



A Study on the High-Order Spectral Model Capability to Simulate a Fully Developed Nonlinear Sea States

Young Jun Kim¹, Hyung Min Baek², Young Jun Yang³, Eun Soo Kim^{1,4} and Young-Myung Choi^{1,4}

¹Researcher, Global Core Research Center for Ships and Offshore Plants, Pusan National University, Busan, Korea

²Ph. D. candidate, Dept. Naval Architecture and Ocean Engineering, Pusan National University, Busan, Korea

³Professor, Dept. Naval Architecture and Ocean Engineering, Tongmyong University, Busan, Korea

⁴Professor, Dept. Naval Architecture and Ocean Engineering, Pusan National University, Busan, Korea

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ABSTRACT: Modeling a nonlinear ocean wave is one of the primary concerns in ocean engineering and naval architecture to perform an accurate numerical study of wave-structure interactions. The high-order spectral (HOS) method, which can simulate nonlinear waves accurately and efficiently, was investigated to see its capability for nonlinear wave generation. An open-source (distributed under the terms of GPLv3) project named "HOS-ocean" was used in the present study. A parametric study on the "HOS-ocean" was performed with three-hour simulations of long-crested ocean waves. The considered sea conditions ranged from sea state 3 to sea state 7. One hundred simulations with fixed computational parameters but different random seeds were conducted to obtain representative results. The influences of HOS computational parameters were investigated using spectral analysis and the distribution of wave crests. The probability distributions of the wave crest were compared with the Rayleigh (first-order), Forristall (second-order), and Huang (empirical formula) distributions. The results verified that the HOS method could simulate the nonlinearity of ocean waves. A set of HOS computational parameters was suggested for the long-crested irregular wave simulation in sea states 3 to 7.

1. Introduction

The performance analysis of an offshore structure operating in the ocean is commonly requested to verify its survivability and operability over its expected design life. The most common way is to conduct an experimental campaign on the offshore platform in the wave basin. On the other hand, it is limited because of the scale effect, difficulty of measurement and modeling, cost, and the limitation of the experimental facility. Numerical analysis can be an alternative to an experiment because it can compensate for the experimental limitations. Nevertheless, it suffers from computational mesh modeling, numerical convergence, and a choice of numerical methods to simplify physical phenomena.

In both experiments and numerical simulations, the quality of ocean waves is the critical factor in modeling a realistic sea state. Therefore, the generated irregular waves experimentally and numerically should be qualified with the target sea state. In those applications, the irregular waves were qualified by comparing the sea spectrum, the

significant wave height, and the peak wave period with the target sea state. On the other hand, considering the design of offshore structure dealing with extreme events, such as wave impact, air gap impact, and green water phenomena, the qualification of a local wave elevation, e.g., wave crest, becomes important and prevail nowadays. The measured wave elevation gives a wave crest probability distribution of single realization (PDSR). The PDSR is a probability distribution of the wave crest from one wave realization of a three-hour typical storm duration. The wave time signal in the experiment and numerical simulation with the limited number of irregular waves and different random seeds gives different wave crest PDSR curves. Hence, the PDSR curve made from a random seed can differ. Therefore, it is difficult to confirm the quality of the wave crest PDSR. Numerous wave realizations can be used to obtain the wave crest probability distribution of ensemble realization (PDER), which is a probability distribution of the wave crest from many three-hour realizations.

The obtained distribution of wave crest can be compared with the reference distributions. Longuet-Higgins (1952) reported the wave

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Corresponding author Young-Myung Choi: +82-51-510-2346, youngmyung.choi@pusan.ac.kr

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crest distribution of linear waves follows the Rayleigh distribution with assumptions of the Gaussian distribution and the narrow-band spectrum. On the other hand, the Rayleigh distribution underestimates the height of the wave crest when the sea states become severe, which can lead to a wrong design. Forristall (2000) suggested the wave crest distribution based on the second-order theory, which gives better results than the Rayleigh distribution. Later, Huang and Zhang (2018) suggested the semi-empirical formula of PDSR (mean and 99% upper bound and 99% lower bound) and PDER from the numerical wave simulation results of 305 sea states. The idea of Huang and Zhang (2018) was to qualify the PDSR with a single wave realization by comparing the distribution of wave crest probability of occurrence (POE) in the range of bounds of wave crest PDER. They compared the PDER between 100 realizations and 1000 realizations: the wave crest PDER showed a difference of -3% to +4% at the POE level of 10^{-4} and a -6% to +7% difference at the POE level of 10^{-5} .

The irregular waves based on the superposition of linear waves are insufficient to model realistic ocean waves. Goda (1983) reported that the secondary peak due to the interaction of waves and nonlinearities is significant in ocean waves. Therefore, considering the nonlinearity is vital for the qualified local wave elevation. Tick (1963) and Hamada (1965) suggested the second-order irregular wave models. They reported that the second-order effect might not be enough to describe a higher-order interaction between wave components. The high-order spectral (HOS) method is a nonlinear wave generation method extending up to an arbitrary order (West et al., 1987; Dommermuth and Yue, 1987). One of the main strengths of HOS is that the derivatives that appear in nonlinear free surface boundary conditions can be treated in the frequency domain. Therefore, the fast Fourier transform (FFT) can be used in the numerical simulation, which makes the HOS method more efficient than the other numerical methods. The open-source project, called HOS-ocean, which models the open ocean by the HOS method, has been published (Ducrozet et al., 2007; Bonnefoy et al., 2009; Ducrozet et al., 2016). Moreover, they apply the HOS method for the numerical wave tank, which is also published as HOS-NWT (Ducrozet et al., 2012). The nonlinear irregular waves generated from the HOS method have been used to simulate the nonlinear waves in computational fluid dynamics (CFD) (Choi et al., 2018; Lu et al., 2022). Furthermore, those numerical tools have been used to simulate the wave-structure interaction problem (Li et al., 2019; Choi, 2019; Xiao et al., 2019). In addition, there was an attempt to define the standard protocol for irregular wave generation because it is used widely in industry and academia (Bouscasse et al., 2021).

