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# Wave resource characterization and co-location with offshore wind in the Irish Sea

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### 4 Abstract

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One barrier affecting progress in the wave energy sector is detailed knowledge of the spatiotemporal distribution of waves in shelf sea regions, including their 6 inter- and intra-annual variability. Here, a recent decade (2012 - 2021) of waves is simulated at high-resolution in the Irish Sea – a region with much 8 offshore energy infrastructure. The spectral wave model SWAN is forced with ERA5 wind fields. There is a strong seasonal cycle in wave height and 10 power. In all months except for July, large waves (significant wave height 11 greater than 5 m) can penetrate into the northern part of the Irish Sea, but 12 the most energetic region is the Celtic Sea, where monthly mean wave power 13 exceeds 30 kW/m in December. In this region, wave power strongly correlates 14 with the North Atlantic Oscillation (NAO) from September to March. To 15 investigate the potential for co-location, i.e. to reduce costs through shared 16 infrastructure, wave and wind power were compared at a leased floating wind 17 site in the Celtic Sea. Over the simulated decade,  $r^2 \sim 0.5$ , demonstrating 18 modest potential for co-location of wind and wave energy technologies in this 19 part of the Irish Sea – considerably less favourable than other sites in the 20 North Atlantic that experience greater swell. 21

- 22 Keywords: Spectral wave model, Wave energy resource, Climate,
- <sup>23</sup> Variability, Uncertainty, International Electrotechnical Commission

### 24 **1. Introduction**

Understanding the spatiotemporal distribution of waves in shelf sea regions, including their seasonal and inter-annual variability, is important for a range of applications and sectors. Knowledge of long term trends in waves, for example the frequency and magnitude of extreme events, contributes to

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our understanding of the impacts and mitigation of climate change [1, 2]. 29 Although tidal currents tend to dominate the transport of shelf sea sed-30 iments, particularly in sheltered regions, waves increase bed shear stress, 31 enhancing sediment resuspension and enabling (enhancing) suspended sed-32 iment transport by weak (strong) tidal currents [3]. The contribution of 33 waves to sediment dynamics can be used to assist mapping the evolution of 34 sea bed sediment distribution over extended time periods – in some cases 35 over thousands of years [4]. As well as affecting marine ecosystems and bio-36 diversity [5], waves affect many maritime activities such as transport and 37 offshore energy. Further, and the focus of this study, waves can be directly 38 exploited as a form of renewable energy conversion, and hence detailed infor-30 mation about their spatiotemporal distribution, including how wave power 40 varies within and between years, is important for resource assessment and 41 characterization [6, 7]. 42

This study focusses on the Irish Sea – a relatively shallow shelf sea en-43 vironment between Ireland and Great Britain. The Irish Sea experiences 44 complex wave dynamics that are influenced by a combination of local and 45 large-scale meteorological factors. Waves have played a critical role in shap-46 ing the Irish Sea since the Last Glacial Maximum [4], influencing sediment 47 transport, erosion and deposition patterns [8]. The wave climate in the Irish 48 Sea is influenced by a combination of factors, including prevailing wind pat-49 terns, storm tracks, and local variations in bathymetry/topography, leading 50 to significant temporal and spatial variability in wave properties across the 51 region. The waves in some regions of the Irish Sea interact with strong tidal 52 currents [9] and large tidal ranges [10], further complicating their spatiotem-53 poral variability. 54

Wave energy resource characterization, particularly at the early stages 55 of project development, is generally performed using numerical models, val-56 idated at discrete points in the model domain against in situ datasets, typi-57 cally sourced from limited existing wave buoy observations [11]. Since phase 58 resolving models are computationally expensive [12], such model assessments 59 are based on (phase averaged) spectral wave models. Various popular third 60 generation spectral wave models, such as WAVEWATCH III, SWAN and 61 WAM, adopt a similar approach [13, 14]; however, one consideration between 62 modelling frameworks is whether the grid is structured or unstructured, with 63 the majority of wave models having both options available. In this study, 64 since there is no focus on any particular region of the domain (as would 65 occur if a proposed wave energy array at a known geographic location was 66

to be investigated), a structured (curvilinear) grid is appropriate, providing 67 approximately consistent resolution throughout the study region. Resource 68 assessments can include the theoretical and/or technical resource, with the 69 latter applied once a technology type (or number of technology options) has 70 been selected. In this study, the focus is on theoretical resource assessment 71 (e.g. in units of available power per metre of wave crest, kW/m), since no 72 past study has provided such an assessment for the Irish Sea. However, the 73 outputs from the model, specifically significant wave height and energy wave 74 period, allow for the subsequent calculation of device specific wave power, 75 applying an available power matrix [15]. 76

