Application of Orthogonal Polynomial Fitting Method to Extract Gravity Wave Signals from AIRS Data Related to Typhoon Deep Convection

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Abstract

Gravity waves can influence weather and climate patterns on various temporal and spatial scales in atmosphere. Despite their recognized importance, there are clearly a lack of sufficient and accurate observations from currently available satellite observing systems to satisfy the requirements of many satellite users. Common method to detect gravity waves is to measure bright temperature (BT) anomalies, which rely on an initial efficient background removal method. Before gravity waves can be extracted from Atmospheric Infrared Sounder (AIRS) raw radiances, Hoffmann and Alexander (2010) used a fourth-order polynomial fitting (4PF) method to remove the background variations. In this study, we propose a new strategy, an optimal orthogonal polynomial fitting (OPF) method using Chebyshev Polynomials as basis functions, to remove the background variations and estimate BT perturbations. By extending the classic 4PF method to the fifth-order polynomial fitting (5PF) method, and combining the Cressman interpolation (CI) method, some experiments are designed to validate the feasibility and superiority of OPF method. The results show that OPF is the optimal method to remove the limb-brightening effect in the extraction of gravity wave signals generated by typhoons. In addition, what we noticed is that an appropriate fitting orders have to be selected to get more accurate BT anomalies signals in the experiments to extract gravity wave signals.

Application of Orthogonal Polynomial Fitting Method to Extract Gravity Wave Signals from AIRS Data **Related to Typhoon Deep Convection**

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Key Points:

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9	•	The OPF method is proposed to extract gravity wave signals generated by typhoon
10		deep convection systems.
11	•	The OPF is an optimal method to remove the background BT and extract grav-
12		ity signals from AIRS data.
13	•	Although the 5PF method is inferior to the OPF method, the 5PF method is su-
14		perior to the 4PF method and the CI method.

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15 Abstract

Gravity waves can influence weather and climate patterns on various temporal and spa-16 tial scales in atmosphere. Despite their recognized importance, there are clearly a lack 17 of sufficient and accurate observations from currently available satellite observing sys-18 tems to satisfy the requirements of many satellite users. Common method to detect grav-19 ity waves is to measure bright temperature (BT) anomalies, which rely on an initial ef-20 ficient background removal method. Before gravity waves can be extracted from Atmo-21 spheric Infrared Sounder (AIRS) raw radiances, Hoffmann and Alexander (2010) used 22 a fourth-order polynomial fitting (4PF) method to remove the background variations. 23 In this study, we propose a new strategy, an optimal orthogonal polynomial fitting (OPF) 24 method using Chebyshev Polynomials as basis functions, to remove the background vari-25 ations and estimate BT perturbations. By extending the classic 4PF method to the fifth-26 order polynomial fitting (5PF) method, and combining the Cressman interpolation (CI) 27 method, some experiments are designed to validate the feasibility and superiority of OPF 28 method. The results show that OPF is the optimal method to remove the limb-brightening 29 effect in the extraction of gravity wave signals generated by typhoons. In addition, what 30 we noticed is that an appropriate fitting orders have to be selected to get more accurate 31 BT anomalies signals in the experiments to extract gravity wave signals. 32

33 1 Introduction

34 Atmospheric gravity waves play a critical role in general circulation at scales ranging from regional weather pattern to global climate (Miller et. al., 2015). Satellite in-35 struments are widely used to detect gravity waves, because it is not affected by weather 36 and can observe its global structure (Moffat-Griffin, 2019; Vargas et. al., 2021). Gener-37 ally, gravity wave signals are obtained by filtering out fluctuations of other scales through 38 satellite observation data, we observed its shape and performed spectral analysis to ob-39 tain its wavelength and period (Florian and Vincent, 2001; Alexander and Barnet, 2007; 40 Wang et. al., 2019). The AIRS detector carried on the Aqua satellite overcomes the short-41 comings of insufficient resolution of previous data, and Its 4.3μ m and 15μ m bands are 42 often used to discern gravity wave signals (Alexander and Barnet, 2007; Hoffmann and 43 Alexander, 2009, 2010). Studies have shown that stratospheric temperature anomalies 44 are directly related to BT from AIRS 4.3μ m absorption band (Hoffmann and Alexan-45 der, 2009, 2010). AIRS radiation can be used to detect gravity waves with a vertical height 46 in the range of 20km-65km and a horizontal wavelength exceeding 40 km (Alexander and 47 Barnet, 2007). 48

