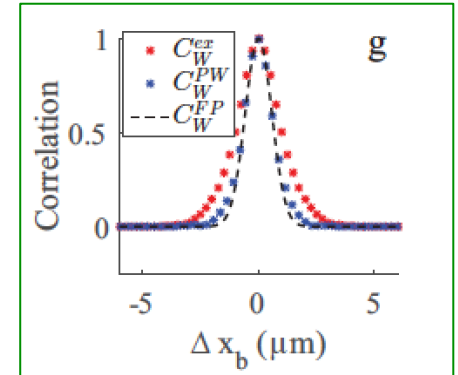
Simple simulation



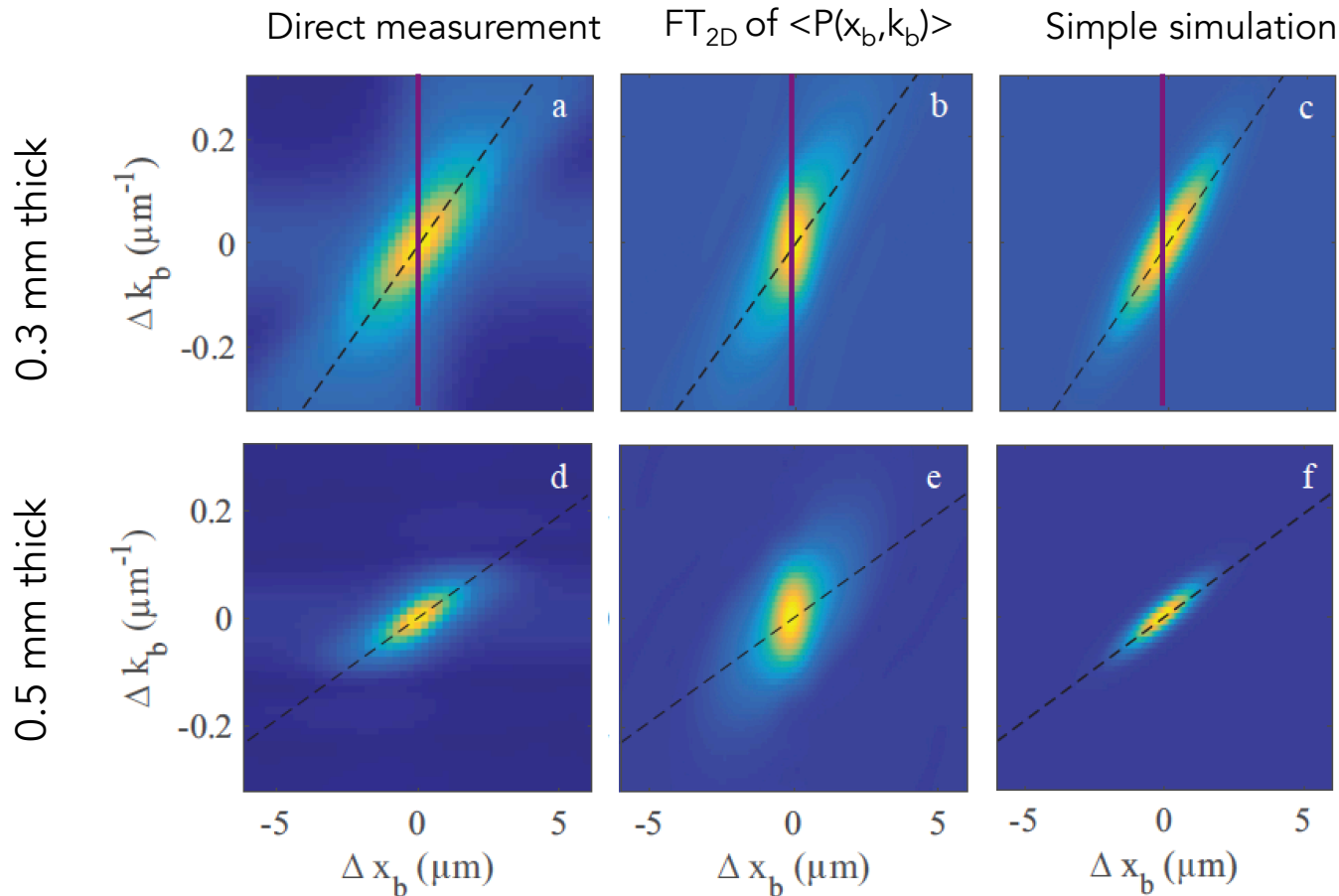
0.5 mm thick



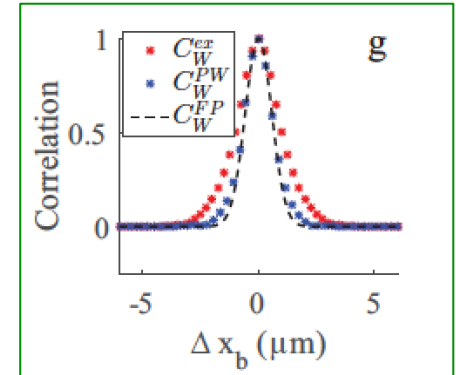
Shift-shift



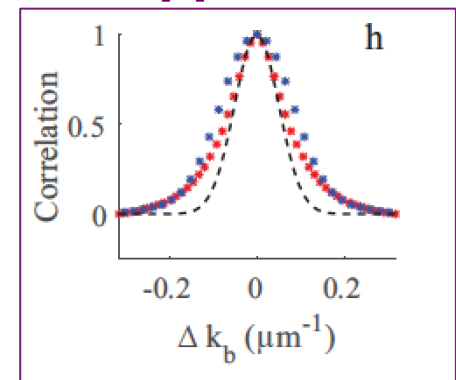
Directly measured shift/tilt correlations



Shift-shift

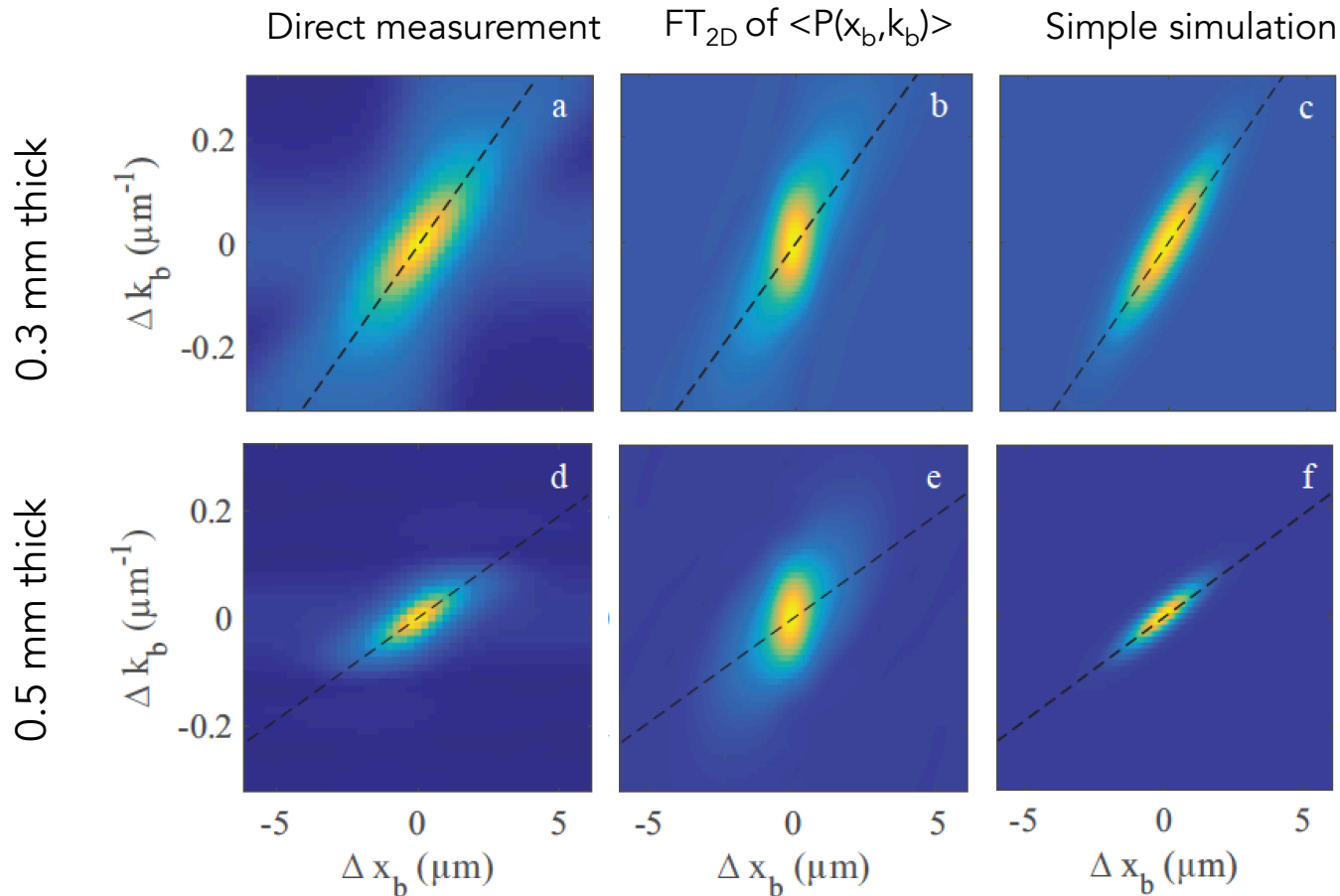


Tilt/tilt[1]

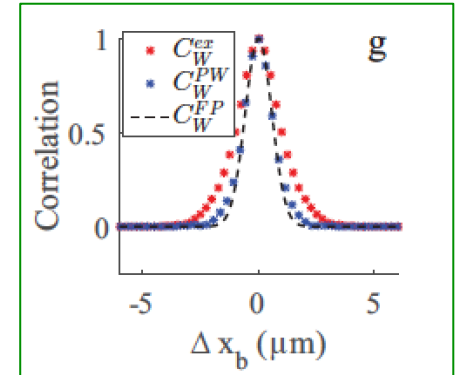


[1] S. Schott et al., "Characterization of the angular memory effect of scattered light in biological tissue," Opt. Express (2015)

