



# Simulation Analysis of an Atmospheric Turbulence Wavefront Measurement System

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**Abstract:** In this paper, a turbulent wavefront measurement model based on the Hartmann system structure is proposed. The maximum recognizable mode number of different lens units is discussed, and the influence of different lens array arrangements on the accuracy of turbulent wavefront reconstruction is analyzed. The results indicate that the increase in the aberration order of the turbulent wavefront has a certain influence on the reconstruction ability of the system. Different lens arrangements and number of lens units will lead to the effective reconstruction of different final mode orders. When using a 5 × 5 lens array arrangement and a hexagonal arrangement of 19 lenses, the maximum order of turbulent wavefront aberrations allowing for effective reconstruction was 25. When the sparse arrangement of 25 lenses or the sparse arrangement of 31 lenses was used, the maximum order allowing for effective reconstruction was 36. If the aberration composition of the turbulent wavefront. When the order of the aberrations of the turbulent wavefront was low, the turbulent wavefront could be measured by the lens arrangement with fewer lens units, and the wavefront reconstruction accuracy was close to the measurement results obtained when more lens units were used.

Keywords: atmospheric turbulence; Hartmann system; wavefront measurement; lens array

# 1. Introduction

Turbulence has long been considered one of the most important factors limiting the performance of optical systems in the atmospheric environment [1]. Monitoring the level of optical turbulence in the atmosphere is of great significance for estimating its impact on the functions of optoelectronic devices and systems operating through the atmosphere [2–4]. In order to overcome the interference of atmospheric turbulence, large ground-based astronomical telescopes have been equipped with adaptive optical systems in astronomical imaging observations [5,6]. When the laser is transmitted in the atmosphere, it may be affected by turbulence disturbance, molecular absorption, etc., which makes it difficult for the measurement system to accurately obtain the beam parameters at the exit of the laser system [7,8]. Therefore, the analysis of the wavefront after the influence of turbulence helps us to obtain more realistic optical system parameters.

The wavefront detector is one of the key components of adaptive optics systems and can measure the dynamic error of the atmospheric turbulence wavefront in real time. The Shack–Hartmann wavefront sensor (SHWFS) is a commonly used wavefront sensor [9–11]. It can measure the wavefront phase of atmospheric turbulence by measuring the slope  $\phi_x$ ,  $\phi_y$  of the atmospheric turbulence phase  $\phi(x, y)$  in real time through a regularly arranged lens array. Rodolphe [12] proposed a method to generate turbulence measurements using



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**Copyright:** © 2024 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). the Shack–Hartmann wavefront sensor. This method takes into account the spatial and temporal statistical characteristics of the slope so that the turbulent wavefront gradient and time series corresponding to the natural guide star and the laser guide star can be generated according to the frozen flow model. Ryan [13] designed a Shack–Hartmann image motion monitor to achieve a 24 h continuous vertical monitoring of atmospheric optical turbulence. Eric [14] believes that the perturbation of the wavefront phase can be measured by a Hartmann wavefront sensor (H-WFS), and then these measurements can be used to directly characterize atmospheric turbulence. However, most of researchers' work on atmospheric turbulence consists of direct measurements and analyses [15–18]. Research on the aberrations of atmospheric turbulence, especially high-order aberrations, is relatively scarce. Especially when the Hartmann system structure is used to measure turbulence of different lens array arrangements on the measurement results still lacks systematic research.