Historically, various background removal methods have been adopted for different 49 observation data (Alexander et. al., 2010). As early as the end of the 20th century, us-50 ing sounding data detected by satellite LIMS (Limb Infrared Monitor), scientists intro-51 duced linear quadratic estimation to separate small-scale temperature perturbations from 52 global temperature data to extract synoptic-scale stratospheric gravity wave signals (Fet-53 zer and Gille, 1994; Eckermann and Preusse, 1999). When extracting tropospheric grav-54 ity waves from $6.7\mu m$ water vapor channel of MODIS (Moderate Resolution Imaging Spectro-55 radiometer) detector, a filtering algorithm was used to minimize the detector-to-detector 56 artifacts (Uhlenbrock et. al., 2007; Lyapustin et. al., 2014). Radiation perturbations sep-57 arated by subtracting a third-order fitting polynomial from AMSU (Advanced Microwave 58 Sounding Unit-A) Channels 9-14 (upper troposphere to middle stratosphere) data can 59 extract 80hPa-2.5hPa gravity wave activity (Wu and Zhang, 2004; Eckermann et. al., 60 2006).61

Satellite remote sensing data have improved our ability to observe gravity waves
 from space (Perrett et. al., 2021). However, there is still a gap between the observed tem perature perturbation signals and simulated gravity waves signals. Some interpolation
 methods, such as CI and 4PF methods, are widely used to remove background variations

in oceanic and atmospheric subjects. AIRS $4.3\mu m$ BT show a scan angle-dependent limb-66 brightening effect and a variable background variations due to planetary waves. Before 67 gravity waves can be detected, Hoffmann and Alexander (2010) proposed to subtract a 68 4PF to remove the limb-brightening and other background effect. The subtracted 4PF 69 is essentially the plane-parallel wave components oriented in the along-track direction. 70 Because the angle-dependent perturbations along the track direction is not taken into 71 account, the separated BT perturbation still contains some background variations, and 72 it is necessary to propose a more accurate gravity wave signals extraction method. 73

74 The primary motivation for our work is to introduced a new method to retrieve gravity wave signals, also known as OPF method, which is one of the methods combining ac-75 curacy with efficiency to remove background BT. This paper is organized as follows, Sec-76 tion 2 is a description of the data and methods. The third part of this article is an in-77 troduction to the typhoon event. Numerical simulation of gravity waves induced by con-78 vection are set up in section 4. In Section 5, OPF method is introduced to fit AIRS back-79 ground BT and extract gravity wave signals, and practical comparison are also carried 80 out in this section. Section 6 presents the conclusions and discussions. 81

⁸² 2 Data and Methods

2.1 Data Selection

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⁸⁴ Gravity waves are detected by AIRS on Aqua satellite via the temperature pertur-⁸⁵ bation anomalies in atmosphere. AIRS instruments can provide infrared radiance spec-⁸⁶ tra in 3.74-4.61 μ m, 6.2-8.2 μ m and 8.8-15.4 μ m wavebands. Among them, the 4.3 μ m and ⁸⁷ 15 μ m CO2 spectral bands have been extensively used to study gravity waves in the strato-⁸⁸ sphere (Alexander and Barnet, 2007; Hoffmann et. al. 2018). Here we select the AIRS ⁸⁹ 4.3 μ m and 15 μ m channel Level 1B raw radiance data to examine gravity waves signals ⁹⁰ observed in typhoon (Soulik 1307).

2.2 A local analysis method

Analysis of satellite highly accurate temperature perturbations involves removing 92 background variations and limb-brightening effect. As is traditionally done with AIRS, 93 The 4PF method was used to remove the background and limb-brightening effect (Hoff-94 mann and Alexander, 2009; Holt and Alexander, 2017; Alexander and Barnet, 2007; Hoff-95 mann et. al., 2014; Hindley et al., 2016; Wright et. al., 2017). In the present manuscript, 96 a new OPF method, based on Chebyshev basis functions, can be also determined to re-97 move the background and limb-brightening effect, in the cross-track as well as along track 98 direction from AIRS raw radiances, and produce highly accurate temperature pertur-99 bations (Junkins et. al., 2013; Li et. al., 2019). 100

