



Anomalous wave statistics following sudden depth transitions: application of an alternative Boussinesq-type formulation

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Abstract

Recent studies of water waves propagating over sloping seabeds have shown that sudden transitions from deeper to shallower depths can produce significant increases in the skewness and kurtosis of the free surface elevation and hence in the probability of rogue wave occurrence. Gramstad et al. (Phys. Fluids 25 (12): 122103, 2013) have shown that the key physics underlying these increases can be captured by a weakly dispersive and weakly nonlinear Boussinesq-type model. In the present paper, a numerical model based on an alternative Boussinesq-type formulation is used to repeat these earlier simulations. Although qualitative agreement is achieved, the present model is found to be unable to reproduce accurately the findings of the earlier study. Model parameter tests are then used to demonstrate that the present Boussinesq-type formulation is not well-suited to modelling the propagation of waves over sudden depth transitions. The present study nonetheless provides useful insight into the complexity encountered when modelling this type of problem and outlines a number of promising avenues for further research.

Keywords Rogue wave · Freak wave · Boussinesq-type equations · Skewness · Kurtosis

1 Introduction

Long considered the stuff of legend, rogue waves are now recognised as a serious hazard to ships and offshore structures. Historical reports of giant, powerful waves appearing first without warning and then suddenly vanishing have since been supported by theory and experiment (Dysthe et al. 2008;

Kharif et al. 2009). In recent decades, numerous studies have explored both the physical mechanisms which might produce such waves and the statistical parameters that may be used to estimate their occurrence probability. Comprehensive reviews are provided by Dysthe et al. (2008), Kharif et al. (2009), Slunyaev et al. (2011), Onorato et al. (2013), and Adcock and Taylor (2014), amongst others.

Rogue waves are typically defined as those having heights which are more than twice the local significant wave height (e.g. Holthuijsen 2007) but their study is complicated by a limited number of real-world measurements (Kharif et al. 2009) and conflicting views as to how much information can be inferred from these (Dysthe et al. 2008). The key question at present is whether such observations represent ‘classical’ extremes which can be described by conventional models and statistics, or ‘freak’ waves requiring new theories and approaches (Haver and Andersen 2000; Dysthe et al. 2008; Kharif et al. 2009). Some authors take the view that rogue waves are rare instances of random superposition in seas of weakly nonlinear waves (Christou and Ewans 2014; Fedele et al. 2016) whilst others hypothesise that certain waves, such as the well-known Draupner wave, must have been produced by some other

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forcing mechanism (Adcock et al. 2011; Cavaleri et al. 2016).

Other possible rogue wave generating mechanisms include modulational instability; interactions with variable bathymetry, opposing currents, or between crossing seas; wind forcing; or some combination of these factors (Dysthe et al. 2008; Kharif et al. 2009; Onorato et al. 2013; Fedele et al. 2016). Attempts to derive a single, unifying theory are complicated by the facts that geometric focusing cannot explain the transient nature of rogue waves (Janssen and Herbers 2009), that modulational instability requires an improbable set of initial conditions (deep-water waves with a narrow spectral bandwidth and narrow directional spreading) (Dysthe et al. 2008), and that rogue waves can be produced even when several of the foregoing factors are absent (Mori and Janssen 2006; Kharif et al. 2009).

The simplest theory assumes that the dynamics of ocean surface waves are purely linear, that the free surface elevation is a stationary, Gaussian process, and that the wave amplitudes are well approximated by the Rayleigh distribution (Ochi 2005; Holthuijsen 2007). However, because ocean waves are inherently (weakly) nonlinear (Trulsen 2018), wave-wave interactions or other mechanisms can result in considerable deviations from the Gaussian model (Fedele et al. 2016). Several authors have suggested that rogue waves may be a result of non-equilibrium dynamics: if waves are somehow forced into an unstable state, their statistics can deviate in such a way as to suggest an increased likelihood of extreme events (Janssen and Herbers 2009; Viotti and Dias 2014). The kurtosis of the free surface elevation is a convenient metric by which to quantify such deviations: an increase in free surface kurtosis signifies an increase in the probability of rogue wave occurrence (Onorato et al. 2004; Mori and Janssen 2006).

Waves propagating into shallower water are known to be transformed by shoaling and nonlinear effects (Dean and Dalrymple 1991; Dingemans 1997) but recent studies have shown that sudden transitions between deeper and shallower domains can also produce strongly non-Gaussian wave statistics. Physical experiments by Trulsen et al. (2012), Zhang et al. (2019), and Trulsen et al. (2020) showed significant increases in free surface skewness and kurtosis for irregular waves near the crest of an inclined seabed of 1-in-20 slope connecting otherwise flat domains, and these findings have been supported by numerical simulations due to Sergeeva et al. (2011), Gramstad et al. (2013), Viotti and Dias (2014), Ducrozet and Gouin (2017), Zhang et al. (2019), and Zheng et al. (2020). Similar results have also been obtained in experimental and numerical studies of waves propagating over submerged bars (Ma et al. 2014, 2015), shoals (Janssen and Herbers 2009; Raustøl 2014; Fallahi 2016; Trulsen et al. 2020), compound slopes (Kashima et al. 2014), and vertical steps (Zheng et al. 2020).

