



Maynooth Wave Energy
Workshop 2026



Realistic energy-maximising control of cyclorotor wave energy converters using estimator, predictor, and nonlinear MPC.

MaxRotorWEC project

Ilias Stasinopoulos¹, A. Ermakov¹, J.V. Ringwood¹.

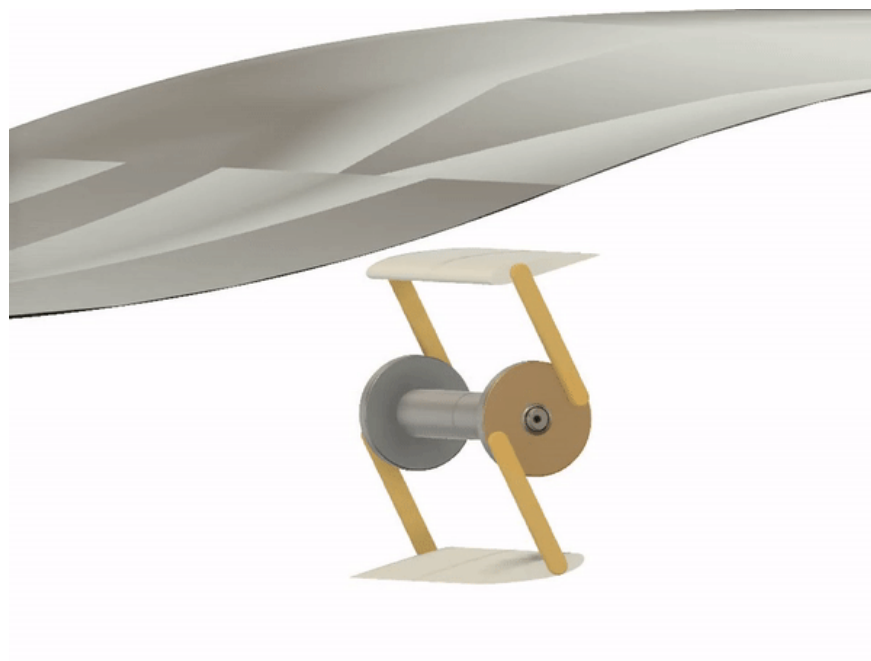
January 23, 2026

¹Centre for Ocean Energy Research, National University of Ireland Maynooth.

1. Introduction
2. Mathematical model
3. Performance metric
4. Realistic control system for a cyclorotor WEC
5. Results
6. Conclusions and discussion

Introduction

The **cyclorotor** is a relatively new direction for **Wave Energy Converters (WECs)**, which obtains energy from the generation of significant lift forces on rotating hydrofoils caused by the elliptical motion of water particles.



Appealing characteristics:

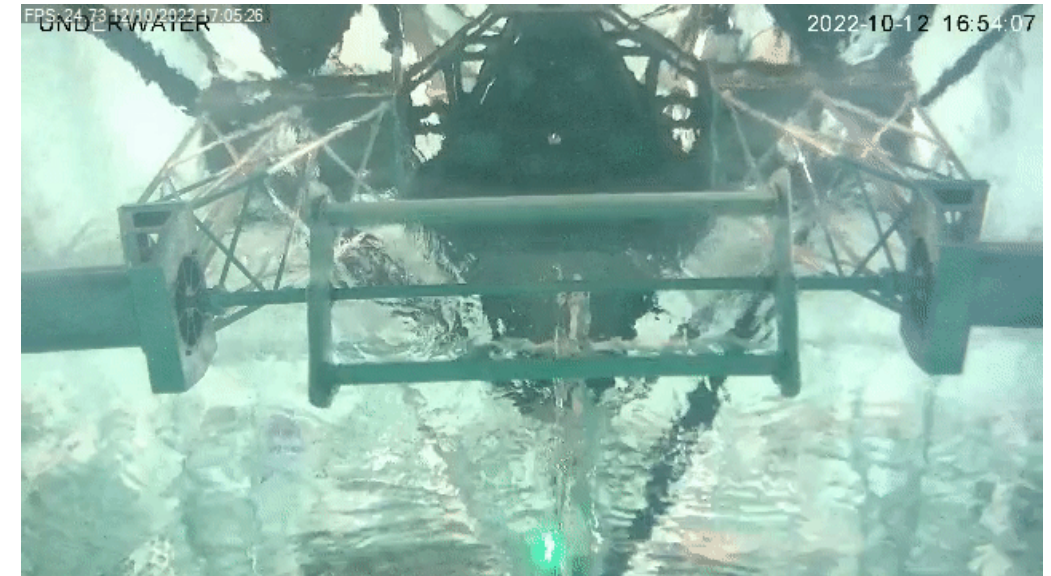
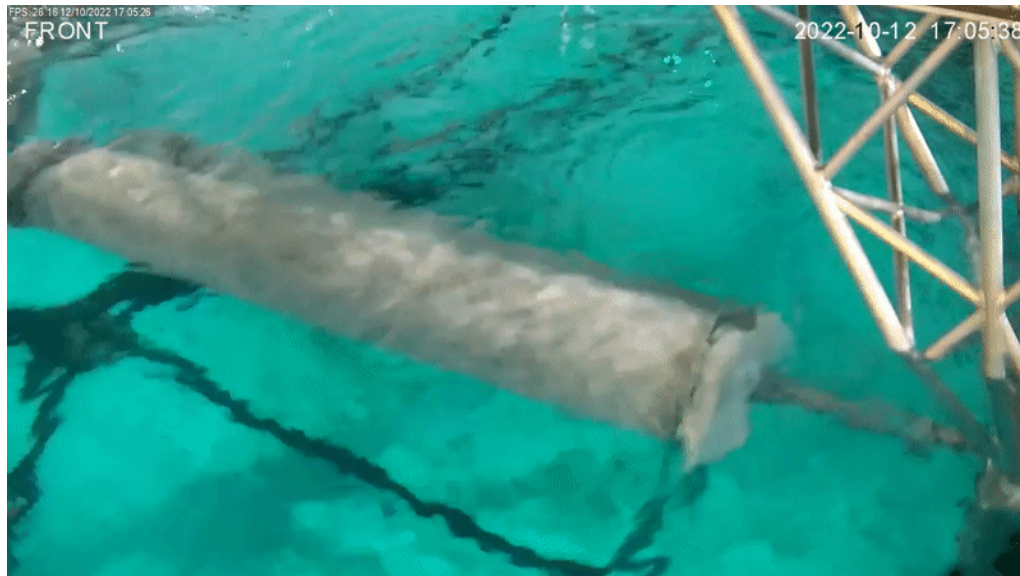
- ▶ Greater power production potential: 70% or more of the power available in an irregular wave
- ▶ Unidirectional rotation
- ▶ Storm survival