¹⁰¹ 3 Typhoon Soulik (TS1307) Overview

TS1307 initially started as a tropical depression moving west across the western 102 Pacific Ocean on July 8, and then intensified into a tropical storm at 02:00UTC on 9 July 103 2013. Figure 1 shows the trajectory, the minimum pressure and maximum sustained sur-104 face wind speed of storm life span. The storm rapidly strengthened in the next 24 hours, 105 becoming a typhoon with category 1 at 08:00UTC on 9 July 2013 and a super typhoon 106 with category 4 at 02:00UTC on 10 July 2013, and then reached its peak wind speed of 107 $\sim 63.88 m s^{-1}$, when it moved westward along the southern periphery of subtropical high 108 pressure system. On the afternoon of 11 July 2013, it weakened to a category 1 typhoon, 109 and then made landfall at Taiwan island with a wind speed of $45ms^{-1}$ at 03:00UTC on 110 13 July 2013. TS1307 reached Fujian Province at 16:00UTC on 13 July 2013 with a wind 111 speed of $33ms^{-1}$, and continued to move inland with heavy rain and rapidly diminish-112 ing wind speeds. TS1307 encountered a preexisting cold eddy and midlevel dry air en-113

trained from its northwest, which coincided with its weakening before landfall. Strikingly,
two concentric eye-wall (CE) structures are identified, one maintained from 07:29 UTC
on July 9 to 08:32 UTC on July 10, and the other could be clearly seen from 06:30 UTC
on July 11 to 16:49 UTC on July 12, which may be related to gravity waves generated
by typhoon deep convection.

Our next step is to analyze whether the gravity waves are generated by deep con-119 vection in the typhoon. For the typhoon events we studied, we identified deep convec-120 tion mainly by the 1231 cm^{-1} AIRS radiance channel, and a threshold of 220K was se-121 lected to detect deep convection (Hoffmann and Alexander, 2010). The AIRS cloud top 122 BT at 8.1 μ m are presented in Figure 2, where high cold clouds are identified by low BT 123 (i=220K), indicating the existence of deep convection. What's striking is that, deep con-124 vection is at its strongest period, when TS1307 intensifies rapidly and has peak inten-125 sity (16:42 on July 9). However, it can be clearly seen that deep convection weakens be-126 fore (17:12 on July 12) and after (17:54 on July 13) TS1307 makes landfall. 127



Figure 1. (a) Trajectory of storm from 6 to 13 July 2013, based on Joint Typhoon Warning Center best track data, and (b) Maximum surface wind speed and minimum central pressure of storm life span.

128 4 Numerical Simulation

The numerical simulation of gravity wave was performed using the Advanced Re-129 search WRF modeling system. The model was set up with a horizontal 102×86 grid points 130 and 30km grid spacing centered on Taiwan Island $(23.8^0N, 120.9^0E)$, a nested domain 131 with 10 km grid spacing and a vertical sigma levels from the surface to 10 hPa, and the 132 topmost 10 km was used as a damping layer. The simulation was integrated for 36h from 133 00:00 UTC 12 July to 12:00 UTC 13 July. Boundary and initial conditions were estab-134 lished using the National Centers for Environmental Prediction (NCEP) Final Analy-135 sis data, which had $1^0 \times 1^0$ grid resolution. The model physics schemes applied are the 136 K-F scheme for cumulus parameterization, Lin microphysics scheme, Yon-sei University 137 planetary boundary layer scheme, and Rapid Radiative Transfer Model for long wave ra-138 diation physics scheme (Hong et al., 2004; Hong et al., 2006; Wu et. al., 2015). 139

The simulated typhoon track agrees well with the observed, although it moves slightly 140 slower than the observation. Fortunately, the simulated typhoon intensity represented 141 by the minimum sea level pressure approaches the observed values after landfall. The 142 magnitudes of gravity waves correlate with typhoon intensity more or less when a typhoon 143 is in a decaying stage. To compare gravity wave characteristics in the WRF simulations 144 and AIRS observations quantitatively, Figure 3 shows a plot of the simulated vertical 145 velocity and potential temperature, the corresponding wavelet coefficient, local wavelet 146 power spectrum (WPS), and its global WPS. Some wave-like cloud structures can be seen 147 in Figure 3a and Figure 3b, indicating gravity waves moving eastward relative to typhoon. 148 In the WRF simulation, most obvious was the significantly wavelet power through the 149



Figure 2. AIRS cloud top temperature at 8.1μm (unit: K). (a) 15:00-20:00UTC 9 July, (b) 02:00-07:00UTC 12 July, (c) 15:00-20:00UTC 12 July, (d) 15:00-20:00UTC 13 July 2013.