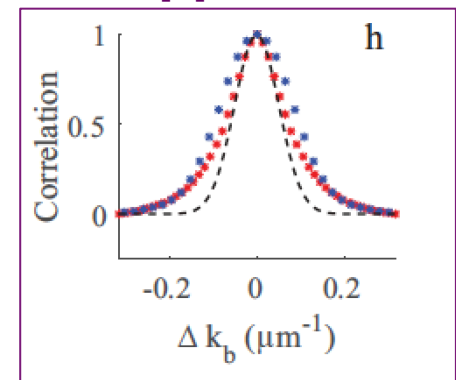
Directly measured shift/tilt correlations



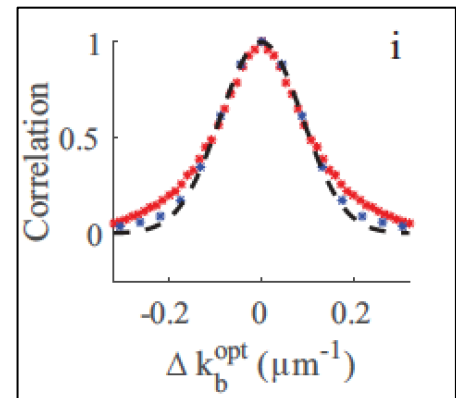
Shift-shift



Tilt/tilt[1]

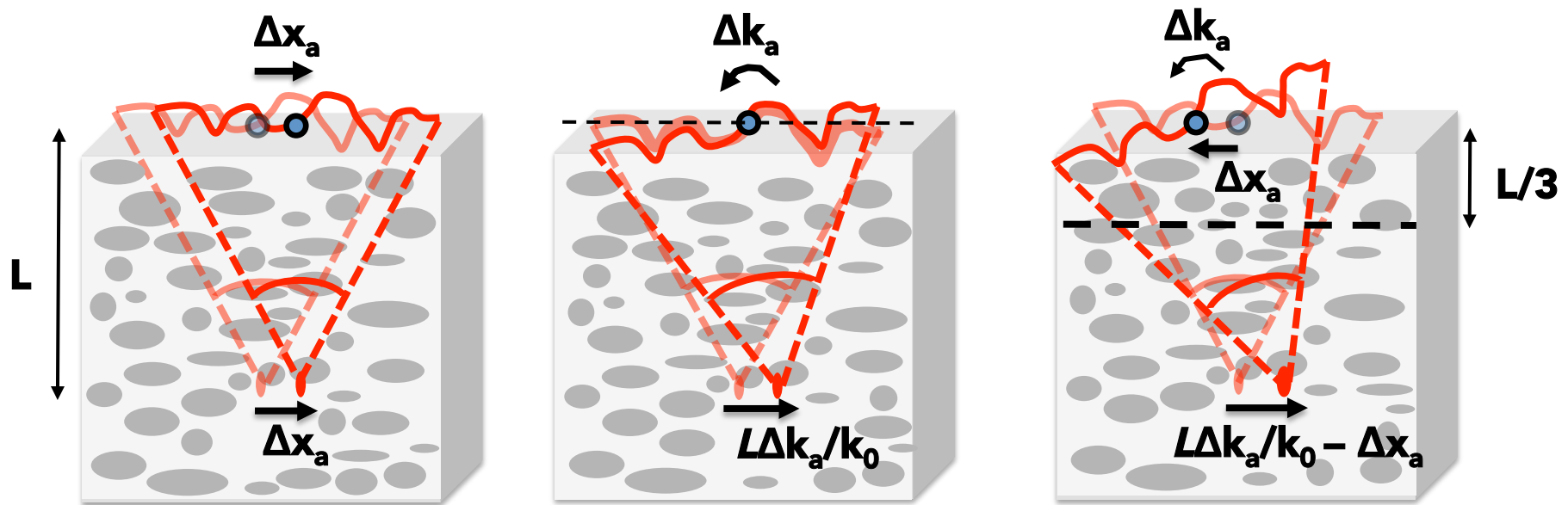


Optimal shift/tilt



[1] S. Schott et al., "Characterization of the angular memory effect of scattered light in biological tissue," Opt. Express (2015)

Scanning distances and the optimal rotation plane

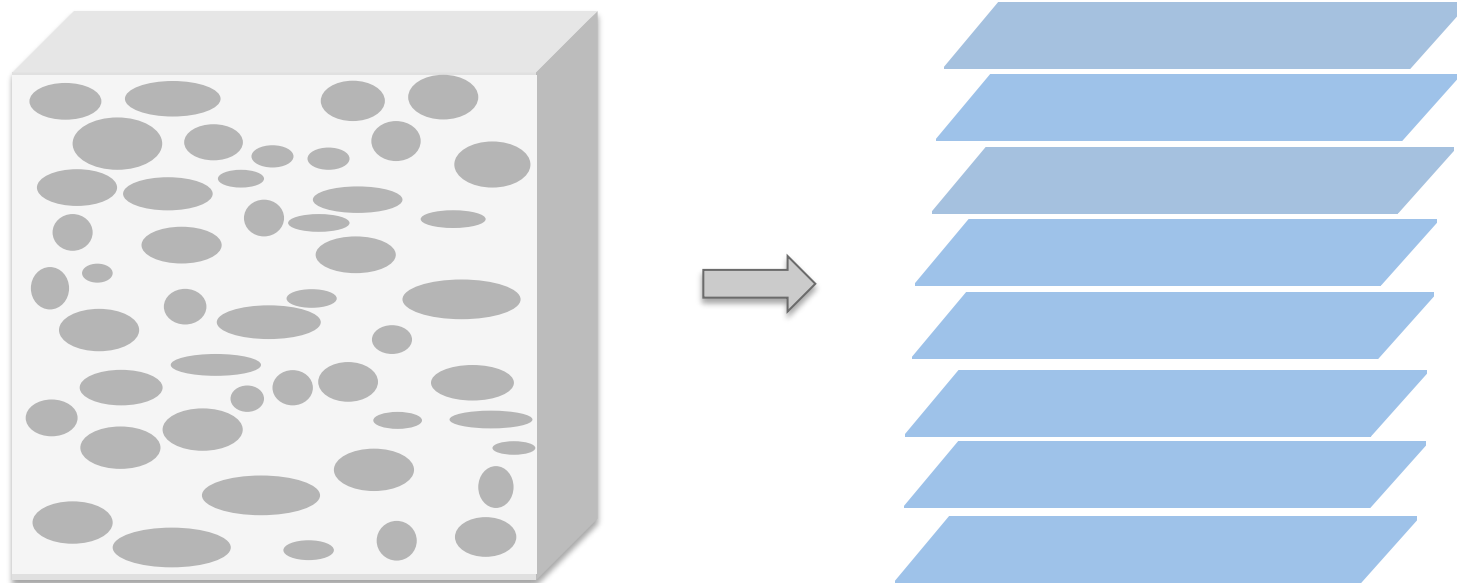


Optimally tilt and shift =
Tilt around plane **$L/3$** deep

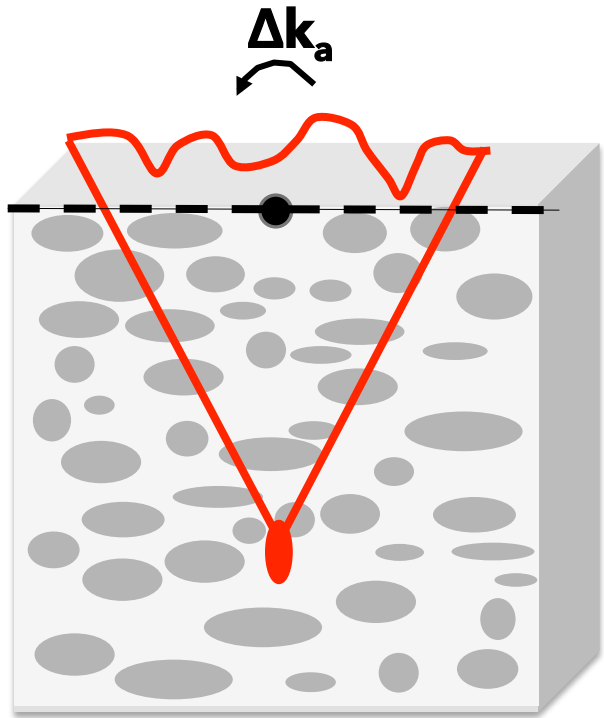
Memory effect	Adaptive Optics	Tilt plane	Scan range
Shift	Pupil	$-\infty$	$\sqrt{2\ell_{tr}/k_0^2 L}$
Tilt	Surface Conjugate	0	$\sqrt{6\ell_{tr}/k_0^2 L}$
Generalized	Sample Conjugate	$L/3$	$\sqrt{8\ell_{tr}/k_0^2 L}$

Why is $L/3$ optimal? An intuitive picture

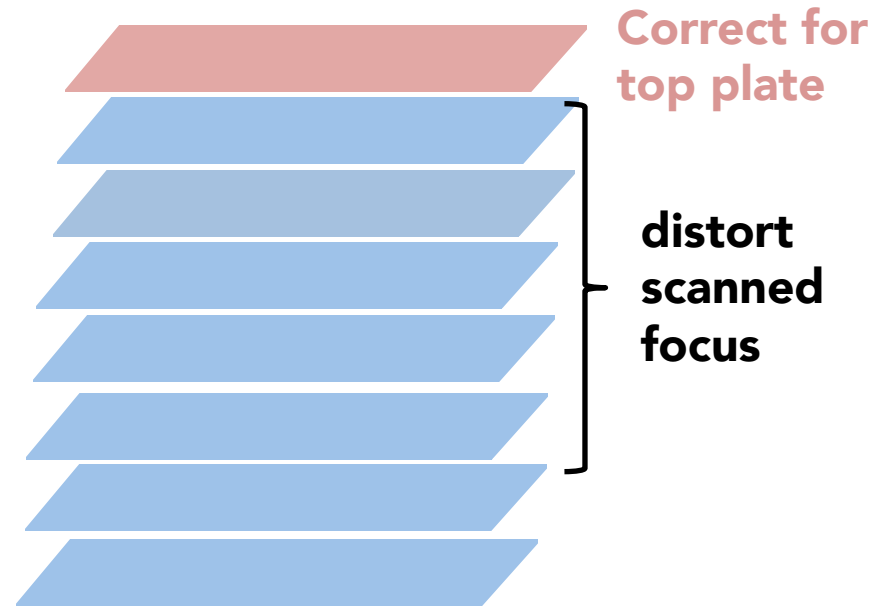
Stack of semi-random phase plates



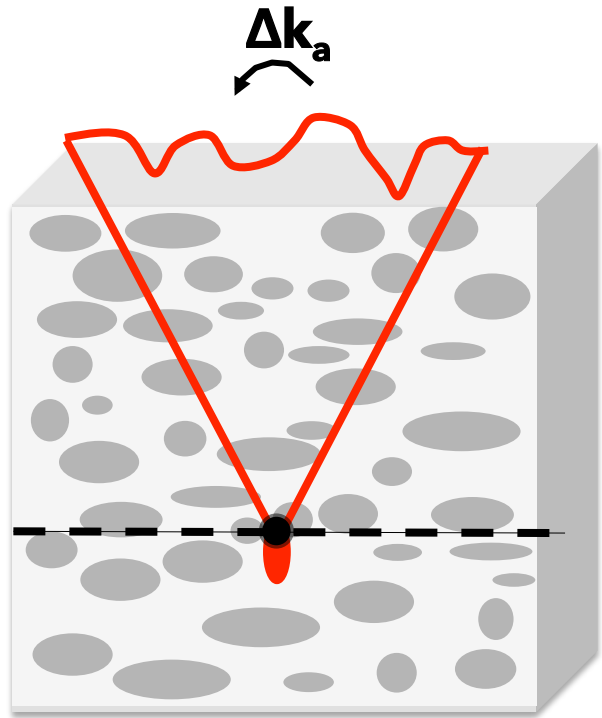
Why is $L/3$ optimal? An intuitive picture