In this paper, a turbulence wavefront measurement model based on the Hartmann system structure is proposed, which can measure and analyze the atmospheric turbulence wavefront under different lens arrangements. At the same time, the wavefront of largeaperture and high-power laser beams propagating through the atmosphere can also be analyzed. According to the correspondence between Zernike polynomials and Seidel aberrations, the turbulent wavefront can be decomposed into multiple single aberrations from low order to high order. In this paper, lens array models with uniform arrangement and sparse arrangement are established. The maximum number of identifiable modes of different lens units is discussed, and the influence of different lens array arrangements on the accuracy of turbulent wavefront reconstruction is analyzed. The results show that the maximum identifiable mode order of the system for the turbulent wavefront is related to the number of sub-lenses in the lens array. Increasing the number of sub-lenses in the lens array can achieve the measurement of a turbulent wavefront with higher-order aberrations. When the order of the aberrations of the turbulent wavefront is low, the turbulent wavefront can be measured by the lens arrangement with fewer lens units, and the wavefront reconstruction accuracy is relatively high.

# 2. Methodology

## 2.1. Wavefront Generation

At present, the wavefronts that have been improved in this system model include distorted wavefronts through atmospheric turbulence, dynamic random wavefronts, functionmodulated wavefronts, static wavefronts, and plane wavefronts (whose amplitude is 1).

The generation methods of the Kolmogorov turbulence random phase screen include the power spectrum inversion method, the Zernike polynomial method, the random midpoint displacement method, and so on [19,20]. In simulations, the Zernike polynomial method is used to generate the phase screen. The random phase screen generated by this method is non-correlated in the time dimension and can be used for the statistical analysis of multi-frame image data [21]. The low spatial frequency component is consistent with the theoretical value, and the high spatial frequency component gradually improves with the increase in Zernike order. In simulations, the Karhunen–Loeve (K-L) function is used to quickly construct the wavefront [11,22–24]. The wavefront  $\varphi(\mathbf{r})$  affected by atmospheric turbulence can be expressed as a two-dimensional function that obeys certain known modes and statistical laws, that is, the two-dimensional form of Zernike polynomials [25]:

$$\Phi(x,y) = \sum_{k=1}^{l} a_k z_k(x,y)$$
(1)

where *l* is the number of modes,  $a_k$  is the coefficient of the *k*th Zernike polynomial, and  $z_k$  is the *k*th Zernike polynomial. Noll derived the covariance of any two Zernike polynomial coefficients from the perspective of energy, which can be expressed as [26]:

$$E(a_j, a_{j'}) = \frac{K_{zz'} \delta_z \Gamma[(n+n'-5/3)/2] (D/r_0)^{5/3}}{\Gamma[(n-n'+17/3)/2] \Gamma[(n'-n+17/3)/2] \Gamma[n+n'+23/3)/2]}$$
(2)

where *n* and *n*' are the radial frequency numbers of  $Z_j$  and  $Z_{j'}$  respectively,  $a_j$  and  $a_{j'}$  are any two coefficients of Zernike polynomials, D and  $r_0$  are the aperture of the telescope and the atmospheric coherence length, respectively,  $\Gamma$  is the gamma function, and  $\delta_z$  and  $K_{zz'}$  can be expressed as:

$$\delta_z = (m = m') \wedge [X_{parity}(j, j')] \lor (m = 0)$$
(3)

$$K_{zz'} = \frac{\Gamma(14/3)[(24/5)\Gamma(6/5)]^{5/6}[\Gamma(11/6)]^2}{2\pi^2} \times (-1)^{(n+n'-2m)/2} \sqrt{(n+1)(n'+1)}$$
(4)

where *m* and *m'* are the angular frequency numbers of  $Z_j$  and  $Z_{j'}$ , respectively,  $\overline{X_{parity}(j, j')}$  denotes that the polynomials of order *j* and *j'* have the same parity,  $\wedge$  is logic and symbol, and  $\vee$  is logic or symbol. From Equations (2)–(4), the covariance matrix of Zernike polynomial coefficients of any order can be obtained, and there is a correlation between Zernike polynomial coefficients. To obtain the turbulent wavefront, Zernike polynomials need to be converted. In the simulation, the K-L function is used to expand the wavefront. The polynomial coefficients are statistically independent, and the Zernike polynomial coefficient matrix can be obtained by conversion.

