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\*CORRESPONDENCE Xingkun Xu ⊠xingkun.xu@student.unimelb.edu.au

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# The impact of spume droplets induced by the bag-breakup mechanism on tropical cyclone modeling

# Xingkun Xu<sup>1,2\*</sup>, Joey Voermans<sup>1</sup>, Takuji Waseda<sup>2</sup>, Il-Ju Moon<sup>3</sup>, Qingxiang Liu<sup>1,4</sup> and Alexander V. Babanin<sup>1</sup>

<sup>1</sup>Department of Infrastructure Engineering, University of Melbourne, Melbourne, VIC, Australia, <sup>2</sup>Graduate School of Frontier Sciences, The University of Tokyo, Kashiwa, Chiba, Japan, <sup>3</sup>Jeju National University, Jeju City, Republic of Korea, <sup>4</sup>Physical Oceanography Laboratory, Ocean University of China, Qingdao, China

Spume, large-radius seawater droplets that are ejected from the ocean into the atmosphere, can exchange moisture and heat fluxes with the surrounding air. Under severe weather conditions, spume can substantially mediate air-sea fluxes through thermal effects and thus needs to be physically parameterized. While the impact made by spume on air-sea interactions has been considered in bulk turbulent air-sea algorithms, various hypotheses in current models have resulted in uncertainties remaining regarding the effect of spume on air-sea coupling. In this study, we extended a classic bulk turbulent air-sea algorithm with a "bagbreakup" physical scheme of spume generation parameterizations to include spume effects in a complicated numerical model. To investigate the impact of spume on air-sea coupling, we conducted numerical experiments in a simulation of Tropical Cyclone Narelle. We observed a significant improvement in the ability to model minimum central pressure and maximum sustained surface wind speed when including the bag-breakup spume scheme. In particular, the impact of the bag breakup-generated spume is observed in the intensity, structure, and size of the tropical cyclone system through the modulation of local wind speed (U10), wave height (Hs), and sea surface temperature.

#### KEYWORDS

tropical cyclone modeling, air-sea-wave-coupled model, sea spume, air-sea heat fluxes, bag-breakup

# **1** Introduction

Tropical cyclones (TCs) are one of the most devastating environmental natural disasters, with destructive and landfalling TCs rarely failing to cause substantial economic loss and damage (Vigdor, 2008; Nordhaus, 2010). Thus, intensive investigations in improving TC forecasting are required (Southern, 1979; Chan, 1985; Moon et al., 2004a; Moon et al., 2004b; Moon et al., 2007; Strachan et al., 2013). Over recent

decades, significant improvements in TC forecasting have been steadily achieved (e.g., in the tracking and positioning of TCs), with contributions made by a combination of updated numerical models and detailed observations (Emanuel et al., 2004). However, while complicated numerical models have been widely used, relatively little progress has been made in the prediction of TC intensity (e.g., as evaluated by minimum center pressure and/or maximum sustained wind speed) (Chan and Kepert, 2010; Kepert, 2010; Emanuel, 2018). Variations in TC intensity partly arise from changes in environmental conditions under a TC system and TCscale internal fluctuations caused by the stochastic processes that result from high-frequency transients (Emanuel et al., 2004). As a critical process, air-sea heat exchange and moist convection can be markedly modulated by water droplets ejected from the ocean surface (Zhang et al., 2017; Xu et al., 2021a; Zhang et al., 2021; Xu et al., 2022). However, this chaotic physical process, while critical, is not represented effectively in the current numerical simulations of TC systems.

