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#### **Key Points:**

- High-resolution weather research and forecast simulations for Hurricane Joaquin show spiral gravity waves (GWs) emanating into the stratosphere
- Stratospheric GW activity is more frequent and intense before and during hurricane intensification than during weakening
- This study provides further evidence that stratospheric GW activity is a valid proxy for hurricane intensification

#### **Supporting Information:**

Supporting Information may be found in the online version of this article.

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# Stratospheric Gravity Waves as a Proxy for Hurricane Intensification: A Case Study of Weather Research and Forecast Simulation for Hurricane Joaquin

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**Abstract** We conducted simulations with a 4-km resolution for Hurricane Joaquin in 2015 using the weather research and forecast (WRF) model. The model data are used to study stratospheric gravity waves (GWs) generated by the hurricane and how they correlate with hurricane intensity. The simulation results show spiral GWs propagating upward and anticlockwise away from the hurricane center. GWs with vertical wavelengths up to 14 km are generated. We find that GW activity is more frequent and intense during hurricane intensification than during weakening, particularly for the most intense GW activity. There are significant correlations between the change of stratospheric GW intensity and hurricane intensity. Therefore, the emergence of intensive stratospheric GW activity may be considered a useful proxy for identifying hurricane intensification.

Plain Language Summary Accurate predictions of changes in hurricane intensity are essential to provide sufficient lead time for warning and evacuation. As a hurricane intensifies, gravity waves (GWs) are emitted into the stratosphere to partially rebalance the sudden energy changes. If a correlation between hurricane intensification and GWs is verified, observing stratospheric GWs with satellite instruments could provide a possible predictor of hurricane intensification. This approach is advantageous when clouds obscure the direct view from above by visible and infrared instruments into the inner state of the hurricane. This study uses mesoscale model simulations to test and verify the correlation between hurricane intensification and GWs and finds that stratospheric GW activity increases prior to peaks in hurricane intensity.

#### 1. Introduction

Tropical cyclones (TCs) are among the most destructive natural weather phenomena and can cause extensive damage to coastal countries and regions. Close monitoring and accurate forecasts of the tracks and intensity of TCs are needed to reduce human and financial losses.

Tropical cyclones are powered by latent heating, mainly from strong updrafts in the eyewall (Charney & Eliassen, 1964; Emanuel, 1986; Kuo, 1965), and latent heat release in the storm is responsible for the dynamical structure and intensity change of the storm (Braun, 2002; Cecil & Zipser, 1999). Latent heat release is also involved in generating stratospheric gravity waves (GWs) (Beres et al., 2004; Kuester et al., 2008; Song & Chun, 2005). Previous studies found a dependence of dominant phase speed and wavelengths of GWs on the depth of the latent heating in the troposphere (e.g., Alexander et al., 1995; Beres et al., 2004, 2002; Salby & Garcia, 1987). Thus, the spatial scale and temporal variation of heating rate determine the spectrum of GWs in the stratosphere (e.g., Alexander & Holton, 2004; Holton et al., 2002; Nicholls et al., 1991; Stephan & Alexander, 2015). Ground-based and satellite observations, reanalysis data, and model simulations have been widely used to study the characteristics of stratospheric GWs generated by convective systems, particularly TCs (e.g., Chane-Ming et al., 2010, 2019; Chow et al., 2002; Kim & Chun, 2010; Miller et al., 2015; Nolan & Zhang, 2017; Wu et al., 2018; Yue et al., 2014), and confirmed that the characteristics of GWs vary significantly as the intensity of TCs changes.

