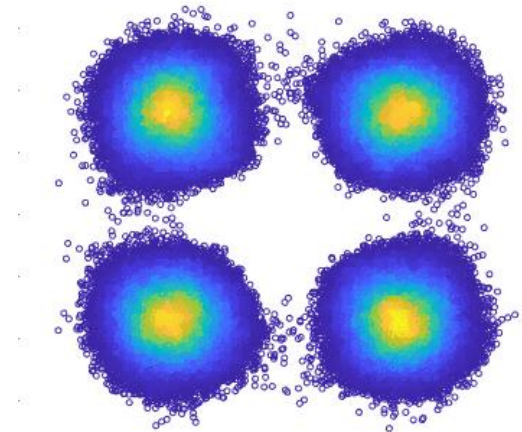
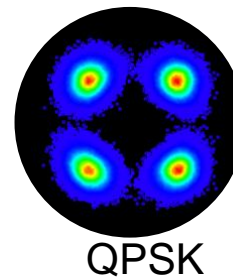


# Modal Wavefront Sensorless Adaptive Optics with Karhunen–Loève Functions

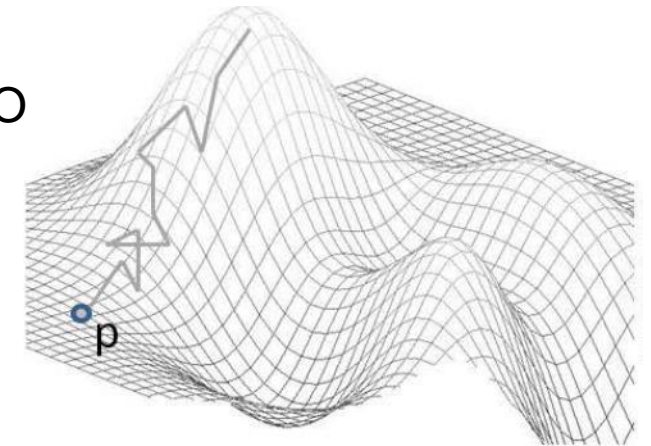
Max Segel, Douglas McDonald and Szymon Gladysz

Fraunhofer Institute of Optronics, System Technologies and Image Exploitation, Ettlingen, Germany



# Outline

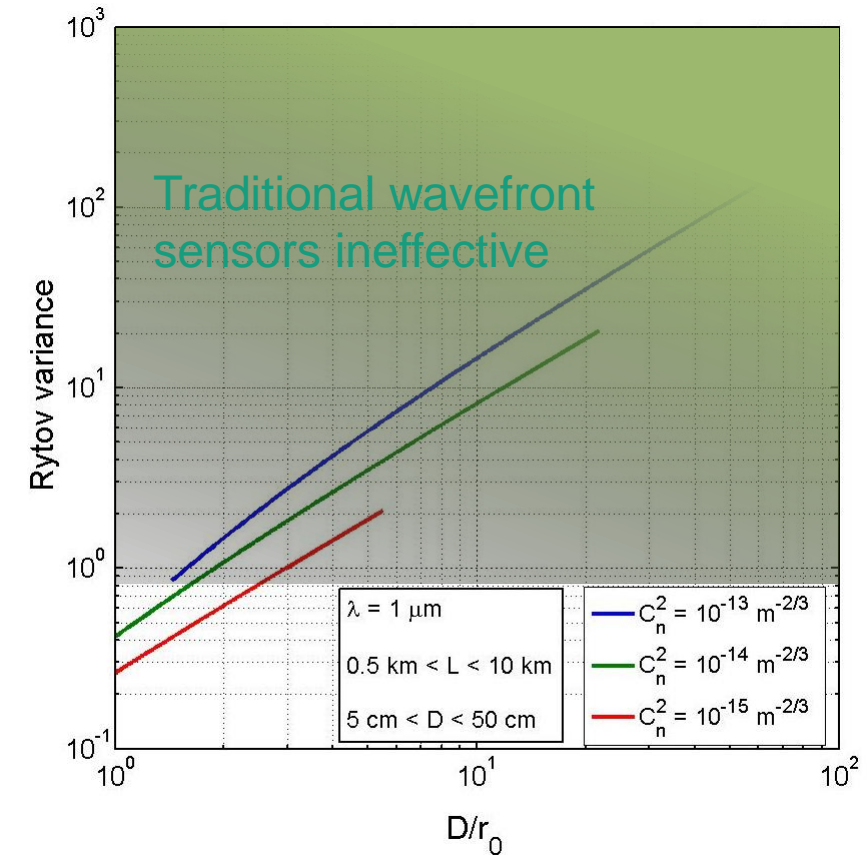
- Why sensorless adaptive optics (AO)?
- Mean squared error minimized wavefront (WF) decomposition in Kolmogorov turbulence
  - Modal decomposition and residuals
  - Karhunen-Loève modes (KL)
- Simulations
  - Turbulence and modal stochastic parallel gradient descent framework (SPGD)
  - Convergence analysis
  - Optima analysis
- 6.3 GBit/s free-space optical (FSO) communication link with sensorless AO
  - Experimental framework
  - Bit error rate (BER) evaluation
- Conclusion & outlook



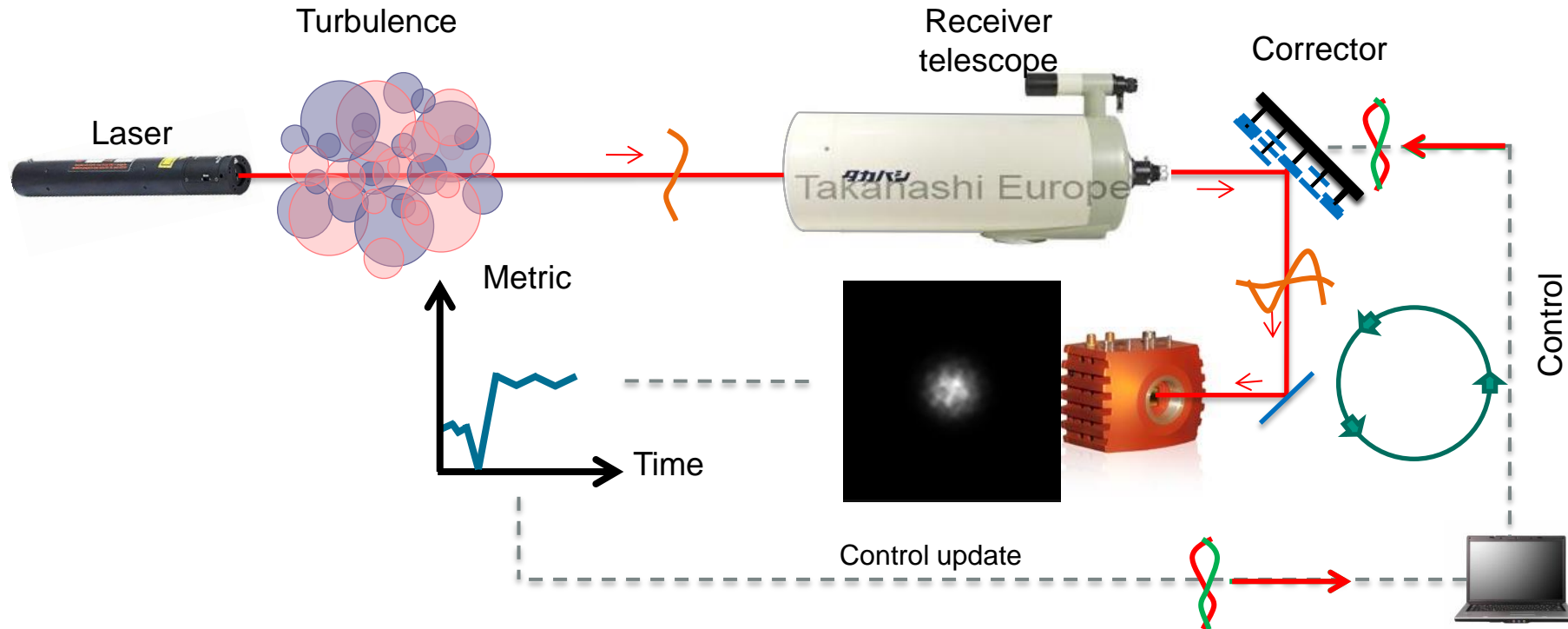
# Why sensorless adaptive optics ?