The foregoing local increases in skewness and kurtosis usually coincide with local enhancements of higher harmonic content related to the sudden decreases in depth and corresponding increases in nonlinearity (Gramstad et al. 2013; Zhang et al. 2019; Trulsen et al. 2020). In fact, Zheng et al. (2020) have recently shown that second-order terms in wave steepness are responsible for the change in the statistical properties near the depth transition for the cases examined by Trulsen et al. (2012) and Gramstad et al. (2013). These deviations are also expected to depend on the initial steepness, spectral bandwidth, and directionality of the waves (Ducrozet and Gouin 2017; Støle-Hentschel et al. 2018; Trulsen et al. 2020; Zheng et al. 2020), the gradient of the seabed slope, and the depth beyond the slope: for milder slopes and deeper depths beyond the slopes, there may be no local maxima, or perhaps even local minima, in skewness and kurtosis (Zeng and Trulsen 2012; Gramstad et al. 2013; Raustøl 2014; Fallahi 2016; Trulsen et al. 2020).

In this paper, the phenomenon of increased free surface skewness and kurtosis following a sudden depth transition is explored further using an accurate yet computationally efficient Boussinesq-type model, following the work of Gramstad et al. (2013), whose model appears to be the simplest of those describing such anomalous statistical deviations. The aim is to first reproduce the findings of Trulsen et al. (2012) and Gramstad et al. (2013) and then extend the parameter space in the numerical simulations to provide further insight into the underlying physics. The paper is structured as follows: Sect. 2 provides a brief description of the numerical model, set-up of the numerical simulations, and grid convergence and sponge layer calibration tests; Sect. 3 compares the present findings with those of Trulsen et al. (2012) and Gramstad et al. (2013) and summarises the results of a model parameter study; and Sect. 4 presents the discussion, conclusions, and recommendations for further work.

2 Model

2.1 Numerical model

The present simulations are performed using OXBOU, a depth-integrated hybrid numerical model designed to simulate the propagation in one horizontal dimension of ocean surface gravity waves from intermediate to shallow and zero water depth. A brief overview of the model features will suffice here; detailed descriptions of the numerical implementation and verification and validation tests are given by Orszaghova (2011), Orszaghova et al. (2012), and Fitzgerald et al. (2016).

The OXBOU model uses two sets of governing equations and two numerical schemes: unbroken waves are simulated using weakly dispersive, weakly non-linear Boussinesq-type

equations, which are solved using a fourth-order finite difference method, whilst broken waves are modelled as bores using the non-dispersive, non-linear shallow water equations, which are solved using a shock-capturing finite volume scheme (Orszaghova et al. 2012). The model switches from the Boussinesq-type to shallow water equations when certain depth or free-surface slope criteria are met, but the present simulations involve non-breaking waves solely and so employ only the Boussinesq-type model. The numerical scheme incorporates a moving boundary piston paddle wavemaker, which is facilitated by a mapping between stretching-compressing physical and fixed computational sub-domains, and is capable of producing waves with approximately correct second-order bound harmonics (see Orszaghova et al. 2012). The scheme also includes an absorbing-generating sponge layer which allows incident waves to propagate freely inshore whilst simultaneously removing offshore-travelling reflections (see Fitzgerald et al. 2016).

OXBOU solves the Boussinesq-type equations of Madsen and Sørensen (1992), which were selected for their enhanced linear dispersion characteristics and computational efficiency (Borthwick et al. 2006; Orszaghova et al. 2012). Following Orszaghova et al. (2012) and Fitzgerald et al. (2016), these equations are presented in a well-balanced, stage-discharge (η, q) form as

$$\eta_t + q_x = \psi(\eta_o - \eta), \quad (1)$$

$$\begin{aligned} q_t + \left(\frac{q^2}{d} + \frac{1}{2}g(\eta^2 - 2\eta b) \right)_x \\ = -g\eta b_x - \frac{\tau_b}{\rho} + \frac{1}{3}h^2 q_{xxt} + \frac{1}{3}hh_x q_{xt} \\ + B \left(h^2 q_{xxt} + gh^3 \eta_{xxx} + 2gh^2 h_x \eta_{xx} \right) \\ + \psi(q_o - q), \end{aligned} \quad (2)$$

where $\eta = b + h + \zeta$ is the free surface elevation above a prescribed horizontal datum (with b the depth of the datum below the seabed, h the still water depth, and ζ the free surface elevation above still water level); q is depth-integrated velocity; ψ is the sponge layer damping strength; $d = h + \zeta$ is the total depth; g is acceleration due to gravity; τ_b is bed stress; ρ is the fluid density; the subscripts t and x denote partial derivatives with respect to time and horizontal distance, respectively; the subscript o refers to solutions imposed by the sponge layers; and B is a linear dispersion coefficient such that the wave celerity, c , is given by

$$\frac{c^2}{gh} = \frac{1 + Bk^2 h^2}{1 + \left(B + \frac{1}{3} \right) k^2 h^2}, \quad (3)$$

where k is the wave number. Setting $B = 1/15$ embeds the [2,2] Padé approximant of the exact linear dispersion relation within the momentum equation, whereas setting $B = 0$ recovers the classical equation derived by Peregrine (1967).