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Challenges:

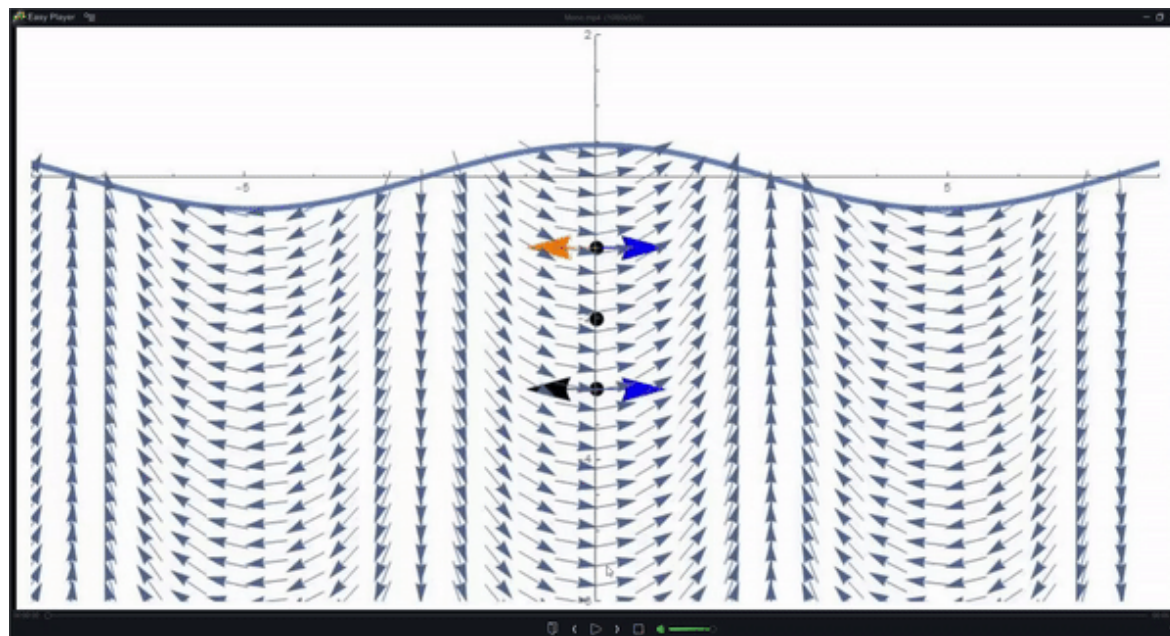
- ▶ Complex hydrodynamics effects
- ▶ High nonlinearity of the models



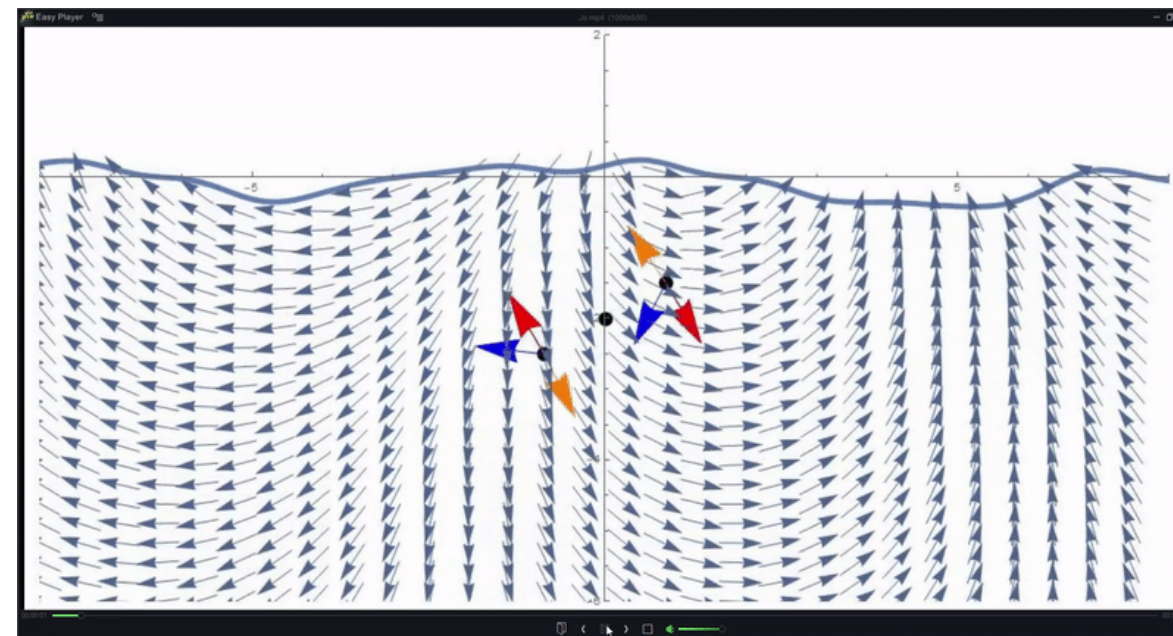
The overall aim of the **MaxRotorWEC** project is to provide technical and economic solutions to the existing problems faced in the design of a radically new wave energy converter concept that exploits hydrodynamic lift forces and can bring wave energy to commercial fruition in the form of a new real-time control strategy.



Monochromatic waves



Panchromatic waves



Black arrow shows the direction of the rotation, **red arrow** shows the direction of the **tangential force**, **blue arrow** the direction of **wave radiated by the foils**, **orange arrow** the direction of the **drag force**.