While wave energy conversion holds promising potential to displace the 77 combustion of fossil fuels, it faces substantial technological challenges, mak-78 ing wave energy one of the more expensive renewable energy technologies 79 at present [16]. One way to reduce costs is to co-locate wave energy with 80 other maritime industries (e.g. aquaculture; [17]) or offshore energy tech-81 nologies (e.g. offshore wind; [18]). In addition to reducing the costs for each 82 technology, e.g. by sharing infrastructure, cabling and O&M programmes, 83 the combination of multiple renewable energy conversion resources has the 84 further advantage of providing a more balanced (aggregated) power output, 85 provided there is low correlation between the resources [19]. Whereas such 86 co-location potential has been demonstrated for other combinations of energy 87 technologies that rely on weather such as wind and solar [20], wind and wave 88 are more directly linked, since the wave climate relies on the wind climate. 89 Therefore, weaker correlation between wind and wave is found on sites that 90 are characterized by a substantial swell component, such as Lanzarote in the 91 Atlantic [21] and the west coast of Ireland [19]. Areas such as the relatively 92 enclosed (and hence less swell-dominated) North Sea have less potential for 93 wind/wave co-location [18] since the waves tend to be in phase with the lo-94 cal wind. In this study (Section 4.4) the potential for co-location of wind 95 and wave energy in the Irish Sea is investigated, since part of the region is 96 relatively exposed to the North Atlantic. 97

In this study, a modelling approach is used to understand the spatiotemporal distribution of wave properties and theoretical wave power throughout the Irish Sea, and the potential for co-location with wind in the most energetic regions. Although various wave models that incorporate the Irish Sea have been developed at various spatial and temporal scales (e.g. [22, 23]), and these models are/were generally suited to their purpose, there are still a few areas that need to be addressed. One product that incorporates the

Irish Sea is the Atlantic-European North West Shelf-Wave Physics Reanal-105 ysis dataset<sup>1</sup>. This dataset is based on the WAVEWATCH III model [24], 106 with a model resolution of  $1/33 \times 1/74^{\circ}$  (approximately 1.5 km), forced by 107 ECMWF ERA5 wind fields [25]. Although such a resolution can be use-108 ful for many applications, it does not facilitate the investigation of subtle 109 spatial changes in wave climate, for example as required for micro-siting of 110 wave energy convertors [26]. In addition, as few models are developed for 111 the specific purposes of wave energy resource assessment, wave energy period 112 is rarely output as a variable, nor is the full wave spectrum routinely used 113 to calculate wave power. Finally, a recent decade needs to be investigated, 114 improving on studies published over a decade ago that encompass the Irish 115 sea (e.g. [27]). The methodology in this study adheres to the IEC (Interna-116 tional Electrotechnical Commission) Technical Specification 62600-101 [11], 117 following a Class 2 (feasibility) resource assessment. A Class 2 resource as-118 sessment is the level of assessment conducted prior to undertaking a design 119 level assessment. 120

#### 121 2. Study region – the Irish Sea

The Irish Sea has overall dimensions of around  $200 \times 400$  km. It connects 122 to the Celtic Sea in the south through St. George's Channel, and to the 123 Malin Sea in the North through the North Channel (Fig. 1a). There are 124 two large islands in the Irish Sea (the Isle of Man and Anglesey) along with 125 numerous smaller islands. There is a deeper channel along the west of the 126 Irish Sea, with shallower regions to the east such as Liverpool Bay. The 127 deepest part of this main channel is 250 m (found in the North Channel), 128 but typical depths are around 100 m. Water depths are generally 20 - 40 m 129 in the shallower regions to the east. 130

The Irish Sea experiences some of the largest tidal ranges in the world, with a (mean) spring tidal range of 12 m at Avonmouth in the Severn Estuary. Tidal ranges are also large in Liverpool Bay (e.g. 10 m in Liverpool), but there are also regions in the west (Arklow – near Dublin) where tidal range is close to zero due to the presence of an amphidromic point [28]. Some regions are associated with very strong tidal currents, particularly where the currents flow around islands and headlands. Spring depth-averaged current

<sup>&</sup>lt;sup>1</sup>https://doi.org/10.48670/moi-00060

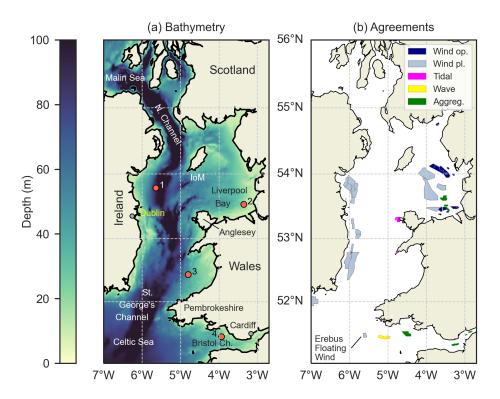


Figure 1: Irish Sea. (a) Bathymtery in metres relative to mean sea level. Red circles are locations of wave buoys used for model validation: 1=AFBI 038A, 2=Liverpool Bay, 3=Cardigan Bay, 4=Scarweather. IoM = Isle of Man. (b) Offshore agreements for wind energy (op. = operational, pl. = planned), tidal stream energy, wave energy, and the extraction of marine aggregates. The location of Erebus Floating Wind Demo is highlighted in (b) as it is used for the co-location analysis presented in Section 4.4.

speeds exceed 2.5 m/s in the Skerries to the northwest of Anglesey [29] and
in Ramsey Sound off the coast of Pembrokeshire [30].