2.2 Set-up of numerical simulations

Following Gramstad et al. (2013), the first set of simulations is designed to replicate the physical experiments described by Trulsen et al. (2012), which were performed in the shallow water basin at the Maritime Research Institute Netherlands (MARIN). These experiments considered three cases of long-crested irregular waves propagating from a piston-type wavemaker (at $x = 0$ m) first over a deeper flat domain, then over a 1-in-20 inclined seabed slope (from $x = 143.41$ to 149.41 m), and finally over a shallower flat domain leading to an absorbing beach (at $x = 173.41$ m). In all three experimental cases, the still water depths before and after the slope were $h = 0.6$ and 0.3 m, respectively, and the nominal input significant wave height was $H_s = 0.06$ m. Cases 1, 2 and 3 were distinguished by the nominal peak periods of their input wave spectra: $T_p = 1.27, 1.70,$ and 2.12 s, respectively. Wave records were obtained from eight gauges placed along the length of the basin, and the influence of the depth transition on the probability of rogue wave occurrence was examined by calculating the skewness and kurtosis of the free surface elevation and exceedance function of the (Hilbert) wave envelope at each location.

In repeating these experiments, the present study follows closely the methodology described by Trulsen et al. (2012) but uses OXBOU to output results at 1 m spatial intervals, and moves the seabed slope 0.01 m closer to the wavemaker to facilitate the use of uniform (fixed) computational grids. The simulations for each case are performed as follows. The wavemaker is used to generate identical irregular waves in both an incident domain and a run-up domain. In the incident domain, the numerical wave tank (from $x = 0$ m to 200 m) is assigned a flat seabed profile ($h = 0.6$ m), whilst in the run-up domain, the tank comprises deeper ($h = 0.6$ m) and shallower ($h = 0.3$ m) sections connected by a 1-in-20 seabed slope (from $x = 143.4$ to 149.4 m). In both domains, the bed is frictionless and the waves propagate into an absorbing sponge layer (from $x = 185.8$ to 200 m), which gradually reduces ζ and q to zero to ensure that there are no reflections either from the end of the tank or the absorbing layer itself. Meanwhile, in the run-up domain, reflections from the slope are removed by an additional absorbing-generating sponge layer (from $x = 92.9$ to 107.1 m), which adjusts the free surface elevation, ζ_r , and depth-integrated velocity, q_r , to match those in the incident domain, ζ_i and q_i (Fig. 1).

Irregular waves are produced as the sum of wave components obtained from a truncated JONSWAP spectrum with peak frequency $f_p = 1/T_p$ and upper and lower cut-off

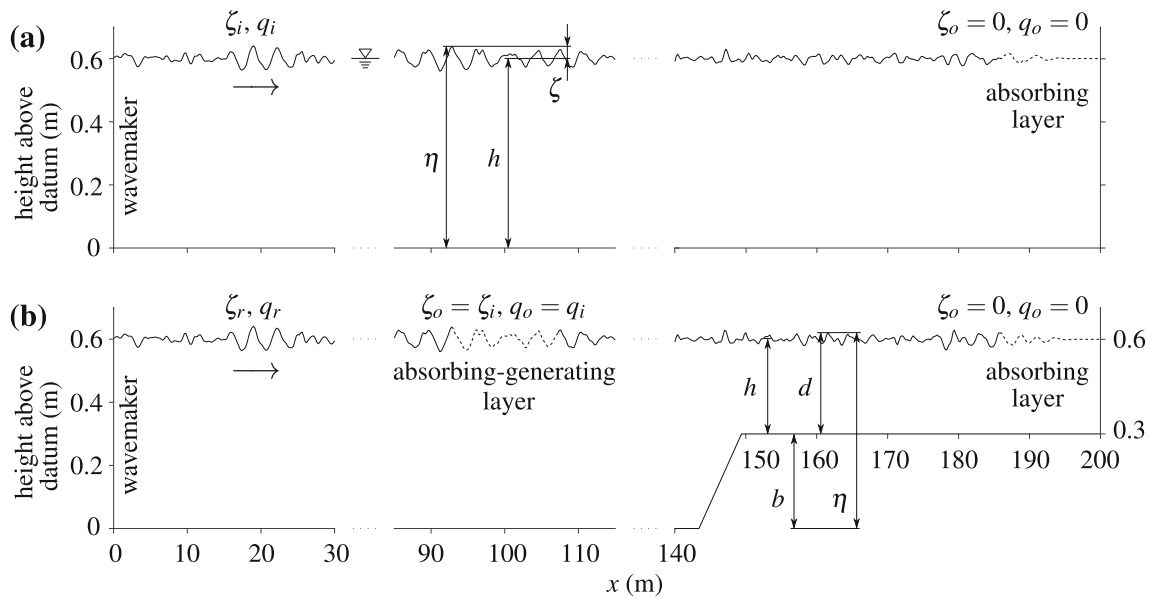


Fig. 1 Schematic diagram showing a simulation performed using coupled (a) incident and (b) run-up domains. Identical irregular waves are produced by the moving boundary wavemakers (left), and absorb-

ing (right) and absorbing-generating sponge layers (centre) are used to eliminate reflections from the ends of the tanks and submerged seabed slope

frequencies $f_{max} = 3f_p$ and $f_{min} = 0.5f_p$. The JONSWAP function is given by

$$S(f) = \alpha \frac{g^2}{(2\pi)^4} \frac{1}{f^5} \exp \left\{ -1.25(f_p/f)^4 \right\} \gamma \exp \left\{ -(f-f_p)^2 / 2(\sigma f_p)^2 \right\}, \quad (4)$$

where f is the component frequency, α is the energy scale parameter, $\gamma = 3.3$ is the peak shape parameter, and σ is the peak width factor, which is assigned values of $\sigma = 0.07$ for $f \leq f_p$ and $\sigma = 0.09$ for $f > f_p$ (Ochi 2005; Holthuijsen 2007). Pseudo-random wave signals are generated using the random-amplitude/random-phase approach of Tucker et al. (1984), in which the amplitudes and phases of the linear components are determined, respectively, from a Rayleigh distribution with scale parameter $\sqrt{S(f)\Delta f}$, where Δf is the frequency domain sampling interval, and a uniform distribution on $[0, 2\pi]$ (Fitzgerald et al. 2016). The corresponding linear wavemaker signal is then calculated using the Biésel transfer function, and a large number of harmonic components is chosen to ensure that the repeat period of the signal is greater than the duration of the simulation. This linear signal can also be corrected by applying a second-order transfer function approximated from the wavemaker theory of Schäffer (1996) but, for ease of computation, only first-order accurate wavemaker signals are considered initially.