Most academic research on applying the HOS model and CFD is limited to the extreme sea state. A parametric study of the HOS model for a wide range of sea conditions has not been conducted. In this context, this reports the results of a parametric study on the HOS method. As a parametric study, one hundred long-crested irregular wave simulations with different random seeds were performed for each sea state and selected HOS parameters for three hours. The present paper performed a stochastic analysis and analyzed the wave

spectrum and wave crest height distribution by comparing them with references.

2. Numerical Wave Model

2.1 High Order Spectral Method

The open ocean is modeled with the rectangular computational domain with a length L in the x direction and a depth h in z direction. The sea bottom was assumed to be flat. The mean free surface was located at $z = 0$, and the z -axis was orienting upward. The perfect fluid and irrotational flow were assumed to introduce the velocity potential Φ . The velocity potential satisfied the Laplace's equation in the fluid domain D as given in Eq. (1). The impermissible condition given in Eq. (2) was imposed on the sea bottom at $z = -h$. The periodic boundary condition shown in Eq. (3) is imposed at the lateral boundary.

$$\nabla^2 \Phi(x, z, t) = 0 \quad \text{in } D \quad (1)$$

$$\frac{\partial \Phi}{\partial z} = 0 \quad \text{at } z = -h \quad (2)$$

$$\Phi(x = 0, z, t) = \Phi(x = L, z, t), \quad \eta(x = 0, t) = \eta(x = L, t) \quad (3)$$

On the free surface $z = \eta(x, t)$, two free surface boundary conditions were imposed. The dynamic and kinematic free surface boundary conditions are given in Eqs. (4) and (5), respectively.

$$\frac{\partial \tilde{\Phi}}{\partial t} + g\eta = -\frac{1}{2} \nabla \tilde{\Phi} \cdot \tilde{\Phi} + \frac{1}{2} (1 + \nabla \eta \cdot \nabla \eta) w^2 \quad (4)$$

$$\frac{\partial \eta}{\partial t} = (1 + \nabla \eta \cdot \nabla \eta) w - \nabla \tilde{\Phi} \cdot \nabla \eta \quad (5)$$

$\tilde{\Phi}(x; t) = \Phi(x, z = \eta(x); t)$ is the free surface velocity potential, and $w(x) = \partial \Phi / \partial z$ is the vertical velocity at the free surface $z = \eta(x, t)$. The periodic boundary condition enables the free surface velocity potential and wave elevations with modal functions to be expressed as Eqs. (6) and (7).

$$\tilde{\Phi}(x, t) = \sum_{n=0}^{N_x} \tilde{A}_n(t) \cos(k_n x) \quad (6)$$

$$\eta(x, t) = \sum_{n=0}^{N_x} B_n(t) \cos(k_n x) \quad (7)$$

$\tilde{A}_n(t)$ and $B_n(t)$ are modal amplitudes of free surface potential and wave elevations, respectively. N_x is the number of modes. $k_n = n\pi/L$ is a pseudo wavenumber adjusted to the domain length. The velocity potential defined in the fluid domain and the vertical fluid velocity are expressed with the perturbation series as follows:

$$\Phi(x, z, t) = \sum_{m=1}^M \Phi^{(m)}(x, z, t) \quad (8)$$

$$w(x, z, t) = \sum_{m=1}^M w^{(m)}(x, z, t) \quad (9)$$

with

$$\Phi^{(m)}(x, z, t) = \sum_{n=0}^{N_s} A_n^{(m)}(t) \frac{\cosh k_n(z+h)}{\cosh k_n h} \cos(k_n x) \quad (10)$$

where the superscript $q^{(m)}$ represents a quantity of $O(\epsilon^m)$, M is the nonlinear order of the HOS method, where $A_n^{(m)}(t)$ is the modal amplitude of velocity potential of corresponding order, and the vertical fluid velocity can be given in $w^{(m)} = \Phi_z^{(m)}$, respectively. The free surface potential and the vertical fluid velocity on the $z = \eta$ were evaluated by applying the Taylor series expansion as given in Eqs. (4) and (5), respectively.

$$\tilde{\Phi}(x, t) = \Phi(x, z = \eta, t) = \sum_{m=1}^M \sum_{k=0}^{M-m} \frac{\eta^k}{k!} \frac{\partial^k \Phi^{(m)}(x, z = 0, t)}{\partial z^k} \quad (11)$$

$$w(x, z = \eta, t) = \sum_{m=1}^M \sum_{k=0}^{M-m} \frac{\eta^k}{k!} \frac{\partial^{k+1} \Phi^{(m)}(x, z = 0, t)}{\partial z^{k+1}} \quad (12)$$

The triangular system, which can be solved explicitly, can be obtained by expanding with respect to the order. The initialization of wave fields for the simulation is taken from the spectrum of irregular waves. The modal amplitudes of the wave elevation and free surface potential are taken as

$$B_n(t=0) = \sqrt{2S(\omega)\Delta k_n} \quad \text{and} \quad \tilde{A}_n(t=0) = -\frac{i\omega_n}{g} B_n(t=0) \quad (13)$$

where $\omega_n^2 = gk_n \tanh k_n h$. After setting the linear wave fields in the HOS simulation domain, the nonlinearity evolves with the simulation time because the nonlinear free surface boundary conditions in Eqs. (4) and (5) make wave interactions. West et al. (1987) and Ducroz et al. (2007) explained the detailed formulation of the HOS method.

3. Numerical Set-Up

3.1 Wave Condition

The wave conditions used in this study were taken from the sea state code suggested by World Meteorological Organization (WMO) (Lee and Bales, 1984; Lewis, 1989) to use representative wave conditions. Table 1 lists the wave conditions for each sea state code. In the present study, five wave conditions from sea state 3 to sea state 7, colored in Table 1, were considered, and the selected range corresponds to 90% of the annual sea state occurrence.