Barchers et al., Appl. Opt., 2002

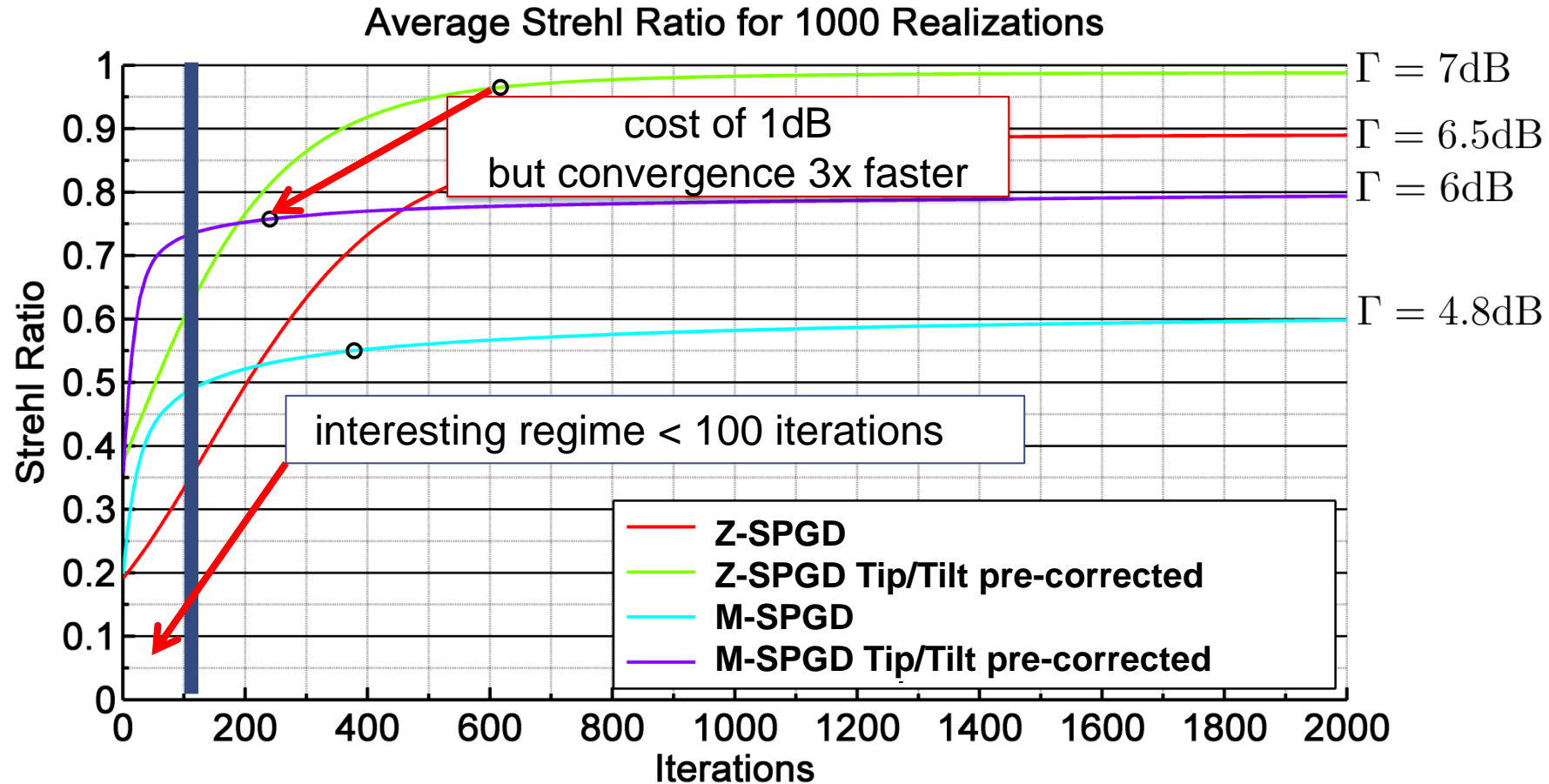
- Free-space optical communication is all about power
  - Link budget, antenna gain, propagation losses
  - Receiver sensitivity, error resilience
- Traditional WF sensing methods require energy redirection  
-> already limited resource diminished even more
- Gradient-based sensorless AO
  - Communication detector metric is evaluated
  - Higher scintillation resilience
  - Low-level hardware implementation enables woofer-tweeter system without power loss
- But: high correction bandwidth demand -> Focus on improving convergence speed



# Sensorless AO concept for free-space optical communications



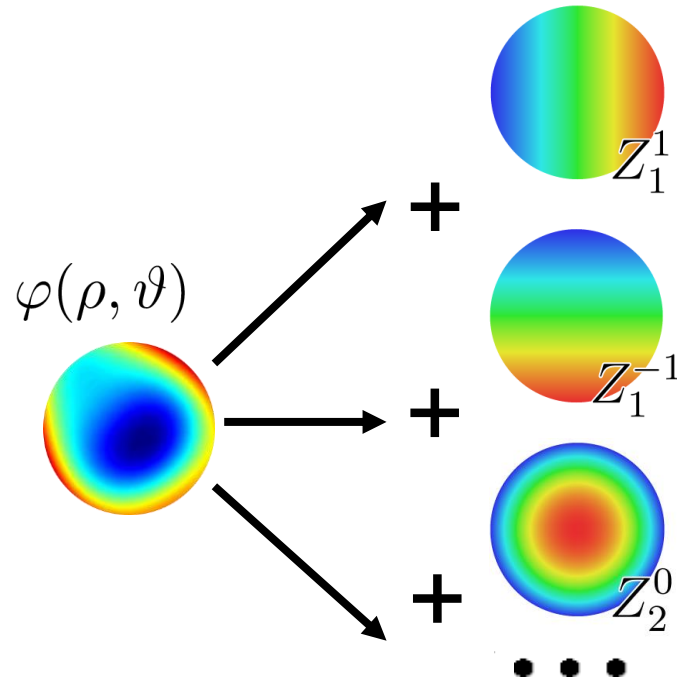
# Zonal-SPGD (Z-SPGD) vs. Modal (M-SPGD) comparison



- ➡ Z-SPGD (M. Vorontsov) slower but more reliable
- ➡ M-SPGD sacrifices performance for speed

# Modal decomposition and residual error analysis

## ■ Decomposition:



## Zernike polynomials and atmospheric turbulence\*

Robert J. Noll

*The Perkin-Elmer Corporation, Norwalk, Connecticut 06856*

(Received 3 October 1975)

This paper discusses some general properties of Zernike polynomials, such as their Fourier transforms, integral representations, and derivatives. A Zernike representation of the Kolmogoroff spectrum of turbulence is given that provides a complete analytical description of the number of independent corrections required in a wave-front compensation system.

$$Z_j(r, \vartheta) = \sqrt{n+1} R_n^m(r) \cos m\vartheta, \quad m \neq 0, \quad j \text{ even}$$

$$Z_j(r, \vartheta) = \sqrt{n+1} R_n^m(r) \sin m\vartheta, \quad m \neq 0, \quad j \text{ odd}$$

$$Z_j(r, \vartheta) = \sqrt{n+1} R_n^0(r), \quad m = 0$$

$$R_n^m(r) = \sum_{k=0}^{(n-m)/2} \frac{(-1)^k (n-m)!}{k! \left(\frac{n+m}{2} - k\right)! \left(\frac{n-m}{2} - k\right)!} r^{n-2k}$$

$$\Delta_J = \langle \varphi^2 \rangle - \sum_{j=1}^J \langle |a_j|^2 \rangle$$

$\Delta_1 = 1.0299 (D/r_0)^{5/3}$	$\Delta_{12} = 0.0352 (D/r_0)^{5/3}$
$\Delta_2 = 0.582 (D/r_0)^{5/3}$	$\Delta_{13} = 0.0328 (D/r_0)^{5/3}$
$\Delta_3 = 0.134 (D/r_0)^{5/3}$	$\Delta_{14} = 0.0304 (D/r_0)^{5/3}$
$\Delta_4 = 0.111 (D/r_0)^{5/3}$	$\Delta_{15} = 0.0279 (D/r_0)^{5/3}$
$\Delta_5 = 0.0880 (D/r_0)^{5/3}$	$\Delta_{16} = 0.0267 (D/r_0)^{5/3}$
$\Delta_6 = 0.0648 (D/r_0)^{5/3}$	$\Delta_{17} = 0.0255 (D/r_0)^{5/3}$
$\Delta_7 = 0.0587 (D/r_0)^{5/3}$	$\Delta_{18} = 0.0243 (D/r_0)^{5/3}$
$\Delta_8 = 0.0525 (D/r_0)^{5/3}$	$\Delta_{19} = 0.0232 (D/r_0)^{5/3}$
$\Delta_9 = 0.0463 (D/r_0)^{5/3}$	$\Delta_{20} = 0.0220 (D/r_0)^{5/3}$
$\Delta_{10} = 0.0401 (D/r_0)^{5/3}$	$\Delta_{21} = 0.0208 (D/r_0)^{5/3}$
$\Delta_{11} = 0.0377 (D/r_0)^{5/3}$	



# Karhunen-Loève modes motivation

- Zernike modes are correlated
  - WF mode amplitude modifications coupled
  - Changing tilt -> coma changes as well
- Correlations are given in Noll's matrix  
(covariance between Zernike polynomials)
- KL mode -> independent coefficients (diagonal cov. matrix)
- Approach: diagonalize Noll's matrix  
-> obtain numerical expression for constructing  
KL from radial Zernike polynomials (N. Roddier 1990)

$$\begin{array}{c}
 \text{Noll's index } j \\
 \begin{array}{cccccccc}
 & 2 & 3 & 4 & 5 & 6 & 7 & 8 & 9 \\
 \begin{pmatrix}
 0,4536 & 0 & 0 & 0 & 0 & 0 & -0,0143 & 0 \\
 0 & 0,4536 & 0 & 0 & 0 & -0,0143 & 0 & 0 \\
 0 & 0 & 0,0235 & 0 & 0 & 0 & 0 & 0 \\
 0 & 0 & 0 & 0,0235 & 0 & 0 & 0 & 0 \\
 0 & 0 & 0 & 0 & 0,0235 & 0 & 0 & 0 \\
 0 & -0,0143 & 0 & 0 & 0 & 0,0063 & 0 & 0 \\
 -0,0143 & 0 & 0 & 0 & 0 & 0 & 0,0063 & 0 \\
 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0,0063
 \end{pmatrix}
 \end{array}
 \end{array}$$