2.3 Grid convergence and sponge calibration tests

Model solutions converged for a uniform computational grid spacing of 0.02 m and a time step of ~ 0.0066 s. Figure 2a shows the excellent agreement in free surface time series obtained when computational grids of resolution 0.018 m, 0.02 m, and 0.022 m (which reproduce the tank using 11,000, 10,000, and 9,000 grid points, respectively) are used to simulate an example focused wave group, which is created by bringing 128 harmonic wave components from the Case 2 spectrum to a linear focus amplitude of 0.03 m at the toe of the seabed slope ($x = 143.4$ m). Wave records from a point just beyond the crest of the slope ($x = 150$ m) show excellent agreement, with root mean square error (RMSE) values ranging from $\sim 2.47 \times 10^{-5}$ m to $\sim 5.68 \times 10^{-5}$ m, as do the corresponding frequency-domain results, which are not shown for brevity. Excellent results are also obtained in tests for mass conservation, reversibility, and the accumulation of round-off error, with model errors typically much less than 1%.

The absorbing and absorbing-generating sponge layers are then calibrated to ensure that they are able to damp effectively waves passing through without altering the incoming wave field. The absorbing-generating layer, which is used only in the run-up domain and placed such that its midpoint lies halfway along the one-dimensional tank (Fig. 1), is assigned a triangular strength profile (such that ψ increases and decreases linearly and symmetrically about the midpoint of the layer), whilst the identical absorbing layers, which are

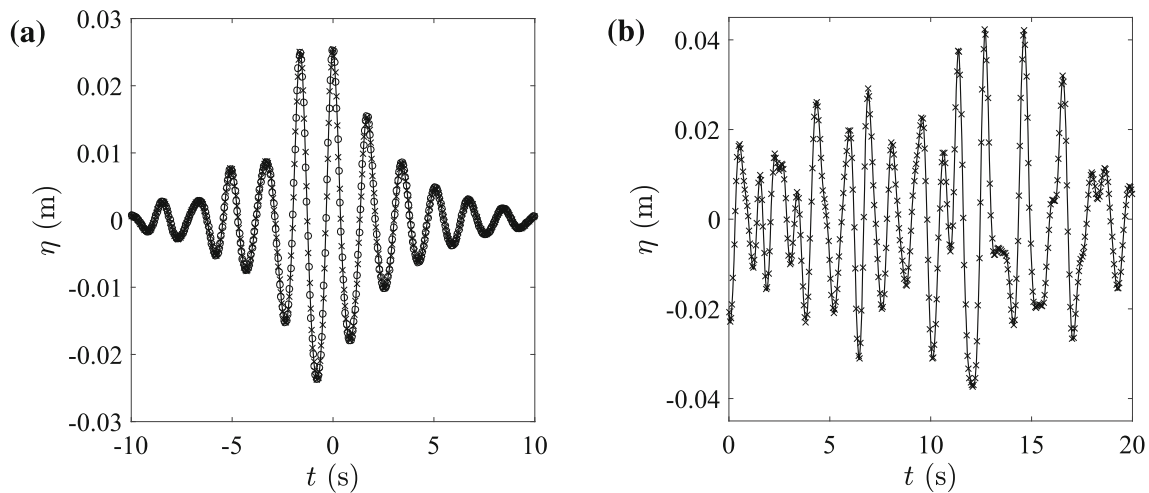


Fig. 2 Free surface elevation time histories at $x = 150$ m showing excellent agreement between (a) records of a crest-focused group simulated on computational grids of resolution 0.018 m (circles), 0.02 m (line),

and 0.022 m (crosses), and (b) subsequent repeat periods (crosses, line) of a periodic irregular wave signal

placed at the ends of the tanks in both the incident and run-up domains, are given linearly increasing strength profiles (Fitzgerald et al. 2016).

Calibration is undertaken by comparing, for different sponge layer lengths, L_s , and integrated sponge layer strengths, $\bar{\psi}$, the wave records obtained from points upstream and downstream of the sponge layers. With the absorbing-generating layer switched off, a crest-focused wave group is first propagated from left to right through the absorbing layers, which are temporarily moved 20 m upstream so that measurements can be taken both upstream and downstream of the layers, and measurements are taken in the run-up domain as the waves are damped to zero. With the absorbing layers calibrated and moved back to the end of the tank, the reflected wave group, which is obtained from an additional simulation with no sponge layers, is then propagated from right to left through the absorbing-generating layer, which is set to damp the waves to the conditions in the incident domain (in this case, still water).