A modified two-parameter Pierson-Moskowitz (P-M) spectrum is applied to describe the wave spectrum in a frequency domain (Kim, 2008) as expressed in Eq. (11). Here, $\omega_p = 2\pi/T_p$ is the peak angular frequency, and H_s is the significant wave height of each sea state. Fig. 1 presents the considered wave spectra for different sea states.

$$S(\omega) = \frac{5}{16} H_s^2 \omega_p^4 \omega^{-5} \exp\left[-\frac{5}{4} \left(\frac{\omega}{\omega_p}\right)^{-4}\right] \quad (14)$$

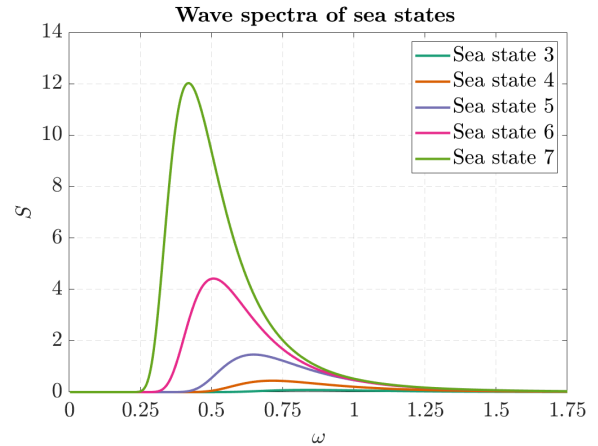


Fig. 1 Wave spectra for different sea states

3.2 HOS Computational Setup and Computational Parameters

The HOS fluid domain had a dimension of $L_x = 15\lambda_p$ in the horizontal direction, and the deep water condition was assumed. Two

Table 1 Annual sea state occurrences and wave parameters with respect to the sea states

Sea state	Mean significant wave height (m)	Most probable peak period (s)	Most probable peak wavelength (m)	Steepness (%)	Occurrence probability (%)
0-1	0.05	-	-	-	0.70
2	0.3	7.5	87.82	0.34	6.80
3	0.88	7.5	87.82	1.00	23.70
4	1.88	8.8	120.90	1.55	27.80
5	3.25	9.7	146.90	2.21	20.64
6	5.0	12.4	240.07	2.08	13.15
7	7.5	15.0	351.29	2.13	6.05
8	11.5	16.4	419.93	2.74	1.11
>8	>14	20	624.52	>2.24	0.02

Table 2 Considered HOS orders and the number of HOS modes

Order	HOS modes		
	$N_x = 128$	$N_x = 256$	$N_x = 512$
$M=1$	○	○	○
$M=2$	○	○	○
$M=3$	○	○	○
$M=4$	○	○	○

computational parameters in the HOS method are important. The first was the order of nonlinearity, e.g., HOS order (M), and the second was the number of HOS modes (N_x) corresponding to the number of spatial discretizations. Four HOS orders and three levels of HOS modes were adopted, as summarized in Table 2. Each HOS simulation was conducted for the three-hours, and 100 simulations with different random seeds were performed for each simulation setup. The HOS waves were measured at $L_x = 5\lambda_p$. For example, Fig. 2 shows a HOS wave time series of sea state 7 with the HOS order $M=4$ and the HOS modes $N_x = 512$.

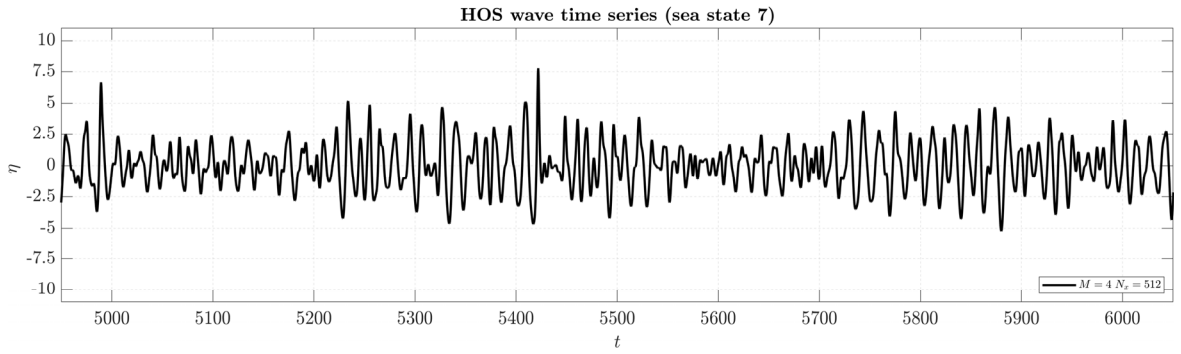
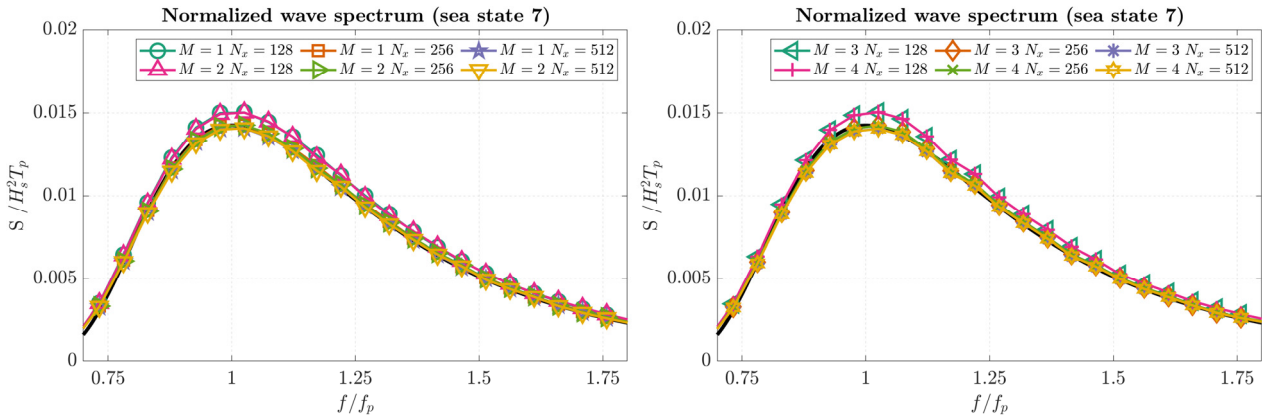
4. Results and Discussions

4.1 Spectral Analysis

The wave spectrum was obtained from the wave elevation time series using Welch's overlapped segment averaging estimator (Welch,

1967), where the window interval was approximately $15T_p$. The averaged wave spectrum can be taken from 100 wave spectra and compared with the target wave spectrum. Fig. 3 gives an example of normalized wave spectra of sea state 7. The solid black line is a reference wave spectrum, and each colored marked lines are the wave spectrum with different combinations of HOS parameters. The wave spectra with HOS modes $N_x = 128$ clearly showed an overestimated spectrum compared to the target spectrum. While with other computational setups, the difference between each setup was minimal, and the difference between each spectrum quantitatively is challenging.