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Since stratospheric GW activity and TC intensity change are both driven by heating, recent works have suggested stratospheric GWs can be used as a proxy for intensity change (Hoffmann et al., 2018; Tratt et al., 2018). Model simulations have revealed that strong updrafts or convective bursts appear up to 3 hr before TC intensification (Hazelton et al., 2017). GWs with long vertical wavelengths generated by the deep latent heat can propagate to the stratosphere in less than one hour (Fritts & Alexander, 2003; Yue et al., 2013, 2014), and this means that intensive stratospheric GW activity could be a predictor for TC intensification on short-term time scales. Using 13.5 years of Atmospheric Infrared Sounder (AIRS) observations of stratospheric GWs, Hoffmann et al. (2018) found a statistically robust correlation that more intensive stratospheric GWs are observed during the intensification of TCs than during weakening. Wright (2019) presented a study of TC-induced GWs using the microwave limb sounder (MLS), the Sounding of the atmosphere using broadband emission radiometry (SABER), and the high-resolution dynamics limb sounder (HIRDLS). Despite different GW spectrum ranges revealed by the sounders, Wright (2019) found a similar result that GW amplitudes steadily increase before TCs reaching peak intensity. However, these relationships require further verification due to the coarse time and space sampling of these satellite observations.

Following the work of Hoffmann et al. (2018), this study conducts realistic model simulations of stratospheric GWs generated by hurricane Juaquin in 2015 to verify the statistical correlation revealed by long-term satellite observations and to examine the possibility to use GW activity as a proxy of hurricane intensity change.

### 2. Reanalysis and Observational Data

#### 2.1. ERA5 Reanalysis

In this study, we use ERA5 reanalysis data (Hersbach et al., 2020) to provide initial and boundary conditions for the WRF simulation of Hurricane Joaquin. The ERA5 reanalysis is produced using the European Centre for Medium-Range Weather Forecasts (ECMWF) IFS Cycle 41r2 model with 4D-Var data assimilation and has a horizontal resolution of 31 km ( $T_L639$  spectral grid). The data are provided at 137 vertical hybrid sigma-pressure levels with the top level at 0.01 hPa ( $\sim$ 80 km) as well as at the surface level. We retrieved hourly data at 0.25° × 0.25° horizontal sampling and all model levels from the ECMWF data archive. Although tropical cyclone intensities are often underestimated in earlier reanalyzes (Hodges et al., 2017), ERA5 better resolves mesoscale vertical motions both over the land and near the Intertropical Convergence Zone (ITCZ) (Hoffmann et al., 2019), which provides more accurate initial and boundary conditions for the simulations of hurricane intensity.

#### 2.2. Tropical Cyclone Track and Intensity Archive

The International Best Track Archive for Climate Stewardship (IBTrACS) (Knapp et al., 2010) was used to evaluate the track and intensity of Hurricane Joaquin in our model simulations. The IBTrACS data were compiled from Regional Specialized Meteorological Centers within the World Meteorological Organization and other national agencies, which compile and archive TC track data individually. The IBTrACS data provides 3 to 6-hourly track and intensity estimates of hurricanes.

#### 3. WRF Model Configuration

Successful reproduction of the TC track and intensity is crucial for simulating and evaluating the TC-induced GWs. A numerical simulation of Hurricane Joaquin was performed using the weather research and forecasting (WRF) model version 3.9.1 (Skamarock et al., 2008). To adequately reproduce the rapid intensification phase of Hurricane Joaquin, it is necessary to conduct simulations with sufficient horizontal resolution. Horizontal resolutions coarser than 3–4 km may fail to represent the physical processes critical to TC intensity evolution (Gentry & Lackmann, 2010; Kim & Chun, 2010). In this study, the simulation used a concurrent one-way nested configuration that featured a fixed outer domain (D01) with  $210 \times 105$  grid points and a vortex-following inner nested domain (D02) with  $201 \times 201$  grid points. The repositioning of D02 was calculated every 15 min. The grid spacings for D01 and D02 are 12 and 4 km, and the time steps for D01 and D02 are 12 and 4 s, respectively. A vertical domain with 90 sigma levels was set from the surface up to 1 hPa ( $\sim$ 49 km), and the topmost 5 km was established as a damping layer. The vertical grid spacing was about 500 m in the stratosphere. The simulation

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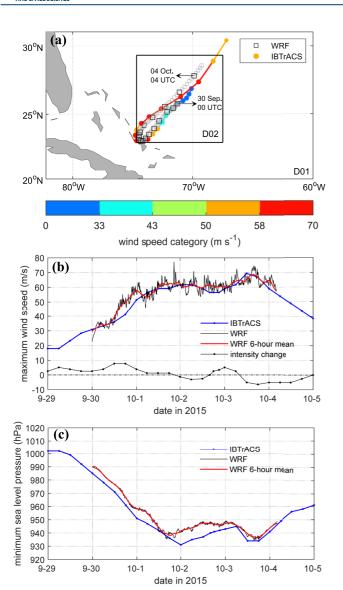