(a) Noll's matrix

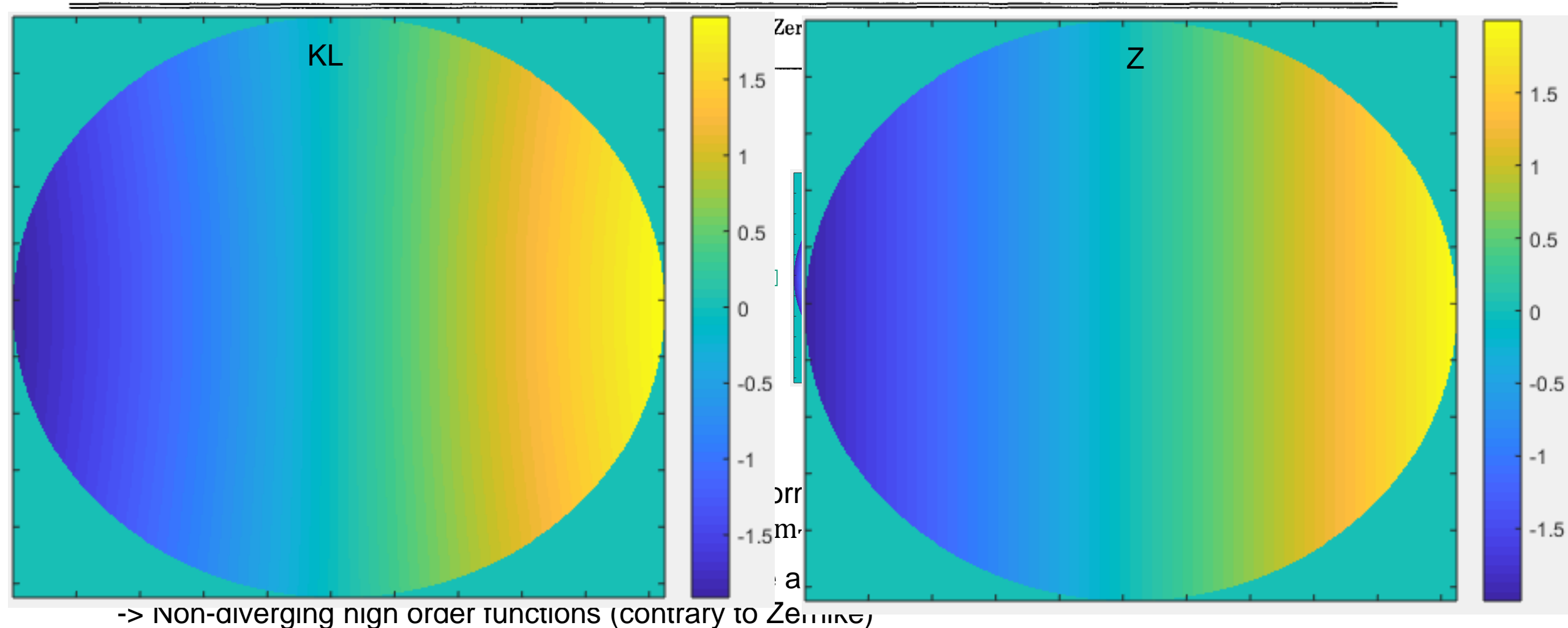


$$\begin{pmatrix}
 0,4541 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\
 0 & 0,4541 & 0 & 0 & 0 & 0 & 0 & 0 \\
 0 & 0 & 0,0242 & 0 & 0 & 0 & 0 & 0 \\
 0 & 0 & 0 & 0,0242 & 0 & 0 & 0 & 0 \\
 0 & 0 & 0 & 0 & 0,0242 & 0 & 0 & 0 \\
 0 & 0 & 0 & 0 & 0 & 0,0067 & 0 & 0 \\
 0 & 0 & 0 & 0 & 0 & 0 & 0,0067 & 0 \\
 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0,0067
 \end{pmatrix}$$

(b) KL covariance matrix

# Karhunen-Loève modes – conversion from Zernike

$$K_l(r, \vartheta) = R_p^q(r) \Theta_p^q(\vartheta)$$



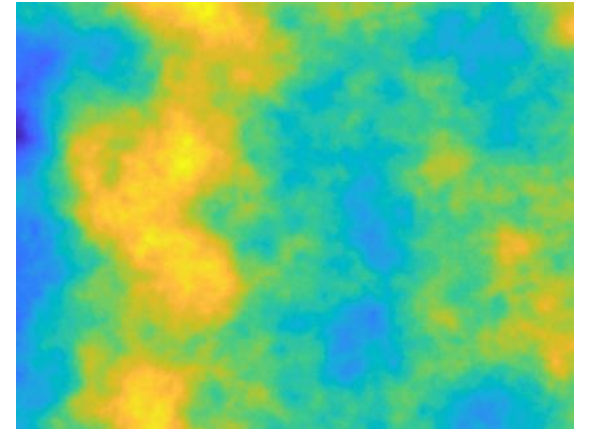


# Simulation framework and modal SPGD configuration

## ■ Turbulence emulation:

- Fourier method with subharmonics (Johansson 1994)
- Independent set of single layer screens (de-tilted)

$$\frac{D}{r_0} = 4$$



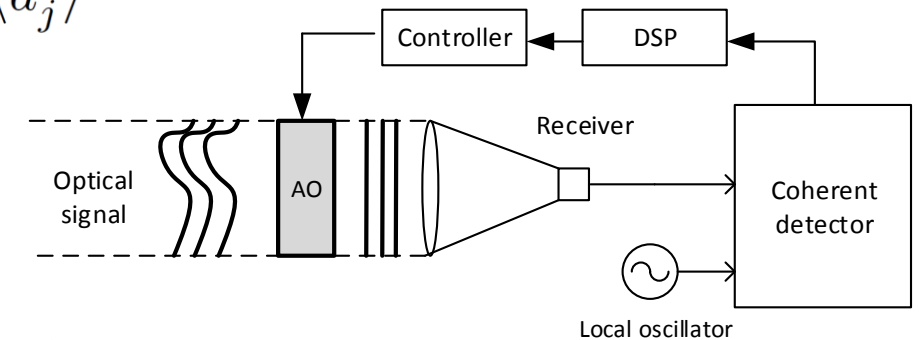
## ■ Modal SPGD configuration: $u_n^{m+1} = u_n^m + G \cdot \delta J^m \delta u \cdot \gamma_n^m$

- Optimize mode amplitudes instead of local phase deviation
- Proposal: weighting mode perturbations according to spatial energy contribution
- Accurate spatial frequency representation

$$\delta \tilde{u}_n = \delta u \cdot \sqrt{\langle a_j^2 \rangle}$$

## ■ Analysis:

- Strehl ratio (SR) – Maréchal's approximation
- Residual errors – squares of ensemble-mean mode coefficient



# Strehl ratio evolution

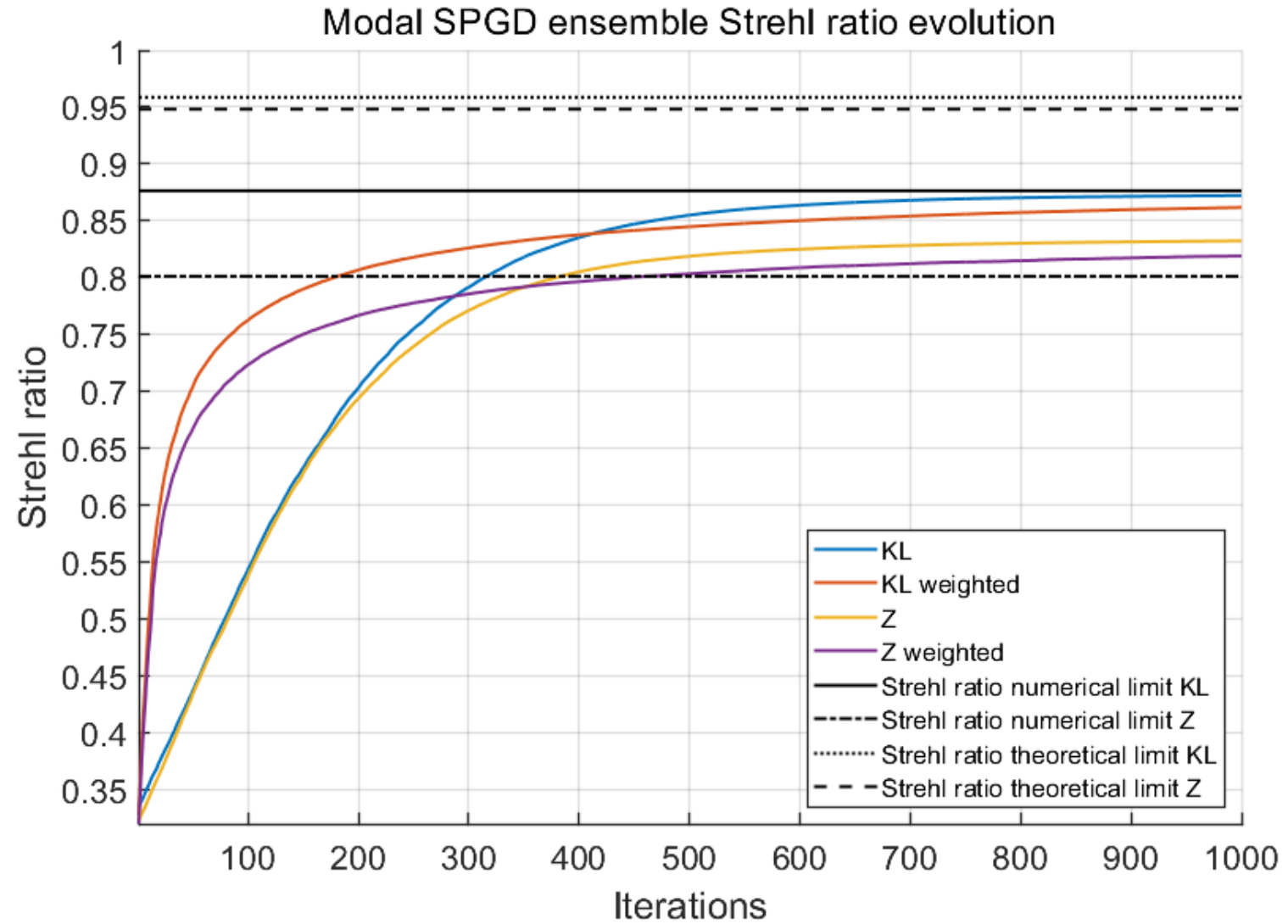
- Numerical limits:

$$SR_{\text{opt}, 105 \text{ modes}} = \exp(-\Delta_{105} * (D/r_0)^{(5/3)})$$

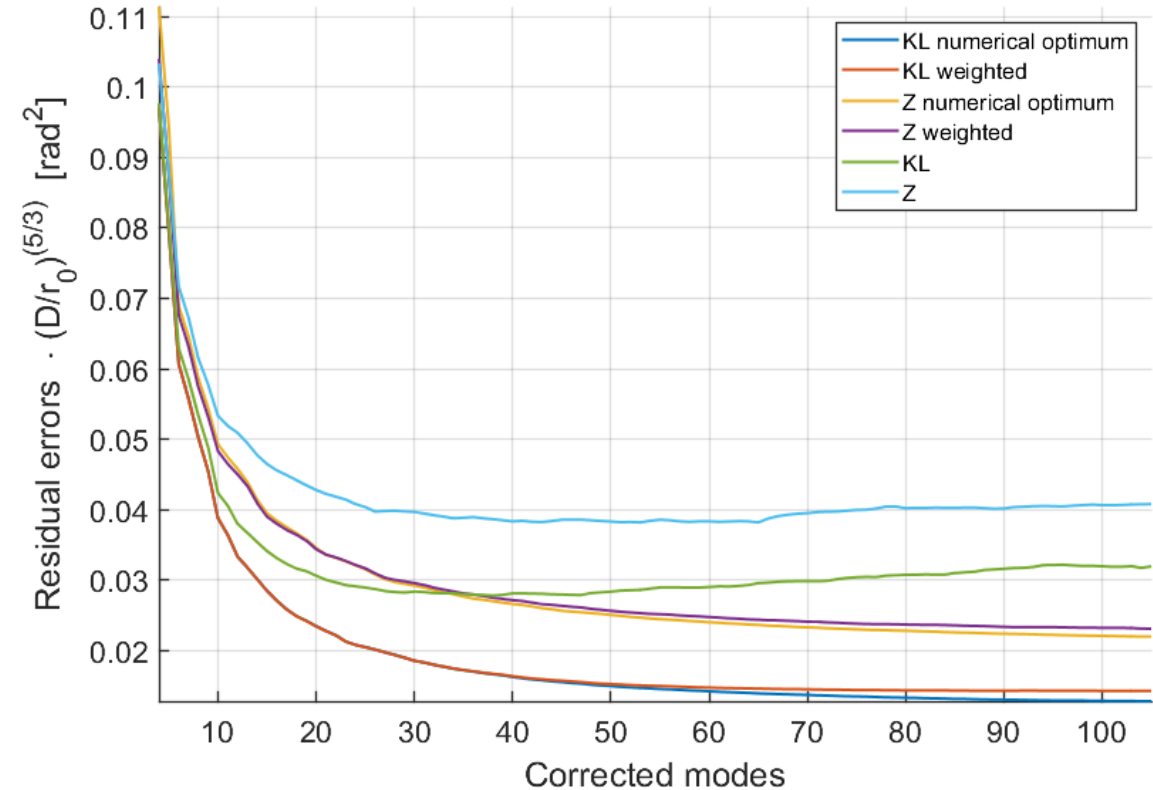
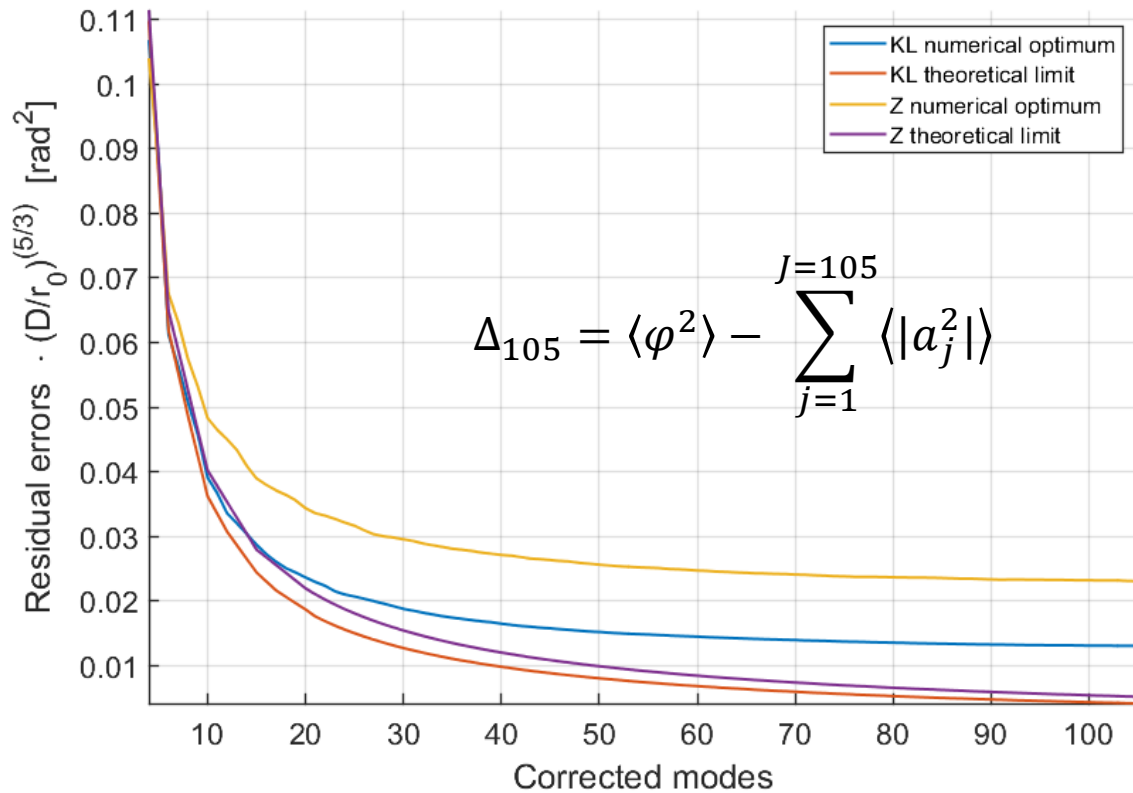
- 5 % SR gain with KL modes (“for free”)

- Weighting speeds up convergence by up to a factor of 4 (KL) and 3 (Z)

- Why Z-SPGD surpasses its numerical limit?



# Residual error – modal optima and numerical results



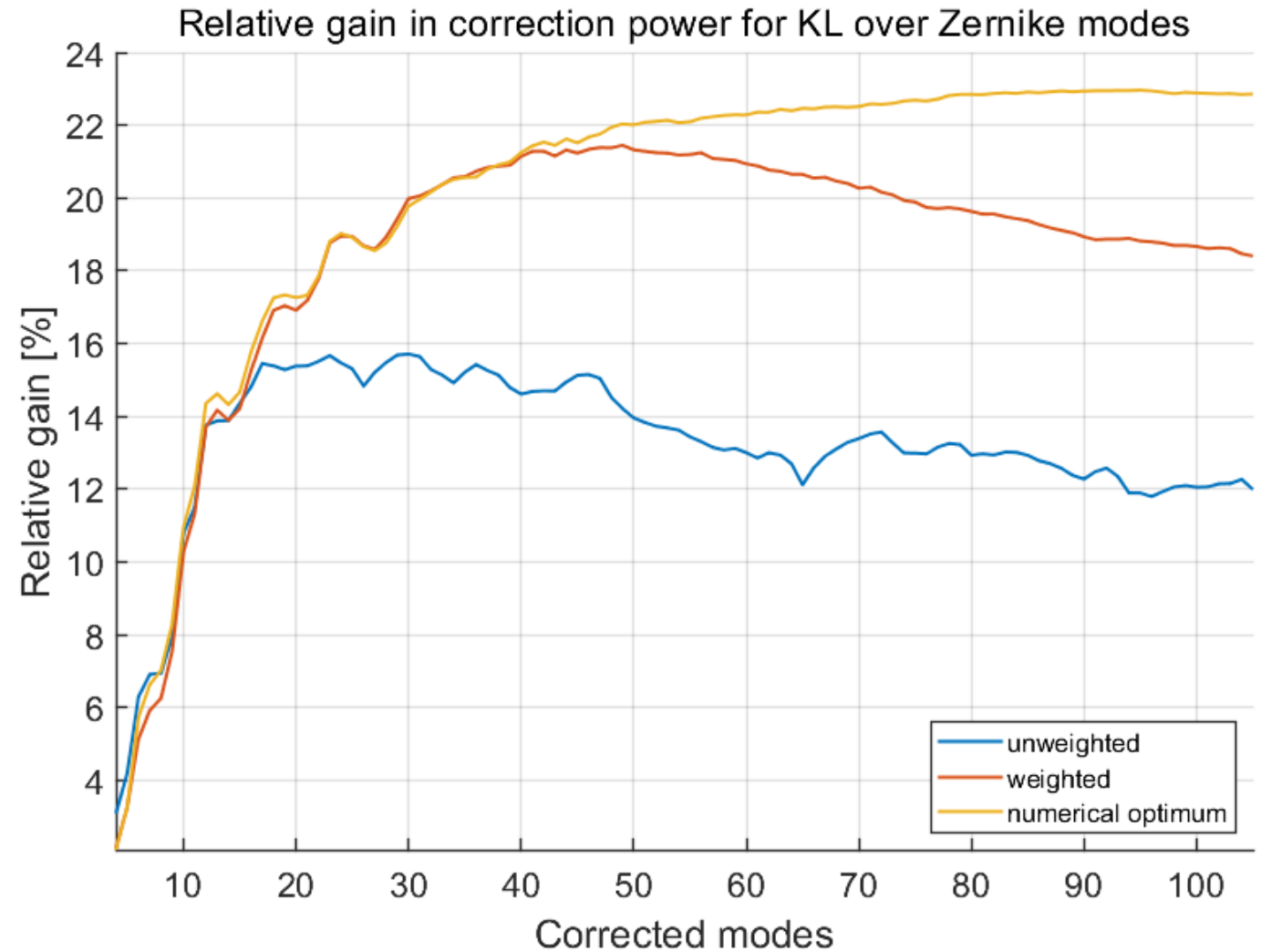
- Accurate spatial frequency representation pushes modal performance close to the limit
- Equally weighted modes correct „unseen“ modes -> SR contradiction to residual errors