To consider the impact of water droplets on a TC system, the full microphysics of water droplet evolution in the air demands a clear understanding. It has been suggested that sea spray impacts air-sea dynamics in the following two ways: (i) through the air-sea saturation layer that is represented by the drag coefficient saturation (ii) and direct air-sea momentum transfer. In addition to a dynamic impact, sea spray can also substantially mediate air-sea heat fluxes (Rizza et al., 2018; Rizza et al., 2021; Zhang et al., 2021). For instance, sea spray-induced heat fluxes (HFs) account for more than 10% of the total air-sea HF. Here, we take the moist enthalpy (heat energy fluxes) generated by water droplets as an example. Based on Pruppacher and Klett (1978), water droplet–induced HFs can be functioned by the following:

$$C_w m \frac{dT}{dt} = -k(T - T_a) + L_v \frac{dm}{dt}$$
(1)

where  $C_w$  is the specific heat of the ocean water; *m* and *T* are the mass and temperature of the water droplets, respectively; *k* is the Boltzmann constant; and  $L_v$  is latent heat evaporation. The positive net heat transfer from the droplet to the atmosphere exists only during the brief period of droplet temperature adjustment. After temperature adjustment, the latent HF realized to the atmosphere is balanced by the diffusion (sensible) HF obtained from the atmosphere for droplet evaporation, and there is no further contribution from the droplet to the enthalpy flux to the atmosphere; that is,  $k(T - T_a) = L_v \frac{dm}{dt}$ . As such, the total amount of enthalpy entering the atmosphere during the entire life cycle of the water droplet (i.e., from injection to fall back into the ocean) is given by the following:

$$Q_k = -C_w \int_0^{\tau_f} m \frac{dT}{dt} dt$$
 (2)

where  $\tau_f$  is the residence time of the water droplets staying in the atmosphere. Assuming that the relaxation time of the water droplet temperature is much larger than that of evaporation (Andreas, 1992), the radius of the water droplets is large, and the residence time of the droplet in the atmosphere significantly exceeds the time

of the droplet temperature adjustment (Andreas and Emanuel, 2001; Andreas et al., 2008). Equation 2 can be written as follows:

$$Q_k = \frac{4}{3} \pi r_0^3 C_w \rho_w (T_w - T_{eq})$$
(3)

where  $r_0$  is the initial radius of the water droplets when sprouting from the ocean;  $\rho_w$  is the density of the ocean water; and  $T_w$  and  $T_{eq}$ are the temperature of the ocean surface and the thermal equilibrium temperature of the water droplets, respectively. Following Troitskaya et al. (2018b), the sensible HFs from the water droplets to the atmosphere ( $Q_s$ ) can be obtained by the latent HFs induced by the water droplets ( $Q_L$ ) subtracted from  $Q_k$ . As  $Q_s$ and  $Q_L$  are sensible and latent HFs induced by an individual water droplet, we need to compute the total amount of water droplets produced at the ocean surface to consider the impact of the HFs induced by the water droplets on the air-sea boundary layer.

To quantify the in-time production of water droplets, a generation function of spume (i.e., water droplets with a radius generally larger than 10 µm) is needed, as spume is believed to account for more than 95% of the total volumetric concentration of water droplets generated by winds ranging from 10 to 15 m s<sup>-1</sup> (Andreas, 1992; Ortiz-Suslow et al., 2016). One of the earliest observations of the spume microphysical generation processes was in the 1980s (Koga, 1981). Later, substantial measurements of spume were conducted (Andreas, 1992; Spiel and De Leeuw, 1996; Spiel, 1998; Lhuissier and Villermaux, 2012; Mehta et al., 2019; Xu et al., 2021b). Recently, Veron et al. (2012) proposed that substantial amounts of spume can be produced by the bursting of the airflowinflated liquid that forms at the lower range of the bubble breakup regime. Based on high-speed camera laboratory observations, Troitskaya et al. (2017), by providing possible physical explanations for various phenomena, concluded that direct spume generation at extreme winds could be largely modulated by a "bagbreakup" mechanism. Throughout a bag-breakup occurrence, a rise in small-scale ocean surface elevations is observed, which is in turn blown into an inflated "sail" by extreme winds. This sail finally breaks up and produces spume. As such, the amount of spume induced by the bag-breakup mechanism can be functioned as follows:

$$\frac{dF}{dr} = \langle N \rangle (F_1 + F_2) \tag{4}$$

where  $\frac{dF}{dr}$  is the spume generation function; *r* is the radius of the spume; (N) is the number of "bags"; and  $F_1$  and  $F_2$  are the number of spumes caused by the "canopy" and "rim" within one bag, respectively (please refer to Supplementary Material 1, Troitskaya et al. (2018a); Troitskaya et al. (2018b) for more information). Therefore, assuming that the bag-breakup mechanism modulates the production of water droplets through the air-sea interface, we can estimate water droplet–induced fluxes by following Perrie et al. (2005); Andreas et al. (2008); Xu et al. (2021a), and Xu et al. (2022) through Eq. 3 and the integral of Eq. 4.

In the present work, we investigated the impact of the spume generated by the bag-breakup mechanism in a TC system. In doing so, we extended the air-sea bulk algorithm of Andreas and Emanuel (2001) and Andreas et al. (2008) with the spume generation bagbreakup function and implemented an updated algorithm into a fully coupled atmosphere-ocean-wave numerical model. The coupled model was then used to simulate TC Narelle, which occurred in 2013. In the *Methods* section, we discuss the fully coupled atmosphere-ocean-wave numerical model used in this study. The results and discussions are provided in the *Results and Discussion* section, which is followed by a summary and conclusion in the *Conclusion* section.

# 2 Methods

### 2.1 Tropical Cyclone Narelle

As a result of a strong monsoon flow associated with the burst of a Madden–Julian Oscillation (White and Fox-Hughes, 2013; Smith et al., 2015), a tropical low pressure formed near 10.5°S 126°E in January 2013. This tropical low initially went west and slowly developed while moving toward the southwest. On 00:00/8 January 2013, this low pressure reached cyclone strength, developed into TC Narelle, and continued to grow under favorable conditions. TC Narelle traveled southwestward on 00:00/9 January 2013 and progressively achieved a peak wind speed of 105 knots (195 km/h) from 00:00 to 12:00 on 11 January 2013 when it was located approximately 470 km to the north of Exmouth, Western Australia. From 13 January 2013, Narelle traveled along the Western Australian coast to the southwest and gradually weakened to below tropical cyclone strength at 06:00/14 January 2013, dissipating well offshore.

### 2.2 Model description

In this study, we adopted the Coupled Ocean-Atmosphere-Wave-Sediment Transport (COAWST v3.3) Modeling System (Warner et al., 2010a). This coupled system comprises three components: an atmosphere model, an ocean model, and a wave model. A model-coupled toolkit was applied to connect these model components and exchange modeling variables at an interval of 30 min. For further information, please refer to Warner et al. (2010b). Below, we briefly clarify in depth our setup for each component in COAWST.

### 2.2.1 Atmosphere

Used as the atmospheric model for the COAWST, the Weather Research and Forecasting (WRF) model, known as the Advanced Research WRF (WRF-ARW v3.9) (Skamarock and Klemp, 2008), is a compressible and non-hydrostatic numerical weather prediction system with a variety of atmospheric physical schemes. In this study, we used the Purdue Lin Scheme (Chen and Sun, 2002) for the microphysics process, the Dudhia Scheme (Dudhia, 1989) for the shortwave-radiation process, the RRTM Scheme (Mlawer et al., 1997) for the longwave-radiation process, the Mellor-Yamada-Nakanishi-Niino scheme Nakanishi and Niino, (2006), Nakanishi and Niino, (2009) for the surface and planetary boundary layer process, and the 5-layer thermal diffusion scheme (Dudhia, 1996) for the land surface process. Due to the limitations of the computational resources, the WRF-ARW model was run with a 7.5-km horizontal resolution, which is somewhat coarse but still allows for simulating a TC's inner core dynamics (Wu et al., 2018). There were 59 sigma levels in the vertical, which was sufficiently fine and allowed for simulating atmospheric vertical dynamic processes. We initiated the WRF-ARW on 00:00/1 August 2014 based on data from the European Centre for Medium-Range Weather Forecasts (ECMWF) and produced fifth-generation atmospheric reanalysis (ERA-5) data with a horizontal resolution of  $0.25^{\circ} \times 25^{\circ}$  and 1-h intervals. The boundary conditions were derived using the same data.