Figure 1. Comparison of the track and intensity of Hurricane Joaquin from weather research and forecast (WRF) model simulation and IBTrACS data. Panel (a) shows the hourly The International Best Track Archive for Climate Stewardship (IBTrACS) hurricane center positions (dots) from 00 UTC 29 September to 12 UTC 4 October, and WRF-simulated hurricane centers (squares) from 00 UTC 30 September to 04 UTC 4 October 2015, respectively. (b) Comparison of IBTrACS MSW and WRF-simulated MSFCW, where the 6-hourly intensity change is derived from IBTrACS data. (c) Comparison of IBTrACS and WRF simulated MSLP. In (b) and (c), the thin black lines indicate model outputs every 6 min, and the thin red lines indicate the 6-hr moving mean of the model outputs.

spans 100 hr from 00:00 UTC 30 September to 04:00 UTC 4 October 2015, and simulation outputs were stored every 6 min.

Initial and boundary conditions were established using the ERA5 reanalysis data. For both domains, the Kain-Fritsch scheme (Kain, 2004) for cumulus parameterization, the WRF single moment 6-class scheme (Hong & Lim, 2006) for microphysics, the new version of rapid radiative transfer model scheme (Iacono et al., 2008) for longwave and shortwave radiation, and the Yonsei University planetary boundary layer scheme (Hong et al., 2006) for the vertical diffusion process were applied. As in Kim and Chun (2010), GWs structures are not fully represented in model outputs from D01, so we emphasize analyzing the outputs from D02. D01 is only used to provide initial and lateral boundary conditions for the vortex-following D02.

#### 4. Results

#### 4.1. WRF-Simulated Track and Intensity of Hurricane Joaquin

Figure 1a shows the geographic region covered by D01 and the initial location of D02, and compares the WRF-simulated hurricane track with the hurricane track provided by IBTrACS. The WRF-simulated hurricane track reproduced the slow southwestward movement of Joaquin before it stalled near the Bahamas and eventually accelerated northeastward. Figures 1b and 1c compare the time series of hurricane intensity, represented by IBTrACS maximum sustained wind speed (MSW), versus maximum surface wind speed from the WRF simulation (referred to as MSFCW hereafter) and the IBTrACS versus WRF simulated minimum sea level pressure (MSLP). After a spin-up time of about 12 hr, the simulation results generally represent the hurricane intensity evolution well. Rapid intensification (i.e., MSW's change exceeding 15.4 m/s during 24 hr) is well reproduced until 18:00 UTC 1 October. The simulation results also reproduce the subsequent weakening, re-intensification, and second weakening of the hurricane. Please refer to the supplement for the verification of model parameters related to latent heating.

#### 4.2. Characteristics of GWs Generated by Joaquin 2015

As an example of the stratospheric GWs generated by Joaquin, Figures 2a–2c show GW features on a single level at 30 km altitude at 00:00 UTC 1 October 2015, when the hurricane was intensifying rapidly. Patterns in vertical velocity show tight spirals, similar to spiral GWs shown in the theoretical and idealized studies of Chow et al. (2002), Nolan and Zhang (2017), and Tratt et al. (2018). As seen in Figure 2a, under the influence of the easterly flow, the GWs show asymmetric patterns: the waves are suppressed downstream on the west side of the hurricane, and the wavefronts are compacted more closely on the east side. Mean zonal and meridional winds in the inner domain are shown in Figure 2b, and winds averaged from ERA5 data in the same area are also shown for comparison. At 30 km, the simulated mean zonal wind is about -10 m/s (i.e., easterly). GW activity and interactions

with the mean flow in the 4 km WRF model output are not entirely resolved in ERA5 data at this horizontal resolution of  $\sim$ 31 km, and so the discrepancy between the mean winds from the model and from ERA5 increases in the stratosphere.