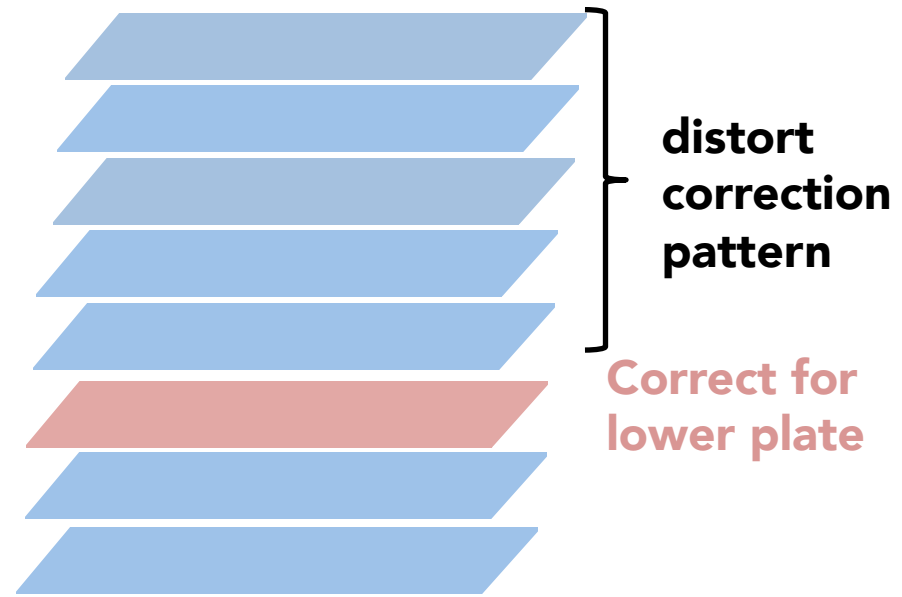
Stack of semi-random phase plates



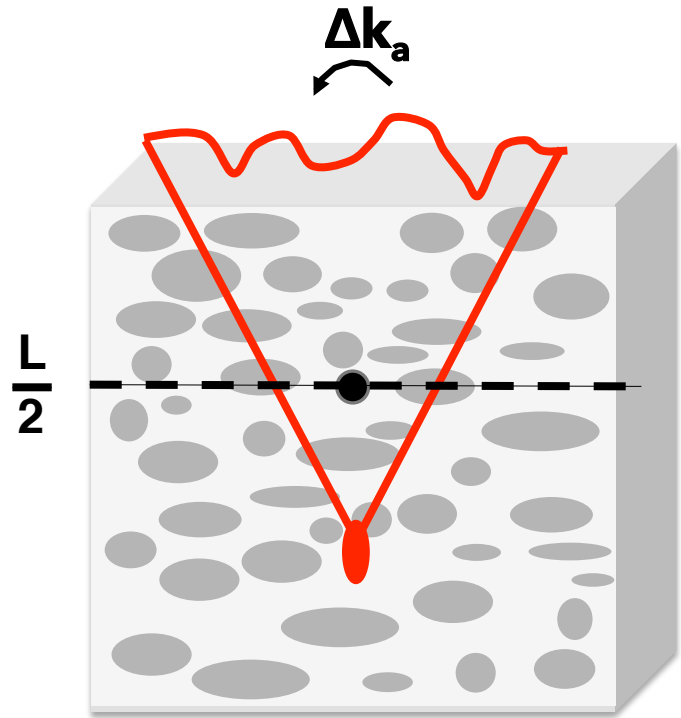
Why is $L/3$ optimal? An intuitive picture



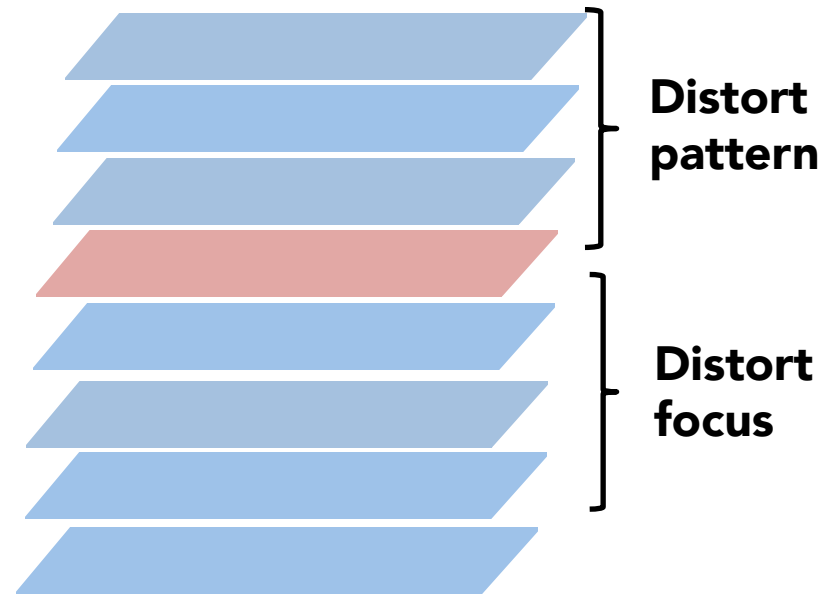
Stack of semi-random phase plates



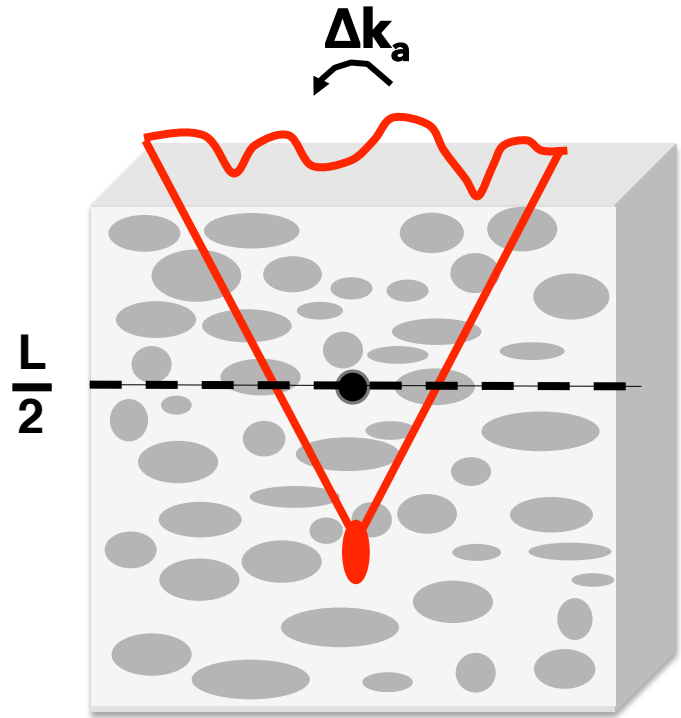
Why is $L/3$ optimal? An intuitive picture



