



P. A. Khorin^{1,2}, A. P. Dzyuba³, and N. V. Petrov³

¹Samara National Research University, Samara, Russia

²IPSI RAS – Branch of the FSRC “Crystallography and Photonics” RAS, Samara, Russia

³ITMO University, Saint-Petersburg, Russia



САМАРСКИЙ УНИВЕРСИТЕТ SAMARA UNIVERSITY ITMO UNIVERSITY

Abstract. The paper investigates the **sensitivity** of interferograms formed using the **structured reference beams**. A study carried out on the use of reference beams with **cylindrical** wavefronts in the interferograms formation to improve the aberrations recognition using a **convolutional neural network**. The applying of a cylindrical reference beam instead of a plane one for recognition of wave aberrations makes it possible to **reduce the mean absolute error** by more than **30%**.

The reference beam:

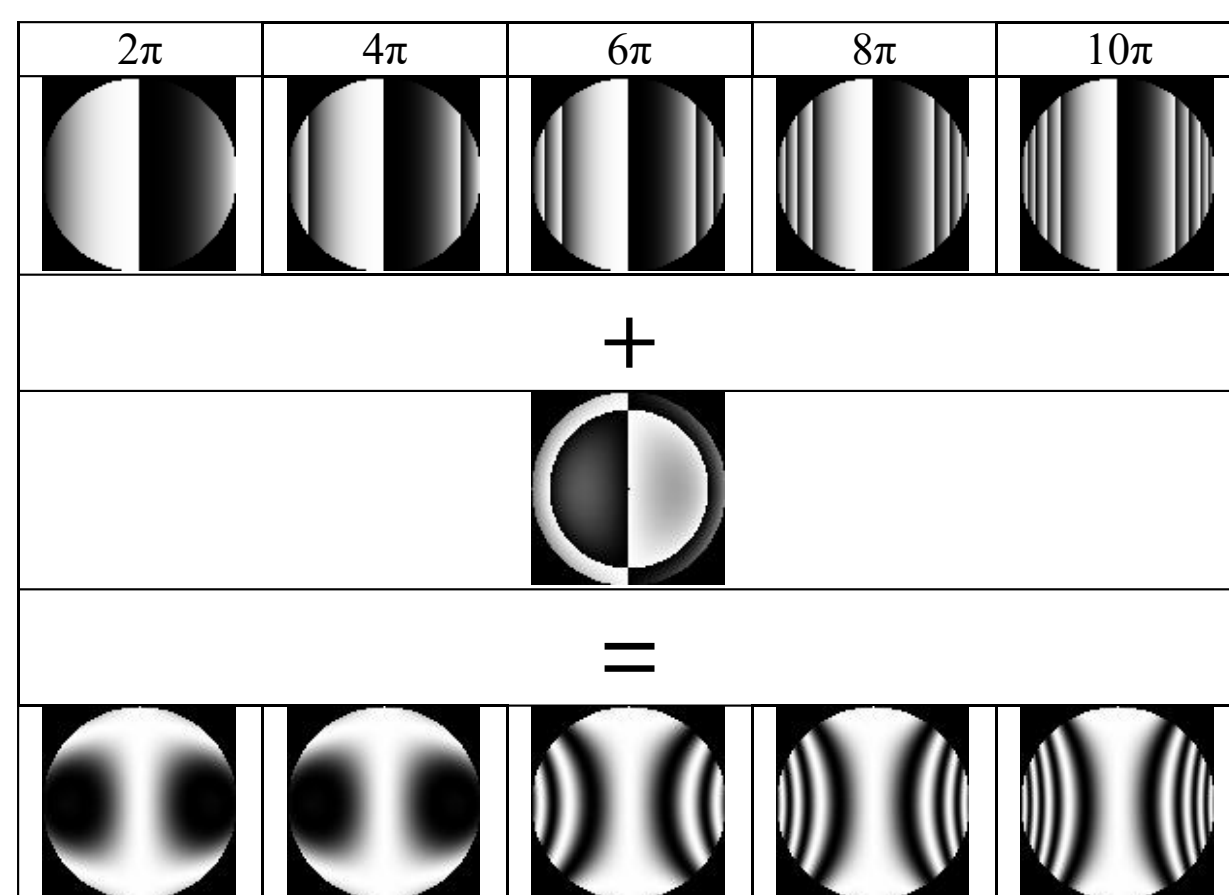
$$E_B(x, y) = \exp[iB(x, y)]$$

The wavefront aberrations:

$$E_W(x, y) = \exp[iW(x, y)]$$

The interferogram:

$$I(x, y) = |E_W(x, y) + E_B(x, y)|^2$$



The interferograms obtained using a plane and structured reference beam corresponding to a cylindrical (cubic) carrier make it possible to form a more complex intensity distribution picture.