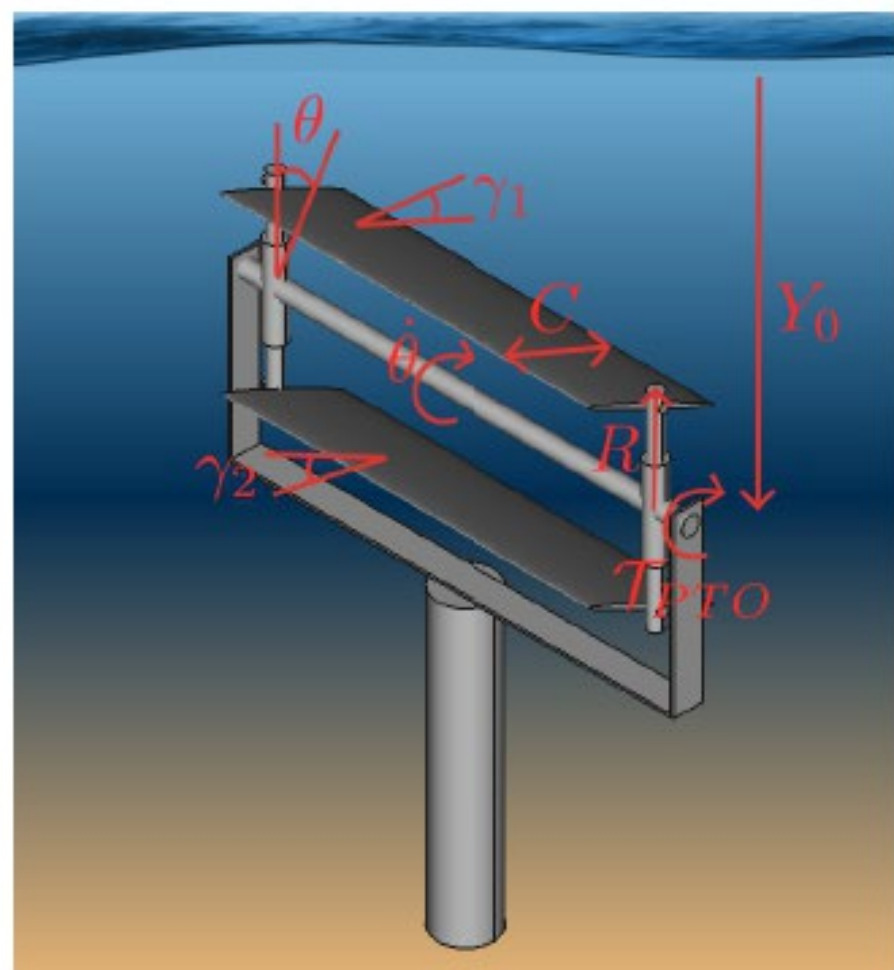


Figure 1: Concept of a twin-foil cyclorotor WEC, illustrating key structural parameters and control actuators.

► Cyclorotor WECs offer a variety of structural parameters and potential control actuators:

Structural parameters: rotor radius R , hydrofoil chord length C .