256 km wavelength (figure 3c). This is also illustrated by the predominant black contour band located at the 256 km wavelength on the local WPS (Figure 3d). The 256 km
wavelength can be intuitively illustrated by the major peak in the global WPS (Figure 3e).

¹⁵⁴ 5 AIRS Observation

Analysis of AIRS radiances first require to subtract a background signals, the re-155 maining residuals are then treated as gravity waves. In this study, a new OPF method 156 has been developed to remove the limb-brightening effect and orthogonally fit the back-157 ground signals. As is traditionally done with AIRS, the 4PF method will be also applied 158 to extract gravity wave signals. Besides, both the 5PF and CI method are employed to 159 evaluate and demonstrate the effectiveness of the OPF method. For the OPF method, 160 the polynomial orders should be selected according to observation. In this study, the poly-161 nomial orders of cross-track and along-track direction are set to 6 and 7, respectively. 162 Alternatively, for the CI method, the influence radius of CI method is initially selected 163 as 3^0 to generate background signals. If there are at least 100 observation points within 164 the influence radius, the background signals of that grid will be computed. Otherwise, 165 the influence radius is increased by 0.1° until there are 100 observation points that fall 166 within the radius. 167



Figure 3. Wavelet spectra analysis of Simulated vertical velocity at z=26 km at 17:00 UTC, 12 July, 2013 (a) Vertical Velocity, (b) Potential Temperature, (c) Wavelet Coefficient, (d)Local WPS, (e)Global WPS.

168 5.1 AIRS Gravity Waves Signals

The deep convection in typhoon generates gravity waves, analysis of which can be 169 conducted using AIRS data. Figure 4 shows the AIRS 4.3μ m BT perturbations induced 170 by TS1307 as sampled at 17:12 UTC 12 July 2013. Ring-like features indicating concen-171 tric gravity waves are easily discerned in each panel. However, gravity waves estimated 172 by PF (4PF and 5PF) and CI methods show an intuitive spurious signals on the right-173 side of the scan. It has to be noted that, wave signals obtained by CI method indicate 174 particularly obvious biases compared to all other methods on the left side of the scan. 175 176 We are aware that no significant false signals with the OPF method are seen on the left and right side of the scan. These suggest that the estimated signals will apparently be 177 more accurate if the OPF method is adopted. 178

AIRS BT perturbation variances by the four methods are displayed in Figure 5. If the variance exceeds the threshold of $0.05K^2$ in the range of r < 100km, it is assumed to be a gravity wave event. Perturbation variances by the four background removal methods determine that waves occurred behind the center of moving typhoon.

¹⁸³ 5.2 Comparison of AIRS BT Signals

The estimated background BT using the four methods are shown in Figure 6, and the black solid line indicates that the estimated background BT equal to raw radiances. From this Figure we can see that the background BT estimated by the PF and CI methods are asymmetric at the right end of the black solid line. However, the background BT estimated using the OPF method are approximately symmetric at the right end of the



Figure 4. Gravity wave signals from AIRS radiance by four methods (a) 4PF, (b) CI, (c) 5PF and (d) OPF method in the altitude range z=30-40 km at 17:12 UTC on 12 July 2013.

black solid line. The background signal obtained by the OPF method match well with
 the raw radiance, which are basically adjacent to the solid line.

To further compare the pros and cons of the four methods for removing limb ef-191 fects along the viewing angle, the optimum BT profile, spanning from $119.9^{\circ}E$ to $137.5^{\circ}E$ 192 along latitude $21^{\circ}N$ in the altitude range 30-40km, can be expected to distinguish these 193 four methods. The removal of the BT background signals is directly related to the char-194 acterization of the perturbation signals. The results in Figure 7 show that there are ob-195 vious differences between the four methods at both ends of the profile line. For the re-196 197 gions where the BT at the end of the scan is the largest, although the 5PF method is an improvement over the 4PF, there is still no obvious improvement effect. In contrast, 198 the OPF method has the best fitted BT at the left and right end of the scan. 199

One way to assess how well a background BT fits a raw BT is to calculate the root mean square error (RMSE), which is a metric that tells us the average distance between the fitted BT from the four methods and the raw BT in the dataset.