$$W(r, \varphi) = 2\pi \sum_{n=0}^{n_{\max}} \sum_{m=0}^n c_{nm} Z_{nm}(r, \varphi) \quad R_n^m(r) = \sum_{p=0}^{(n-m)/2} \frac{(-1)^p (n-p)!}{p! \left(\frac{n+m-p}{2}\right)! \left(\frac{n-m-p}{2}\right)!} \left(\frac{r}{r_0}\right)^{n-2p}$$

$$Z_{nm}(r, \varphi) = Z_N(r, \varphi) = A_n R_n^m(r) \begin{cases} \cos(m\varphi) \\ \sin(m\varphi) \end{cases} \quad A_n = \sqrt{(n+1)/\pi} \quad B_{p=2}(x, y) = \alpha x^3$$

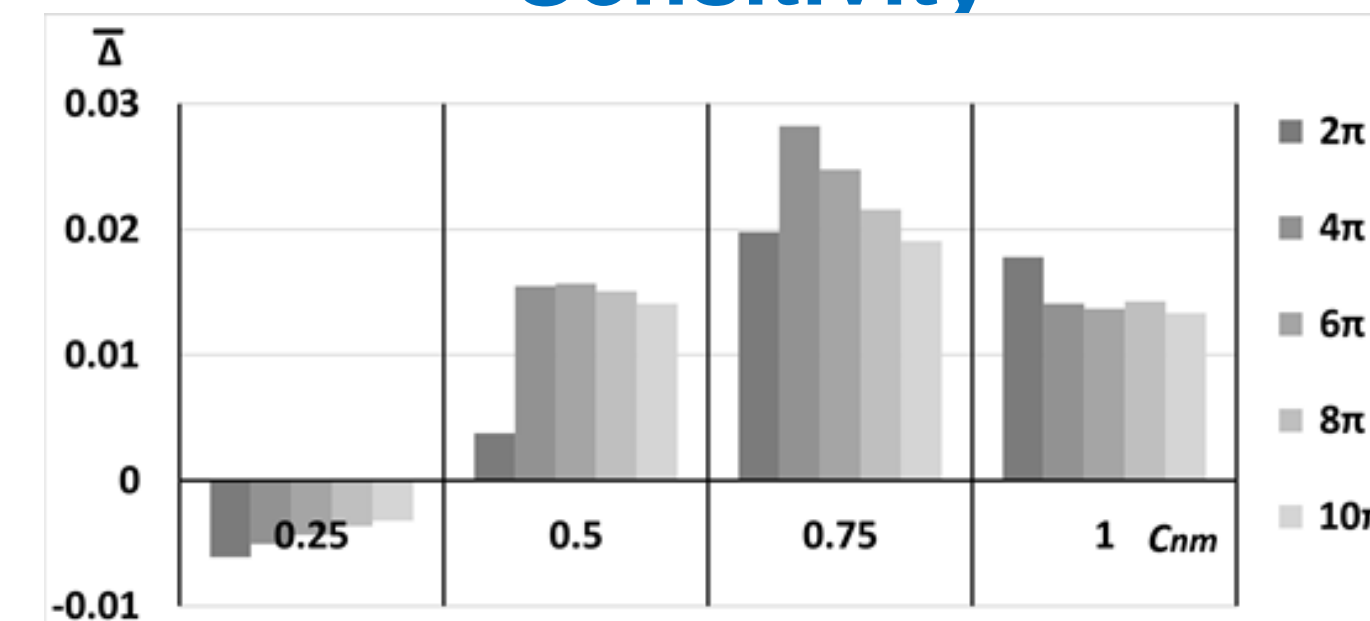
Sensitivity

$$S_p = \sqrt{\frac{\iint [I_p(x, y) - I_{0p}(x, y)]^2 dx dy}{\iint I_{0p}^2(x, y) dx dy}} \quad \Delta = (S_2 - S_1) / c_{nm}$$