The difference ratio of each wave spectrum is compared. Fig. 4 illustrates the difference ratio of the wave spectrum with respect to the angular frequency. The tolerance criterion of the wave spectral analysis is $\pm 5\%$ within the frequency range $f \in [0.75f_p; 1.5f_p]$, where f_p is the peak frequency of the target sea state. Note that this spectral qualification criterion was adopted from previous studies (Canard et al., 2020; Canard et al., 2022). The red-colored region presents the target tolerance zone. First, the wave spectra obtained with $N_x = 128$ were overestimated compared with the target spectra for all sea states regardless of the HOS order. For all combinations of the HOS parameters except for the HOS modes $N_x = 128$, the difference ratio of wave spectrum lie in the $\pm 5\%$ tolerance within the target frequency range. A comparison of the difference ratio with respect to the HOS order revealed a relatively large variation as the HOS order increases.

**Fig. 2** Example of the HOS wave time series ($N_x = 512$, $M=4$)**Fig. 3** Normalized wave spectra of sea state 7 with different combinations of HOS parameters

A quantitative comparison of the wave spectrum for each HOS computational parameter was conducted. The maximum difference ratio and the average absolute difference ratio of the wave spectrum in the target frequency range were evaluated using Eqs. (15) and (16), and the values are presented in Table 3.

$$\text{Maximum difference} = \max \left(\frac{S(f) - S_{\text{Target}}(f)}{S_{\text{Target}}(f)} \right), \quad (15)$$

$$f \in [0.75f_p; 1.5f_p]$$

$$\text{Average absolute difference} = \text{mean} \left(\left| \frac{S(f) - S_{\text{Target}}(f)}{S_{\text{Target}}(f)} \right| \right), \quad (16)$$

$$f \in [0.75f_p; 1.5f_p]$$

Table 3 lists the computational setup where their maximum and averaged absolute difference ratio is larger than 10% is colored red, larger than 5% is colored yellow, and less than 5% is colored green. As shown in Fig. 4, all results with HOS modes $N_x = 128$ have maximum and average absolute difference ratios larger than 5%. The difference ratio decreased as the number of modes increased. In addition, the difference ratio tends to increase as the HOS order increases, but the increment is relatively small.

For all sea states, the smallest average absolute difference ratio was

measured with the computational setup of HOS modes $N_x = 512$ and HOS orders $M=1$. The largest maximum difference ratio with HOS modes $N_x = 256$ was 4.00% (sea state 4, $N_x = 256$, $M=4$), and the largest maximum difference ratio with HOS modes $N_x = 512$ was 3.82% (sea state 5, $N_x = 512$, $M=3$). The largest average absolute difference ratio with HOS modes $N_x = 256$ was 1.58% (sea state 5, $N_x = 256$, $M=3$), and the largest average absolute difference ratio with HOS modes $N_x = 512$ was 1.58% (sea state 5, $N_x = 512$, $M=3$). The average absolute difference ratio with HOS modes $N_x = 256$ and $N_x = 512$ was suppressed by under 2%. In addition, approximately 1% of the average absolute difference ratio is measured with HOS mode $N_x = 512$ and HOS order $M=2$. Therefore from the spectral analysis, the HOS modes $N_x = 512$ is recommended for the HOS wave generation.

4.2 Wave Crest Probability Distribution Analysis

As discussed in the Introduction, both the PDSR and the PDER of the HOS waves were compared with the Rayleigh (first-order), the Forristall (second-order), and the Huang (semi-empirical formula) distributions. Eqs. (17)–(19) describe the mathematical formula of the Rayleigh, the Forristall, and the Huang distributions, respectively. Each distribution describes the POE of the measured wave crest from the mean free surface (η_c). In Eq. (20), U_r is the Ursell number, S_1 is

Table 3 Maximum and averaged difference of wave spectrum with respect to sea states and HOS parameters

		Sea state 3						Sea state 4					
		Maximum difference (%)			Average absolute difference (%)			Maximum difference (%)			Average absolute difference (%)		
Order (M)	Mode (N_x)	128	256	512	128	256	512	128	256	512	128	256	512
1		8.26	2.69	1.38	6.80	1.32	0.70	8.30	2.87	1.54	6.75	1.31	0.69
2		8.09	2.51	1.48	6.74	1.29	0.72	8.41	2.86	1.62	6.67	1.28	0.78
3		8.07	2.81	1.66	6.75	1.31	0.81	9.42	3.99	2.62	6.57	1.36	1.11
4		8.11	2.81	1.66	6.73	1.31	0.81	8.78	4.00	2.06	6.58	1.36	1.09
		Sea state 5						Sea state 6					
		Maximum difference (%)			Average absolute difference (%)			Maximum difference (%)			Average absolute difference (%)		
Order (M)	Mode (N_x)	128	256	512	128	256	512	128	256	512	128	256	512
1		8.47	3.15	1.82	6.83	1.37	0.74	7.52	2.03	1.44	6.56	1.14	0.60
2		9.65	3.70	2.23	6.63	1.24	0.97	8.43	3.27	1.84	6.48	1.31	1.04
3		10.11	3.07	3.82	6.44	1.58	1.58	9.44	3.11	2.60	6.37	1.42	1.36
4		9.94	3.06	2.87	6.44	1.57	1.35	9.44	3.13	2.58	6.37	1.41	1.36
		Sea state 7											
		Maximum difference (%)			Average absolute difference (%)								
Order (M)	Mode (N_x)	128	256	512	128	256	512						
1		8.01	2.49	1.40	6.73	1.29	0.74						
2		8.19	3.34	2.06	6.51	1.23	0.86						
3		9.24	3.15	2.60	6.47	1.42	1.31						
4		9.25	3.16	2.57	6.48	1.42	1.32						