The Irish Sea is host to much offshore energy activity including present and future wind farms, planned tidal stream and tidal range projects, and wave energy arrays (Fig.1b). All tidal and wave projects are in the process of development, but 13 wind sites, covering 449 km<sup>2</sup> of seabed, are currently operational. Many additional wind energy sites are at various stages of planning, covering a further 3118 km<sup>2</sup> of sea bed.

#### <sup>146</sup> 3. Methods

The third-generation spectral wave model SWAN (Simulating WAves 147 Nearshore) was used to simulate wave climates over the North Atlantic, and 148 within the Irish Sea. SWAN is an Eulerian formulation of the discrete wave 140 action balance equation [31]. The model is spectrally discrete in frequencies 150 and directions, and the kinematic behaviour of the waves is described by 151 the linear theory of gravity waves. SWAN accounts for wave generation by 152 wind, non-linear wave-wave interactions, whitecapping, and the shallow wa-153 ter effects of bottom friction, refraction, shoaling, and depth-induced wave 154 breaking. 155

The evolution of the action density  $(N = E/\sigma)$  is governed by the wave action balance equation which, in spherical coordinates, is

$$\frac{\partial N}{\partial t} + \frac{\partial c_{\lambda} N}{\partial \lambda} + \frac{\partial c_{\phi} N}{\partial \phi} + \frac{\partial c_{\sigma} N}{\partial \sigma} + \frac{\partial c_{\theta} N}{\partial \theta} = \frac{S_{tot}}{\sigma}$$
(1)

where E is spectral energy density,  $\sigma$  is angular frequency,  $\theta$  is wave direction,  $c_{\lambda}$  and  $c_{\phi}$  are the propagation velocities in the zonal ( $\lambda$ ) and meridional ( $\phi$ ) directions,  $c_{\sigma}$  and  $c_{\theta}$  are the propagation velocities in spectral space, and  $S_{tot}$  represents the source terms, i.e. generation, dissipation, and non-linear wave-wave interactions.

Version 41.31 of SWAN was run in third-generation mode, with Komen linear wave growth and whitecapping, and quadruplet wave-wave interactions. SWAN default formulations and coefficients were used for all of the physical processes.

167 3.1. Data

168 3.1.1. Wind data

<sup>169</sup> Wind data for model forcing was ERA5 – a reanalysis product generated <sup>170</sup> by ECMWF [25]. 10 m components of wind speed (northward and eastward) <sup>171</sup> were extracted 3-hourly over both model domains (outer North Atlantic and <sup>172</sup> inner Irish Sea) at a spatial resolution of  $1/4 \times 1/4^{\circ}$ . For the co-location <sup>173</sup> analysis presented in Section 4.4, wind speeds at 100 m height were extracted <sup>174</sup> (to calculate wind power) as this is more consistent with the hub height of <sup>175</sup> wind turbines.

#### 176 *3.1.2. Bathymetry*

Bathymetry at both model scales was interpolated to the model grid points from GEBCO, available at a resolution of 15 arc-seconds.

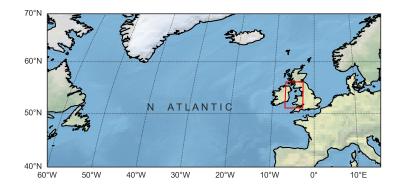


Figure 2: Outer model domain of the North Atlantic wave model. Red box is nested (Irish Sea) region.

179 3.1.3. Wave buoy data

Wave data used for model validation was extracted from Cefas-Wavenet.
The data was hourly, and two different years were used for the validation –
2012 and 2020.

#### 183 3.2. Outer Atlantic model

Initially, an outer model of the North Atlantic was run, extending from 184 60°W to 15°E, and 40°N to 70°N (Fig. 2). This model has a spatial resolution 185 of  $1/6 \times 1/6^{\circ}$ . Spectral (directional) resolution of this outer model was 8° (i.e. 186 45 azimuthal directions). Discretized frequencies were in the range 0.04 - 2.0187 Hz, logarithmically distributed into 40 intervals. Three-hourly ERA5 wind 188 fields were used to force this model, which was run for a full decade (2012-180 2021) at a time step of 15 minutes. Since the Irish Sea is sufficiently far 190 from the boundary (Fig. 2), no boundary conditions were applied to the 191 North Atlantic model. However, two-dimensional action density spectra were 192 output every hour along the boundaries of the Irish Sea nested model at a 193 resolution of  $1/12 \times 1/12^{\circ}$  – a suitable compromise between outer and inner 194 model resolutions. 195

#### 196 3.3. Nested Irish Sea model

<sup>197</sup> The nested Irish Sea model extended from 7°W to 2.7°W, and 51°N to <sup>198</sup> 56°N (Fig. 1a). This model was developed on a curvilinear grid, with 516 × <sup>199</sup> 1011 grid points (i.e. approximately a resolution of  $1/120 \times 1/202^{\circ}$  – a <sup>200</sup> resolution that is consistent with IEC Technical Specification 62600-101 for <sup>201</sup> a Class 2 resource assessment [11]). The Irish Sea grid is described further

Station	Lat	Lon	Year	Useable (%)	$R^2$	RMSE (m)	S.I.~(%)	Bias (m)
AFBI 038A	$53^{\circ}47'.03N$	$5^{\circ}38'.20W$	2020	100	0.939	0.241	20.44	-0.149
Liverpool Bay	$53^{\circ}32'.00N$	$3^{\circ}21'.20W$	2012	100	0.930	0.247	29.61	-0.173
Cardigan Bay	$52^{\circ}26'.00N$	$4^{\circ}48'.00W$	2020	98.8	0.948	0.262	17.46	-0.102
Scarweather	$51^{\circ}26'.00\mathrm{N}$	$3^{\circ}56'.00W$	2012	100	0.884	0.239	20.01	-0.045

Table 1: Details of model validation for  $H_s$ . RMSE is the Root Mean Square Error, and S.I. is Scatter Index.