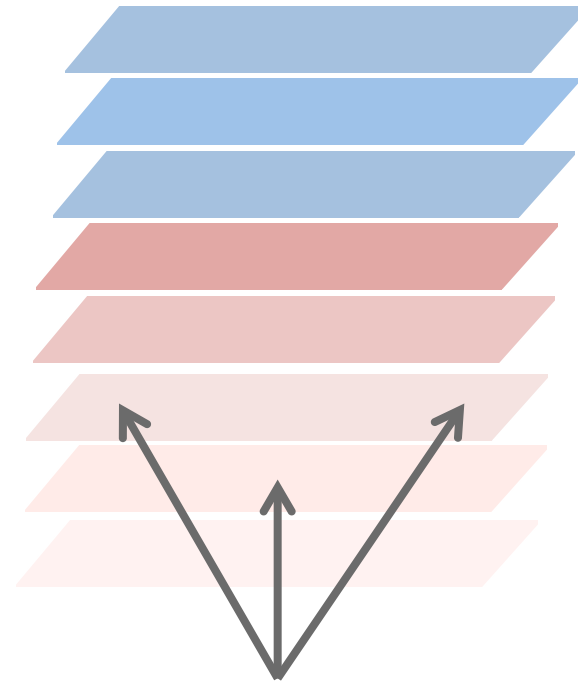
Stack of semi-random phase plates



Why is $L/3$ optimal? An intuitive picture

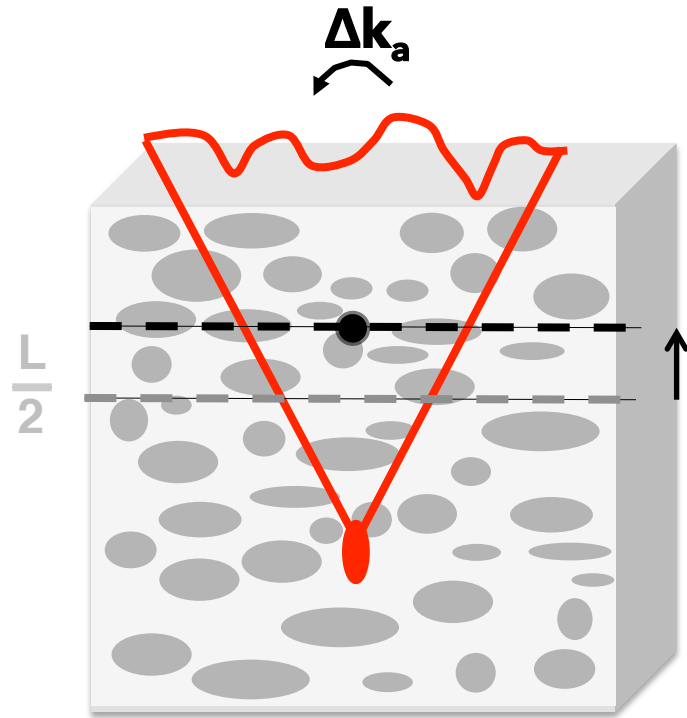


Stack of semi-random phase plates

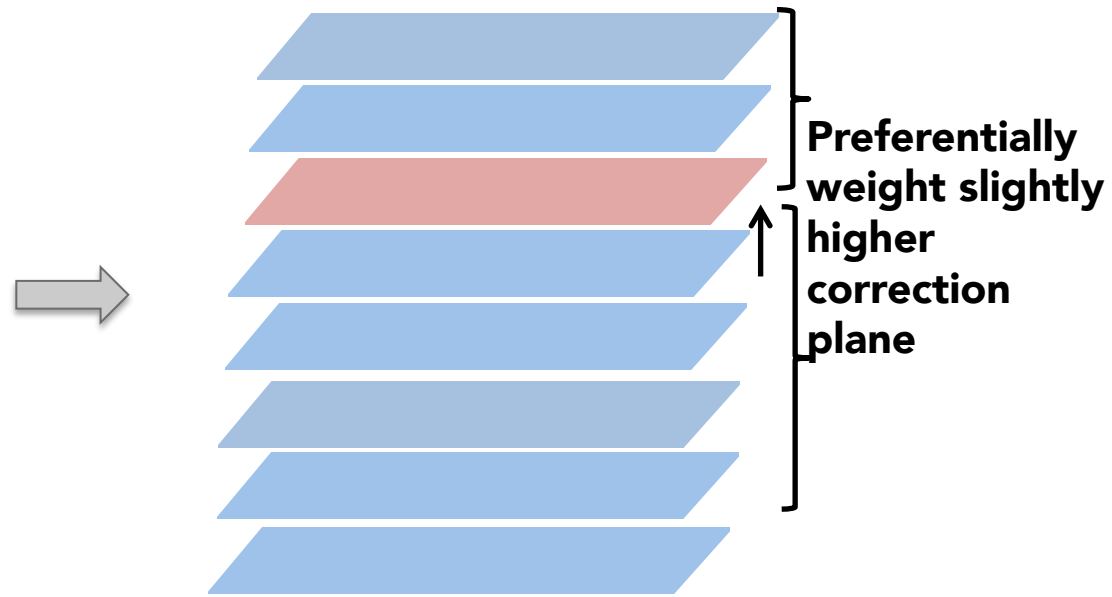


**Correcting
here also
corrects for
planes *after*
focus and at
edges**

Why is $L/3$ optimal? An intuitive picture

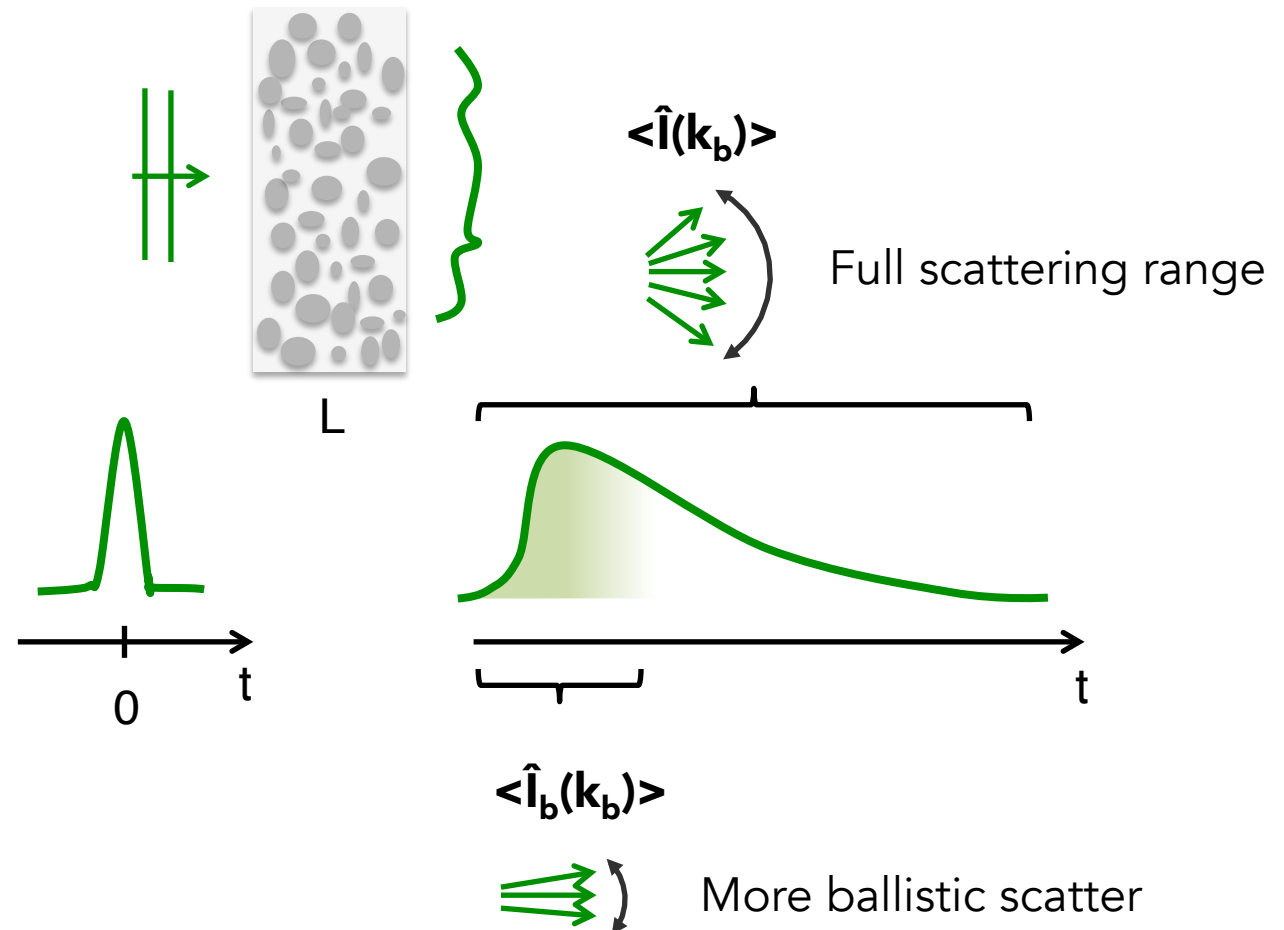


Stack of semi-random phase plates



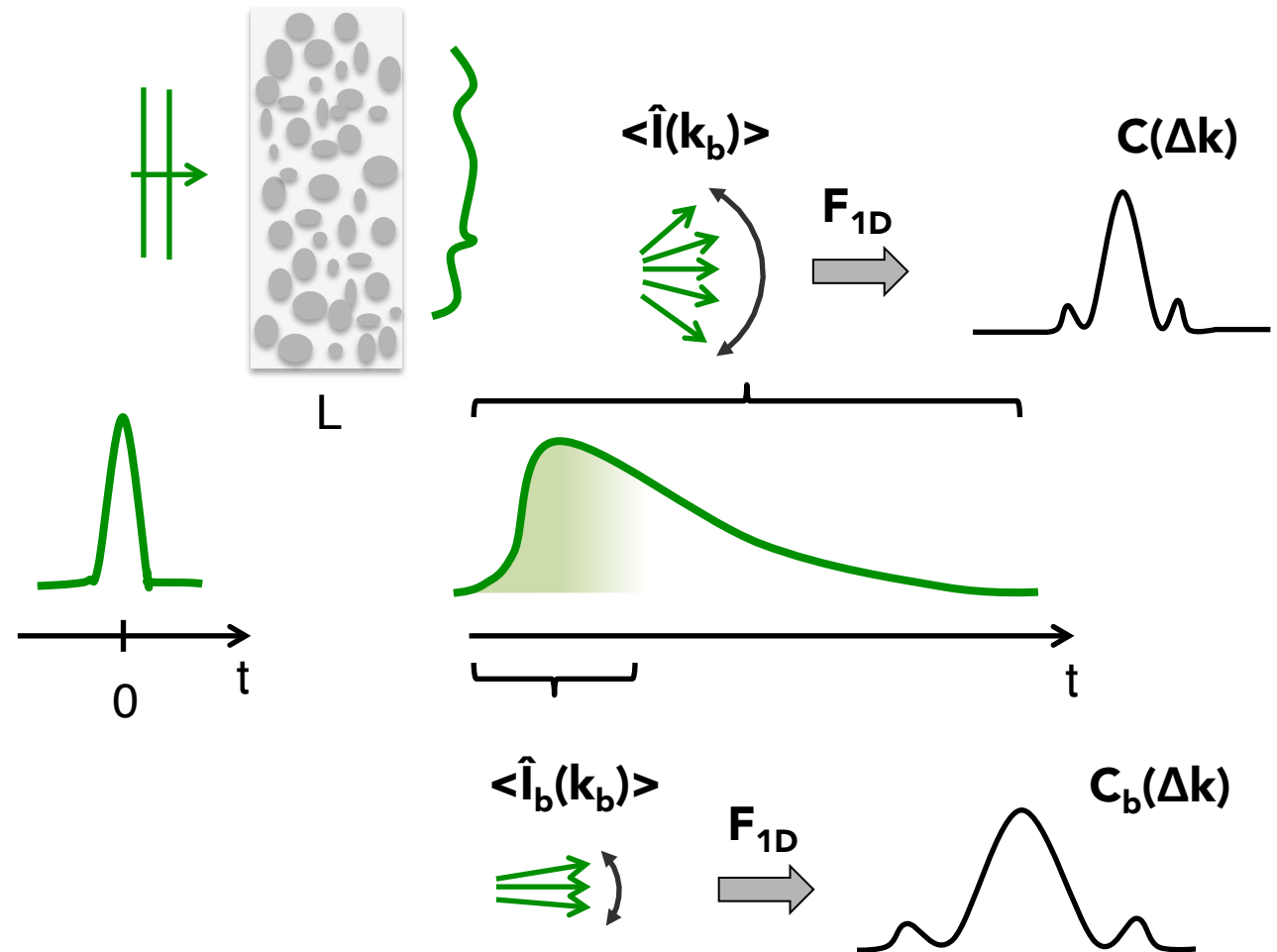
Towards a larger memory effect with time gating