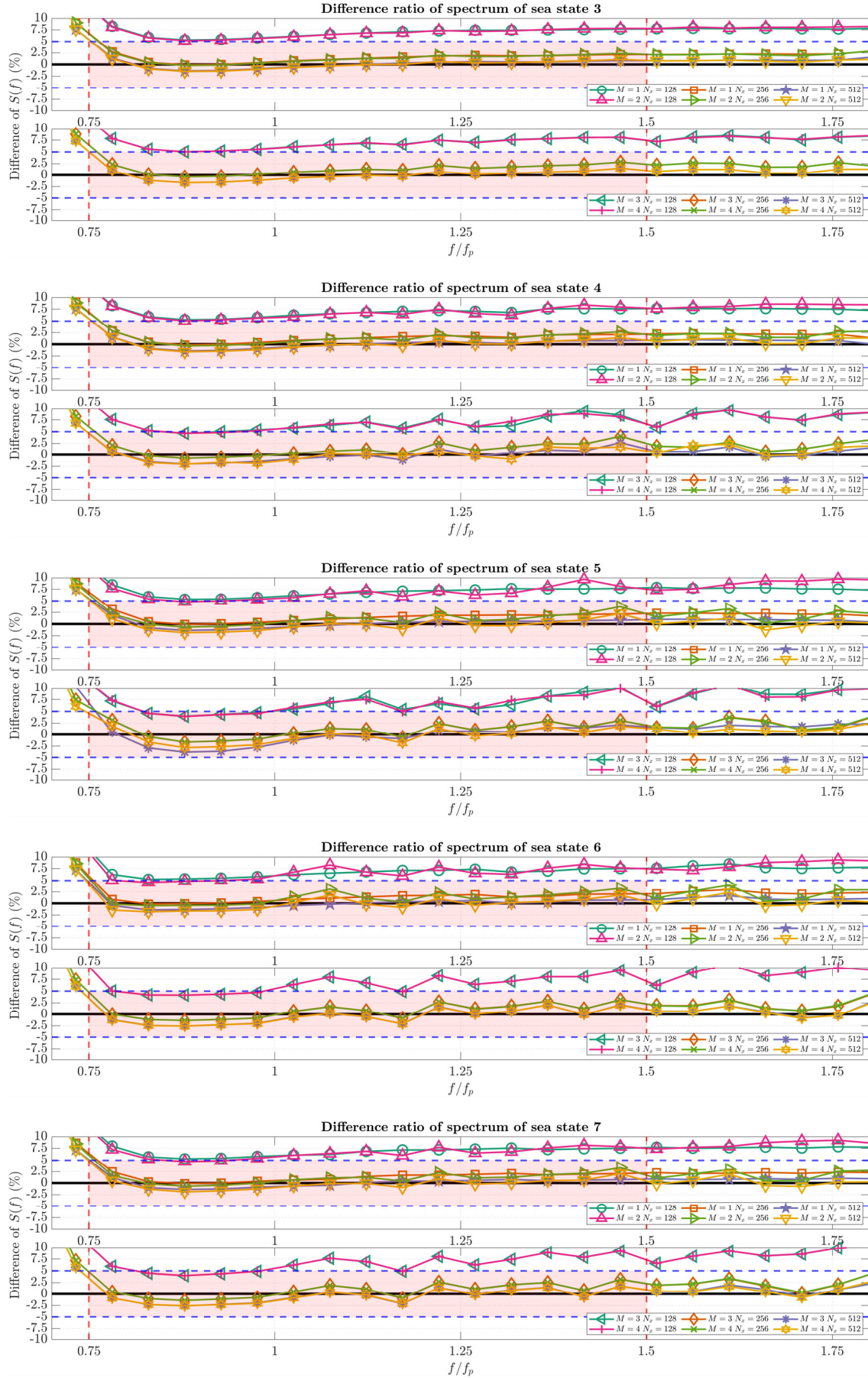


Fig. 4 Difference ratio between the measured wave spectrum and the target wave spectrum. The red zone is the target tolerance zone.