A random wavefront that does not conform to the statistical law of turbulence can be directly generated by Equation (1). The Zernike coefficient is a pseudo-random number uniformly distributed in the range of (-1, 1). The Zernike coefficients between frames are randomly independent, and the order of Zernike polynomials can be set arbitrarily [27].

## 2.2. Wavefront Reconstruction Algorithm

The commonly used wavefront reconstruction methods in adaptive optics include the region method, the Zernike mode method, and the direct slope method. In this paper, the Zernike mode method was used for wavefront reconstruction. The phase distribution of the wavefront can be expressed by Equation (1). The wavefront reconstruction calculation of the Zernike mode method can be expressed in the form of the following matrix:

$$\begin{bmatrix} G_{\mathbf{x}(1)} \\ G_{\mathbf{y}(1)} \\ G_{\mathbf{x}(2)} \\ G_{\mathbf{y}(2)} \\ \vdots \\ G_{\mathbf{x}(m)} \\ G_{\mathbf{y}(m)} \end{bmatrix} = \begin{bmatrix} Z_{\mathbf{x}1(1)} & Z_{\mathbf{x}2(1)} & \dots & Z_{\mathbf{x}N(1)} \\ Z_{\mathbf{y}1(1)} & Z_{\mathbf{y}2(1)} & \dots & Z_{\mathbf{y}N(1)} \\ Z_{\mathbf{x}1(2)} & Z_{\mathbf{x}2(2)} & \dots & Z_{\mathbf{x}N(2)} \\ Z_{\mathbf{y}1(2)} & Z_{\mathbf{y}2(2)} & \dots & Z_{\mathbf{y}N(2)} \\ \vdots \\ Z_{\mathbf{x}1(m)} & Z_{\mathbf{x}2(m)} & \dots & Z_{\mathbf{x}N(m)} \\ Z_{\mathbf{y}1(m)} & Z_{\mathbf{y}2(m)} & \dots & Z_{\mathbf{y}N(m)} \end{bmatrix} \cdot \begin{bmatrix} a_1 \\ a_2 \\ \vdots \\ a_N \end{bmatrix}$$
(5)

where *m* is the total number of lens elements, *N* is the number of Zernike polynomials, and  $Z_{xN(m)}$  and  $Z_{yN(m)}$  are the average wavefront slope of the *N*th Zernike polynomial in the mth lens region in the *x* and *y* directions, respectively, which can be simplified as:

$$\mathbf{G} = \mathbf{Z} \bullet \mathbf{A} \tag{6}$$

Here, G is the calculated wavefront slope matrix, Z is the 2 m  $\times$  N reconstruction matrix, and A is the Zernike polynomial coefficient matrix that we need to calculate. The specific solution of matrix A can be achieved by a matrix operation. In general, twice the total number of lenses is larger than the number of Zernike terms, so the singular value decomposition method can be used to calculate the generalized inverse matrix Z+ of Z. The matrix A is determined by

$$\mathbf{A} = \mathbf{Z}^{+} \bullet \mathbf{G} \tag{7}$$

After the coefficient matrix is calculated, the wavefront can be reconstructed by substituting it back into Equation (1).

A

## 2.3. Evaluation Method of Wavefront Reconstruction Accuracy

In this paper, we used the root-mean-square error (RMSE) as the standard to measure the accuracy of the wavefront reconstruction. The RMSE represents the root-mean-square value of the wavefront residual; the smaller the value, the higher the accuracy of the restoration. The phase information of a residual wavefront is obtained by subtracting the reconstruction wavefront and the incident wavefront, and then the RMSE is calculated. The calculation formula is:

$$\varepsilon_{RMSE} = \sqrt{\left(\sum_{u} \left(\phi(u) - \phi_o(u)\right)^2\right)/N} \tag{8}$$

where  $\phi_o(u)$  is the original wavefront,  $\phi(u)$  is the recovery wavefront, and *N* is the total number of sampling points.