<sup>202</sup> in Lewis et al. [10]. The spectral resolution of this model was identical to <sup>203</sup> the outer model of the North Atlantic. In addition to the boundary forcing <sup>204</sup> from the outer model, the inner nest was also forced by three hourly ERA5 <sup>205</sup> wind fields. The Irish Sea model was again run for a decade (2012 - 2021) <sup>206</sup> at a time step of 2 minutes. Model variables such as significant wave height <sup>207</sup> ( $H_s$ ), energy wave period ( $T_e$ ), and wave power (calculated using the full <sup>208</sup> wave spectrum) were output at the model grid points every three hours.

#### 209 3.4. Validation

The inner nested model was validated at four contrasting locations through-210 out the Irish Sea (Fig. 1a), using one year of hourly<sup>2</sup> wave buoy data at each 211 location. Two of the locations (Liverpool Bay and Scarweather) were vali-212 dated throughout 2012, and the other two locations (AFBI 038A and Cardi-213 gan Bay) throughout 2020. Agreement between the observations and model 214 are plotted for  $H_s$  in Fig. 3, and further details of the validation are pro-215 vided in Table 1. The validation is an improvement on other, coarser, model 216 studies that incorporate the study region, such as a  $1/24 \times 1/24^{\circ}$  SWAN 217 model of the NW European shelf, forced by ERA-Interim wind fields [27]. 218 For that model, the  $H_s$  error metrics calculated for the year 2005 in the mid-219 dle of the Irish Sea – approximately mid-way between the Cardigan Bay and 220 AFBI 038A wave buoys – were RMSE=0.31 m, Scatter Index (S.I.)=25%, 221 and Bias=-0.16 m. 222

#### 223 4. Results

The results focus initially on the fundamental wave properties  $-H_s$ ,  $T_e$ and wave direction – before examining wave power. The results consider both intra- and inter-annual variability.

<sup>&</sup>lt;sup>2</sup>The hourly wave buoy data were interpolated to the three hourly model output.

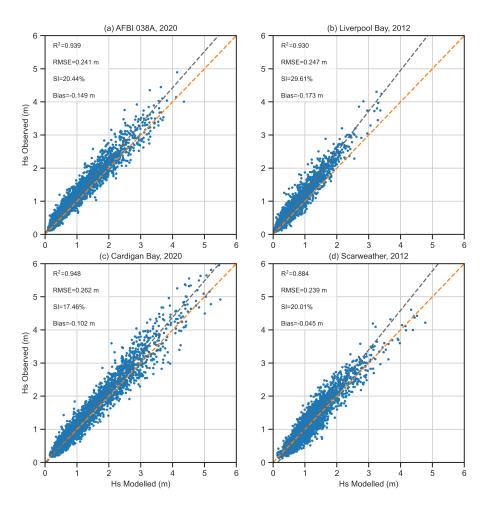


Figure 3: Validation of  $H_s$  over one year. Dashed orange line is x = y, and dashed grey is line of best fit. Locations of observations shown on Fig. 1a.

#### 227 4.1. Wave height, period and direction

The spatiotemporal distribution of  $H_s$  is shown as an annual cycle of 228 monthly means averaged over all 10 years of simulation (Fig. 4). Given the 229 location of the Irish Sea relative to the North Atlantic, there is a strong sea-230 sonal cycle of  $H_s$ , with more energetic autumn/winter months (January to 231 March and October-December) compared to spring/summer months. Mini-232 mal wave energy propagates into the Irish Sea via the North Channel, but 233 swell waves from the Atlantic penetrate from the south (through St. George's 234 Channel) as far as Anglesey, particularly when supplemented by local winds. 235 The largest wave heights are experienced in the Celtic Sea, where the Febru-236 ary mean (for example)  $H_s$  is around 3 m. Examining the most energetic 237 year within each month (Fig. 5), it is possible to experience large waves 238 (maximum values of  $H_s$  exceeding 5 m) in the northern part of the Irish Sea 239 under certain conditions in all months other than July. Examining Febru-240 ary 2014 in more detail, the atmospheric conditions that resulted in this 241 energetic month consist of repeated low pressure systems generated in the 242 Atlantic propagating across the UK (Fig. 6). Peak wind speed during this 243 month was 32.5 m/s or 63 knots (4 February 2014 09:00). Some areas that 244 are persistently sheltered from waves include the north Wales coast and the 245 Severn Estuary (i.e. upstream of the Bristol Channel) – Fig. 5. To compare 246 with a previous WAM modelling study that ecompasses the Irish Sea, the 247 maximum value of  $H_s$  simulated by a WAM model in Liverpool Bay from 248 1996 - 2006 was 5.63 m (1997) [32] – comparable to the maximum values in 240 this region calculated in the current study (Fig. 5). 250

Energy wave period generally follows the distribution of wave heights (Fig. 7). Longer period (swell waves) are associated with more exposed locations close to the Celtic Sea, where monthly mean wave periods during winter months are around 8 s, reducing to around 5-6 s in the summer. In the northern part of the Irish Sea, average wave periods are typically 4-5s at all times of the year.