Excellent absorption properties are achieved by setting, for all layers, $L_s = 4\lambda_p = 14.2$ m and $\bar{\psi} = 4\omega_p = 14.8$ rad/s, where λ_p is the peak wavelength and ω_p is the peak angular frequency of the Case 2 spectrum. Following Fitzgerald et al. (2016), a periodic irregular wave signal with repeat period $\sim 2.17 \times 10^2$ s is then used to determine the efficacy of the sponge layer absorption by testing for repeatability in the wave record at a given gauge. Figure 2b shows the excellent agreement (RMSE $\approx 2.64 \times 10^{-4}$ m) in free surface time series obtained between subsequent repeat periods in the wave record at $x = 150$ m in the run-up domain,

which confirms that the reflections from the end of the tank and submerged seabed slope are negligible.

3 Results

3.1 Comparison with the results of Trulsen et al. (2012) and Gramstad et al. (2013)

The three experimental cases performed at MARIN are simulated by first discretising their input spectra into 2^{14} harmonic wave components to produce irregular wave signals and corresponding linear paddle signals with repeat periods $\sim 1.67 \times 10^4$ s, 1.11×10^4 s, and 1.39×10^4 s, respectively (Fig. 3a-b). OXBOU is then used to run each simulation for a duration of $T_d = 1.10 \times 10^4$ s with the linear dispersion coefficient tuned for optimal dispersion: $B = 1/15$. With the three simulations complete, the wave records are compiled and the first 200 s of each is neglected, following Trulsen et al. (2012), which leaves, at each grid point, records of duration $\sim 8.48 \times 10^3$, 6.36×10^3 , and 5.90×10^3 peak wave periods, respectively. Figure 3c shows, for the Case 2 simulation, the convergence of the normalised mean, standard deviation, skewness, and kurtosis of the free surface elevation with number of time samples in the wave record at $x = 150$ m. Each statistic is normalised by the corresponding value obtained for the entire record, and it is clear that the $\sim 1.644 \times 10^6$ samples are sufficient to provide robust estimates for each experimental case.

Figure 4 then compares, for each case, the simulated variations in variance, skewness, and kurtosis along the length

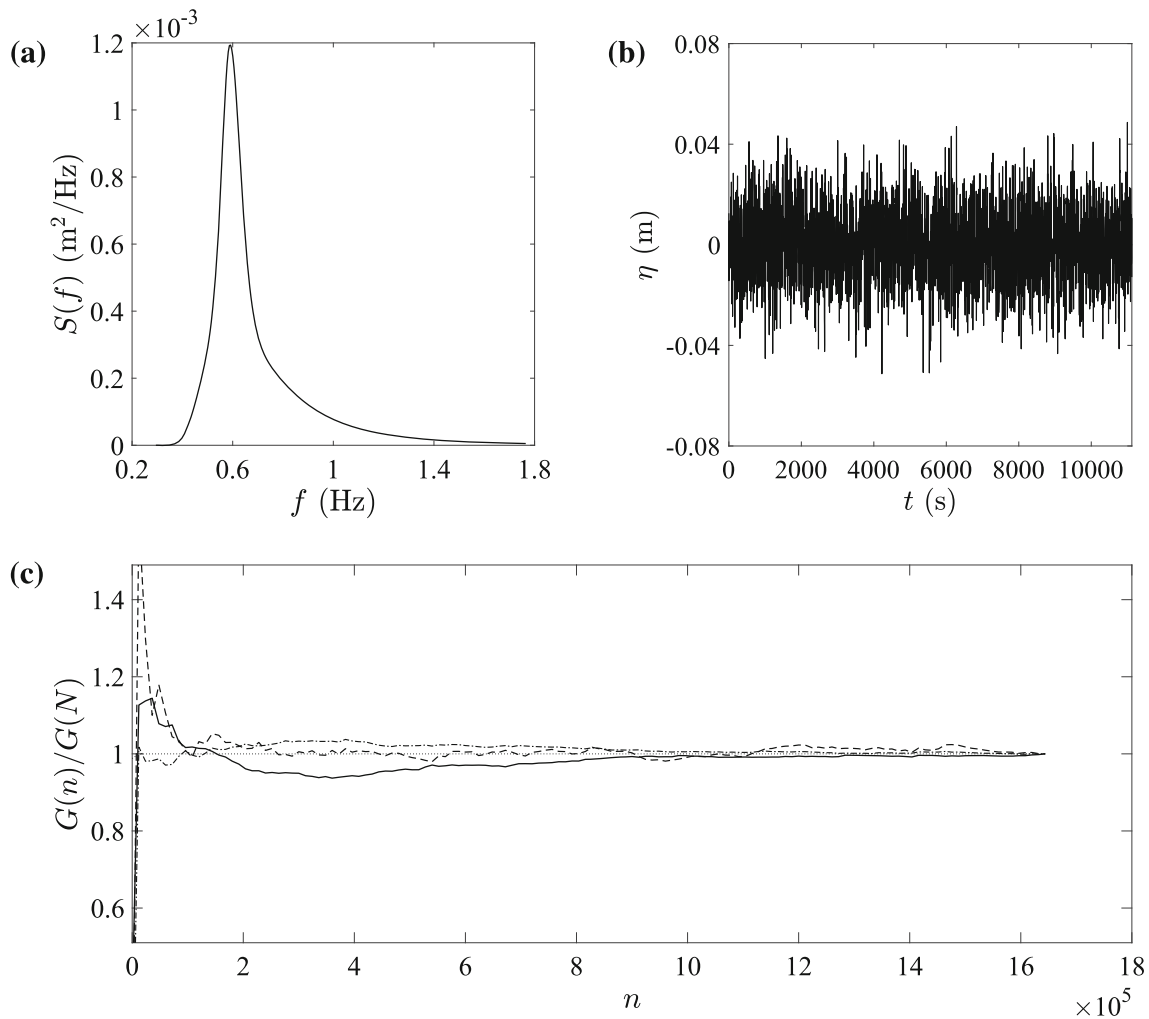


Fig. 3 Example plots from the present Case 2 simulation showing (a) the input JONSWAP spectrum, (b) the nominal input wave signal, and (c) the convergence of the statistical moments G with the number of