### 2.2.2 Ocean

To consider the response from the underlying ocean to the atmosphere, a free-surface and topography-following coordinate Regional Ocean Model System (ROMS) with wind stress forcing and air-sea fluxes exchanging with the WRF was defined as the ocean component in the COAWST. As a free-surface regional oceanic numerical model, ROMS with terrain-following coordinates solved the Reynolds-averaged Navier-Stokes equations (Shchepetkin and McWilliams, 2005). In this application, we adopted a model domain with the same horizontal resolution (7.5 km) as the WRF model to increase the computation efficiency. In the vertical, 30 levels were used for the extended topography-following coordinates. The vertical stretching parameters  $\theta s = 5$ ,  $\theta b = 0.5$ , and Tcline = 5 were used. Reanalysis data from the global Hybrid Coordinate Ocean Model (HYCOM) GLBa0.08, which was based on a part of the U.S. Global Ocean Data Assimilation Experiment (GODAE), were used to determine the sea surface level (zeta), currents (U, V), vertically averaged currents (ubar, vbar), salinity (salt), and temperature (temp) for the initiation of the ROMS. The outputs from HYCOM were also used to obtain the open boundary conditions for the currents, temperature, and salinity. The open boundary conditions were defined as Chapman conditions for the free surface and twodimensional momentum, Flather conditions for the threedimensional momentum, and temperature and salinity with radiation and nudging conditions. A 1-month simulation was conducted through a coupled WRF-ROMS model to obtain a hot start oceanic field. While the 1-month spin-up was considered sufficient for stabilizing the ocean model, it should be noted that the spin-up preparation is critical for a short-term met-ocean event simulation.

### 2.2.3 Wave

The Simulating WAves Nearshore (SWAN) wave model used in COAWST is a third-generation wave model. SWAN integrates in spatial and spectral space to solve the wave action equation accounting for wind-wave generation, wave breaking, wave-wave interaction, and other factors. In this study, the simulation domain and resolution for SWAN were set as the same as used for ROMS to conserve computational resources by shortening the time required to recalculate grid data (Figure 1). Komen et al. (1984) was adopted for the whitecapping calculation. By specifying a directional resolution of 10°, 36 wave directions were determined. In addition, 24 frequencies (0.04–1.0 Hz) were derived by defining the minimum frequency as 0.04 Hz. The data of the global simulation of the WaveWatch III model (ftp:// polar.ncep.noaa.gov/pub/history/waves) were used for the boundary conditions of SWAN. In accordance with the oceanic field preparation, the initial conditions of SWAN were derived from the outputs of a 1-month WRF-SWAN coupled model running with the same model grids and domain as used in this study.

### 2.3 Experimental designs

The COAWST model was used to investigate the impact of spume on the modeling of TC Narelle. Historically, the Coupled Ocean-Atmosphere Response Experiment (COARE) bulk algorithm has been adopted to estimate air-sea interfacial HFs. Here, to characterize the role of spume in the air-sea heat exchange, we substituted the default bulk turbulent algorithm in the surface module within the WRF with the air-sea microphysical algorithm suggested by Andreas et al. (2008). In doing so and in accordance with Perrie (2004), spume-induced sensible and latent HFs were proportionally added to the interfacial direct air-sea sensible and latent HFs, respectively, as follows:

$$H_{L,T} = H_L + H_{L,sp} \tag{5}$$

$$H_{S,T} = H_S + H_{S,sp} \tag{6}$$

where  $H_{L,T}$  and  $H_{S,T}$  are the total latent and sensible heat transfer

across the air-sea interface, respectively;  $H_L$  and  $H_s$  are the direct air-sea latent and sensible HFs, respectively; and  $H_{L,sp}$  and  $H_{S,sp}$  are the spume-induced latent and sensible HFs, respectively (see Supplementary Material 2 for more information). As such, by using the updated coupled model (i.e., Eqs. 1–6), two numerical experiments were conducted. Expt. 1 was the control run in which the spume scheme was absent, while Expt. 2 included the spume scheme. Therefore, the impact of spume (more specifically, spume produced by the bag-breakup mechanism, hereafter referred to as "the spume scheme") on local atmospheric and oceanic environments can be investigated.

# **3** Results and discussion

### 3.1 Atmosphere

Figure 2 shows a comparison between observations from the International Best Track Archive for Climate Stewardship (IBTrACS) and the simulation results. The simulation results with and without the spume scheme are comparable before 06:00/10 January 2022; however, after 06:00/10 January 2022, the inclusion of the spume scheme deepens the minimum central pressure  $(P_{min})$  by up to 20 hPa and significantly reduces the errors with observations. This improvement can also be seen in the maximum sustained surface wind speed (V<sub>max</sub>). By introducing the spume scheme, V<sub>max</sub> increases by up to 13 m s<sup>-1</sup> in contrast to the simulation without spume (Figure 2B), thus reducing the error with observations. While concurrent in situ observations are scarce due to the limitations of measurement techniques, we can observe improvements when comparing our simulated wind speeds at a 10-m height (U<sub>10</sub>) to the measurements of ASCAT MetOp-A, CryoSat, HY-2, Jasson-1, and Ocean Surface Topography Mission/Jason-2 (Supplementary Material 3).



#### FIGURE 1

Domain of the COAWST model. The inner domain outlined by dashed lines (ROMS and SWAN) is nested with the outer domain outlined by solid lines (WRF). The best-track observations and the track of TC Narelle modeling without and with the spume scheme are represented in solid black lines with squares, solid blue lines with circles, and solid red lines with triangles, respectively. The passage points of satellites are represented by cross markers.



#### FIGURE 2

(A) Minimum central pressure (P<sub>min</sub>) and (B) maximum sustained surface wind speed (V<sub>max</sub>). The solid black line, solid blue line, and solid red line are the observations of the International Best Track Archive for Climate Stewardship and the modeling results without and with the spume scheme, respectively. The gray shadow represents the period of model spin-up.

Figures 3A, D, G present the spatial distributions of the total air-sea HFs of Expt. 1. The maximum of the HFs through the air-sea interfaces is located at the radius of maximum wind (RMW). Consistent with Expt. 1, the maximum of the HFs in Expt. 2 is at the RMW (Figures 3B, E, H). We observe that with the development and intensification of TC Narelle, the maximum of the HFs continuously increases. For example, the maximum of the HF azimuthal average reaches 450, 500, and 550 W m<sup>-2</sup> on 00:00/10 January 2013, 00:00/11 January 2013, and 00:00/12 January 2013, respectively. In comparison with Expt. 1, once the spume

scheme is considered, the maximum HF azimuthal average is significantly enhanced by up to 150, 350, and 375 W m<sup>-2</sup> on 00:00/ 10 January 2013, 00:00/11 January 2013, and 00:00/12 January 2013, respectively (Figures 3C, F, I). This is because the seawater temperature and thus the initial temperature of the spume droplets are higher than the air that surrounds them, which means that the spume droplets are expected to transfer heat to the surrounding air. This, in turn, increases the quantity of heat transferred from the ocean to the above atmosphere. While spume is likely to cool the atmosphere because of