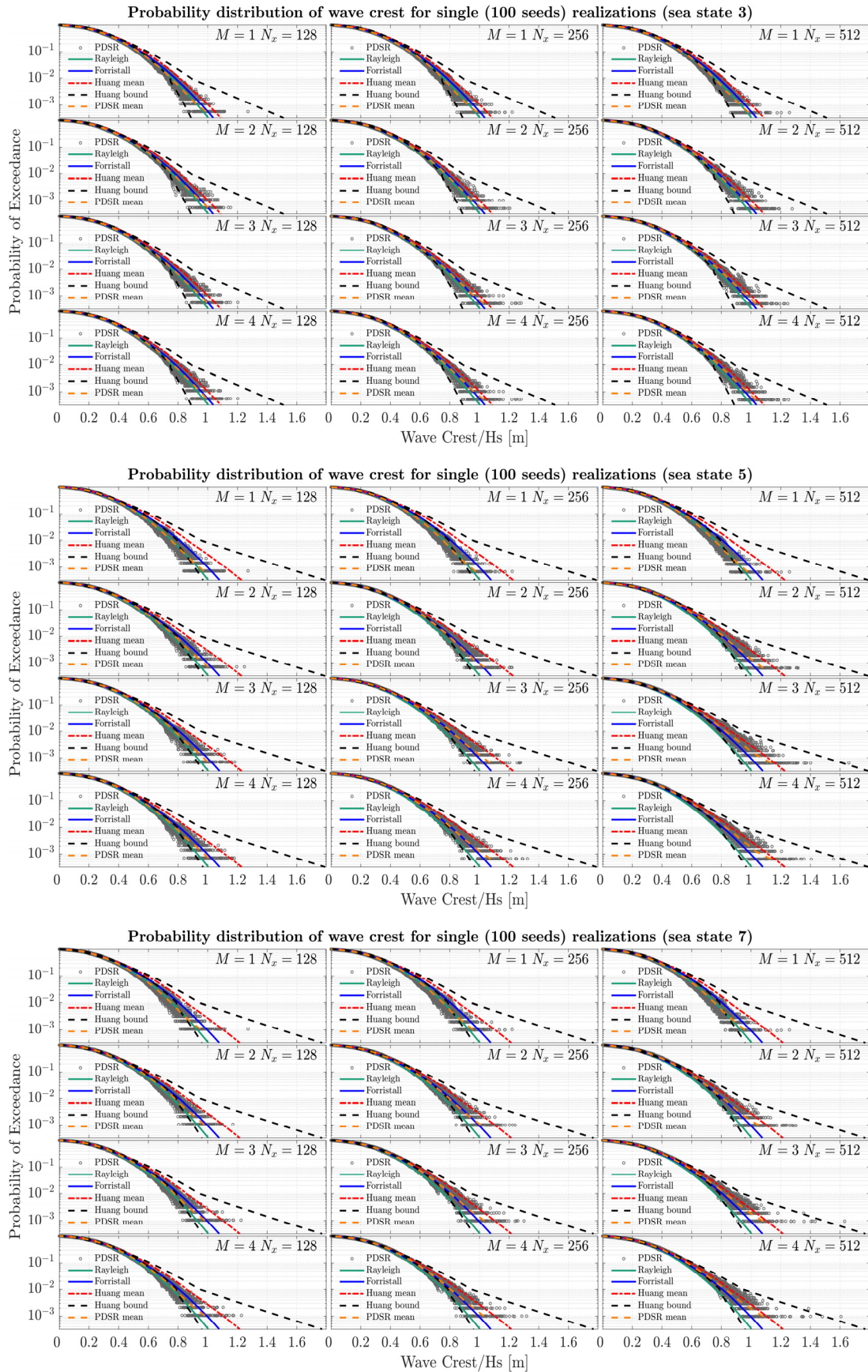


Fig. 5 PDSR and mean PDSR of 100 realizations made with different combinations of HOS parameters for sea states 3, 5, and 7. These were compared with the Rayleigh (first-order), the Forristall (second-order), and the Huang (semi-empirical formula) distributions.

Table 4 Coefficients for Huang semi-empirical PDSR and PDER formula

	POE > 10 ⁻²				POE < 10 ⁻²			
	PDSR Mean	Upper 99%	Lower 99%	PDER	PDSR Mean	Upper 99%	Lower 99%	PDER
a_0	0.3712	0.3516	0.3708	0.3733	0.2894	0.1334	0.3752	0.3242
a_1	1.0087	2.3892	0.9835	0.9398	12.3011	13.0432	9.1269	11.7467
a_2	-43.0667	-105.4167	-39.9404	-40.0095	-662.6320	-751.0935	-446.8393	-652.1470
a_3	567.5292	1557.3914	598.3819	512.0601	12153.3466	14727.6571	7837.5720	12308.3001
a_4	-1173.1204	-5807.4512	-2144.4920	-849.0734	-68031.8045	-87711.0810	-42682.1177	-70529.2504
a_5	0.1276	0.0791	0.2427	0.1294	0.3779	0.0840	0.8351	0.3785
a_6	0.3115	0.3550	-0.5379	0.2882	-3.7904	-5.2045	-5.7942	-3.8837
b_0	2.006	1.620	2.212	2.0411	1.5277	0.7965	2.4637	1.7321
b_1	4.841	19.720	10.951	3.6068	67.2118	44.9229	82.5688	72.7179
b_2	-321.181	-909.665	-637.673	-272.2806	-3683.1338	-2525.6956	-4300.5362	-4093.6916
b_3	846.332	10465.556	6707.056	-58.9649	63759.0846	47184.1324	68857.4691	72132.2957
b_4	27223.189	-22952.443	-10244.141	32786.2976	-336712.3631	-270084.1075	-337914.749	-386504.7502
b_5	0.832	-3.726	4.505	0.9003	-8.1382	-13.3160	2.5661	-9.9594

the steepness parameter, k_1 is the wavenumber, T_1 is the mean wave period, and d is the water depth. The Huang PDSR and PDER coefficients in Eq. (19) are summarized in Table 4.

$$P(\eta_c > \eta) = \exp\left[-8\frac{\eta^2}{H_s^2}\right] \quad (17)$$

$$P(\eta_c > \eta) = \exp\left[-\left(\frac{\eta}{\alpha H_s}\right)^\beta\right] \quad \begin{array}{l} \alpha = 0.3536 + 0.2892S_1 + 0.106U_r \\ \beta = 2 - 2.1597S_1 + 0.0968U_r^2 \end{array} \quad (18)$$

$$P(\eta_c > \eta) = \exp\left[-\left(\frac{\eta}{\alpha' H_s}\right)^{\beta'}\right] \quad (19)$$

$$\begin{array}{l} \alpha' = a_0 + a_1S_1 + a_2S_1^2 + a_3S_1^3 + a_4S_1^4 + a_5U_r + a_6U_r^2 \\ \beta' = b_0 + b_1S_1 + b_2S_1^2 + b_3S_1^3 + b_4S_1^4 + b_5U_r^2 \end{array}$$

$$U_r = \frac{H_s}{k_1^2 d^3} \quad S_1 = \frac{2\pi}{g} \frac{H_s}{T_1^2} \quad k_1 = \frac{4\pi^2}{g T_1^2} \quad (20)$$

Fig. 5 presents the PDSR curves from 100 realizations and compares them with the reference distributions. Each graph presents a sea state, and every subplot presents a combination of HOS parameters. The name of each computational setup is written inside the subplot, and all subplot shares the same axis limits. Each marker presents a wave crest height probability, and the mean PDSR curve is an average of all wave crest height probability distributions from 100 wave realizations. The analyses of the PDSR markers and the mean PDSR curve are described as follows

First, the PDSR markers and the mean PDSR curves were compared with the reference distributions. With the HOS mode $N_x = 128$, the change of HOS order did not influence the mean PDSR curves significantly, and the mean PDSR curves mostly follow the Rayleigh distribution regardless of the wave condition. With HOS modes $N_x = 256$ and $N_x = 512$, a meaningful difference was measured with the change in the HOS order. When the first-order ($M=1$) was

applied, the mean PDSR curves followed the Rayleigh distribution regardless of the number of HOS modes. When the second-order ($M=2$) was used, the mean PDSR curves followed the Forristall distribution. This trend was presented more distinctly for the higher sea states.