- Goal: select early arriving "snake" photons for scanning

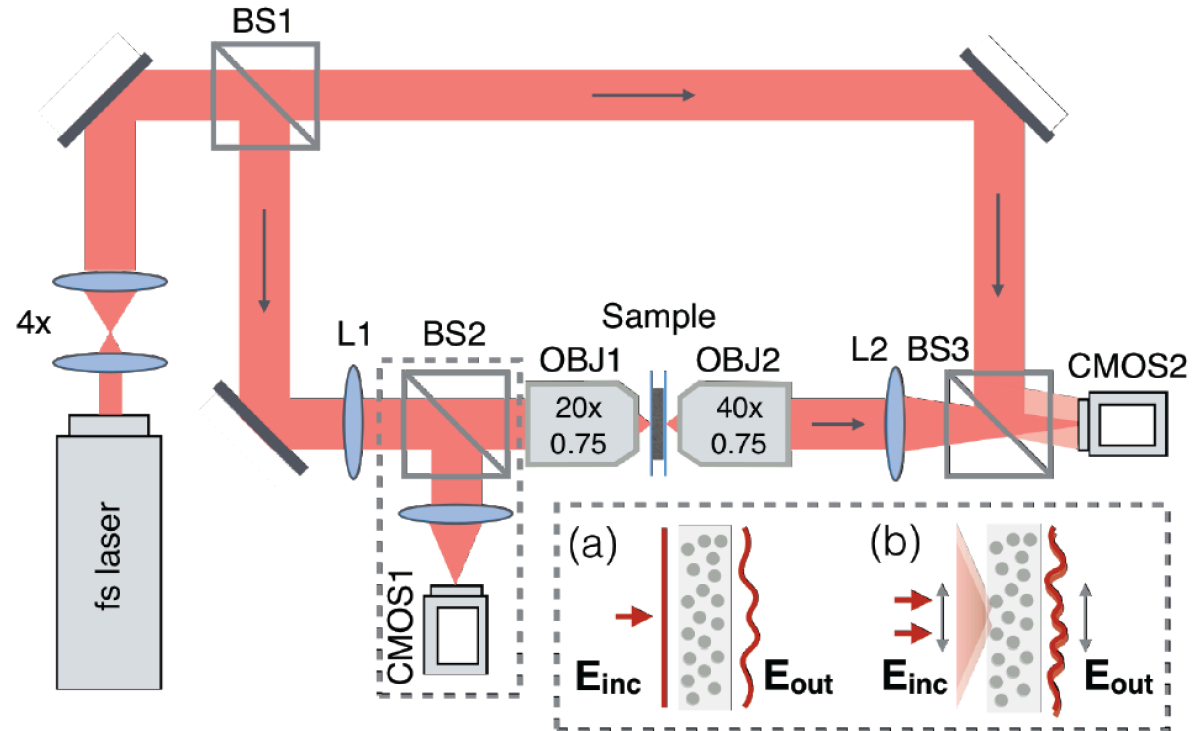


Towards a larger memory effect with time gating

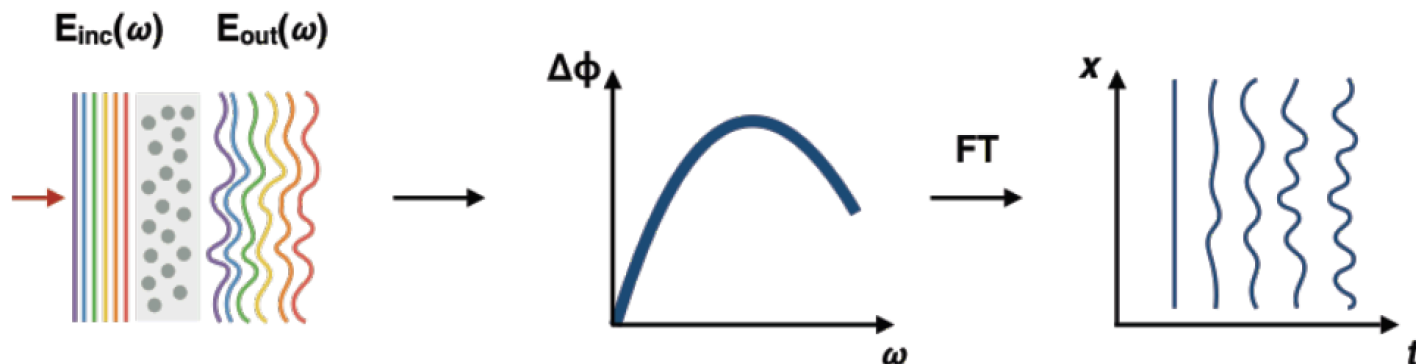
- Hypothesis: early arriving snake photons offer larger scan range



Experimental setup

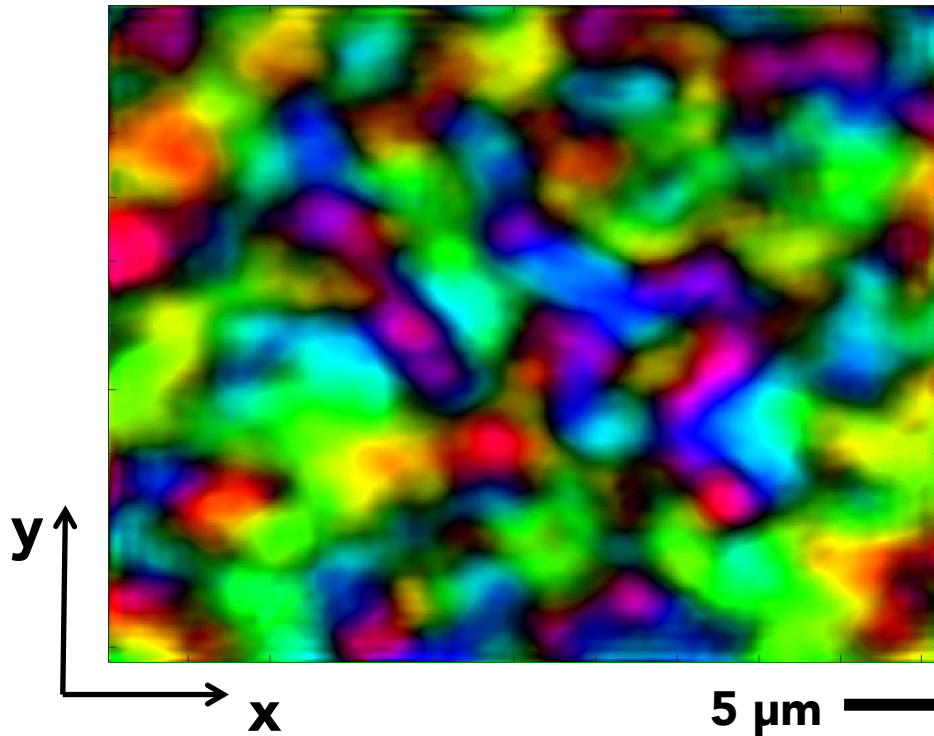


- Eventually obtained gating measurements in the spectral domain:

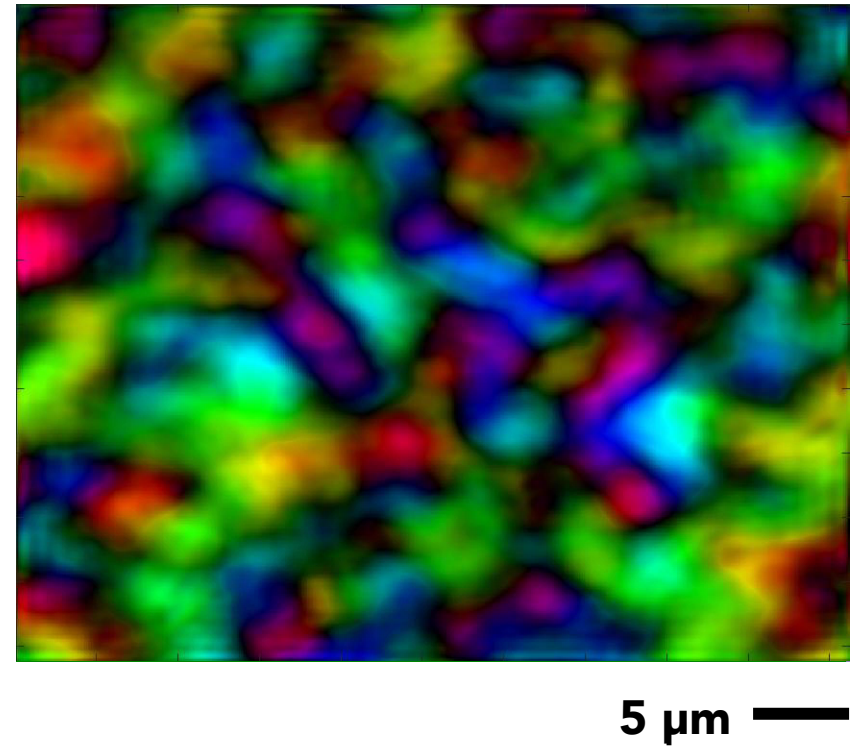


Ultrafast speckle evolution over space

Un-normalized



Normalized

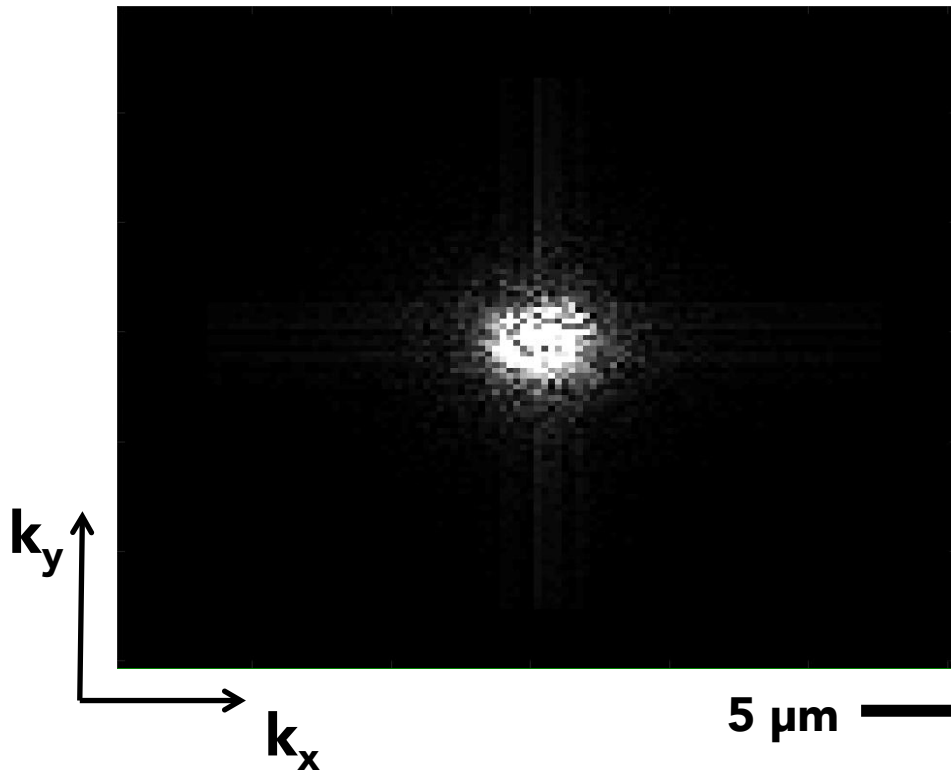


- Time step per frame: 8.5 femtoseconds
- 360 μm thick tissue phantom

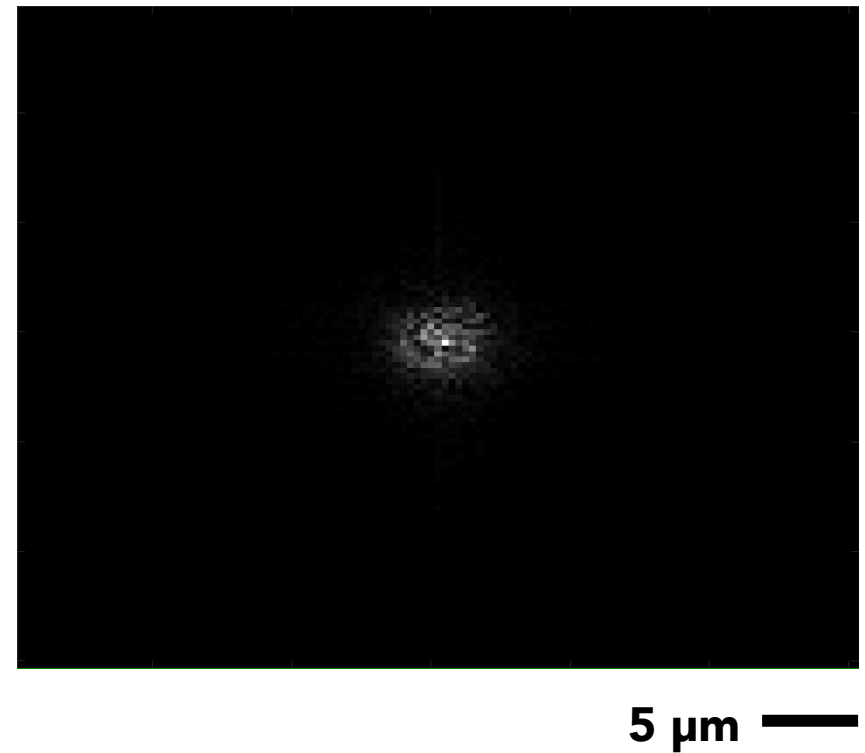


Ultrafast speckle evolution over wavevector

k-space, un-normalized

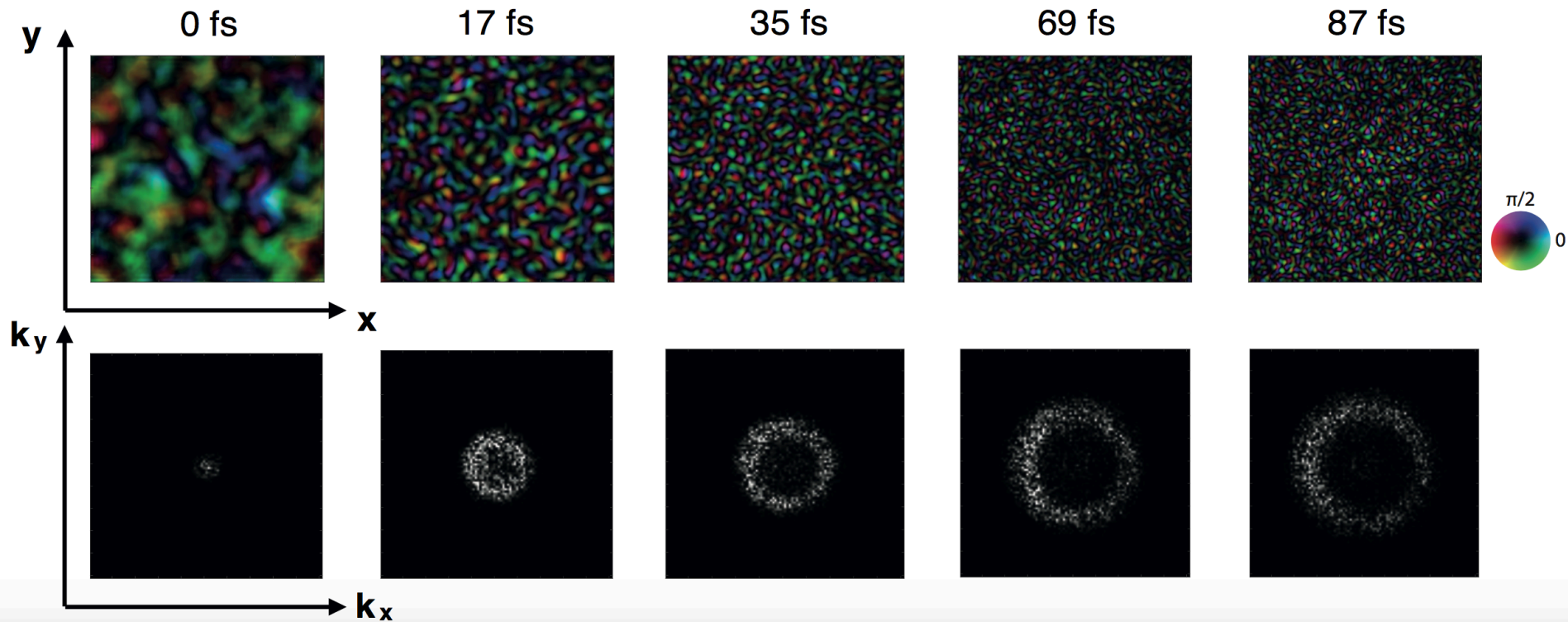


k-space, normalized

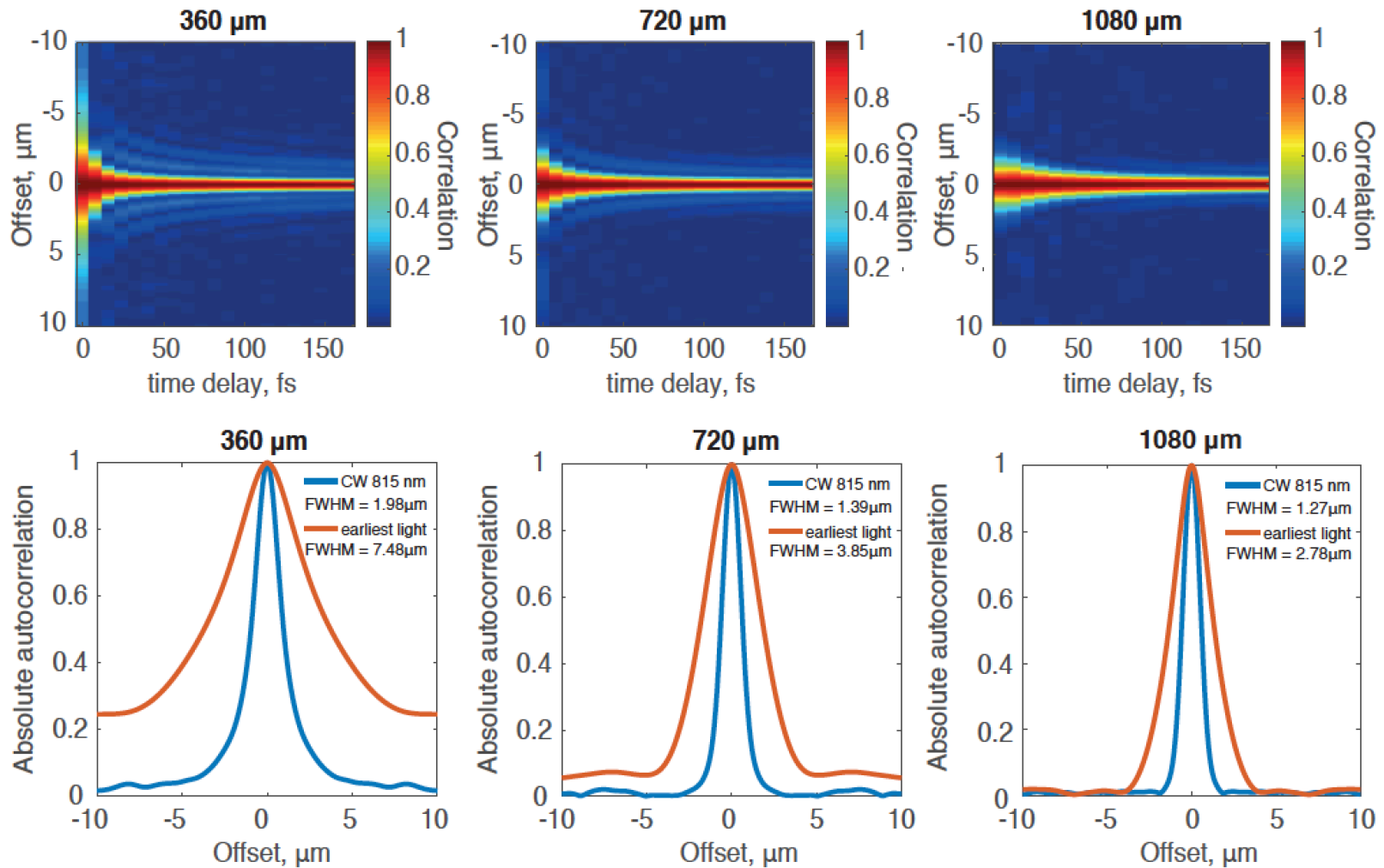


- Time step per frame: 8.5 femtoseconds
- $360\ \mu\text{m}$ thick tissue phantom