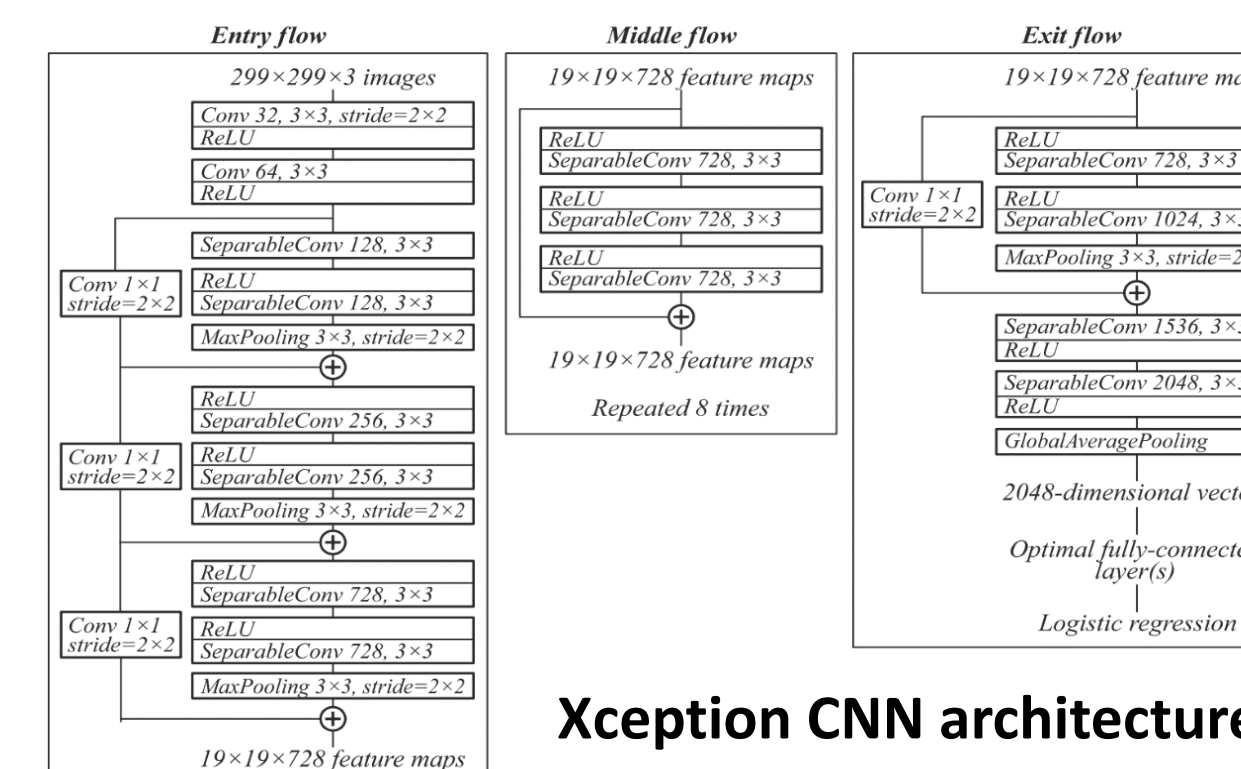
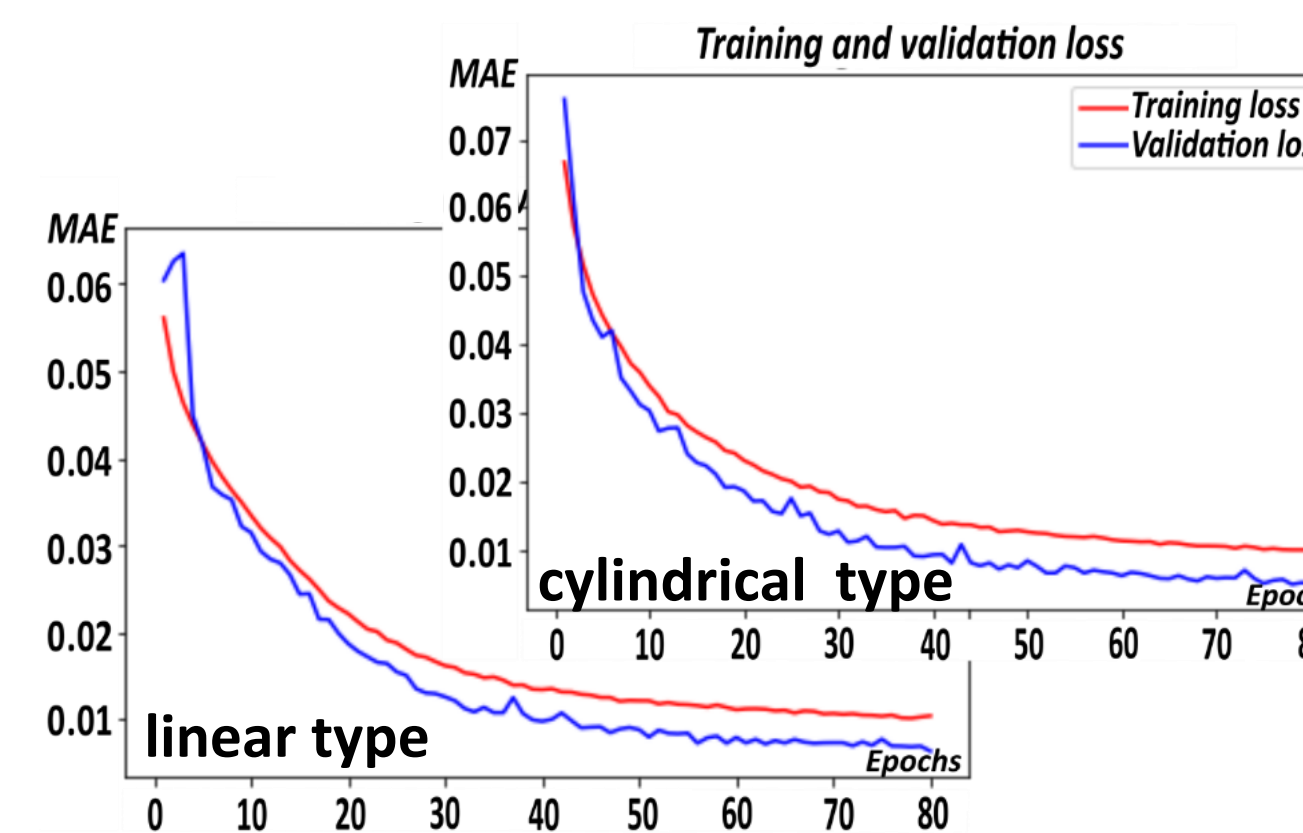
The parameter **S** will allow us to estimate the recognition sensitivity of a linear and cylindrical interferograms, which corresponds to the standard deviation (SD) value of the p-type interferogram formed by an **aberrated** wave $I_p(x, y)$ from the **unaberrated** interferogram $I_{p0}(x, y)$.

Acknowledgments. This work was supported by the grant of the President of the Russian Federation (No. MD-6101.2021.1.2).

Sensitivity



CNN



Xception CNN architecture

Recognition results

The mean absolute recognition error for the model interferograms of various types with a variable reference beam parameter α

Type interferograms	Angle	MAE
Linear	$\alpha=2\pi$	0.0063
	$\alpha=4\pi$	0.0065
	$\alpha=6\pi$	0.0068
Cylindrical	$\alpha=2\pi$	0.0050
	$\alpha=4\pi$	0.0047
	$\alpha=6\pi$	0.0050

- Nvidia GeForce RTX 2070
- 8 GB of GDDR6-type memory
- Keras package for Python language

Conclusion. The use of reference beams with the **cylindrical** wavefronts is proposed to improve the aberration recognition from interferograms using convolutional neural networks. The interferogram **sensitivity** when using a cylindrical reference beam increases **by at least 10%** compared to a plane reference beam for the radially asymmetric types of aberrations, and the **mean absolute error** of aberration recognition **decreases** from 0.0068 to 0.0047.