The mean and maximum  $H_s$ ,  $T_e$  and  $P^3$  over the entire decade of simulation are shown in Fig. 8. In the Celtic Sea, the maximum wave height and period are around 10 m and 16 s, respectively. Applying

$$P_{deep} = \frac{\rho g^2}{64\pi} H_s^2 T_e \tag{2}$$

 $<sup>^{3}</sup>$ Calculated using the full wave energy spectrum – see Section 4.2.

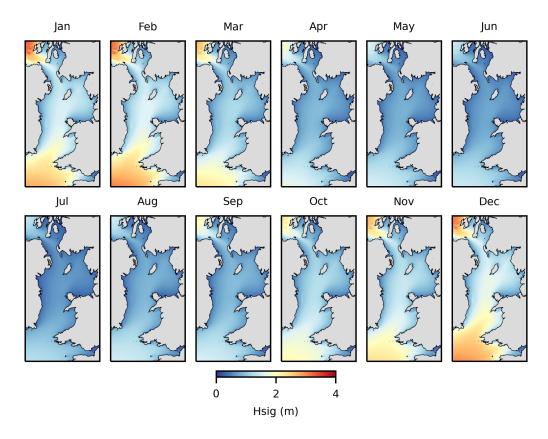


Figure 4: Annual cycle of monthly mean significant wave height averaged over all 10 years (climatological monthly wave height).

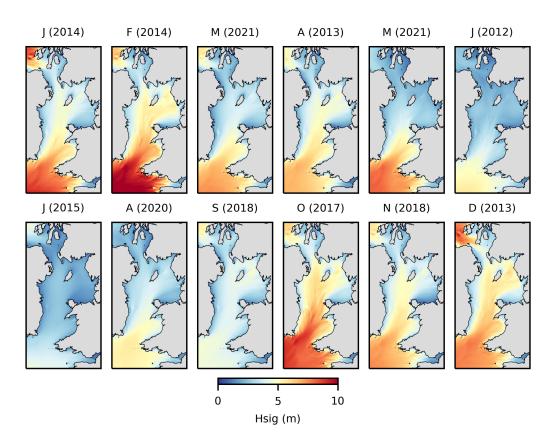


Figure 5: Most energetic years for each month of the year plotted as Hsig. For each month, the most energetic year is given in brackets.

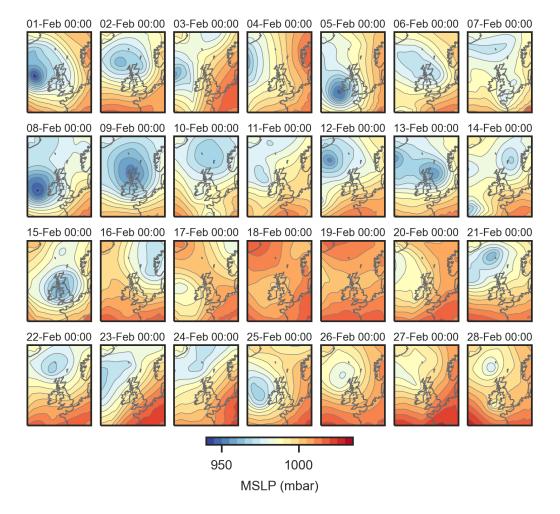


Figure 6: Isobars of mean sea level pressure (in mbar) every 24 hours throughout February 2014 – the month with the largest wave heights over the simulated decade (Fig. 5).

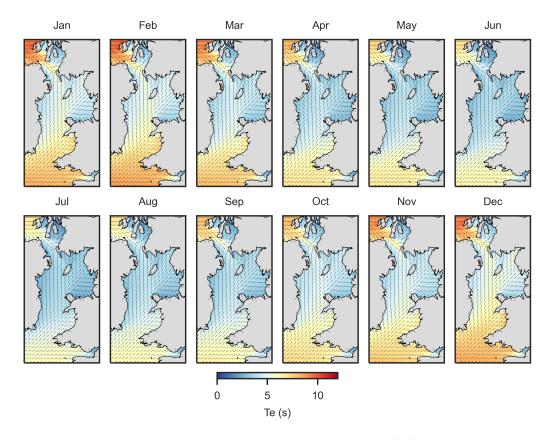


Figure 7: Annual cycle of monthly mean energy wave period  $(T_e)$  and wave direction (shown as unit vectors based on the direction of mean energy transport).