Ultrafast speckle evolution over space and wavevector

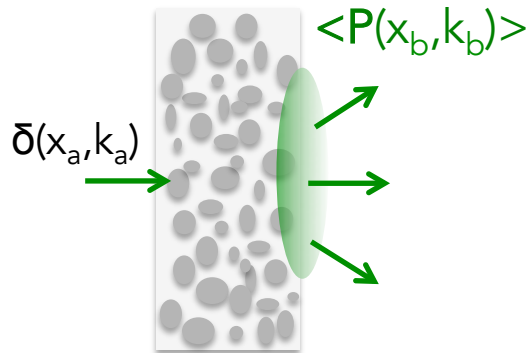


Time gating extends the shift-shift memory effect 3-4X

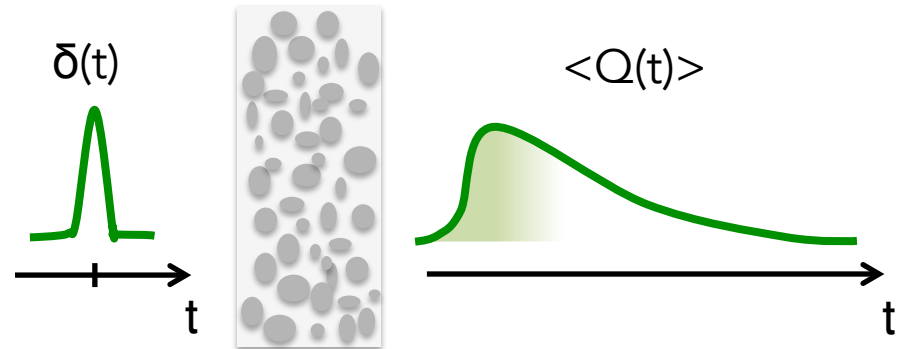


To do: Put all of this together

Shift/tilt memory effect



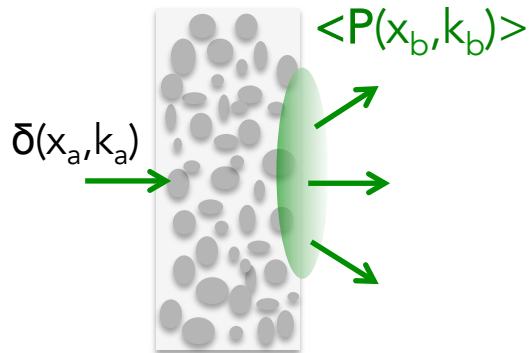
Time gating



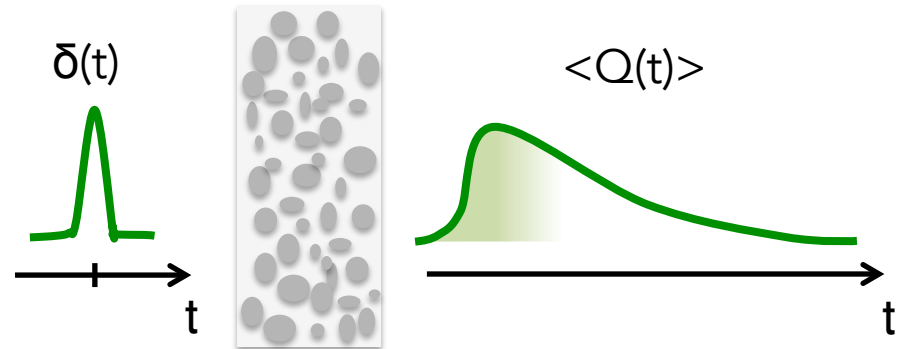
1. Combine above: $\mathcal{F} [\langle P(x_b, k_b, t_b, \omega_b) \rangle] \rightarrow C(\Delta k, \Delta x, \Delta \omega, \Delta t) \quad ?$

To do: Put all of this together

Shift/tilt memory effect

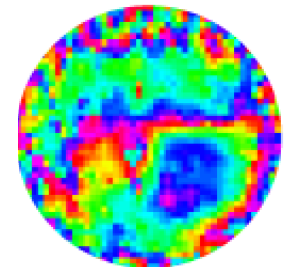
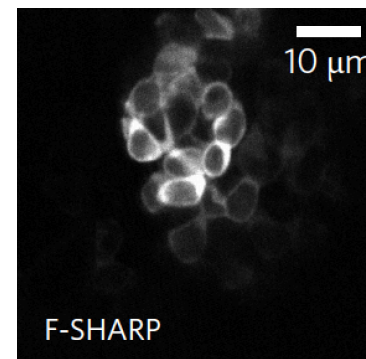
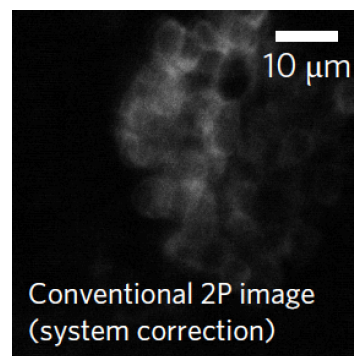


Time gating



1. Combine above: $\mathcal{F} [\langle P(x_b, k_b, t_b, \omega_b) \rangle] \rightarrow C(\Delta k, \Delta x, \Delta \omega, \Delta t) \quad ?$

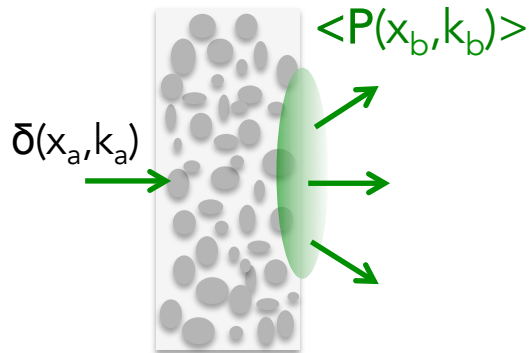
2. Implement
with F-Sharp¹



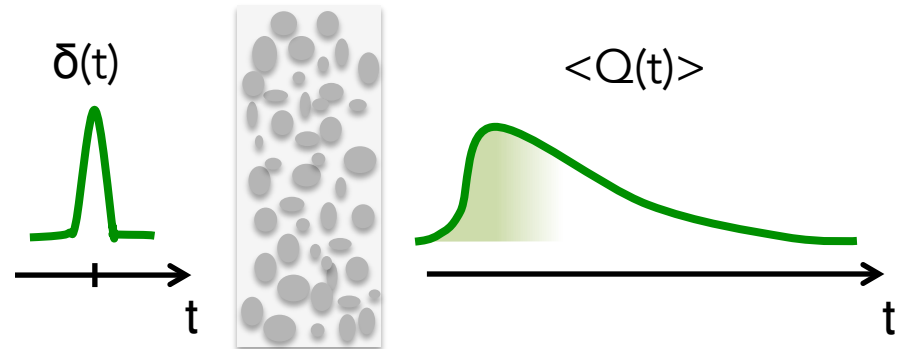
¹I. N. Papadopoulos et al., "Scattering compensation by focus scanning holographic aberration probing (F-SHARP)," Nature Photon. 2016

To do: Put all of this together

Shift/tilt memory effect

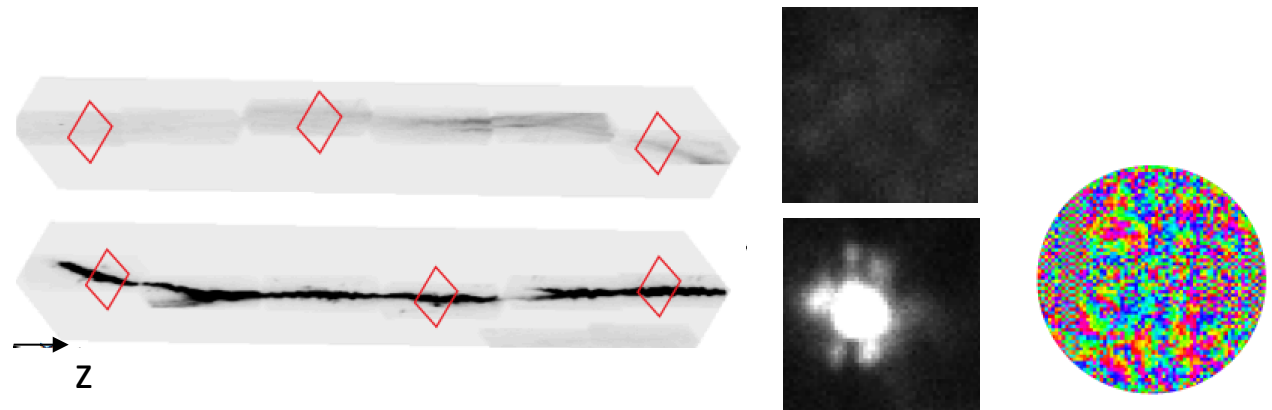


Time gating



1. Combine above: $\mathcal{F} [\langle P(x_b, k_b, t_b, \omega_b) \rangle] \rightarrow C(\Delta k, \Delta x, \Delta \omega, \Delta t) \quad ?$

2. Implement with F-Sharp¹



¹I. N. Papadopoulos et al., "Scattering compensation by focus scanning holographic aberration probing (F-SHARP)," Nature Photon. 2016

Thank you!