#### 3. Numerical Simulation Conditions

#### 3.1. Simulation System Parameters

Under the same arrangement, the wavefront reconstruction accuracy of the system increases with the increase in the duty factor of the lens array. When the duty factor of the lens array is about 0.8, the wavefront reconstruction accuracy of the system is moderately different from that obtained when the duty factor of the lens array is 1 [28]. On the premise of using the smallest lens size combination to detect the largest distortion wavefront, we chose a duty factor of the system lens array of 0.8.

In addition, since the Zernike mode method is based on centroid detection when reconstructing the wavefront, the centroid detection accuracy is particularly important. To improve the accuracy of the sub-spot centroid measurement, it is especially necessary to ensure that the sub-spot size in the detection surface corresponds to a large number of pixels. In this system, the minimum pixel area covered by the spot was set to 10 pixel  $\times$  10 pixel to ensure the accuracy of the centroid measurement. According to Equation (9), the number of pixels occupied by the spot can be determined by:

$$p = 2.44 \frac{\lambda}{d} \cdot \frac{f}{P} \tag{9}$$

where  $P = 4.5 \ \mu m$  is the pixel size, and  $\lambda = 1064 \ nm$  is the wavelength; if  $p \ge 10$ , then  $f \ge 20 \ d$ . However, in addition to considering the number of pixels in the imaging spot, the selection of the lens parameters should also consider whether the camera pixel resolution can achieve the effective detection of wavefront distortion under different wavefront distortion degrees.

Figure 1 shows the imaging properties of the sub-lens with a plane wavefront (green parallel line) incident on the lens and focused on the reference spot (green spot). The distorted wavefront (red parallel line) does not have a normal incidence, focusing on the position deviating from the reference spot (red point). The offset angle  $\alpha$  can be calculated according to geometric parameters. According to the geometric relationship of the offset angle, the relationship between the wavefront distortion and the detected spot displacement can be derived:

(

$$x = \frac{\delta y}{f} = \frac{\Delta z}{d} \tag{10}$$

The relationship between the PV (peak–valley) value and the RMS value of the wavefront had to be measured, and its  $\beta$  was determined by simulation. When the PV value of the initial wavefront was 0.6  $\lambda$ , and the RMS value was about 0.15  $\lambda$ , the beam quality factor  $\beta$  of the far-field spot was about 1.8. Here,  $\beta$  is an important parameter used to describe the quality of a laser beam. It is usually used to measure the degree of similarity between a laser beam and an ideal Gaussian beam and can also be used to compare the quality difference between different laser beams, defined as the ratio of the actual far-field divergence angle to the reference far-field divergence angle or as the ratio of the actual focused spot radius to the ideal spot radius. Therefore, we set the wavefront PV value of the minimum effective reconstruction to be achieved by the measurement system to about 0.6  $\lambda$ . If the number of single-row lenses was 5, and the space-occupying factor of the system was 0.8, the wavefront measured by a single lens was about 0.096  $\lambda$ . According to (10), we can calculate  $f \geq 47$  d.

When the lens diameter was d = 25.4 mm, the focal length was  $f \ge 47 d \approx 1194$  mm. In other words, when the diameter of the selected lens was 25.4 mm, the focal length of the lens had to be adjusted to not less than 1194 mm to meet the measurement requirements of the system. In summary, the main input parameters of the system are shown in Table 1.



Figure 1. Sub-lens imaging schematic diagram.

Table 1. System input parameters.