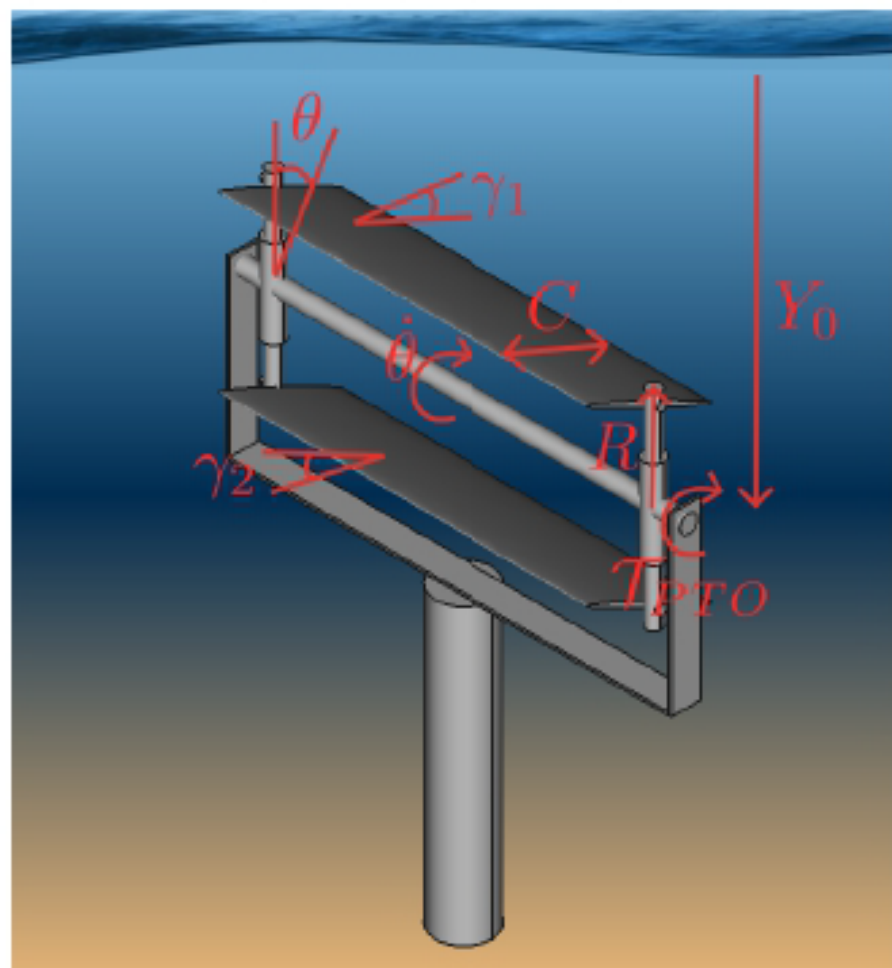


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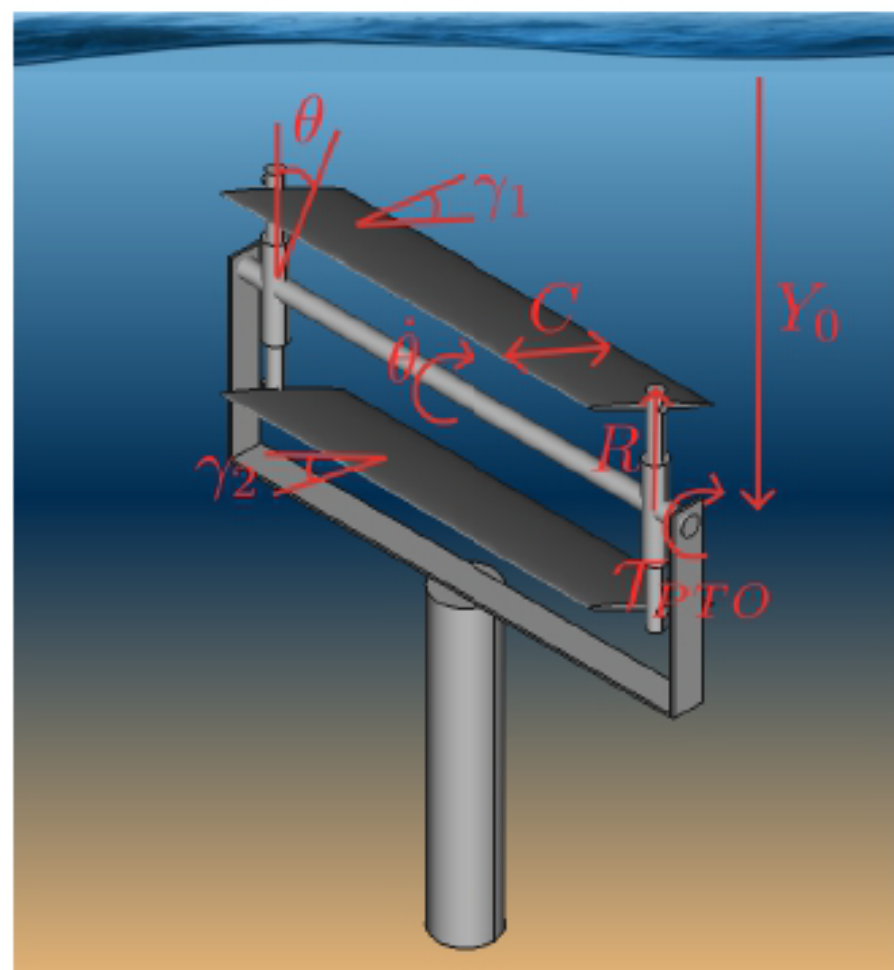


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Slow control inputs: submergence depth Y_0 .

Fast real time control inputs: hydrofoil pitch angles γ_1, γ_2 , and PTO torque \mathcal{T}_{PTO} , used to regulate rotational velocity $\dot{\theta}$.

► The latter variables are particularly critical for maximizing power production.

- ▶ Most numerical performance evaluations are carried out in (relatively unrealistic) regular wave conditions or in short-duration simulations of irregular waves (< 10 min).

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Main contribution

This work introduces **the first realistic energy-maximising control system for a cyclorotor WEC**, integrating an estimator and a predictor of the relative foil-fluid velocity in irregular waves, together with a Nonlinear Model Predictive Control (NMPC) approach.

- ▶ This estimator-predictor-NMPC structure is fundamentally different from existing control formulations for traditional WECs:
 - Severe nonlinearity of mathematical models.
 - Rapidly changing relative foil-fluid velocity as the system input.
 - Multiple control inputs and diverse set of sensors.

Motivation and contribution

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Other contributions

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Other contributions

- ▶ The reduction in energy capture due to the inaccuracies in estimation and prediction is quantified.
- ▶ A comparison between realistic and idealized control is conducted for two ocean regions, in terms of annual power output.

Mathematical model

A 2-D control-oriented mathematical model is used ¹ .

Position:

$$x_i(t) = R \cos (\theta(t) + \pi(i - 1)),$$
$$y_i(t) = Y_0 - R \sin (\theta(t) + \pi(i - 1)),$$

¹A. Ermakov, F. Thiebaut, G. S. Payne, and J. V. Ringwood, “Validation of a control-oriented point vortex model for a cyclorotor-based wave energy device,” *J. Fluids Struct.*, vol. 119, p. 103875, 2023.

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Rotational velocity:

$$\begin{aligned}(V_{R_i})_x(t) &= -R \dot{\theta} \sin (\theta(t) + \pi(i - 1)), \\(V_{R_i})_y(t) &= -R \dot{\theta} \cos (\theta(t) + \pi(i - 1)),\end{aligned}$$

where $i = 1, 2$ is the hydrofoil number, $\theta(t)$ represents the angular position of the rotor in polar coordinates, $\dot{\theta}(t)$ is the angular velocity, R is the rotor radius, and Y_0 is the submergence depth of the rotor center.

¹A. Ermakov, F. Thiebaut, G. S. Payne, and J. V. Ringwood, "Validation of a control-oriented point vortex model for a cyclorotor-based wave energy device," *J. Fluids Struct.*, vol. 119, p. 103875, 2023.

The **relative foil-fluid velocity** is defined as the vector difference between the local wave-induced fluid velocity V_W (modeled with JONSWAP spectrum)² and the hydrofoil rotational velocity V_R , augmented by the additional contribution from wake-induced and radiative effects V_H (modeled using a complex potential formulation)³:

$$\hat{\mathbf{V}}_i = \mathbf{V}_{W_i} - \mathbf{V}_{R_i} + \mathbf{V}_{H_i}.$$

²A. Arredondo-Galeana, A. Ermakov, W. Shi, J. V. Ringwood, and F. Brennan, “Optimal control of wave cycloidal rotors with passively morphing foils: An analytical and numerical study,” *Mar. Struct.*, vol. 95, p. 103597, 2024.

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The **angle of attack** for each hydrofoil is calculated as:

$$\alpha_i(t) = \arcsin \left(\frac{(V_{R_i})_x * (\hat{V}_i)_y - (V_{R_i})_y * (\hat{V}_i)_x}{|V_{R_i}| |\hat{V}_i|} \right) + \gamma_i,$$

where γ_i is the pitch angle of hydrofoil i .

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where γ_i is the pitch angle of hydrofoil i .

Then, the **lift and drag forces** acting on the rotating hydrofoils can be evaluated as:

$$F_{L_i} = \frac{1}{2} C C_L(a_i) |\hat{V}_i|^2, \quad F_{D_i} = \frac{1}{2} C C_D(a_i) |\hat{V}_i|^2,$$

where C is the hydrofoil chord length, C_L and C_D are the lift and drag coefficients, respectively, which are functions of the angle of attack a_i .