#### FIGURE 3

(A, D, G) are total air-sea heat fluxes without the spume scheme on 10–11 January 2013. (B, E, H) are the same as (A, D, G) but with the spume scheme. (C, F, I) represent the azimuthal averages of the total air-sea heat fluxes. The direction in which TC Narelle is moving forward at different times is demonstrated by the red arrows. The azimuthal averages of the total air-sea heat fluxes for the simulation results without and with the spume scheme are shown by solid blue and red lines, respectively. The standard deviations of the total air-sea heat fluxes in all radial directions are represented by shadows. The radius of maximum wind is represented by solid circles and dashed lines in spatial distributions and azimuthal averages, respectively.



(A, D, G) are sea level pressure (SLP) without the spume scheme on 10–12 January 2013. (B, E, H) are the same as panels (A, D, G) but with the spume scheme. (C, F, I) represent the azimuthal averages of the SLP. The direction in which TC Narelle is moving forward at different times is demonstrated by the red arrows. The vectors are the directions of the local winds. The azimuthal averages of the SLP are shown by solid lines. The standard deviations of the SLP in all radial directions are represented by shadows. The radius of maximum wind is represented by solid circles and dashed lines in spatial distributions and azimuthal averages, respectively.

evaporation, such a cooling process cannot be completed because of the limited suspension time of the spume in the air. This is consistent with the results of Andreas (1992) and Andreas et al. (2008), who proposed that the timescale of spume evaporation in the air (minutes to days) is much larger than that of the heat exchange resulting from temperature differences (seconds). While the spume-induced HFs are noticeable at RMW, spume has no discernible effect on the air-sea HFs in the areas located 120 km away from the center of the TC (Figures 3C, F, I). Therefore, we expect the structure of the TC to change considerably due to the presence of the sea spray spume.

Figures 4A, D, G depict the spatial distributions of the atmospheric pressure at various periods without the spume scheme. When compared to Expt. 2 (Figures 4B, E, H), we observe limited changes overall. However, the azimuthal averages of sea level pressure (SLP) are dramatically affected as a result of introducing the spume scheme, specifically within the RMW. For instance, in comparison with the simulation results of Expt. 1, Expt. 2 increases the minimum SLP azimuthal average by up to 2, 6, and 22 hPa on 00:00/10 January 2013, 00:00/11 January 2013, and 00:00/12 January 2013, respectively (Figures 4C, F, I).

The spatial distribution of  $U_{10}$  and the ocean surface stress at different times in Expt. 1 are shown in Figures 5A, D, G and Figures 6A, D, G, respectively. Once the spume effects are considered, while the directions of the local winds have slightly

changed, the maximum U<sub>10</sub> and ocean surface stresses are greatly enhanced (Figures 5B, E, H; 6B, E, H). We notice that such an impact becomes more apparent with the development and intensification of the TC. This is in agreement with the spatial distributions of the HFs, which further show the impact of spume on the local wind fields. For example, in contrast with the simulation results without the spume scheme, adding spume increases the maximum of the U10 azimuthal averages by up to 1.0, 6.6, and 22.9 m s<sup>-1</sup> and the maximum of the ocean surface stress azimuthal averages by up to 0.04, 0.80, and 1.61 N m<sup>-2</sup> on 00:00/10 January 2013, 00:00/11 January 2013, and 00:00/12 January 2013, respectively (Figures 5C, F, I; 6C, F, I). While the maximum of the U<sub>10</sub> is increased when introducing the spume, the location of the maximum U10 moves closer to the TC center (i.e., the RMW decreases) such that the TC becomes smaller (on average 10 km) in comparison with the simulated results without the spume scheme.

### 3.2 Waves

During the passage of the TC, we expect spume to make a significant impact on the waves as spume radically affects wind fields, and the local sea state is highly dependent upon these fields.