Parameter	Description	
Pixel size/µm	4.5	
Beam wavelength/nm	1064	
Lens size/mm	25.4	
Lens spacing/mm	6.35	
Duty factor	0.8	
Lens focal length/mm	1200	

## 3.2. Lens Array Arrangement

In this paper, different turbulent wavefronts were analyzed. It was necessary to consider the influence on the wavefront reconstruction accuracy not only of the number of sub-lenses in the lens array of the measurement system but also of different lens arrangements. Therefore, we propose two lens array layouts: a uniform arrangement and a sparse arrangement. The uniform arrangement included the  $5 \times 5$  lens array arrangement and a 19-lense hexagonal arrangement, and the sparse arrangement included 25 lenses and a 31-lense sparse arrangement. Here, the sparse arrangement was mainly applied to the recovery analysis of higher-order aberrations, because the slope variation of higher-order aberrations was mainly concentrated in the edge of the wavefront. The specific lens array layouts are shown in Figure 2. The red area in the figure is the effective detection range of the wavefront to be measured.



**Figure 2.** Different lens array arrangements. (a) A  $5 \times 5$  lens array, (b) a hexagonal arrangement of 19 lenses, (c) a sparse arrangement of 25 lenses; (d) a sparse arrangement of 31 lenses.

# 4. Results and Discussion

# 4.1. Single Aberration Analysis

When using Zernike polynomials to reconstruct the wavefront of a distorted wavefront, mode coupling and confusion need to be considered. Mode coupling is caused by the number of Zernike terms selected in wavefront reconstruction being less than the number of mode terms of the actual distorted wavefront. The reason for mode confusion is that highorder aberrations and low-order aberrations cannot be effectively distinguished within the sub-lens range of the system. Dai [22] and Zhang [29] et al. also discussed the relationship between mode confusion, mode coupling, and the number of Zernike terms used in wavefront reconstruction. By selecting different wavefront reconstruction orders, the corresponding wavefront reconstruction accuracy and stability curves are obtained, and then the final wavefront reconstruction order is determined by comparison. The turbulence wavefront is mainly composed of low-order Zernike polynomials, and the proportion of high-order Zernike polynomials is very small. Therefore, the first 28 Zernike polynomials excluding piston and tilt were selected for wavefront reconstruction. To avoid mode coupling, the order of the mode wavefront reconstruction we selected was the same as the order of the actual aberration. According to the four kinds of lens array arrangement described in Section 3.2, the reconstruction analysis of each single aberration order was carried out. The simulation results are shown in Figure 3, and the statistical values of the reconstruction accuracy for the different orders of single aberrations of the four kinds of lens array arrangement are shown in Table 2.

In order to facilitate the exposition, in the following, the lens arrangements are indicated as 1, 2, 3, 4, corresponding to the  $5 \times 5$  lens array arrangement, the hexagonal arrangement of 19 lenses, the sparse arrangement of 25 lenses, and the sparse arrangement of 31 lenses, respectively.

Combining Figure 3 and Table 2, it can be seen that among the four lens array arrangements, the lens arrangement 1 and the lens arrangement 4 allowed for better reconstruction accuracy for the first 28 single aberrations. This is because the number of lens units in these two arrangements was relatively large. The reconstruction accuracy for single aberrations of the lens arrangement 1 was better than that achieved by the lens arrangement 3. The reason is that the number of lens units in the two arrangements was close, and the lens units in the former were arranged more closely. According to the results obtained with arrangement 3 and arrangement 4, we concluded that a sparse arrangement does not provide much advantage in low-order aberration reconstruction. When the number of lens units is relatively small, the aberration recovery ability of a sparse arrangement is not as good as that of a uniform arrangement. However, when the number of sparsely arranged lens units is large, a sparse arrangement has a good reconstruction effect on the aberrations of the turbulent wavefront, especially on high-order aberrations. This is because the higher the order of the turbulent wavefront aberrations, the larger their proportion at the wavefront edge. Figure 4 shows the reconstruction results in the presence of some high-order aberrations when using the lens arrangement 4.





**Table 2.** The statistical values of the recovery accuracy for the different orders of single aberrations of the four lens array arrangements.