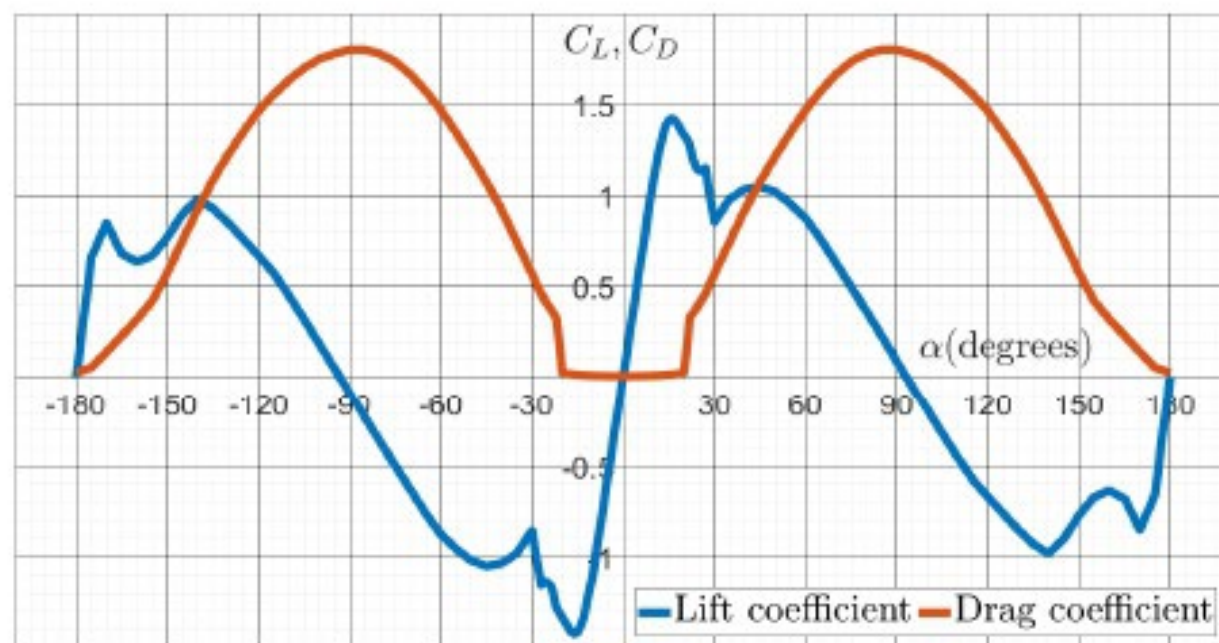


Figure 2: Lift and drag coefficients for NACA0015 hydrofoil for Reynolds numbers in the range $10^4 \leq Re \leq 10^7$.

The **tangential and radial forces** on each hydrofoil i are obtained by projecting the lift and drag forces along the tangential and radial directions of the hydrofoil circular trajectory:

$$F_{T_i} = F_{L_i} \sin(\alpha_i - \gamma_i) - F_{D_i} \cos(\alpha_i - \gamma_i),$$

$$F_{R_i} = F_{L_i} \cos(\alpha_i - \gamma_i) + F_{D_i} \sin(\alpha_i - \gamma_i).$$

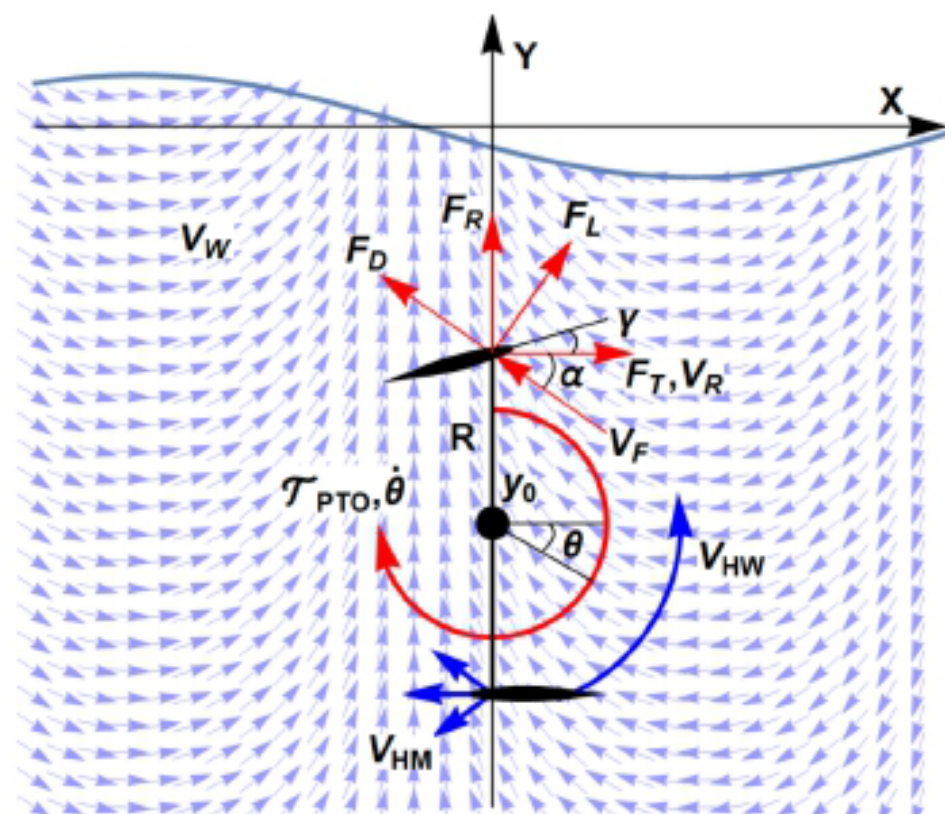


Figure 3: Two-dimensional mathematical model illustrating the operating principle of a cyclorotor WEC.

The tangential components of the lift and drag forces accelerate or decelerate the cyclorotor rotation, generating the wave-induced torque \mathcal{T}_{Wave} , which is evaluated as:

$$\mathcal{T}_{Wave} = (F_{T_1} + F_{T_2})R.$$

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Wave power is extracted by applying a power take-off (PTO) torque, \mathcal{T}_{PTO} . As a result, the dynamics of the controlled cyclorotor are governed by Newton's second law of rotation:

$$I\ddot{\theta}(t) = \mathcal{T}_{Wave} - \mathcal{T}_{PTO},$$

where I is the inertia of the rotor, $\ddot{\theta}$ is the angular acceleration.