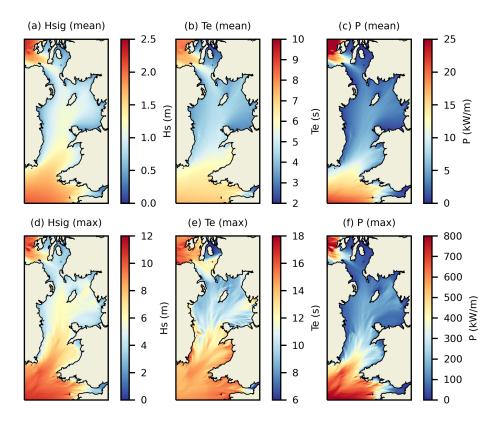


Figure 8: Distribution of mean and peak  $H_s$ ,  $T_e$  and P over the entire decade of simulation. P is directly output from the SWAN model, based on the full wave energy spectrum.

gives a wave power of around 800 kW/m, i.e. corresponding to the peak value in panel (f). Wave power is examined in more detail in the following sections.

#### 263 *4.2.* Wave power

The components of wave power (i.e. wave energy flux) were evaluated internally by SWAN, using

$$P_{\lambda} = \rho g \int \int c_{\lambda} E(\sigma, \theta) d\sigma d\theta \tag{3}$$

266 and

$$P_{\phi} = \rho g \int \int c_{\phi} E(\sigma, \theta) d\sigma d\theta \tag{4}$$

The annual cycle of monthly mean wave power (i.e. climatological monthly wave power) is shown in Fig. 9. The distribution has much in common with the distribution of  $H_s$ , but since wave power is a function of wave height squared (in addition to wave period), the regions of high wave power are more localized, particularly within the Celtic Sea. Again, there is a strong seasonal trend, with January, February and December (i.e. winter months) associated with high wave power. Wave power is minimal from months April to September.

<sup>275</sup> Uncertainty was calculated using

uncertainty 
$$=\frac{ts}{\sqrt{n}}$$
 (5)

where s is the standard deviation, and t = 1.833 is Student's t-value at a confidence level of 90% for n = 10 samples (i.e. 10 years). Uncertainty in monthly wave power is shown in Fig. 10, focussing only on the six most energetic months (January to March and October to December). The highest uncertainty occurs during February, followed by December. Expressing uncertainty as a percentage of the mean, February stands out, followed by December.

The decadal mean wave power over a large portion of the Irish Sea is 283 relatively low – in the range 5 - 10 kW/m (Fig. 8c). This is similar to the 284 wave energy resource that is found to the east of Orkney (i.e. the region that 285 is sheltered from the North Atlantic) [6] and most of the Mediterranean [33]. 286 The mean winter resource in the majority of the Irish Sea rarely exceeds 20 287 kW/m (Fig. 10), and so the main part of the Irish Sea is highly unlikely 288 to support wave energy conversion beyond the testing of scaled prototypes. 289 However, in common with previous, albeit coarser, model studies of wave 290 power that encompass the Irish Sea (e.g. [27]), the most energetic region is 291 the Celtic Sea. In this region, the decadal mean wave power is around 20 292 kW/m (Fig. 8c), with typical winter means of 30-40 kW/m (Fig. 10). These 293 values are comparable to the west coast of Orkney, at the location of the 294 highly successful EMEC (European Marine Energy Centre) grid-connected 295 wave energy test site [34]. It should be noted that instantaneous wave power 296 can exceed 800 kW/m in the Celtic Sea (Fig. 8f), and so devices would 297 require a survivability mode [35]. 298

#### 299 4.3. North Atlantic Oscillation (NAO)

Many studies have investigated the impacts of natural climate variability on regional or global ocean waves [36]. Key to these studies are climate indices such as the Arctic Oscillation (AO) and North Atlantic Oscillation

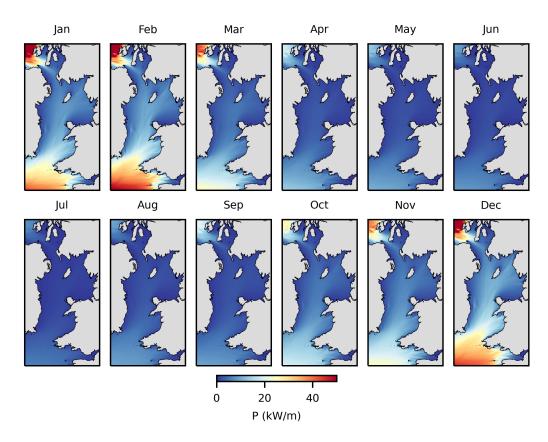


Figure 9: Annual cycle of monthly mean wave power averaged over all 10 years (climato-logical monthly wave power).

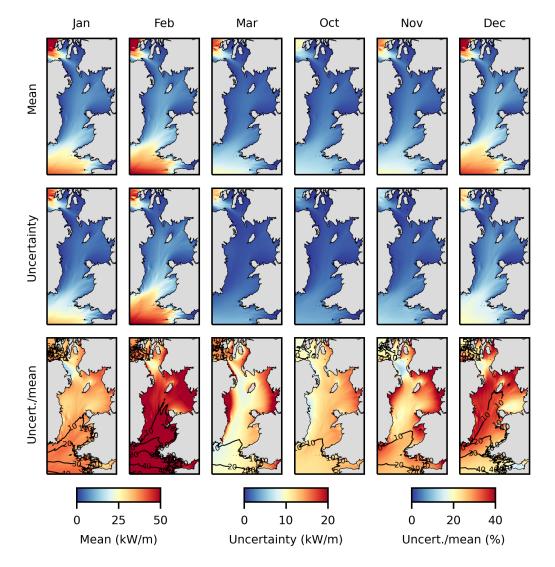


Figure 10: Monthly distribution of mean wave power, wave power uncertainty (90% confidence), and uncertainty expressed as a percentage of mean wave power. Contour values on the bottom panels show mean wave power (i.e. the same data represented in the top row of subplots). Focus is only on the more energetic months (January–March and October– December).