	Quantity	Mean	Standard Deviation	Variance
$5 \times 5$ Lens array	25	0.03944	0.02821	$7.96036  imes 10^{-4}$
Hexagonal arrangement of 19 lenses	25	0.05175	0.02475	$6.12562  imes 10^{-4}$
25 Units sparsely arranged	25	0.05184	0.03849	0.00148
31 Units sparsely arranged	25	0.03282	0.01831	$3.35307  imes 10^{-4}$

Original Wavefront

Reconstructed Wavefront

Residual Wavefront





# 4.2. Maximum Recognizable Mode Order of the System

The wavefront reconstruction accuracy and stability are used to evaluate the wavefront reconstruction process when considering different mode reconstruction orders for wavefront reconstruction. The wavefront reconstruction accuracy evaluation method was described in detail in Section 2.3. Stability means that the anti-noise interference ability of the wavefront reconstruction process can be evaluated by the condition number of the reconstruction matrix [30,31]. The condition number is defined as:

$$Cond(Z) = \sigma_{\max} / \sigma_{\min}$$
 (11)

where  $\sigma_{max}$  and  $\sigma_{min}$  represent the maximum and the minimum singular values of the reconstruction matrix Z, respectively. The relationship between the Zernike mode coefficient fluctuation  $\Delta A$  of the reconstructed wavefront and the slope measurement disturbance  $\Delta G$  is as follows:

$$\frac{\|\Delta A\|_2}{\|A\|_2} = Cond(Z) \frac{\|\Delta G\|_2}{\|G\|_2}$$
(12)

The above formula shows that the larger the condition number, the greater the fluctuation of the Zernike mode coefficients of the reconstructed wavefront caused by the slope measurement error.

According to Figure 3, the aberration recovery accuracy of the four arrangements showed an upward trend after the 21st order, which indicated that the increase in the aberration order had a certain degree of influence on the recovery ability of the system. Therefore, we continued to increase the order of the turbulent wavefront aberrations to be measured and analyzed the maximum order of recognizable modes that could be achieved by the different arrangements. In addition, the condition numbers of the four arrangements for different wavefronts are reported to judge whether the recovery results

were reliable. The turbulent wavefront aberration reconstruction accuracy of the different examined arrangements is shown in Figure 5a, and the curve displaying the condition number changing with the increase in the aberration order is shown in Figure 5b.



**Figure 5.** Reconstruction results of a turbulent wavefront by different lens arrangements. (**a**) Turbulent wavefront reconstruction accuracy, (**b**) turbulent wavefront reconstruction stability.

According to Figure 5, when the order of the turbulent wavefront aberrations exceeded 25, the condition number of the lens arrangements 1 and 2 increased sharply, and the wavefront recovery accuracy decreased rapidly, which means that the wavefront reconstruction ability was poor. Therefore, we determined that the maximum order of turbulent wavefront aberrations for the lens arrangements 1 and 2 allowing for achieving effective

reconstruction was 25. According to Figure 5a, we could also conclude that in order to ensure a high reconstruction accuracy, the order of turbulent wavefront aberrations with the lens arrangements 1 and 2 should not exceed 21. With the lens arrangements 3 and 4, the reconstruction accuracy and stability of the turbulent wavefront composed of the first 36 aberrations were relatively good. In order to continue to explore the maximum possible order of these two arrangements allowing for effective wavefront reconstruction, we continued to increase the constituent aberrations of the turbulent wavefront. Further simulation results are shown in Figure 6. According to the above analysis and as shown in Figure 6, the maximum order allowing for effective reconstruction was 36 with the lens arrangements 3 and 4. This further illustrates that different lens arrangements and different numbers of lens units in the turbulent wavefront reconstruction system will lead to effective recovery in the presence of different aberration orders.



Figure 6. Reconstruction results of turbulent wavefront aberrations by the examined sparse arrangements.