Performance metric

Mechanical power: The time-averaged mechanical shaft power generated by the cyclorotor WEC over the time interval $[0, T_0]$ is defined as the product of the rotational velocity $\dot{\theta}$ and the applied PTO torque \mathcal{T}_{PTO} .

$$\bar{P}_{Shaft} = \frac{1}{T_0} \int_0^{T_0} \mathcal{T}_{PTO} \dot{\theta}(t) dt.$$

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Performance function

$$J = \frac{1}{T_0} \int_0^{T_0} (\mathcal{T}_{PTO} \dot{\theta} - \mu \Delta \mathcal{T}_{PTO}^2) dt,$$

where μ is a tunable weighting factor that penalizes large fluctuations in the PTO torque, and $\Delta \mathcal{T}_{PTO}$ denotes the maximum variation in PTO torque observed over the time interval T_0 .

An additional post-processing metric to evaluate the efficiency of wave energy conversion is the **Capture Width Ratio (CWR)**:

$$CWR = \frac{\bar{P}_{Shaft}}{P_{Wave}} \times 100\%,$$

where P_{Wave} is the power available for absorption in an irregular wave.

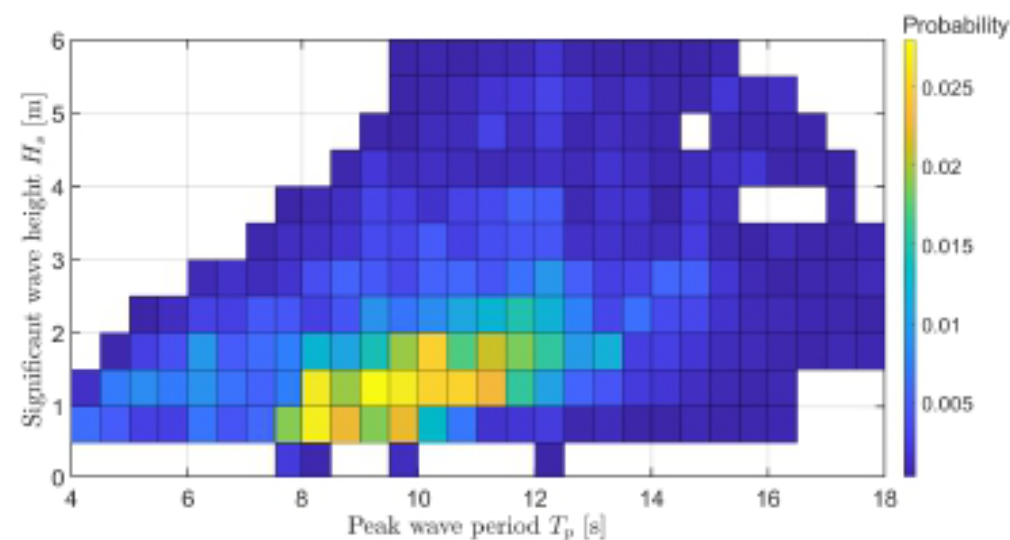
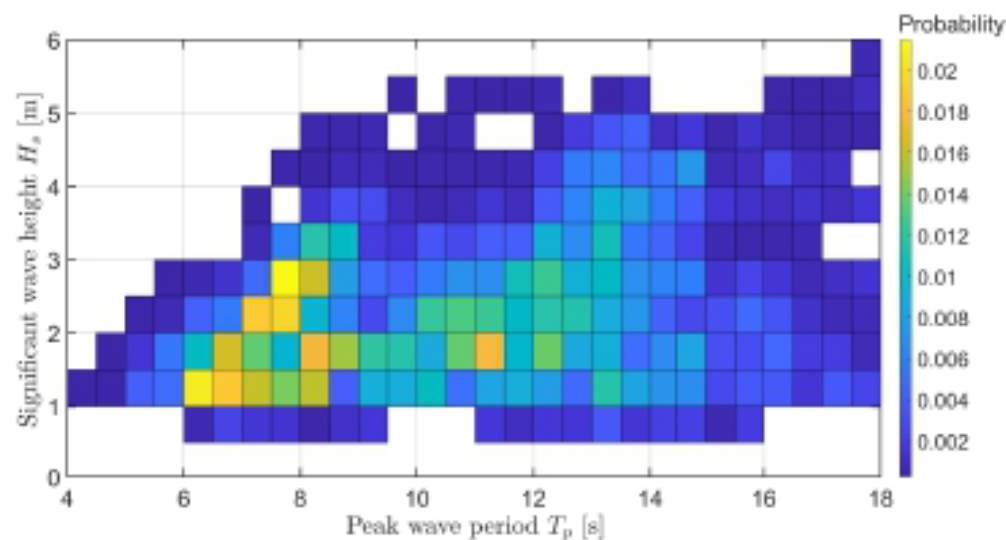
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The **total annual mechanical energy production** in a coastal location is calculated using the following expression. It sums the product of the time-averaged power output for each sea state, $\bar{P}_{Shaft}(H_s, T_p)$, its **probability of occurrence**, $p(H_s, T_p)$, and the total number of seconds in a year, $T_{seconds}$:

$$P_{Annual} = \sum_{T_p} \sum_{H_s} \bar{P}_{Shaft}(H_s, T_p) \cdot p(H_s, T_p) \cdot T_{seconds}.$$



(a) Humboldt Bay, located off the US West Coast (California).

(b) Bay of Biscay, located off the North Atlantic coast of France.

Figure 4: Scatter plots of the probability distribution of different sea state occurrences at two locations, for the year 2024. The data were obtained from the ERA5 dataset ⁴.

⁴ECMWF, 2025. European centre for medium-range weather forecasts. www.copernicus.eu/en. [Accessed 26-05-2025]