The third-order ($M=3$) and the fourth-order ($M=4$) HOS simulations with HOS modes $N_x = 256$ and $N_x = 512$ were compared for sea states 5 and 7. The mean PDSR curves mostly lied between the Forristall distribution and the Huang mean distribution. The mean PDSR curve showed a significant increase as the number of HOS mode increased. Moreover, the variations of the PDSR markers from the mean PDSR curve has changed as the number of HOS mode increased. For example, in the case ‘sea state 7/ $M=4/N_x = 256$ ’ and ‘sea state 7/ $M=4/N_x = 512$ ’, the number of PDSR markers under the Huang 99% lower bound decreased, and the number of PDSR markers close to the Huang 99% upper bound increased. This result suggests that HOS mode $N_x = 512$ is required to generate extreme wave events. One reason for this variation of PDSR markers is the increase in the Nyquist frequency and the increase in HOS mode. The increase in Nyquist frequency leads to more proper modeling of high-frequency wave components and the nonlinearity of waves.

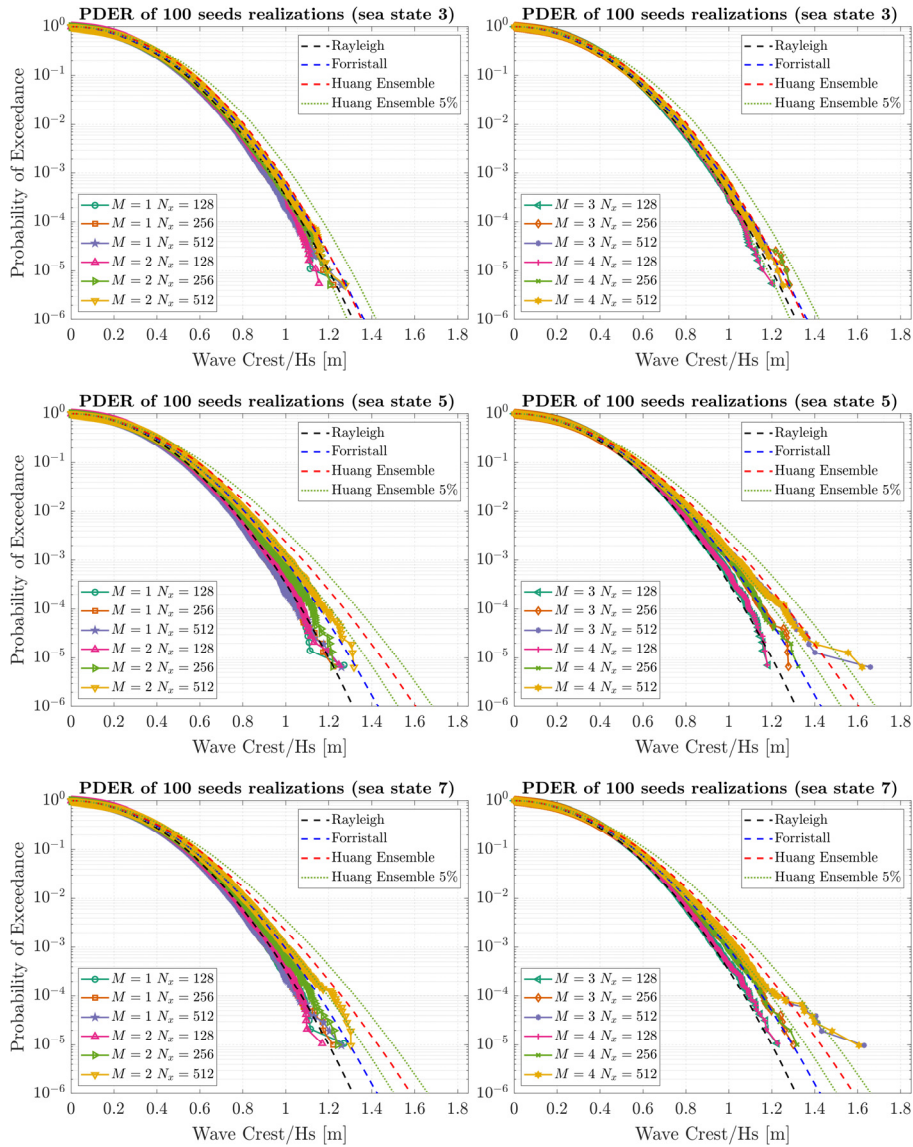
Second, the PDSR markers were compared with the Huang 99% bounds. Considering the concept of the Huang 99% bounds, the PDSR markers are expected to mostly be in the Huang 99% bounds. Therefore, the analysis counts all wave crest heights with their POE lower than 10⁻² and compares them with the Huang bounds. Table 5 lists the occurrence rate of the measured wave crest height POE not being inside the Huang bounds for POE lower than 10⁻² for each sea state and each HOS computational parameter. The computational setup with an occurrence rate higher than 10% is colored red, higher than 5% is colored yellow, and lower than 5% is colored green (Table 5).

For sea states 3 and 4, which are almost linear wave conditions, the influence of HOS parameters was smaller than in the other sea states. On the other hand, for the sea states 5 to 7, more than half of the PDSR

Table 5 Occurrence rate of the measured wave crest height POE not being inside of the Huang bounds for POE lower than 10^{-2} .