FIGURE 5

(A, D, G) are 10-m wind speed ( $U_{10}$ ) without the spume scheme on 10–12 January 2013. (B, E, H) are the same as (A, D, G) but with the spume scheme. (C, F, I) represent the azimuthal averages of  $U_{10}$ . The direction in which TC Narelle is moving forward at different times is demonstrated by the red arrows. The vectors are the directions of the local winds. The azimuthal averages of  $U_{10}$  are shown by solid lines. The standard deviations of  $U_{10}$  in all radial directions are represented by shadows. The radius of maximum wind is represented by solid circles and dashed lines in spatial distributions and azimuthal averages, respectively.

Figures 7A, B, D, E, G, H depict the spatial distributions of significant wave height (Hs) at different times for Expt. 1 and Expt. 2, respectively. The maximum Hs is largely increased because of the adoption of the scheme in Expt. 2. This increment, consistent with the development of U<sub>10</sub>, increases with the intensification of the TC. Specifically, the maximum Hs of Expt. 2 is enhanced by up to 1.3, 1.4, and 3.8 m on 00:00/10 January 2013, 00:00/11 January 2013, and 00:00/12 January 2013, respectively (Figures 7C, F, I) as compared to the simulated results in Expt. 1. We note that the simulation results for Hs are improved when introducing spume as compared with the measurements of CryoSat, HY-2, Jason-1, and Ocean Surface Topography Mission/Jason-2 (Supplementary Material 3). While spume produces critical effects on Hs, it negligibly alters the location where the maximum Hs occurs (i.e., the maximum Hs distributes averagely in all radial directions). As TC Narelle occurred in the Southern Hemisphere, the maximum Hs is expected to be located in the left front quadrant of the TC's forward direction. This is due to the fact that a (young) swell propagates in the same direction as the locally generated wind sea, which is in the left front as a TC spins clockwise in the Southern Hemisphere, whereas the propagation directions of the wind sea and (young) swells keep opposite and/or cross each other (Holthuijsen et al., 2012). This spatial distribution pattern is not observed in either Expt. 1 or Expt. 2. One possible reason is that the

movement speed of TC Narelle is so slow in the experiments that the waves under the TC system are largely dominated by the locally generated wind waves instead of the swell produced at earlier points (Moon et al., 2003).

# 3.3 Ocean

As the underlying ocean is closely coupled with atmospheric environments and local wave fields, and spume significantly alters the atmosphere and waves, we can expect a controlling impact of spume on the upper ocean. Figures 8A, D, G show the spatial distributions of sea surface temperature (SST). During the passage of the TC system, the SST decreases as a result of deep and cold water rising to the ocean surface as a consequence of upwelling and turbulent mixing. It can be seen that the SST decrease caused by the TC system occurs in the back quadrants of the TC as it moves forward, and the extent of the SST decrease follows the intensity of the TC system. As compared with the simulation results in Expt. 1, incorporating the spume scheme has negligible effects on the direction of the ocean current, but it enhances the extent and expands the area of decreasing SST (Figures 8B, E, H). For example, while the azimuthal average of the minimum SST in Expt. 2 is equivalent to that in Expt. 1 on both 00:00/10 January 2013 and



#### FIGURE 6

(A, D, G) are ocean surface stress without the spume scheme on 10–12 January 2013. (B, E, H) are the same as (A, D, G) but with the spume scheme. (C, F, I) represent the azimuthal averages of surface stress. The direction in which TC Narelle is moving forward at different times is demonstrated by the red arrows. The vectors are the directions of the local currents. The azimuthal maximum of the surface stress is shown by solid lines. The radius of maximum wind is represented by solid circles and dashed lines in spatial distributions and azimuthal averages, respectively.



#### FIGURE 7

(A, D, G) are significant wave height (Hs) without the spume scheme on 10–12 January 2013. (B, E, H) are the same as (A, D, G) but with the spume scheme. (C, F, I) represent the azimuthal averages of Hs. The direction in which TC Narelle is moving forward at different times is demonstrated by the red arrows. The vectors are the propagation directions of the local waves. The azimuthal averages of Hs are shown by solid lines. The standard deviations of Hs in all radial directions are represented by shadows. The radius of maximum wind is represented by solid circles and dashed lines in spatial distributions and azimuthal averages, respectively.