# Relative gain comparison

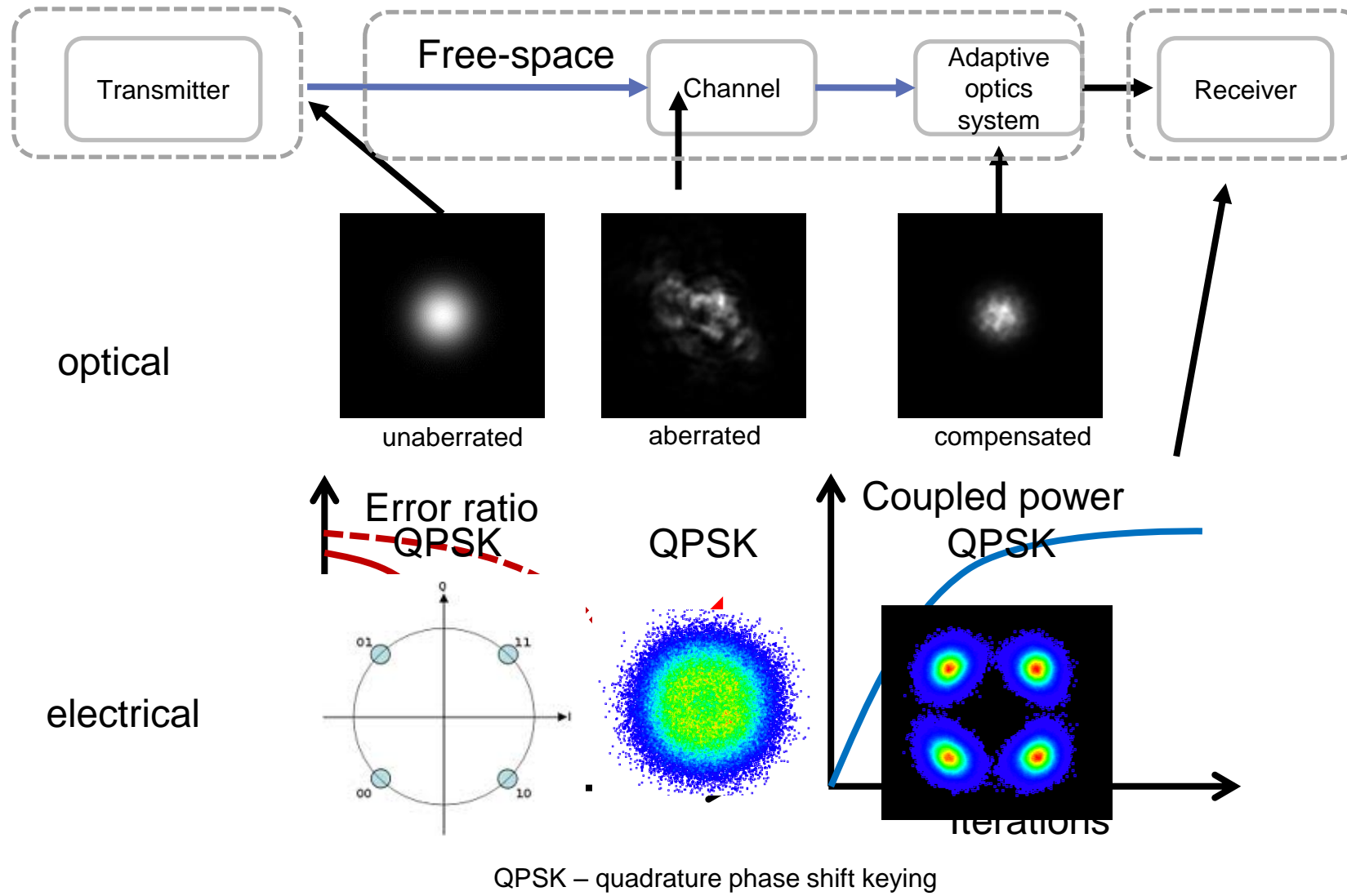
- Relative gain:

$$G_{\text{rel}} = \frac{\sqrt{\Delta_Z} - \sqrt{\Delta_{\text{KL}}}}{\sqrt{\Delta_Z}} * 100\%$$

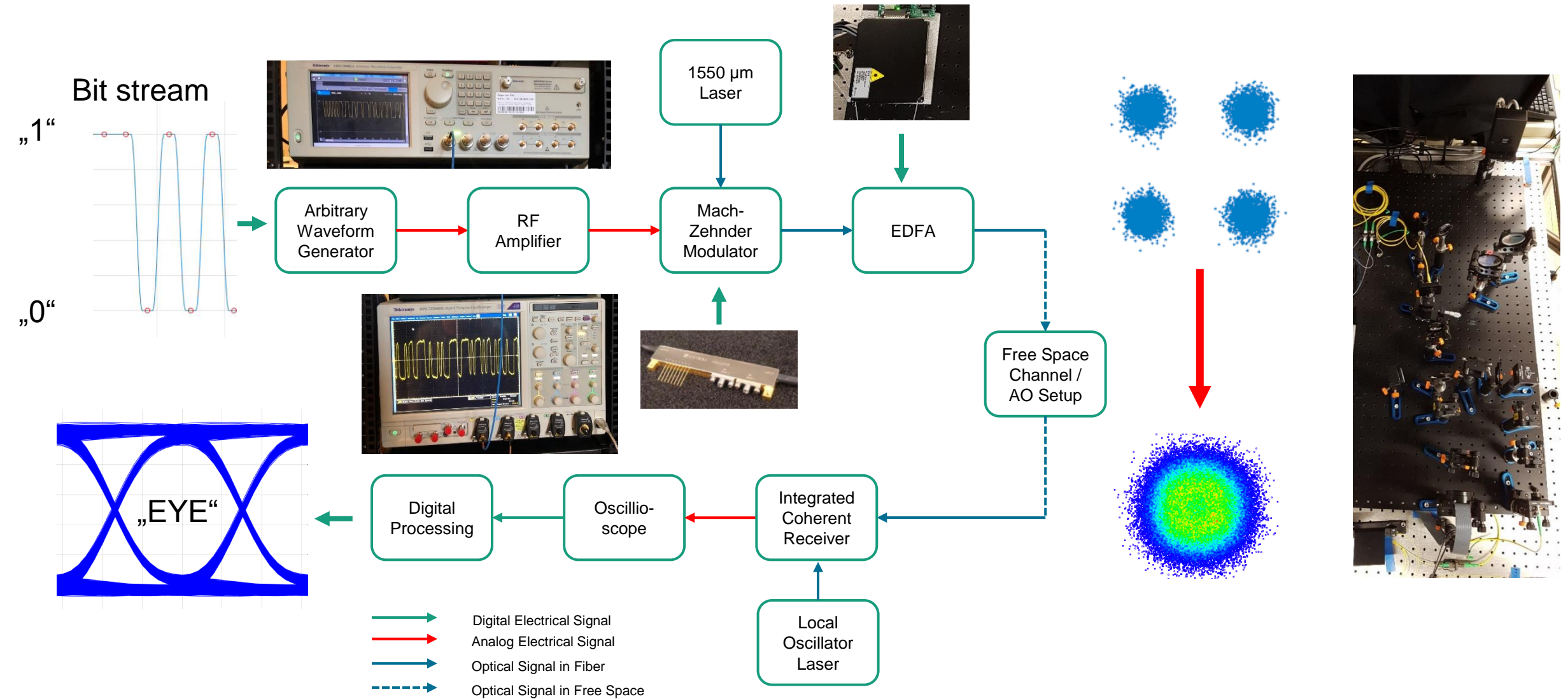
- Incorporation of a minimal number of modes required
- Saturation peak gives number of modes to be included
- Accurate spatial frequency representation diminishes correction errors