GW vertical wavelengths and wave propagation angles (Figures 2c and 2d) are calculated by a 3D Stockwell transform method (Hindley et al., 2016, 2019; Wright et al., 2017). The wave propagation angles confirm that GWs propagate outward from the center in an anticlockwise manner. The peak vertical wavelength is about 10–14 km. As estimated from Figure 2a, at the altitude of 30 km, the horizontal wavelengths within 200 km of

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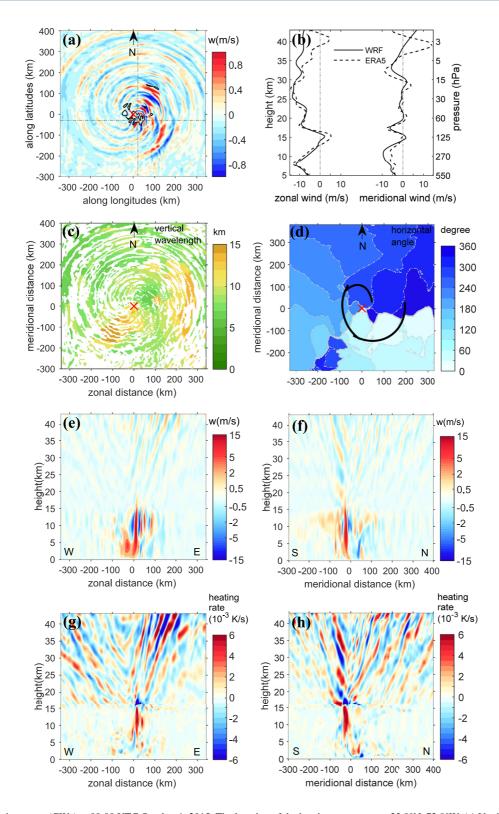
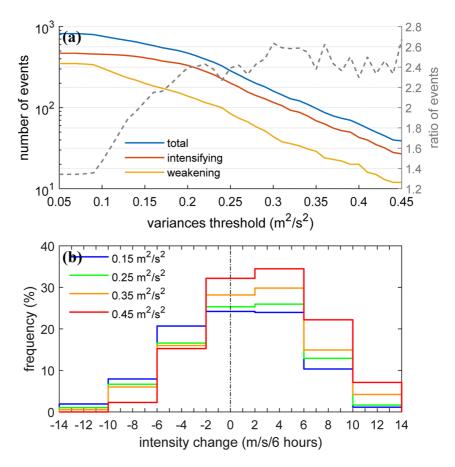


Figure 2. Features of gravity waves (GWs) at 00:00 UTC October 1, 2015. The location of the hurricane center was  $23.9^{\circ}$ N,  $72.9^{\circ}$ W. (a) Vertical velocities at 30 km (GWs with amplitude <0.1 m/s are excluded); the red cross denotes the hurricane center, and the black contours enclose regions where the 5–15 km net heating rate  $(\partial T/\partial t)$  exceed  $5 \times 10^{-4}$  K/s. The gray dot-dashed lines indicate the longitude and latitude the cross-sections in (e)–(h) are made. (b) Comparison of the simulated mean zonal and meridional wind in the inner domain with the same parameters derived from the ERA5 data. (c) Vertical wavelengths at 30 km. (d) Angles of horizontal propagation (clockwise from north) at 30 km. The black curve with an arrow schematically shows the direction of wave propagation. (e)–(f) Cross-section of WRF simulated vertical velocities. (g)–(h) Cross-section of WRF simulated net heating rate  $(\partial T/\partial t)$ . W, west; E, east; S, south; N, north.