time samples n in the wave record (which has a total of $N \approx 1.644 \times 10^6$ samples) at $x = 150$ m: mean (dotted line), standard deviation (dashed-dotted line), skewness (dashed line), and kurtosis (solid line)

of the tank with those obtained from the Boussinesq-type numerical simulations of Gramstad et al. (2013) and the physical experiments of Trulsen et al. (2012). The results from the present Boussinesq-type simulations are shown with 95% confidence intervals determined using histograms produced by calculating the same statistics for 1000 bootstrap samples, which are obtained by random sampling with replacement of 5% of the available data. Although the trends for each statistic are qualitatively similar, the present profiles do not match those reported by Trulsen et al. (2012) and Gramstad et al. (2013): the skewness results are consistently lower and initially negative (Fig. 4d-f), and the kurtosis profiles exhibit greater reductions along the tank and much less prominent spikes near the crest of the submerged seabed slope (Fig. 4g-i).

3.2 Case 2 parameter study

To investigate these discrepancies, a parameter study based on the Case 2 simulation is used to examine the effects of various model inputs on the kurtosis profiles obtained for irregular waves propagating over a flat, horizontal bed (Fig. 5a) as well as over the submerged seabed slope (Fig. 5b). For a flat domain with still water depth $h = 0.6$ m, the kurtosis profile obtained for $x < 143.4$ m (Fig. 5a: solid line) is practically identical to that obtained in the Case 2 simulation (Fig. 5b: solid line), which confirms that the upstream kurtosis profile is unaffected by reflections from the submerged slope. This flat-bed simulation also demonstrates a reduction in kurtosis along the length of the tank: the kurtosis decreases from the input value of ~ 3 and appears to stabilise at a value of ~ 2.9 towards the end of the domain. Repeating this sim-