(NAO). The NAO is a climatic phenomenon characterized by fluctuations 303 in atmospheric pressure between the subtropical high over the Azores and 304 the Icelandic Low [37]. The NAO exhibits variability over interannual and 305 decadal timescales. Positive NAO phases are associated with stronger west-306 erly winds and milder winters in northern Europe, while negative phases are 307 associated with weaker westerlies and colder winters. Previous studies have 308 demonstrated that there is a strong correlation between the NAO and wave 309 power in the North Atlantic [38] and in the waters to the north of Scotland 310 [39]. If such a relationship is established for a region or location, this would 311 allow trends in wave power to be explored over long time periods. This re-312 lationship is explored here for the most energetic region in the study area – 313 the Celtic Sea. 314

Wave power was averaged over the region 7°W to 5°W and 51°N to 52°N, 315 capturing the Celtic Sea. Monthly mean wave power over this region was 316 compared against monthly NAO values available from https://crudata. 317 uea.ac.uk/cru/data/nao/ – an update of the dataset described by Jones 318 et al. [40]. The correlation between NAO and monthly means is shown in 319 Table 2. A threshold of  $r \ge 0.5$  was chosen to select only those times of the 320 year when there was a relatively strong relationship between the monthly 321 mean NAO and wave power; therefore only those months where r > 0.5322 are highlighted in **bold** on the table, corresponding to the period September 323 to March (including the January anomaly where r = 0.403). The relation-324 ship is not as strong as that reported in the north of Scotland by Mackay 325 et al. – they observed a relatively strong and positive relationship over all 326 months of the year. Here, the continuous period September to March was 327 used to establish a trend between the NAO and monthly mean wave power 328 (Fig. 11). The strength of the relationship over these months is r = 0.609329  $(r^2 = 0.371)$ , increasing slightly to r = 0.623  $(r^2 = 0.389)$  if the January out-330 lier is removed. Therefore, during the months September through to March, 331 higher (positive) NAO values, characterized by stronger westerlies (associ-332 ated with milder temperatures), results in higher wave power in the Celtic 333 Sea. In contrast, lower (i.e. strongly negative) NAO values are characterized 334 by weaker westerly winds (associated with colder temperatures), and hence 335 reduced wave power in the Celtic Sea. 336

#### 337 4.4. Co-location

By developing multiple renewable energy technologies at a single location (co-location) it could be possible to reduce variability in power output and

Month	r
January	0.403
February	0.670
March	0.617
April	0.355
May	-0.087
June	0.040
July	-0.401
August	-0.128
September	0.810
October	0.674
November	0.659
December	0.584

Table 2: Linear Pearson correlation coefficient (r) between monthly NAO and monthly mean wave power averaged over the Celtic Sea (7°W to 5°W and 51°N to 52°N). Those months with  $r \ge 0.5$  are highlighted in bold, but note that the continuous autumn-winterearly spring period (September to March) was used for the analysis presented in Fig. 11.

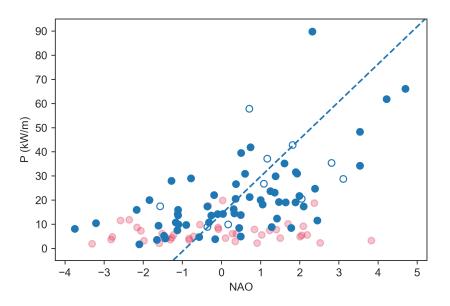


Figure 11: Relationship between monthly NAO index and monthly mean wave power in the Celtic Sea. The dashed trend line  $(r^2 = 0.389)$  is based on months February, March, September, October, November, December (filled blue circles) and January (open blue circles). Other months are shown as red circles.

reduce overall costs due to shared infrastructure [41]. However, regions are only candidates for co-location if there is a weak correlation between the two (or more) energy resources, otherwise there are no particular benefits in diversifying energy conversion technologies, particularly when one technology (e.g. wave) is considerably more expensive than the other (e.g. offshore wind). Co-location potential was investigated for the most energetic region in the study area – the Celtic Sea.