Out of Huang bound (%)		Sea state 3			Sea state 4					
Mode (N_x)		128	256	512	128	256	512			
Order (M)										
1		8.73%	9.21%	9.04%	27.93%	25.00%	24.79%			
2		2.50%	0.63%	0.10%	8.20%	1.81%	2.53%			
3		2.72%	0.26%	0.05%	5.93%	1.75%	0.06%			
4		2.67%	0.21%	0.20%	6.13%	1.31%	0.00%			

Out of Huang bound (%)		Sea state 5			Sea state 6			Sea state 7		
Mode (N_x)		128	256	512	128	256	512	128	256	512
Order (M)										
1		65.43%	71.11%	69.11%	61.18%	58.60%	60.67%	61.44%	57.97%	58.80%
2		34.43%	15.42%	3.79%	29.91%	11.38%	3.08%	35.56%	13.31%	5.30%
3		38.86%	8.01%	0.73%	31.82%	5.34%	1.17%	34.44%	7.20%	1.40%
4		37.14%	8.35%	1.33%	31.45%	6.28%	1.17%	34.33%	8.13%	2.00%

**Fig. 6** PDER of 100 realizations with different combinations of HOS parameters for all sea states. These are compared with the Rayleigh (first-order), the Forristall (second-order) and the Huang (semi-empirical formula) distributions.

markers measured from first-order ($M=1$) HOS simulations were lower than the Huang 99% lower bound. The occurrence rate gradually decreases as the HOS order increases from $M=1$ to $M=3$. While the difference between $M=3$ and $M=4$ was minimal. Similarly, the occurrence rate decreases as the number of HOS modes increases. The lowest occurrence rate for each sea state was commonly found with HOS setup $M=3/N_x=512$ or $M=4/N_x=512$, and those values were retained under 2%.

Fig. 6 compares PDER curves of 100 realizations and the reference distributions for sea states 3, 5, and 7. An additional reference distribution presenting the 5% bound of the Huang ensemble distribution was added as an indicator. For sea states 3, due to the lack of nonlinearity, the difference between each PDER curve with different computational setups was smaller than the other sea states. For sea states 5 and 7, a significant change in wave crest height was observed, particularly at the POE level of 10^{-5} .

The PDER curves obtained from the first-order HOS simulations for all sea states agree well with the Rayleigh distribution. The PDER curves of the second-order HOS simulations matched well with the Forristall distribution when the number of HOS modes was higher than $N_x=256$. The third- and fourth-order PDER results usually lie between the Forristall distribution and the Huang PDER distribution, while the difference between the two HOS orders is minimal. The $M=3/N_x=512$ and $M=4/N_x=512$ setups showed the best compromise among all HOS computational setups with the Huang ensemble distribution. Within the POE level between 10^{-2} and 10^{-4} , the HOS PDER curves follow the -5% bound of Huang ensemble distribution. Within the POE level between 10^{-4} and 10^{-6} , HOS PDER curves show overestimated wave crest probability compared to the Huang ensemble distribution. On the other hand, the number of realizations is insufficient to conclude the PDER curve's accuracy at the POE level of 10^{-5} .

5. Conclusions

This paper performed a parametric study on the open-source program HOS-Ocean. With three numbers of HOS modes (N_x) and four levels of HOS orders (M), twelve combinations of HOS computational parameters were applied to the HOS simulations to find the recommended HOS parameters for irregular wave generation. Therefore, 100 three-hour realizations of HOS waves were made for five sea states, and the quality waves were verified by following qualification procedures.

First, the spectral analysis was performed with twelve combinations of HOS setup and five sea states, and the averaged wave spectrum was compared with the target wave spectrum. The maximum and average spectral differences were quantitatively analyzed within the target frequency range using $\pm 5\%$ tolerance. Second, the nonlinearity of irregular waves with respect to the HOS parameters and the variation of sea states were checked by comparing the POE of the wave crest height. The PDSR and PDER of 100 realizations were compared with

the reference probability distributions, and the influence of HOS parameters and sea states on the nonlinearity of irregular waves was investigated. As a result, the following conclusions were acquired.

(1) The results with HOS modes $N_x=128$ show overestimated wave spectrum and underestimated wave crest height regardless of the HOS order. Consequently, the HOS mode was larger than $N_x=128$ is required for the current HOS computational setup, regardless of the sea state.

(2) The minimum spectral difference (averaged absolute difference ratio) was found when the first order was applied. The spectral difference increases as the HOS order increases. On the other hand, regardless of the HOS order and the sea state, the maximum difference ratio was maintained below 5%, and the averaged absolute difference ratio was kept below 2% with HOS modes $N_x=256$ and $N_x=512$.

(3) The wave crest height PDSR and PDER for different combinations of HOS parameters were compared with the reference distributions.

- When the first-order HOS order was used, the wave crest height was significantly underestimated even for sea states 3 and 4. This underestimation clearly showed that it is important to check both the wave spectrum and the wave crest height POE for the irregular wave analysis.
- Comparing the PDSR of the second-, third-, and fourth-order HOS simulation with the Huang 99% bounds, the HOS wave crest generated using two combinations of HOS parameters $M=3/N_x=512$ and $M=4/N_x=512$ were considered adequate for all sea states. For sea state 3, other HOS setups, such as $M=2/N_x=256$ or $M=2/N_x=512$ were considered appropriate.

(4) The HOS setups, $M=3/N_x=512$ and $M=4/N_x=512$, satisfy the $\pm 5\%$ tolerance in the spectral analysis. The amount of nonlinearity of waves measured using the two HOS setups was verified by comparing the wave crest height POE with the Huang PDSR and PDER distributions. The difference in wave properties between the two HOS setups was small. In conclusion, considering that the HOS domain length is $15\lambda_p$, the suggested HOS computational parameter would be $\lambda_p/\Delta x \geq 35$ with $M=3$.

Conflict of Interest

No potential conflict of interest relevant to this article was reported.

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Author ORCIDs

Author name	ORCID
Kim, Young Jun	0000-0002-1648-6485
Baek, Hyung Min	0000-0002-8363-6746
Yang, Young Jun	0000-0002-8635-2474
Kim, Eun Soo	0000-0002-1132-3046
Choi, Young-Myung	0000-0002-7397-3933