Realistic control system for a cyclorotor WEC

η - free surface perturbation

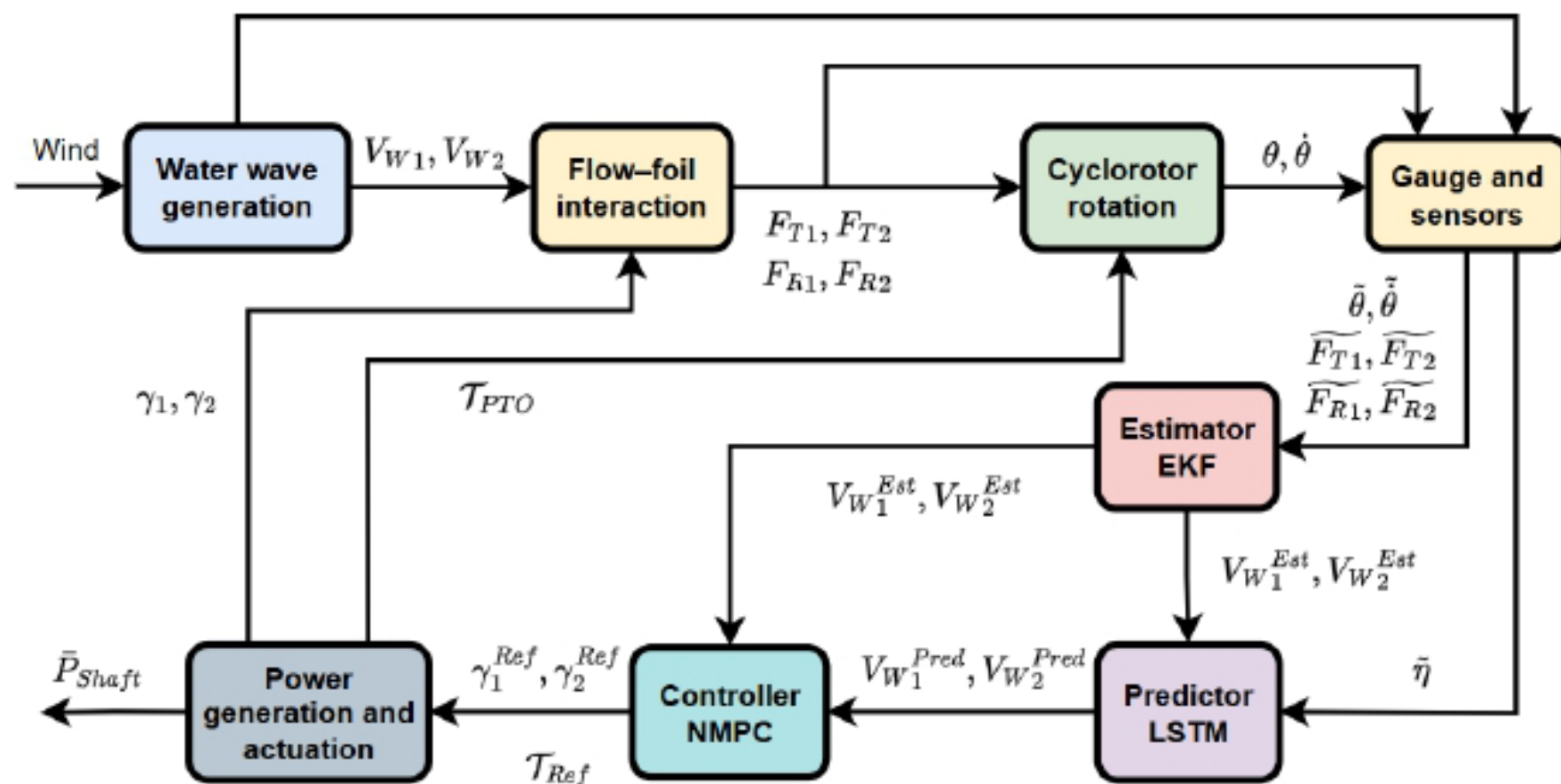


Figure 5: Diagram of the proposed realistic control architecture for a cyclorotor WEC.

The wave-induced fluid velocity is estimated using the **Extended Kalman Filter (EKF)**, which incorporates measurements of tangential and radial forces from sensors mounted on the hydrofoils, along with rotational velocity measurements from sensors located on the rotor shaft⁵.

The relative foil/fluid velocity is reconstructed via: $\hat{\mathbf{V}} = \mathbf{V}_W - \mathbf{V}_R + \mathbf{V}_H$.

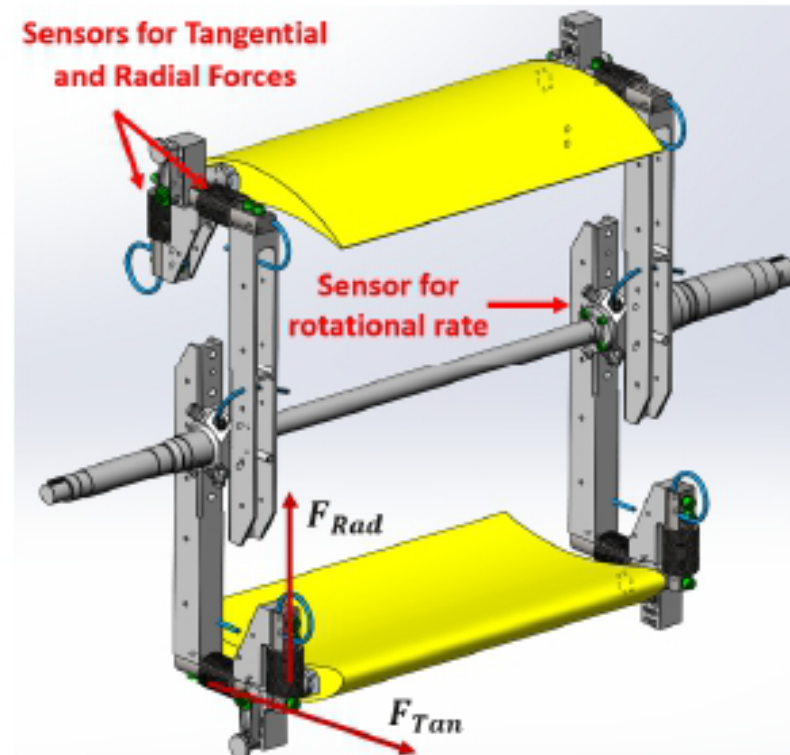


Figure 6: Sensors system for cyclorotor based WEC.

⁵I. Stasinopoulos, A. M. Ermakov, and J. V. Ringwood, “Relative foil-fluid velocity estimation and forecasting for cyclorotor wave energy conversion,” in *Proc. IEEE OCEANS 2025 Conf.*, Brest, France, 2025.

The dynamics of the cyclorotor are governed by Newton's second law of rotation. The control-oriented mathematical model described before is employed:

$$\ddot{\theta} = \frac{(F_{T_1}(\gamma_1, \dot{\theta}, V_{W_1}) + F_{T_2}(\gamma_2, \dot{\theta}, V_{W_2})) R - \mathcal{T}_{PTO}}{I}.$$

Table 1: Estimator parameters

Measurable variables:	$\tilde{\theta}, \widetilde{F_{T_1}}, \widetilde{F_{R_1}}, \widetilde{F_{T_2}}, \widetilde{F_{R_2}}$
Estimated variables:	$\dot{\theta}^{Est}, (V_{W_1}^{Est})_x, (V_{W_1}^{Est})_y, (V_{W_2}^{Est})_x, (V_{W_2}^{Est})_y$
Constants:	R, I
Other variables:	$\ddot{\theta}$
Control inputs:	$\gamma_1, \gamma_2, \mathcal{T}_{PTO}$



Figure 7: Cyclorotor WEC concept suggested by the Atargis Energy Corporation.