# Coherent free space optical communication scheme



# 6.25 Gbit/s coherent FSO communication link with sensorless AO





# Closed loop sensorless AO setup

DM

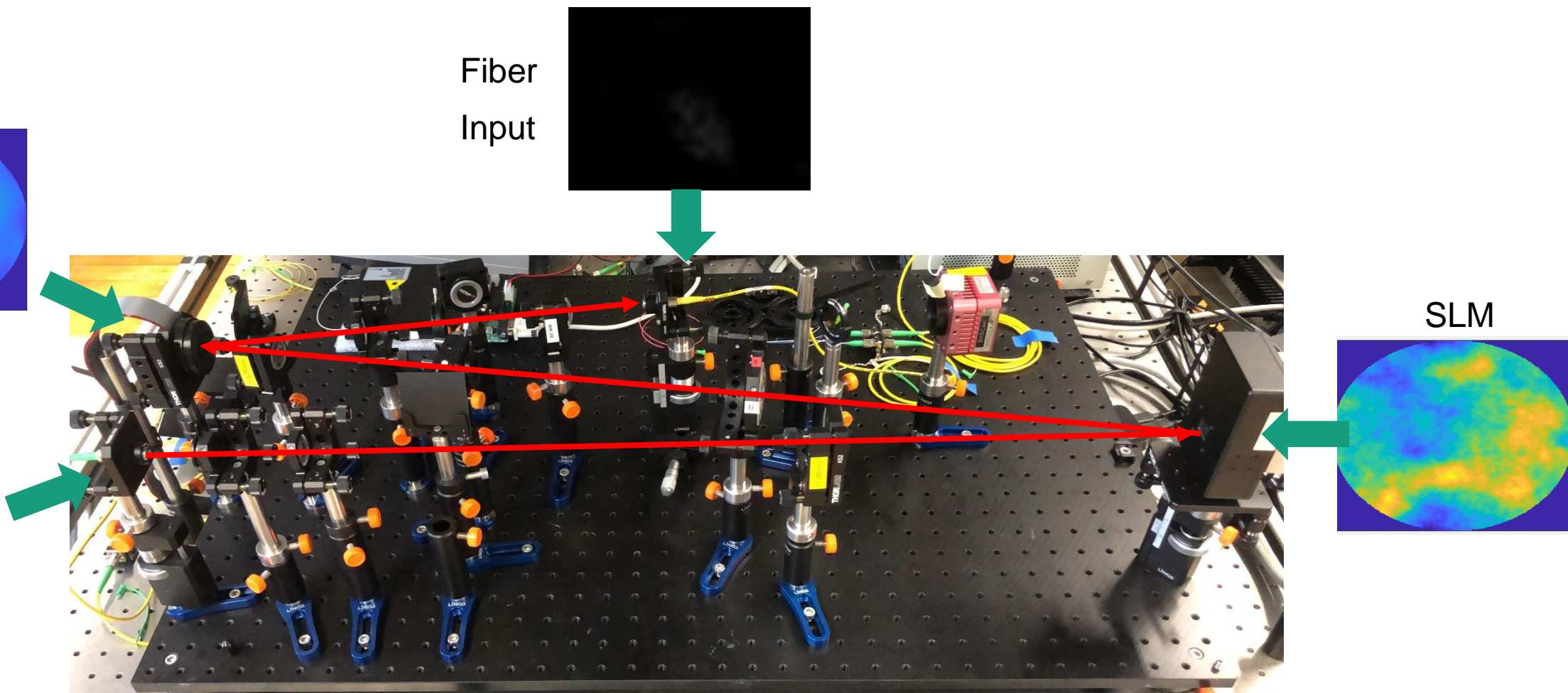
Fiber  
Input

SLM

Fiber  
Output

DM – deformable mirror

SLM – spatial light modulator



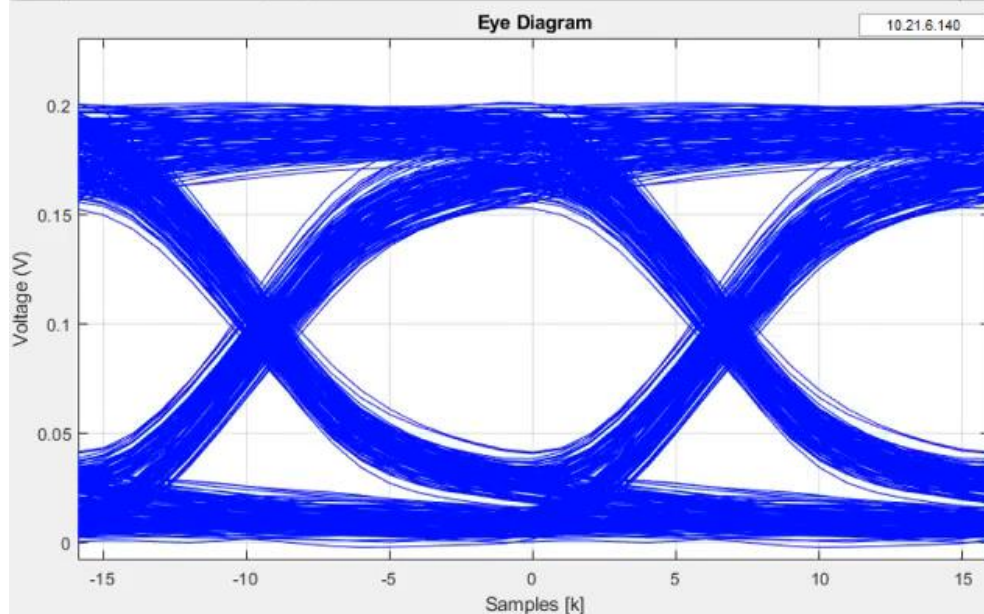


# Setup demonstration

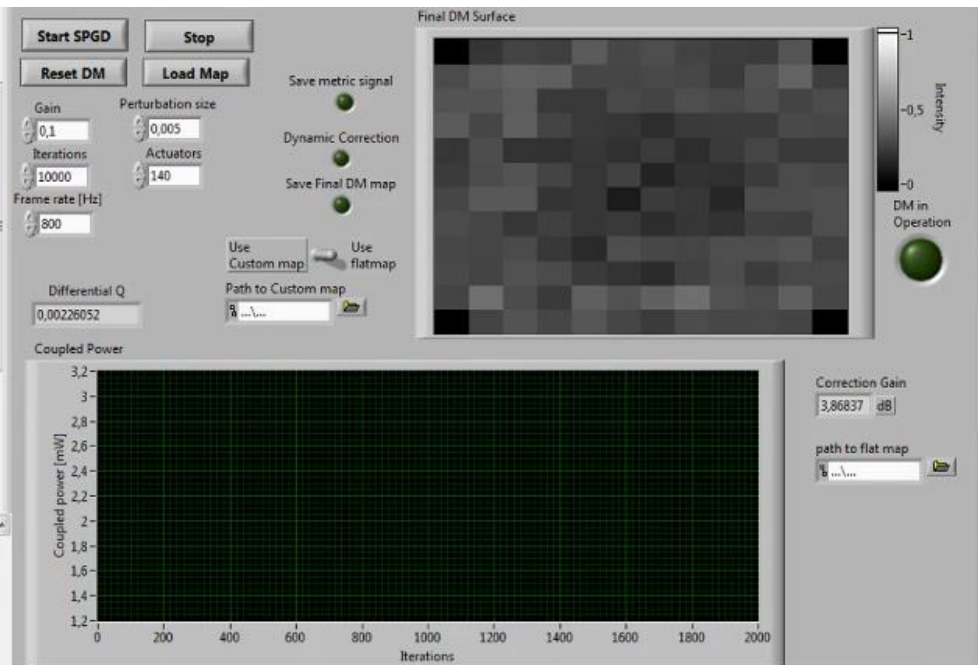
SLM  
control



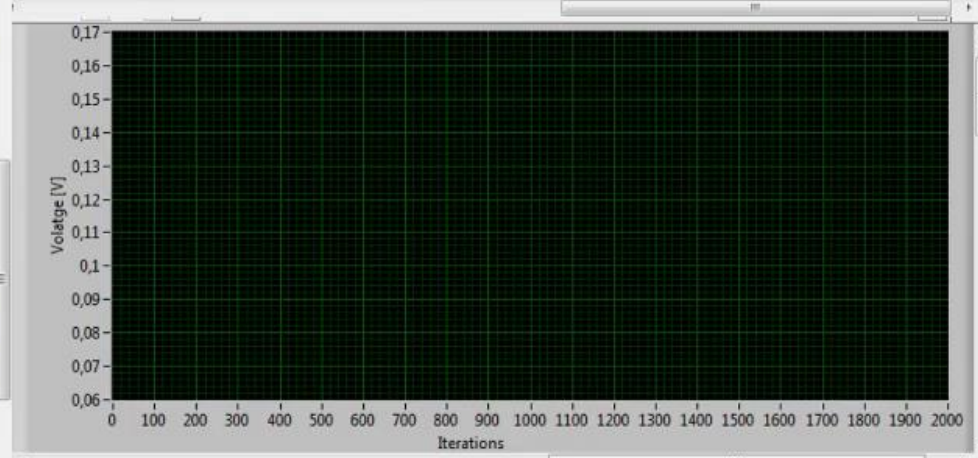
Live  
EYE



SPGD  
control



Live  
metric

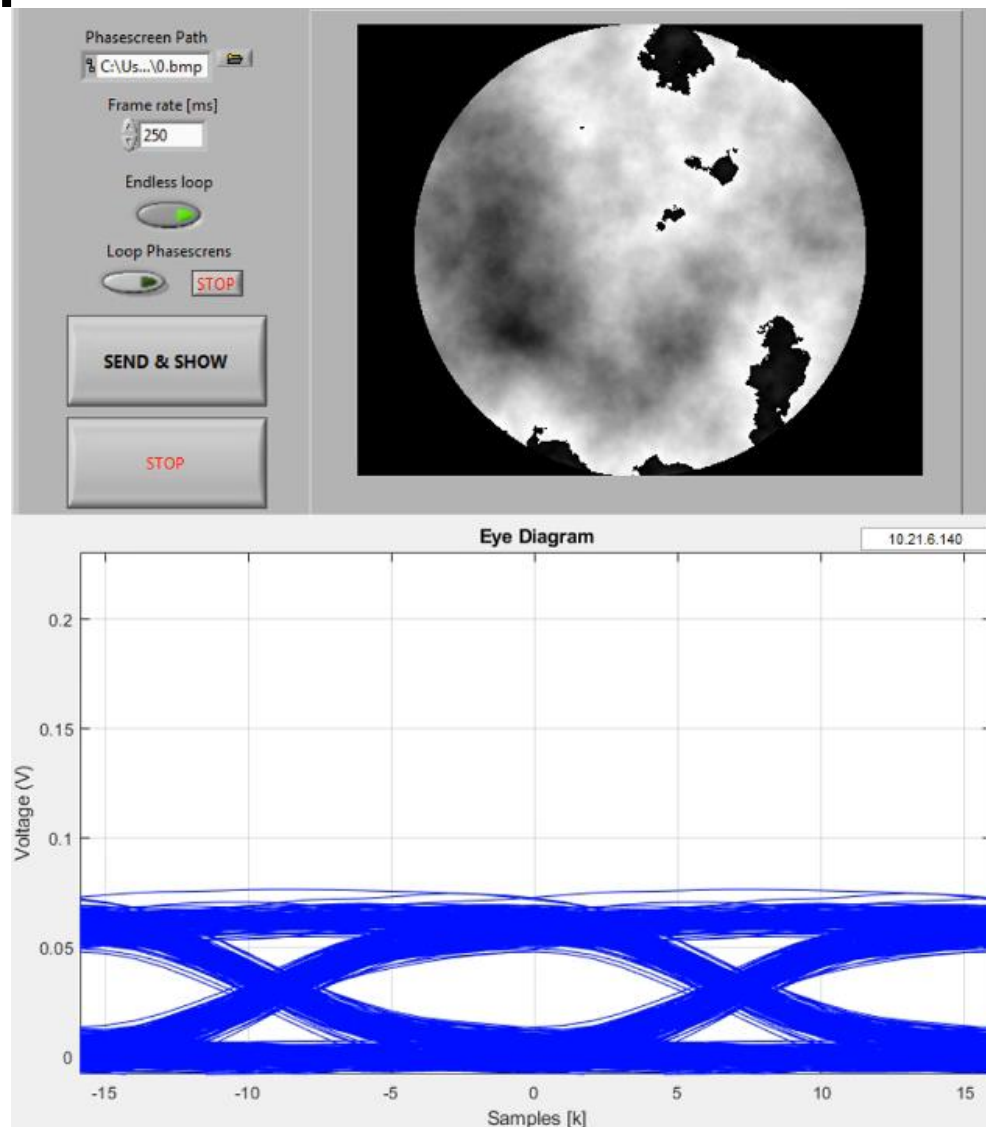


# Setup demonstration – tilt removed

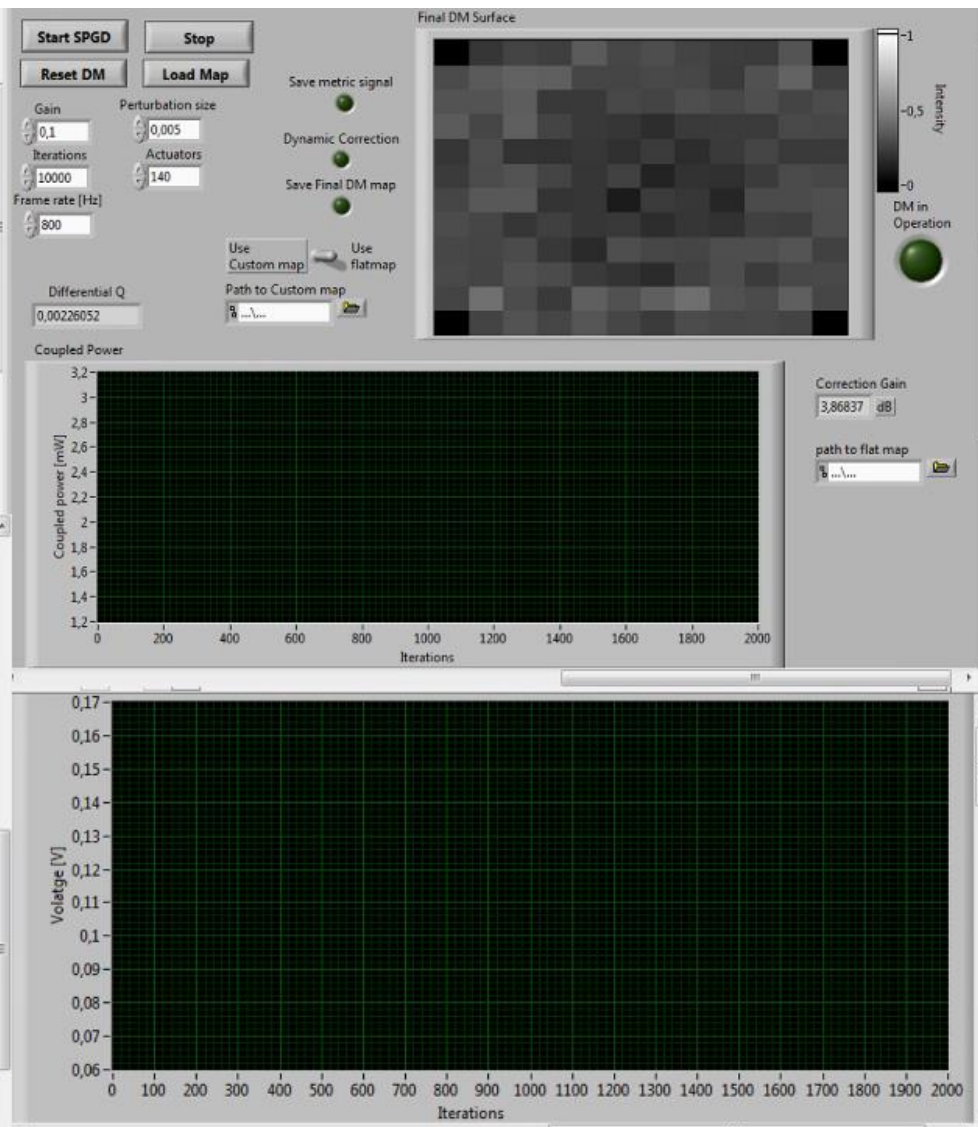