Joint work with:

University of Twente:

Gerwin Osnabrugge

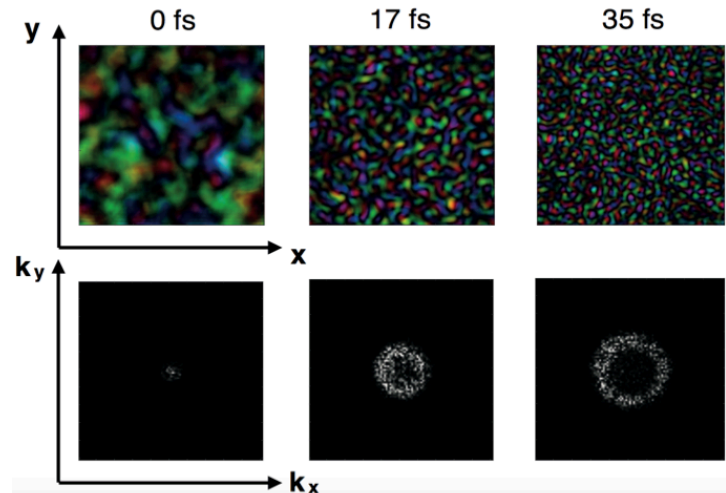
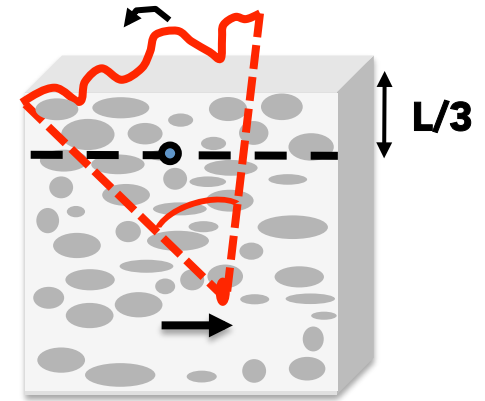
Ivo M. Vellekoop

Charité Medical School:

Yiannis Papadopoulos

Nick Kadobianskyi

Benjamin Judkewitz



2018: starting as an assistant professor in Duke University's Biomedical Engineering Department, contact me if you'd like to chat!

Quick derivation of L/3 depth:

Fokker-Plank model for correlation in anisotropic scatterer:

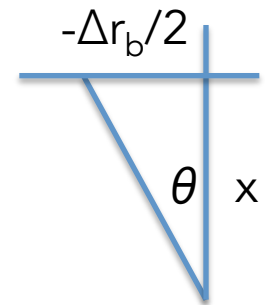
$$C_W^{FP}(\Delta \mathbf{r}_b, \Delta \mathbf{k}_b) = \exp \left(-\frac{L^3 k_0^2}{2\ell_{tr}} \left[\frac{|\Delta \mathbf{k}_b|^2}{3k_0^2} - \frac{\Delta \mathbf{k}_b \cdot \Delta \mathbf{r}_b}{k_0 L} + \frac{|\Delta \mathbf{r}_b|^2}{L^2} \right] \right). \quad (10)$$

Find optimal $\Delta \mathbf{k}_b$: take derivative w.r.t. $\Delta \mathbf{k}_b$ and set to 0:

$$\Delta \mathbf{k}_b^{opt} = \frac{3k_0 \Delta \mathbf{r}_b}{2L}.$$

Use $\Delta k_a = \Delta k_b$ and $\Delta r_b = \Delta r_a + \Delta k_a k_0 / L$:

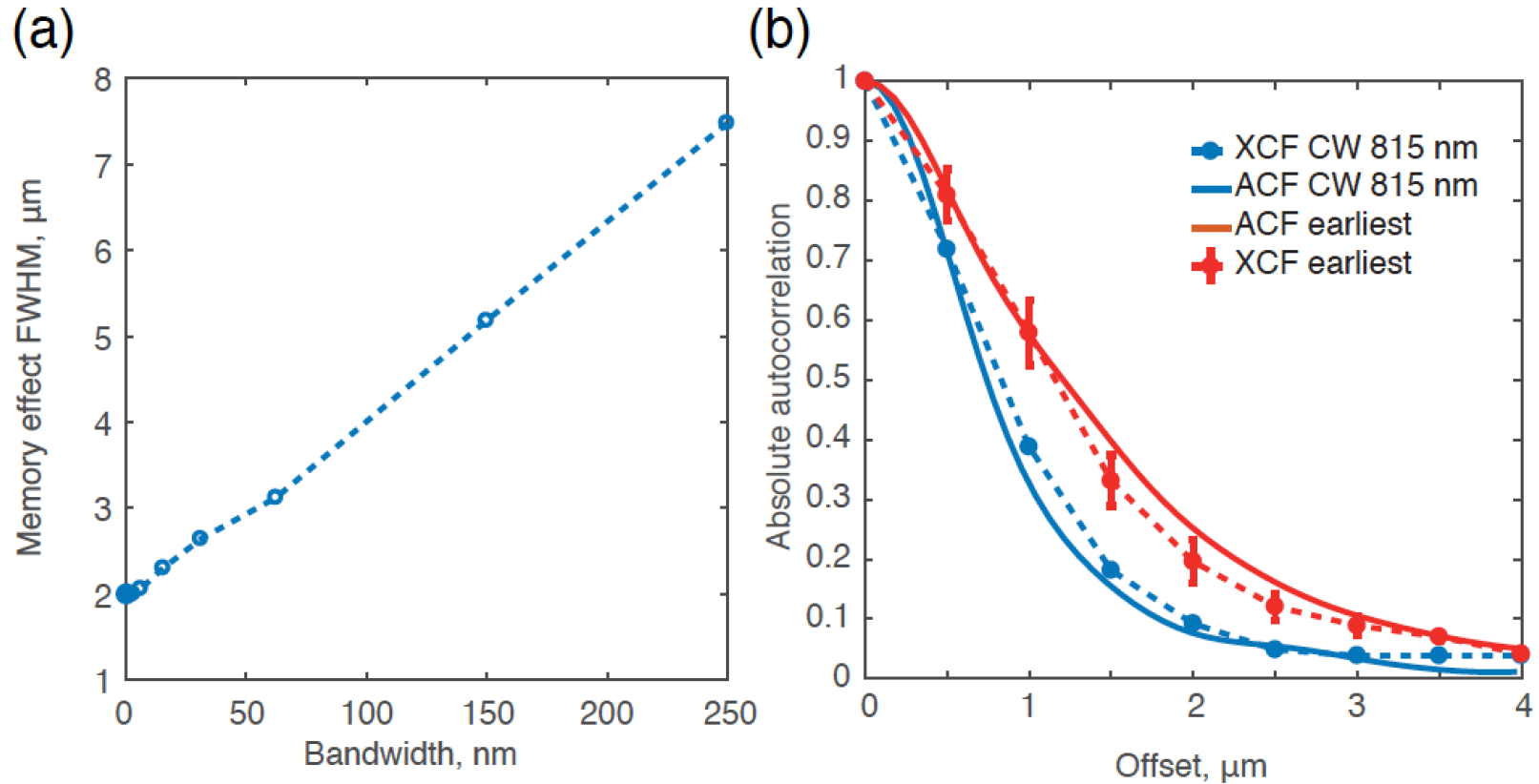
$$\Delta \mathbf{k}_a^{opt} = \frac{3k_0 \Delta \mathbf{r}_b}{2L} \text{ and } \Delta \mathbf{r}_a^{opt} = -\Delta \mathbf{r}_b / 2$$



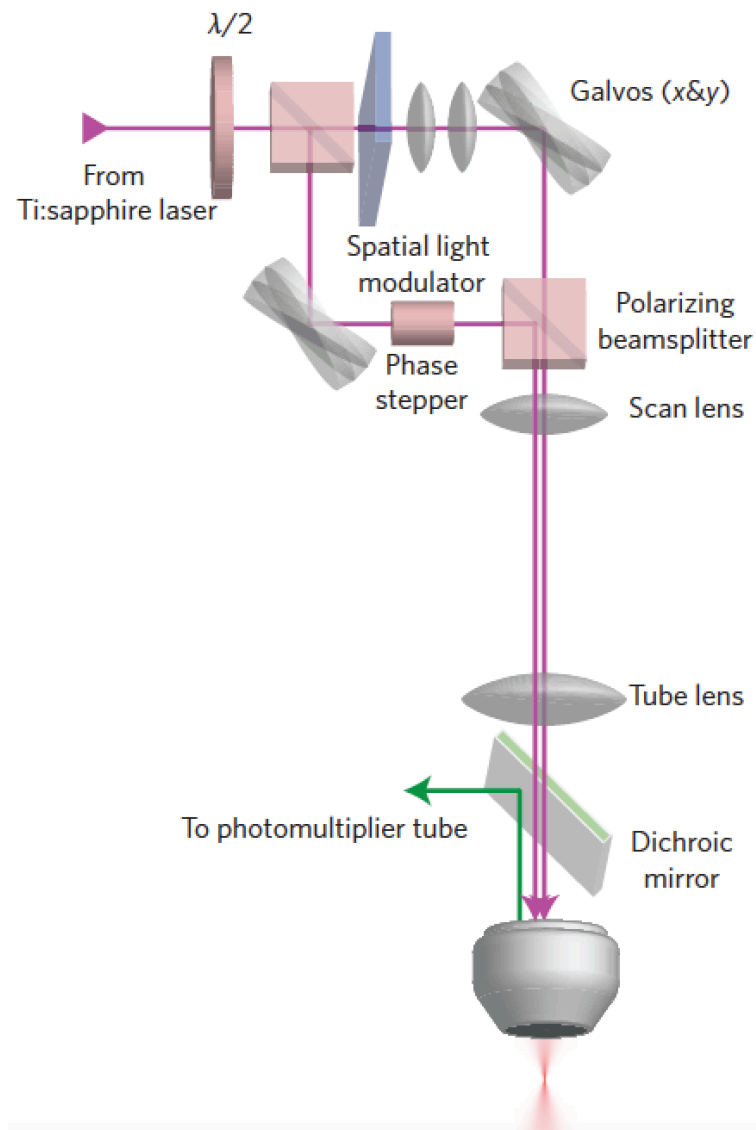
$$\tan(\theta) \sim \theta = (1/k_0) * 3k_0 \Delta r_b / 2L = \Delta r_b / 2x$$

$$x = \Delta r_b / 2 * 2L / 3\Delta r_b = L/3$$

Time gating shift/shift correlations with physical shifting



Principle of F-Sharp



$$|E_{\text{PSF}}(x)|^4 * \text{Object}(x) = \text{Image}(x)$$

F-SHARP microscopy

$$\underbrace{|E_{\text{PSF}}(x)|^3 e^{-j\phi_{\text{PSF}}(x)}}_{\sim \delta(x)} * E_{\text{PSF}}(x) = \underbrace{E_{\text{recon}}(x)}_{\sim E_{\text{PSF}}(x)}$$

Evolution of corrected strong beam after every correction step