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**Figure 3.** Occurrence frequency of stratospheric gravity waves (GWs) with respect to the hurricane intensity change. (a) The number of GW events associated with hurricane intensification or weakening for different minimum variance thresholds and the ratios of events during hurricane intensification to events during hurricane weakening (gray dashed line). (b) Frequency distribution of GWs intensity with respect to intensity change for selected variance thresholds.

the hurricane center are about 40 km. GWs with spectral characteristics such as this tend to propagate primarily vertically rather than horizontally, and as such propagation time from the troposphere to the stratosphere is usually less than 1 hr (Yue et al., 2014). Strong updrafts in the upper troposphere associated with TCs produce large heating rates, also called "hot towers" (Braun, 2002; Montgomery et al., 2006). The tropospheric net heating rates (here defined as temperature tendency,  $\partial T/\partial t$ ) larger than  $3 \times 10^{-3}$  K/s are mainly seen between 5 and 15 km, and net heating rates larger than  $5 \times 10^{-3}$  K/s between 10 and 15 km (Figures 2g and 2h) along with the tropospheric updrafts (Figures 2e and 2f).

#### 4.3. Occurrence Frequency of GW Events and Hurricane Intensity Change

Figure 3 presents an analysis of stratospheric GW occurrence frequency with respect to hurricane intensity change. The WRF simulation outputs were stored every 6 min, and the GW activity sampled at a 6-min interval is referred to as one GW event hereafter. Model outputs from the spin-up period (the first 12 hr) are excluded, leaving 880 events to be considered for statistical analysis. The intensity of stratospheric GWs is represented by the mean vertical velocity variance between 20 and 43 km. GW intensity varies as the hurricane intensifies and weakens. Figure 3a shows that 820 events had a vertical velocity variance larger than 0.05 m<sup>2</sup>/s<sup>2</sup>, 250 events had a variance larger than 0.25 m<sup>2</sup>/s<sup>2</sup>, and 32 events had a variance larger than 0.45 m<sup>2</sup>/s<sup>2</sup>. There is a clear separation in the number of GW events with respect to hurricane intensity change, with more GW events found during intensification than weakening. The distinction between intensification and weakening scenarios is particularly clear for the strongest GW events. The ratio of GW events during hurricane intensification to GW events during hurricane weakening increases from 1.34 at the threshold of 0.05 m<sup>2</sup>/s<sup>2</sup> to 2.67 at the threshold of 0.45 m<sup>2</sup>/s<sup>2</sup>. However, it should be kept in mind that for large variance thresholds, the ratios are calculated from smaller numbers of events,

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so they may exhibit larger fluctuations and uncertainties. Figure 3b shows that the probability distribution function with respect to the intensity change of the GW events is skewed toward hurricane intensification, particularly for stronger GWs.

Several sensitivity tests were conducted to confirm the results above:

- Results are consistent whether the 6-hr change of MSFCW or MSLP is used as a measure of hurricane intensity change
- 2. Results remain consistent if we use vertical velocity variances on each model level above 20 km, instead of mean variances of vertical velocities of all levels between 20 and 43 km as the intensity of GWs
- 3. Moreover, Joaquin is a well-organized hurricane with strong updrafts and large net heating rates in convective bands close to the center. Stratospheric GWs with high intrinsic frequencies and shorter horizontal wavelengths tend to appear close to the hurricane center, while GWs with low intrinsic frequencies and longer horizontal wavelengths are expected to propagate horizontally further away from the hurricane center (e.g., Alexander et al., 1995; Fritts & Alexander, 2003). Therefore, we also tested GWs within 200 and 300 km of the hurricane center. We found that the above conclusions are robust (i.e., stratospheric GW activity is more frequent and intensive when the hurricane is intensifying than when it is weakening). These results are consistent with the statistical analysis of GW event occurrence frequencies with respect to TC intensity change based on 13.5 years of AIRS observations shown by Hoffmann et al. (2018)

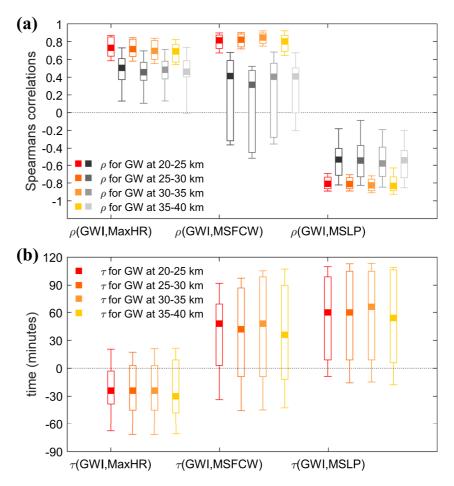
#### 4.4. Time-Lagged Correlations Between Stratospheric GWs Events and Hurricane Intensity

Since both TC intensity and features of TC-induced stratospheric GWs individually depend on latent heat release during convection, in this subsection, we analyze correlations between heat release, hurricane intensity, and stratospheric GW activity for the Joaquin case. Our analysis first focuses on GWs with long vertical wavelengths and thus fast vertical phase speeds that may propagate upward to the upper stratosphere in a short time (typically in less than 1 hr).