SLM  
control

$$\frac{D}{r_0} = 4$$

Live  
EYE



SPGD  
control



Live  
metric

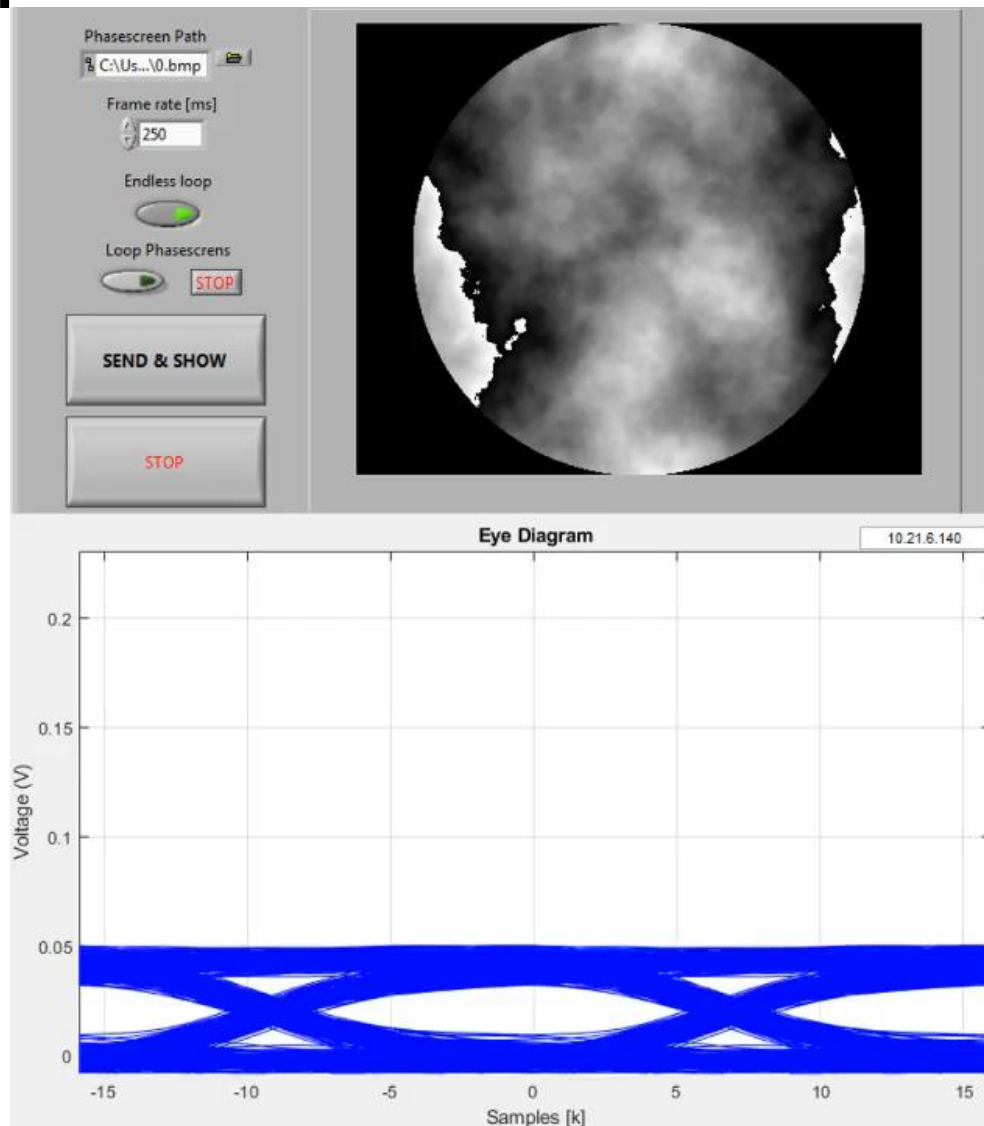


# Setup demonstration – tilt removed

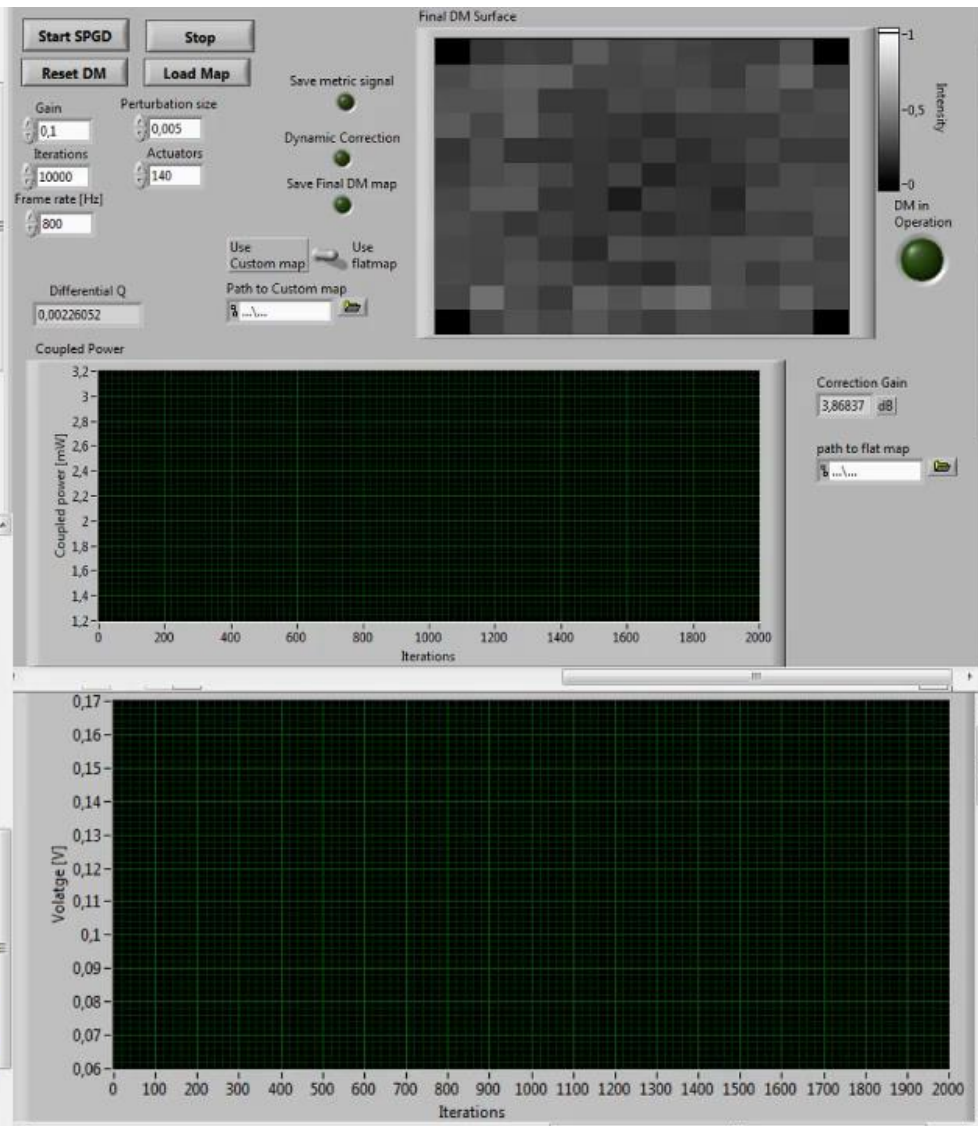
SLM  
control

$$\frac{D}{r_0} = 4$$

Live  
EYE

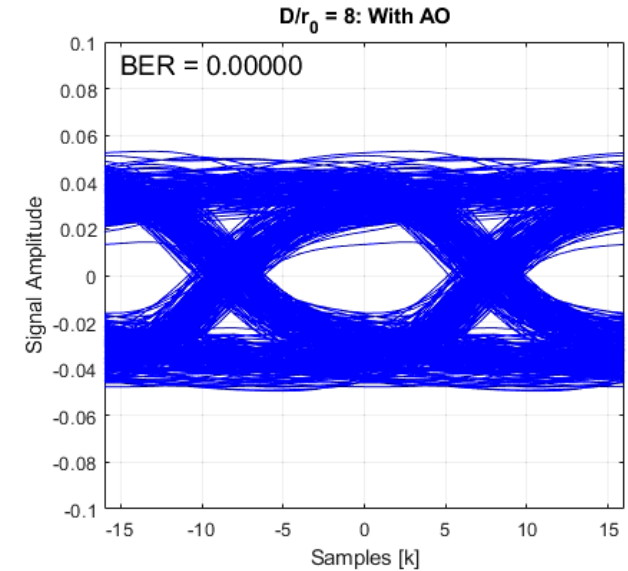
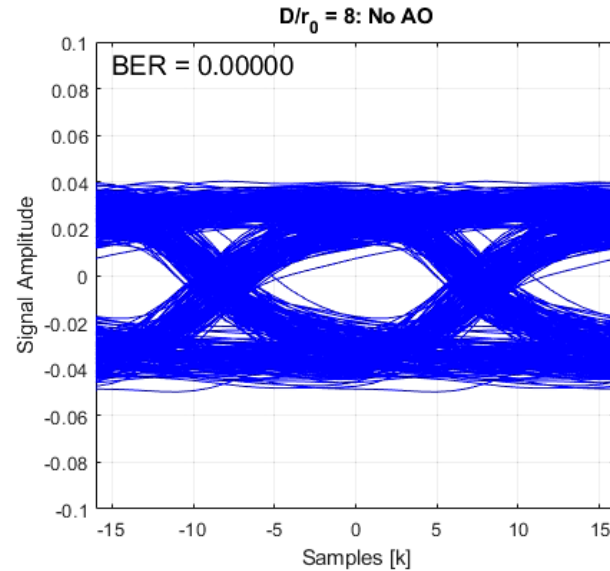
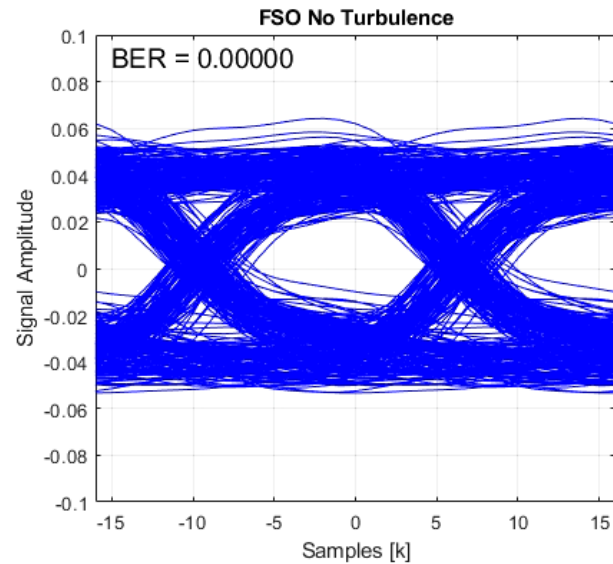
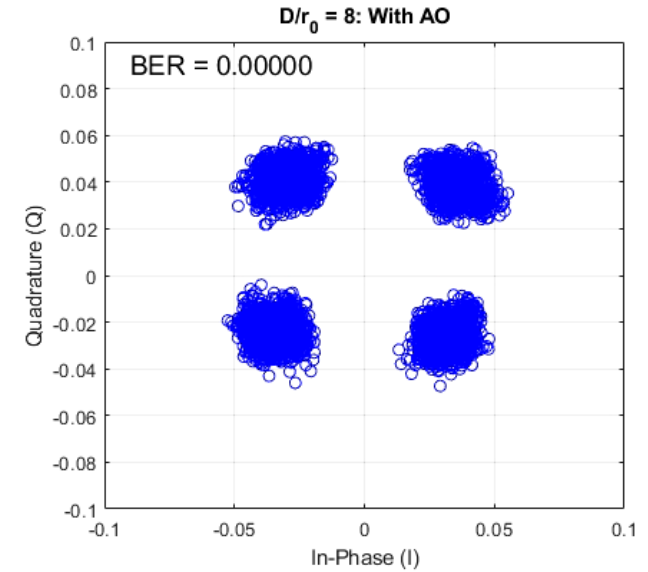
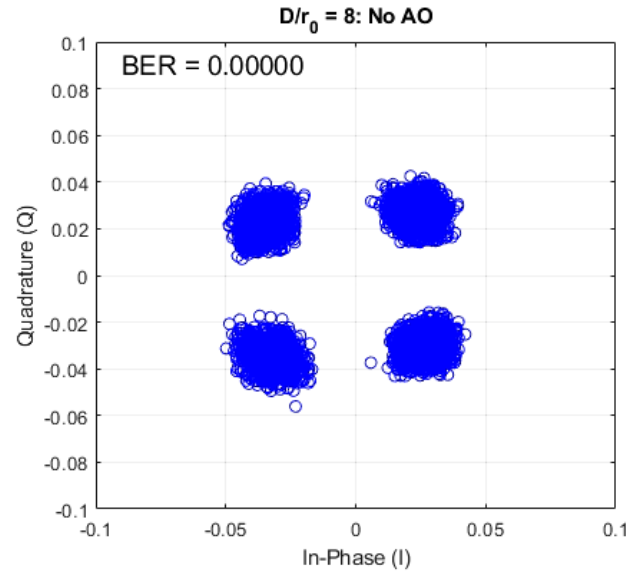
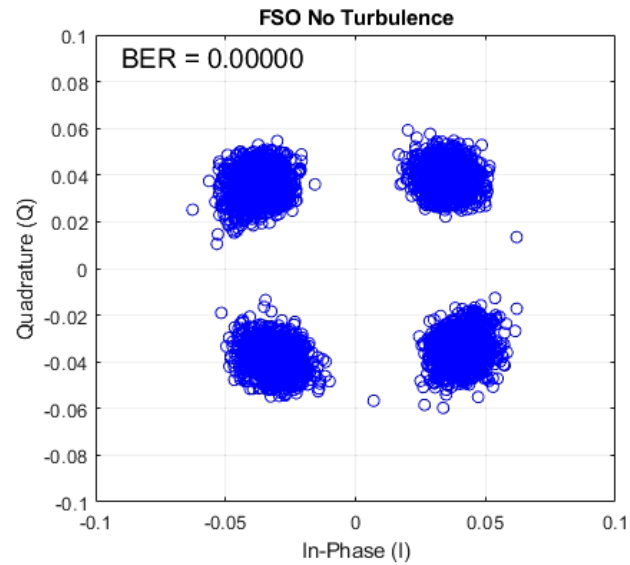


SPGD  
control



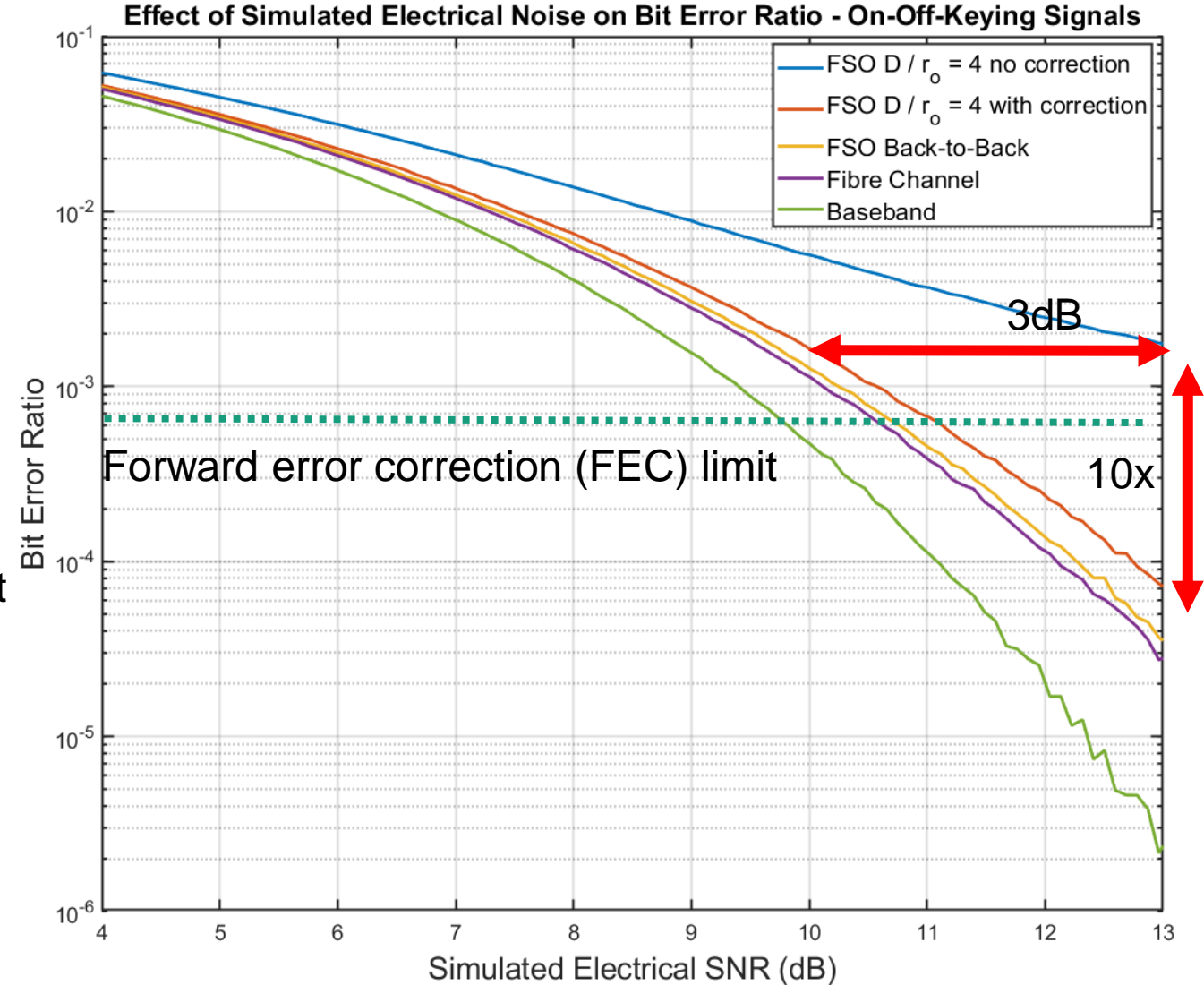
Live  
metric

# Coherent FSO communications system at 6.25 Gbit/s



# Bit Error Ratio (BER) evaluation – On-Off Keying

- How to read the plot
  - Achievable BER for a certain SNR
  - Goal: reduce BER below FEC
- Turbulence increases power requirements for achieving a certain BER
- AO correction pushes BER below FEC limit



# Conclusion & outlook

- Implementation of mean squared minimized modal wavefront expansion
- *a priori* incorporation of knowledge of the Kolmogorov turbulence
- 6.3 Gbit/s FSO com setup with sensorless AO
- BER evaluation of AO correction in weak turbulence