The primary renewable energy technology in this region is likely to be offshore wind; therefore the detailed wind energy resource was examined at the Erebus Floating Wind Demo site in the Celtic Sea (Fig. 1b) and it was assumed that wave energy technology could at some stage be incorporated into this location. Only theoretical power was considered for both resources – the wave power was based on the full wave spectrum output from the SWAN model (Section 4.2), and the power density of wind was calculated using

$$\frac{P}{A} = \frac{1}{2}\rho U_{100}^3 \tag{6}$$

where A is the swept area of the rotor,  $\rho$  is air density, and  $U_{100}$  is the 354 instantaneous (3 hourly) wind speed 100 m above sea level (available as a 355 variable directly from ERA5). Variability in power was considered over the 356 entire decade of the wave simulations (2012 - 2021). Typical time series 357 (where power is normalized by the maximum over the year) is shown for 358 2012 (Fig. 12). In this sample time series, there are times when wind and 359 wave are very clearly in phase (e.g. the large events around 3-6 January), 360 and time periods when wind and wave are out of phase (e.g. 26-27 January). 361 Since both resources are seasonal, correlation coefficients were calculated for 362 each month, capturing all 10 years of simulation over each calendar month 363 (Table 3). The  $r^2$  is relatively consistent across all months, with a mean 364 value of 0.502, but with perhaps more potential for co-location during the 365 months of April  $(r^2 = 0.393)$  and September  $(r^2 = 0.421)$ . Calculating the 366 cross-correlation (Fig. 13), there is a lag of around 3 hours between wind 367 and wave. Therefore, in the Celtic Sea region, there is moderate potential 368 for co-location between wind and wave – much less so than other regions of 369 the North Atlantic such as Lanzarote (Canary Islands) where the correlation 370 coefficient is consistently low  $(r^2 < 0.1)$  due to a strong swell component [21]. 371

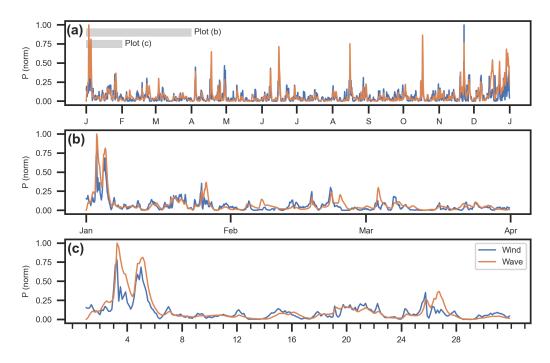


Figure 12: Time series of (normalized) theoretical wind and wave power at the Erebus Floating Wind Demo site in the Celtic Sea during 2012.

Month	$r^2$
January	0.444
February	0.503
March	0.442
April	0.393
May	0.497
June	0.519
July	0.482
August	0.581
September	0.421
October	0.479
November	0.472
December	0.479
Entire record	0.502

Table 3: Correlation coefficient squared  $(r^2)$  between wind and wave power at Erebus Floating Wind Demo during each month (entire 10 year simulation).

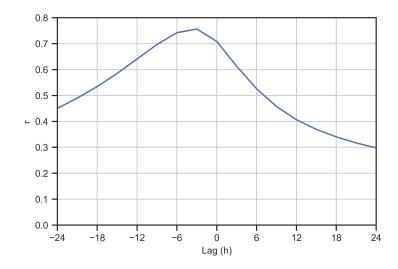


Figure 13: Cross-correlation between wind and wave power at Erebus Floating Wind Demo over the entire 10 year simulation. The maximum correlation was found at -3 h, demonstrating that in general peak wind power leads peak wave power by around 3 h.

#### 372 5. Conclusions

This model study has provided insights into the spatiotemporal distribu-373 tion and variability of wave properties and wave power in the Irish Sea, with 374 a particular focus on the energetic Celtic Sea region. The results revealed a 375 distinct seasonal pattern in wave properties, with larger waves and enhanced 376 theoretical wave power during autumn and winter months, attributed to 377 more energetic atmospheric conditions and swell waves propagating from the 378 North Atlantic. The Celtic Sea is the most energetic region in the study 379 area, with a mean December wave power that exceeds 30 kW/m. 380

The study investigated the relationship between wave power and the North Atlantic Oscillation (NAO), which exhibited a relatively strong correlation during the period September to March. This relationship highlights the potential for using climatic indices like the NAO to predict long-term trends in wave power, facilitating strategic planning for renewable energy applications in regions such as the Celtic Sea.

Examining co-location potential for renewable energy technologies, considering wave and offshore wind, the Celtic Sea demonstrated moderate suitability due to a 3 h lag between wind and wave events. Although the potential for co-location was found to be less promising compared to other regions of the North Atlantic, this finding could be useful for optimizing the renewable
 energy mix and reducing costs through shared infrastructure.

Although the study is robust, there are a few ways that it could be im-393 proved, i.e. possible areas for future work. Although the priority was to 394 simulate a recent decade, extending the analysis to a longer time period (e.g. 395 several decades) would provide an understanding of how wave power in the 396 Irish Sea has changed over time, for example as a result of climate change. 397 The study focussed on the theoretical resource, but extending to the technical 398 resource, particularly in the Celtic Sea, would further help developers con-390 verge on a particular technology type. Finally, the (1D and 2D) wave spectra 400 output from the model could be examined in more detail – interesting ex-401 tensions could be spectral validation against wave buoys, and characterizing 402 bi-modal sea states. 403

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### 411 Data availability

Model bathymetry, wind forcing and validation data are all publicly available from the sources described in the text. The outputs from the wave model are available on reasonable request, noting that the data size is around 1 TB.

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