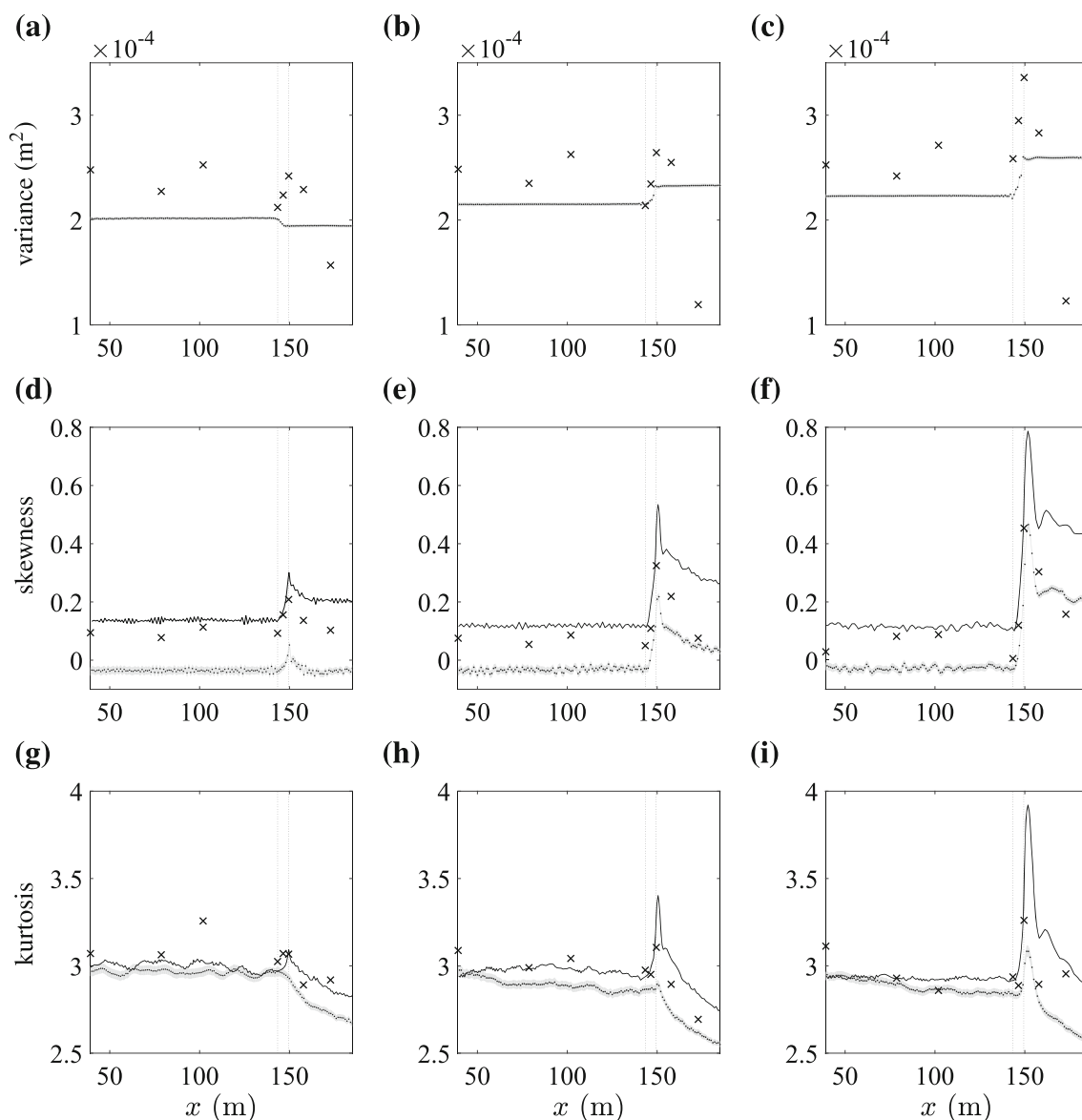


Fig. 4 Profiles of free surface elevation statistics: variance (a–c), skewness (d–f), and kurtosis (g–i) for Cases 1 (left column), 2 (centre column), and 3 (right column). Results are obtained from the physical experiments of Trulsen et al. (2012) (crosses), the Boussinesq-

type simulations of Gramstad et al. (2013) (solid lines), and the present Boussinesq-type simulations (dots with 95% confidence intervals shaded in grey). The vertical dotted lines mark the positions of the toe (left) and crest (right) of the submerged seabed slope

ulation with a lower input value of kurtosis (which is done by replacing the original wavemaker signal with the negatively skewed wave record subsequently obtained at $x = 160$ m) yields a more uniform profile, which further suggests an equilibrium kurtosis value of ~ 2.9 for this case. However, this equilibrium value is found to depend, as in earlier studies (see Janssen 2003; Zeng and Trulsen 2012), on both the still water depth (Fig. 5a: dotted line) and the bandwidth of the input wave spectrum (Fig. 5a: dashed line).

For simulations including the submerged seabed slope, the kurtosis profiles appear insensitive to the location of

the generating-absorbing sponge layer and the end-of-tank boundary condition. A similar profile is also obtained when the strengths of the absorbing and absorbing-generating layers are reduced by 90% (Fig. 5b: dotted line), which implies that the observed reduction in kurtosis is not the result of excess numerical damping. Dividing each wave record from the Case 2 simulation into five equal sections and taking the quasi-ensemble average of these fifths yields a similar profile (Fig. 5b: dashed line), as does taking the ensemble average across five alternate, independent realisations (Fig. 5b: dashed-dotted line). This demonstrates that the

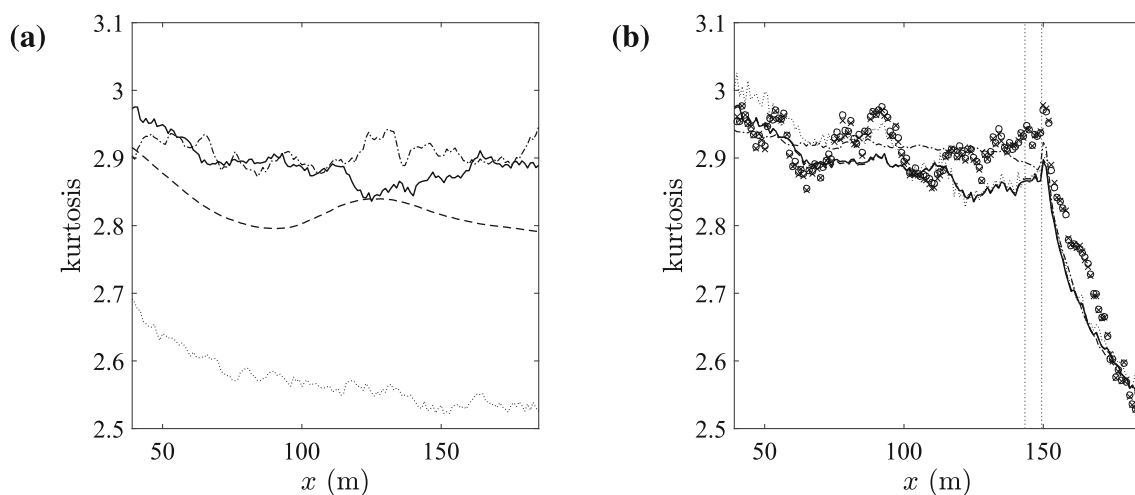


Fig. 5 Kurtosis profiles from the Case 2 parameter study. **(a)** Flat domain: still water depth, $h = 0.6$ m (solid line); narrower input spectrum (dashed line); lower input kurtosis (dashed-dotted line); and $h = 0.3$ m (dotted line). **(b)** Submerged seabed slope: single realisation (solid line); quasi-ensemble average of the single realisation divided

into fifths (dashed line); ensemble average of five alternate, independent realisations (dashed-dotted line); reduced sponge layer strengths (dotted line); and shorter simulations using first- (circles) and second-order (crosses) accurate wavemaker signals

present results do not depend on the type of measurement taken. Moreover, the kurtosis profiles obtained from shorter-duration (for ease of computation) simulations using first- and second-order accurate wavemaker signals are very similar (Fig. 5b: circles; crosses), which implies that neither are the observed trends due to error waves produced by the first-order accurate wavemaker (see Orszaghova et al. 2014).