00:00/11 January 2013, the decline in SST is largely more pronounced in Expt. 2 on 00:00/12 January 2013 (Figures 8C, F, I). That is, the minimum SST is further decreased by 1.2°C in Expt. 2 as compared to that in Expt. 1 mainly at the RMW. This is in accordance with current studies suggesting that spume strengthens the SST cooling caused by a TC system (Perrie, 2004; Perrie et al., 2005; Xu et al., 2022), which is a direct result of the spume-induced intensification of the TC system. This can be explained as follows. Spume increases total air-sea HFs, reinforcing the local winds and waves specifically at the RMW. In turn, additional turbulent kinetic energy from the atmosphere to the ocean is provided, enhancing warm surface water mixing with cooler water from the surface to the thermocline and promoting the upwelling of colder water to the surface. Once the SST cooling has become enhanced because of the strong upwelling, the temperature of the spume is also reduced, leading to a reduction in spume-induced HFs, providing negative feedback on the interaction between the spume and the upper ocean.

# 4 Conclusion

The present study used a coupled atmosphere-ocean-wave numerical model to investigate the impact of a bag breakupinduced spume scheme on the atmosphere, ocean, and wave modeling of the passage of TC Narelle. We did so by extending an air-sea turbulent bulk algorithm by implementing an observation-based spume parameterization. Two different numerical experiments were performed, one without and one with the spume scheme, to study the impact of spume on the airsea interactions during TC Narelle.

When considering our simulations, we can observe substantial improvements in the ability to model minimum SLP and maximum wind speed as compared with observations from the World Meteorology Organization. These improvements are consistent with observations from ASCAT MetOp-A and Ocean Surface Topography Mission/Jason-2. By providing additional heat to the atmosphere, spume causes a TC system to intensify, and this is represented in our model by a decrease in  $P_{min}$  and an increase in  $V_{max}$ . Furthermore, as  $U_{10}$  increases, RMW reduces by approximately 10 km in the model, suggesting a complex but critical impact of spume on the intensity, structure, and size of the TC system.

It can also be noticed that the stronger prevailing winds induced by spume ultimately contribute to higher sea states, and we can observe an increase in Hs by up to 3.8 m. Since the generation of spume is heavily influenced by the interaction between local waves and winds, an increase in  $U_{10}$  and rise in Hs can result in a positive feedback on spume production. In contrast with the positive feedback between the spume and local winds and waves, a negative feedback can occur between the spume and the upper ocean. This happens because the intensification of the TC system when including spume leads to stronger vertical mixing and

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upwelling, which in turn enhance SST cooling after the TC passes. For instance, we can see a decrease in the minimum SST by as much as 1.2°C in our simulations. Enhanced SST cooling can reduce the impact of spume on air-sea HFs by reducing the temperature difference between the ocean (and thus spume droplets) and the atmosphere. Therefore, it can be seen that spume has significant effects on atmospheric and oceanic environments by modulating wind speed, Hs, and SST. Therefore, spume must be included in operational models for TC forecasting.

# Data availability statement

The original contributions presented in the study are included in the article/Supplementary Material. Further inquiries can be directed to the corresponding author.

# Author contributions

All authors contribute to this present work and approve the submitted version. XX designed and conducted the numerical simulations. XX initiated the first version of the manuscript. JV, TW, I-JM, QL, and AB contributed to the final revision of the manuscript. All authors contributed to the article and approved the submitted version.

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# Conflict of interest

The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

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# Supplementary material

The Supplementary Material for this article can be found online at: https://www.frontiersin.org/articles/10.3389/fmars.2023.1133149/ full#supplementary-material

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