²⁰³ The formula to find RMSE is as follows:

$$RMSE = \sqrt{\frac{SSE}{n}}, SSE = \sum_{i=1}^{n} (y_i - \widehat{y}_i)^2 \tag{1}$$

where N is the number of samples, y_i is the fitted background BT and \hat{y}_i is the raw BT.



Figure 5. AIRS BT perturbation variances obtained by the four methods (a) 4PF, (b) CI, (c) 5PF and (d) OPF method.

Another way is to calculate R-Squared (RS), which indicates the correctness of the background BT and shows how well the background BT fits the raw data.

$$RS = 1 - \frac{SSE}{SST}, SST = \sum_{i=1}^{n} (y_i - \bar{y}_i)^2$$
(2)

where SST is the total sum of squares and \bar{y}_i is the mean fitted background BT.

Here, the RMSE and RS are particularly useful for comparing the fit of these four 208 methods. By employing both RS and RMSE as indicators, the accuracy of the fitted BT 209 can be validated comprehensively. Figure 8 shows RMSE (blue line) and the determi-210 nation coefficient RS (red line) between the background and raw BT at both ends of the 211 profile line. As you can see from the figure 8, OPF has the lowest RMSE, which indi-212 cates that it's able to fit the background BT the best out of the four potential methods. 213 In addition, it can be seen from Figure 8 that the RS of 5PF is the largest, and the RS 214 of OPF is slightly weaker than that of 5PF. However, in combination with Figure 7, the 215 5PF mistakenly treats some real signals as gravity wave signals, which results in the fit-216 ted background BT being closer to the raw BT. Therefore, on the whole, among the four 217 218 methods, the OPF method is the best for fitting the background BT at both ends of the profile line. This suggests that if we utilize the OPF method, the fitted BT will appar-219 ently be more accurate. 220



Figure 6. Comparison of Estimated BT background signals from the four methods (a) 4PF, (b) CI, (c) 5PF and (d) OPF method.

5.3 AIRS BT Wavelet Analysis

The wavelet analysis, commonly used in meteorology, is employed to represent the 222 wave signals revealed by the BT curves in Figure 7. Local wavelet power spectrum (WPS) 223 and global WPS of the estimated BT obtained by utilizing the four fitting methods are 224 shown in Figure 9 and 10. The cone of influence (COI), which can isolate the background 225 and false signals from the realistic wave signals, enclosed by the blue curve and the x-226 axis, represents where edge effects become important. The circles surrounded by the black 227 curve in the figure are where the 95% confidence test was passed. The wavelength can 228 229 be recognized by looking at the high-intensity spectrogram and visualizing its magnitude. It can be seen that wave signals exhibit an obvious high wavelet power through 230 the 256 km wavelength in Figure 9 and 10. This is illustrated by the predominant black 231 circles located at the 256km wavelength on the local WPS. The 256km wavelength also 232 illustrated by the major peak in the global WPS and the corresponding wavelet coeffi-233 cient. However, the spectrum of BT obtained by the 4PF method shows a wavelength 234 between 256 km and 512 km, and the wavelet power by CI method also revealed two spec-235 tral peaks with wavelengths greater than 256 km. Strikingly, they are both outside the 236 COI and beyond the 95% confidence level. These demonstrate that the BT signals ob-237 tained by the CI and 4PF method still contain strong background signals that has not 238 been removed. It is worth noting that in the wavelet spectrum revealed by the 5PF and 239 OPF methods, the most notable spectral peak is at 256 km wavelength, and there are 240



Figure 7. Comparison of BT by the four methods (a) Raw BT profile and background BT profile (b) Perturbation BT profile.

no other significant wavelengths. As can be seen from Figure 3 and 11, the gravity waves
identified from the WRF simulation are reproduced well in the AIRS BT perturbations
estimated by 5PF and OPF method, both in terms of horizontal wavelength and wave
morphology.