Mean vertical velocity variances between altitude ranges of 20–25, 25–30, 30–35, and 35–40 km are calculated as a proxy of GW intensity (referred to as GWI hereafter) at different altitude ranges. According to our simulations, large heat release generally appears between 5 and 15 km, so we define the maximum heating rate at 5-15 km (referred to as MaxHR hereafter) as an indicator of heat release due to the hurricane. The MSFCW and MSLP are considered as a proxy of hurricane intensity. We split the entire time series of the WRF simulation, excluding the first 12 hr of the spin-up period, into independent 6-hr segments starting from each model output at a 6-min interval. That makes 820 cases of 6-hr time series of GWI, MaxHR, MSFCW, and MSLP for the statistical analysis. We then calculate the Spearman rank-order correlation coefficients ρ of each pair of time series of GWI versus MaxHR/MSFCW/MSLP. Median values of ρ(GWI, MaxHR), ρ(GWI, MSFCW), and ρ(GWI, MSLP) are about 0.5, 0.4, and -0.6, respectively (Figure 4a, gray), which indicates a moderate level of correlations between GW activity, heat release, and hurricane intensity. This result agrees with the statistical correlation previously found between stratospheric GW activity and TC intensification based on 13.5 years of AIRS observations of stratospheric GWs (Hoffmann et al., 2018). A sensitivity test with respect to the length of the time series shows that the correlation slightly decreases as the length of the time series increases. For the entire time series, median values of ρ(GWI, MaxHR), ρ(GWI, MSFCW), and ρ(GWI, MSLP) are 0.32, 0.24, and -0.43, respectively (not shown). The correlation for the entire time series is slightly lower than that measured for Hurricane Joaquin by Hoffmann et al. (2018). This difference is reasonable because model output at a 6-min interval resolves more fluctuations than the 6-hourly observations in Hoffmann et al. (2018). Fluctuations weaken the monotonic relationship between two variable series and thus reduce the Spearman rank-order correlation level.

Considering that there may be a time lag of 0–3 hr between a large heat release and TC intensification, as shown in Hazelton et al. (2017), and that GWs take time to propagate to the stratosphere, we searched for the "best" time lag within a time window of  $\pm 6$  hr that produces the most significant time-lagged Spearman rank-order correlation coefficients for each 6-hr GWI time series. Correlations significantly increase when the time lag is considered: the median values of time-lagged  $\rho$ (GWI, MaxHR),  $\rho$ (GWI, MSFCW), and  $\rho$ (GWI, MSLP) are about 0.7, 0.8, and -0.8 (Figure 4a, orange), and the standard deviations of the correlation coefficients considerably decrease. The "best" time lag  $\tau$  found with this procedure is shown in Figure 4b. Negative values indicate GW intensity changes after the change of heat release represented by MaxHR, whereas positive values indicate GW

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**Figure 4.** Spearman correlation coefficients and time lag between variable series. Only values that have passed the significance test with 95% are kept. (a) Spearman correlation coefficients  $\rho$  between the GWI and MaxHR, MSFCW, and MSLP, respectively. The original  $\rho$  is marked in black and gray, and the time-lagged  $\rho$  is marked in orange. (b) The "best" time lag  $\tau$  between GWI and MaxHR, MSFCW, and MSLP, respectively. The box plot displays the minimum, first quartile (25%), median, third quartile (75%), and maximum values.

intensity varies before the hurricane intensity change as represented by MSFCW and MSLP. The median time lag values show that GW intensity follows the heating rate changes within about 24–30 min, and then the hurricane intensity changes about 36–60 min after the change of GW intensity.