4 Discussion and conclusions

The kurtosis profiles obtained in each experimental case agree qualitatively with those of Trulsen et al. (2012) and Gramstad et al. (2013) but the present numerical model is clearly unable to capture accurately the spikes near the crests of the submerged seabed slopes (Fig. 4g–i). A parameter study has confirmed that the present results do not depend on the type of measurement taken, the position or damping strengths of the sponge layers, or the order of accuracy of the wavemaker signal (Fig. 5b). Further discrepancies are also evident: for the depths considered here, second-order bound harmonics are expected to positively skew the probability distribution function for the free surface elevation (Onorato et al. 2005) but the present skewness results are initially negative (Fig. 4d–f). Replication of an example irregular wave simulation with the ‘fully nonlinear’ OceanWave3D model (see Engsig-Karup et al. 2009) (comparison not shown for brevity) confirms that OXBOU produces consistently lower values of free surface elevation skewness and kurtosis.

The discrepancies between the present results and those of Gramstad et al. (2013) most likely stem from differences in the underlying momentum equations. The exact source of these discrepancies, however, is difficult to determine. When examining the propagation of irregular waves over a compound slope, Kashima et al. (2014) found that the present equation set returned values of skewness and kurtosis which were considerably lower than those obtained in the corresponding physical experiment. These lower values were explained as being the result of insufficient nonlinearity in the numerical simulations, but Gramstad et al. (2013) were able to use a similar weakly nonlinear model to reproduce the results of Trulsen et al. (2012). Further, in deriving the present equation set, Madsen and Sørensen (1992) adopted a mild slope assumption which retained only the lowest-order spatial derivatives of the water depth. This means that the present model is unable to capture the effects of the sudden depth transition as well as that of Gramstad et al. (2013), which retains these high-order terms. It is also worth noting that two of the present three experimental cases consider water depths which exceed the depth limit ($k_p h < 1$, where k_p is the peak wavenumber of the input spectrum) recommended to ensure the accuracy of the present equation set (see Madsen and Sørensen 1992, 1993).

Using a boundary element method with fast multipole acceleration to solve Laplace’s equation for potential flow with fully nonlinear boundary conditions, Zheng et al. (2020) have recently predicted the local changes in the statistical properties of irregular waves propagating over a range of submerged slopes in close agreement with the experiments

by Trulsen et al. (2012). In doing so, Zheng et al. (2020) have demonstrated that these local changes are driven by second-order terms, which may help to explain why the peaks in skewness and kurtosis cannot be accurately captured by the present Boussinesq-type model. The present equation set includes a linear dispersion coefficient, B , which may be tuned to produce either enhanced dispersion characteristics or approximately correct second-order bound harmonics (Yao 2007). Herein, B is assigned a value of 1/15 for optimal dispersion. It is reasonable to assume that if the bound waves are inaccurate, significant errors in skewness and kurtosis will arise near the sudden depth transition, because the peaks in skewness and kurtosis at this location are likely a consequence of the release of second-order bound waves by the depth transition (Zheng et al. 2020). Although there is no value of B which can make the present equation set equivalent to that of Gramstad et al. (2013), it is possible to match the linear dispersion relations by setting $B = 0.057$. However, this is found to make no appreciable difference to the present results and does not address the need to correct the bound waves. Frequency domain comparisons between OceanWave3D and OXBOU (again not shown for brevity) demonstrate that there is also no value of B which gives satisfactory agreement on sub-harmonic and super-harmonic content.

Modelling this sudden depth transition problem is challenging because it requires an accurate yet computationally efficient numerical code which is able to incorporate the effects of both dispersion and nonlinearity on the evolution of the wave field. The work of Gramstad et al. (2013) has shown that the key physics underlying this localised increase in the probability of rogue wave occurrence can be captured by a weakly dispersive, weakly nonlinear Boussinesq-type model. There are, however, many different sets of Boussinesq-type equations and the present study demonstrates the importance of making an appropriate selection. Although OXBOU is a very useful tool for modelling nearshore wave propagation, run-up, and overtopping, it is clear that the underlying equation set is not well-suited to modelling the propagation of waves over a sudden depth transition. It is thus recommended that this problem be revisited using a revised version of OXBOU based on an improved set of Boussinesq-type equations. The equations of Schäffer and Madsen (1995), for instance, provide the same enhanced linear dispersion characteristics as those of Madsen and Sørensen (1992) but are not limited to mildly sloping seabeds. It should also be noted, however, that the accuracy of any numerical model will depend on the means by which the spatial and temporal derivatives are calculated (Borthwick et al. 2006), and that sudden depth transitions invariably prove challenging for any low-order finite difference scheme. Shock-capturing schemes offer an alternative approach but are generally less accurate and may introduce further complications.

In future studies, it would prove valuable to compare statistical results not only between different Boussinesq-type formulations but also between weakly and highly nonlinear models, following Viotti and Dias (2014), Ducrozet and Gouin (2017), and Zheng et al. (2020), as well as with physical experiments, following Zhang et al. (2019) and Trulsen et al. (2020). It would also be interesting to explore whether idealised, multi-layer numerical models, such as SWASH (Zijlema et al. 2011), can provide additional insight. Future work should examine not only the extreme amplitudes but also the shapes and periods of these rogue waves, which are crucial in understanding the strength of the wave impact and the resilience of ships and offshore structures (Kharif et al. 2009; Adcock and Taylor 2014). The effects of directionality must also be considered because large waves evolve differently in unidirectional and directionally spread seas (Adcock and Taylor 2014), and studies have shown that even a small amount of counter-propagating wave energy can result in a significant reduction in free surface kurtosis (Ducrozet and Gouin 2017; Støle-Hentschel et al. 2018). Finally, real-world observations should be included wherever possible in studies of rogue wave formation and occurrence probability (Slunyaev et al. 2011) because it is the ocean that provides the most representative conditions with which to test and revise new theories.

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