To further select the optimal AIRS BT perturbation signals, the first step is to in-245 tercept 200 km at the left and right ends of the curves in Figure 7. Figure 11 shows the 246 local and global WPS of the BT perturbations at the right end of the curves. The most 247 striking is that the BT perturbation spectrum revealed by the 4PF method contains a 248 significant spurious background signal. The most intuitive is that there are some signif-249 icant small wave signals with wavelengths ranging from 4 to 8 km in the BT perturba-250 tion spectrum obtained by the OPF method. Relatively speaking, these indicate that 251 BT perturbation obtained by the OPF method contains less background signals and more 252 real signals. 253

²⁵⁴ 6 Conclusion and Discussion

In this paper, the OPF method is presented to extract gravity wave signals from 255 the AIRS data, and a Typhoon event is selected as an example. When applying the OPF 256 method, we need to pay attention to the selection of the appropriate orders in x and y 257 directions, after the polynomial coefficients are calculated based on observational data. 258 Gravity wave signals from typhoon are successfully extracted by the OPF method with 259 accuracy higher than CI and PF (4PF and 5PF) method. Therefore, it is validated that 260 the OPF method can extract gravity wave signals accurately. The RMSEs of the OPF 261 method are the smallest among those methods extracting gravity wave signals. The real 262 waves signals by WRF simulation are reproduced well in the AIRS BT perturbation ob-263 tained by OPF method. Although the 5PF method is inferior to the OPF method, the 264 5PF method is superior to the 4PF method and the CI method. However, it has to be 265 pointed out that to obtain accurate gravity wave signals, better mathematical methods 266



Figure 8. Comparison of RMSE and RS between the raw and the background BT fitted by the four methods (4PF, CI, 5PF and OPF method) at the (a) left and (b) right end of the profile line.

- ²⁶⁷ need to be proposed later to eliminate the interference caused by the satellite scanning
- ²⁶⁸ angle and other scale signals.

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Figure 9. Wavelet coefficient and WPS (Local and Global) of the CI (a, b, c) and OPF(d, e, f) BT curves in Figure 7.

²⁷² 7 Appendix: OPF Method

The OPF method is based on Chebyshev polynomials and basis functions. The raw BT can be fitted as (Junkins et al., 2013; Li et al., 2019):

$$\tilde{T}(x_i, y_i) = \sum_{K=0}^{K_0} \sum_{S=0}^{S_0} A_{K,S} \Phi_K(x_i) \xi_S(y_i)$$
(A.1)

where $x_i (i = 1, 2, ..., N)$ and $y_j (j = 1, 2, ..., M)$, and K and S are the orders of polynomials in the x and y directions, respectively. K_0 and S_0 are the corresponding cut-off



Figure 10. Wavelet coefficient and WPS (Local and Global) of the 5PF (a, b, c) and OPF (d, e, f) BT curves in Figure 7.

orders. $\Phi_K(x_i)$ is the k-order Chebyshev polynomial in the x direction, and $\xi_S(y_j)$ is the s-order Chebyshev polynomial in the y direction.

Because the Chebyshev polynomial is orthogonal, the Chebyshev expansion coefficients $A_{K,S}$ can be written as

$$A_{K,S} = \frac{\sum_{i=1}^{N} \sum_{j=1}^{M} T(x_i, y_i) \Phi_K(x_i) \xi_S(y_j)}{\sum_{i=1}^{N} \Phi_K(x_i)^2 \sum_{j=1}^{M} \xi_S(y_j)^2}$$
(A.2)



Figure 11. Local and Global WPS of the estimated BT by these four methods (a) CI, (b) 4PF, (c) 5PF and (d) OPF method at the right end of the curves in Figure 7.

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The sum of squared errors SSE is expressed as

$$SSE(A_{0,0}, A_{1,0}, ..., A_{K_0, S_0}) = \sum_{i=1}^{N} \sum_{j=1}^{M} [T - \sum_{K=0}^{K_0} \sum_{S=0}^{S_0} A_{K,S} \Phi_K(x_i) \xi_S(y_j)]^2$$
(A.3)

The raw BT is orthogonally expanded using the OPF method to determine the alongtrack and cross-track eigenvectors of each grid point, which are multiplied with the corresponding weight coefficients.

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