As shown in Figure 4, GWs are triggered after latent heat release and propagate fast in the vertical direction. They can be observed in the stratosphere even before the hurricane intensity itself increases. However, note that there are large peak-to-peak ranges for the time lag in Figure 4b. This variation in the peak-to-peak range shows substantial complexity in the physical relations between latent heat release, hurricane intensity, and GW activity being involved. Therefore, further modeling and observational studies are needed to better understand this complexity and to establish that stratospheric GW activity is not only a proxy but also a reliable predictor of TC intensification. The supplement contains the Spearman correlation coefficients and time lag, same as in Figure 4 but separately for the intensification and weakening periods.

We conducted sensitivity tests to confirm the robustness of the above results:

- 1. The results are consistent if the 99th percentile, median, or mean value of the net heating rates between 5 and 15 km is used as the indicator of heat release
- 2. Time windows of ±3 and ±12 hr have been tested for the "best" time lag, and the results agree well with the above results with only minor differences of about 12–18 min in peak-to-peak ranges of the time lag
- 3. When all stratospheric GWs in the inner domain are considered (up to around 400–500 km from the hurricane center), the correlations between stratospheric GWs and hurricane intensity remain, but the median value

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of the "best" time lag is around 0. That is, only the fast-propagating GWs have the potential for predicting hurricane intensity

#### 5. Conclusions

In this study, we performed a mesoscale simulation of Hurricane Joaquin in 2015 using the WRF model to study the correlations between the features of the stratospheric GWs generated by the hurricane and the hurricane intensity. First, the simulated track and intensity of Joaquin were compared with the IBTrACS "best track" data, and the characteristic of the simulated stratospheric GWs was analyzed. It was found that the storm generated spiral GWs and that the GWs rotate and spread anticlockwise away from the hurricane center.

This study confirms that intensive stratospheric GW activity generated by a hurricane can be a proxy for the intensification of the hurricane itself. Analyses show a clear distinction of GW occurrence frequencies with respect to hurricane intensity change: stratospheric GW activity is more frequent and intensive when the hurricane intensifies rather than when it weakens. This phenomenon is particularly prominent for the strongest GW events. This result agrees with observational results found by Hoffmann et al. (2018) based on 13.5 years of AIRS observations and Wright (2019) based on 17 years of MLS, SABER, and HIRDLS observations of TC-induced GWs. Moreover, the correlation between the intensity changes of stratospheric GWs activities and the hurricane is more significant when the time lag is considered.

Measuring the internal structure and dynamics of TCs from space-based infrared sensors is typically not possible because the dense cloud coverage due to the TCs block the view of the instrumentation below cloud top. However, since the stratospheric GW signals that indicate the change of a TC are visible to passive infrared and microwave instruments (e.g., AIRS, Hoffmann & Alexander, 2010; Yue et al., 2013, the infrared atmospheric sounding interferometer [IASI] [Hoffmann et al., 2014], and MLS [Wright, 2019]), it is possible to monitor significant changes in TC intensity by observing GWs with passive infrared and microwave sounders. This proxy is particularly useful when a cloud canopy obscures the direct view to the TC center for other instruments.

However, it should be noticed that whether intensive stratospheric GW activity can be observed before TC intensification is also largely determined by dynamical and thermal variabilities in the TCs and the effects of the atmospheric background conditions on GW generation and propagation. In addition to latent heating, other factors that may link GW activity and TC intensity, such as the interaction of GWs and TC intensity evolution with the diurnal cycle of TC intensity (Dunion et al., 2014; Evans & Nolan, 2019), will be investigated in future studies.

#### **Conflict of Interest**

The authors declare no conflicts of interest relevant to this study.

## **Data Availability Statement**

The ERA5 reanalysis data (Copernicus Climate Change Service, 2017) were retrieved from ECMWF Meteorological Archival and Retrieval System (https://doi.org/10.24381/cds.adbb2d47 last accessed: 1 November 2021). IBTrACS data were obtained from National Centers for Environmental Information, National Oceanic and Atmospheric Administration (https://doi.org/10.25921/82ty-9e16 last accessed: 1 November 2021).

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