## 4.3. Turbulent Wavefront Analysis

The third section of this paper discusses the accuracy of turbulent wavefront aberration reconstruction under different lens arrangements and the maximum order allowing for effective reconstruction that can be achieved with the various arrangements. The atmospheric turbulence wavefront in the actual measurement presented mixed aberrations. According to the Equations (2)–(5) in Section 2.2, we can obtain a series of random turbulent wavefronts. In order to facilitate the comparison of the reconstruction ability of the four arrangements in the presence of mixed aberrations, we generated two different sets of turbulent wavefronts. In one group, the maximum order of aberrations that constituted the turbulent wavefront was 28, and the aberration coefficients of the orders from the 22nd to the 28th were much smaller than the remaining aberration coefficients. The other group of turbulent wavefront only retained the wavefront aberration coefficients of the first 21 orders of the previous group. Figure 7 shows the RMS value curve of the generated turbulent wavefront aberrations.





The generated wavefront was processed and examined by the lens array systems to obtain a reconstructed wavefront, and then the wavefront reconstruction accuracy was calculated. Figure 8 shows one of the calculation examples. The same turbulent wavefront was reconstructed by the above four arrangements. The measured turbulent wavefront PV value was  $1.56 \lambda$ , and the RMS value was  $0.26 \lambda$ . The turbulent wavefront reconstruction accuracy of the four arrangements is shown in Figure 9.



Figure 8. Turbulent wavefront reconstruction.



**Figure 9.** The turbulent wavefront reconstruction accuracy of the different lens arrangements. (a) A 28-order turbulent wavefront, (b) a 21-order turbulent wavefront.

According to Figure 9, we can conclude that for general turbulent wavefronts, the number of sub-lenses in the lens array is a major factor limiting wavefront measurements. Due to the relatively small number of lens units, the maximum number of modes that could be effectively identified was also relatively low. This caused the system to lose the ability to measure the turbulent wavefront when higher-order aberrations were present in. The reconstruction results when using the lens arrangements 3 and 4 proved that increasing the number of sub-lenses in the lens array can allow for the measurement of a turbulent wavefront with higher-order aberrations. As shown in Figure 9b, when the aberration order of the turbulent wavefront was low, the lens arrangement with fewer lenses could be

used to measure the turbulent wavefront, and the wavefront reconstruction accuracy was less different from that achieved when the number of lenses was large, compared to the previous situation.

## 5. Conclusions

In this paper, a turbulent wavefront measurement model based on the Hartmann system structure is proposed, which can measure and analyze atmospheric turbulence wavefronts using different lens arrangements. Four lens array models with uniform and sparse arrangements were established. The maximum identifiable aberration order for different lens numbers was discussed, and the influence of different lens array arrangements on the accuracy of turbulent wavefront reconstruction was analyzed. The results showed that the increase in the aberration order of the turbulent wavefront had a certain influence on the reconstruction ability of the system. When the system contained a  $5 \times 5$  lens array arrangement or a hexagonal arrangement of 19 lenses, the maximum order of turbulent wavefront aberration allowing for effective reconstruction was 25. In order to ensure a high reconstruction accuracy, the reconstruction order of turbulence wavefront aberrations should not exceed 21. When the system contained a 25-lense sparse arrangement or a 31-lense sparse arrangement, the reconstruction accuracy and stability of the turbulent wavefront composed of the first 36 aberrations were relatively good. This also proved that different lens arrangements and different numbers of lenses in the turbulence wavefront reconstruction system will lead to effective reconstruction in the presence of aberration of different orders.

When the aberration composition of the turbulent wavefront contained higher-order aberrations, the system could not accurately measure the turbulent wavefront. Increasing the number of sub-lenses in the lens array could achieve the measurement of a turbulent wavefront with higher-order aberrations. When the aberration order of the turbulent wavefront was low, the lens arrangement with a small number of lens units could be used to measure the turbulent wavefront.

The turbulence wavefront measurement model proposed in this paper provides a new idea and method for atmospheric turbulence measurement. It is effective for the analysis of the operating performance of optical systems affected by turbulence.

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