► The Extended Kalman Filter is implemented in MATLAB and tested on a cyclorotor similar to the one suggested by the Atargis Energy Corporation⁵.

⁵S. G. Siegel, “Numerical benchmarking study of a cycloidal wave energy converter,” *Renew. Energy*, vol. 134, pp. 390–405, 2019.



Figure 7: Cyclorotor WEC concept suggested by the Atargis Energy Corporation.

- ▶ The Extended Kalman Filter is implemented in MATLAB and tested on a cyclorotor similar to the one suggested by the Atargis Energy Corporation⁵.

- ▶ The cyclorotor has radius $R = 6\text{m}$, a submergence depth $Y_0 = -12\text{m}$ and is equipped with two hydrofoils NACA0015 with chord length $C = 5\text{m}$, and section mass $m = 1000\text{kg/m}$.

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- ▶ A panchromatic sea state with peak period $T_p = 10\text{s}$ and significant height $H_s = 2\text{m}$ is simulated.

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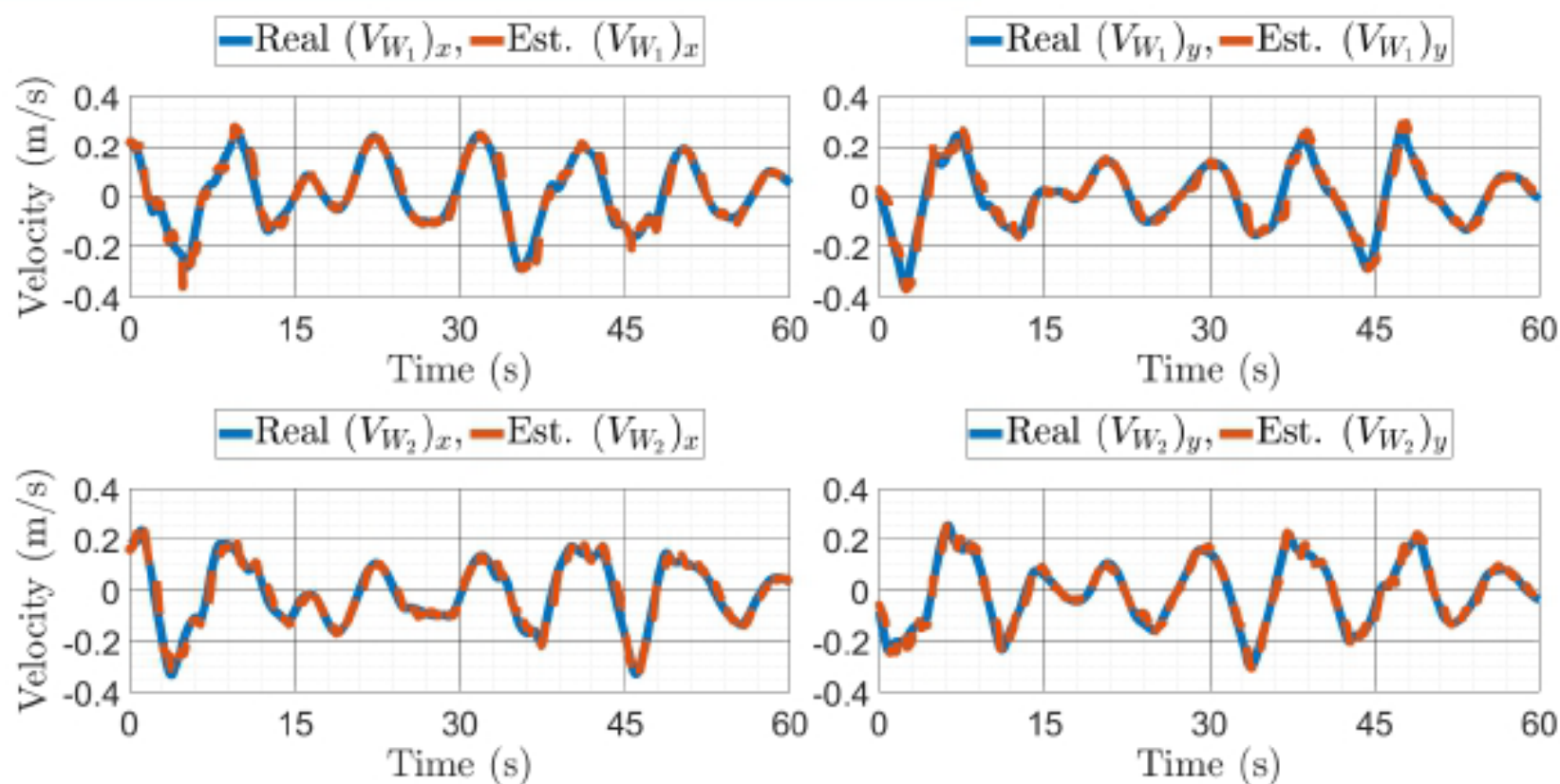


Figure 8: Comparison between the actual and estimated x and y components of the wave-induced fluid velocity vector \mathbf{V}_W for both hydrofoils, assuming a 5% model error and a 10% sensor error.

The predictor for the relative foil/fluid velocity is based on a **Long Short Term Memory (LSTM) Recursive Neural Network (RNN)**⁶.

Inputs:

- ▶ Previously estimated values of wave-induced fluid velocity for hydrofoils.
- ▶ Measurements of free surface elevation a gauge located up-wave.

Outputs: Prediction of wave-induced fluid velocity. The relative foil/fluid velocity is reconstructed via: $\hat{\mathbf{V}} = \mathbf{V}_W - \mathbf{V}_R + \mathbf{V}_H$.

⁶I. Stasinopoulos, A. M. Ermakov, and J. V. Ringwood, “Relative foil-fluid velocity estimation and forecasting for cyclorotor wave energy conversion,” in *Proc. IEEE OCEANS 2025 Conf.*, Brest, France, 2025.

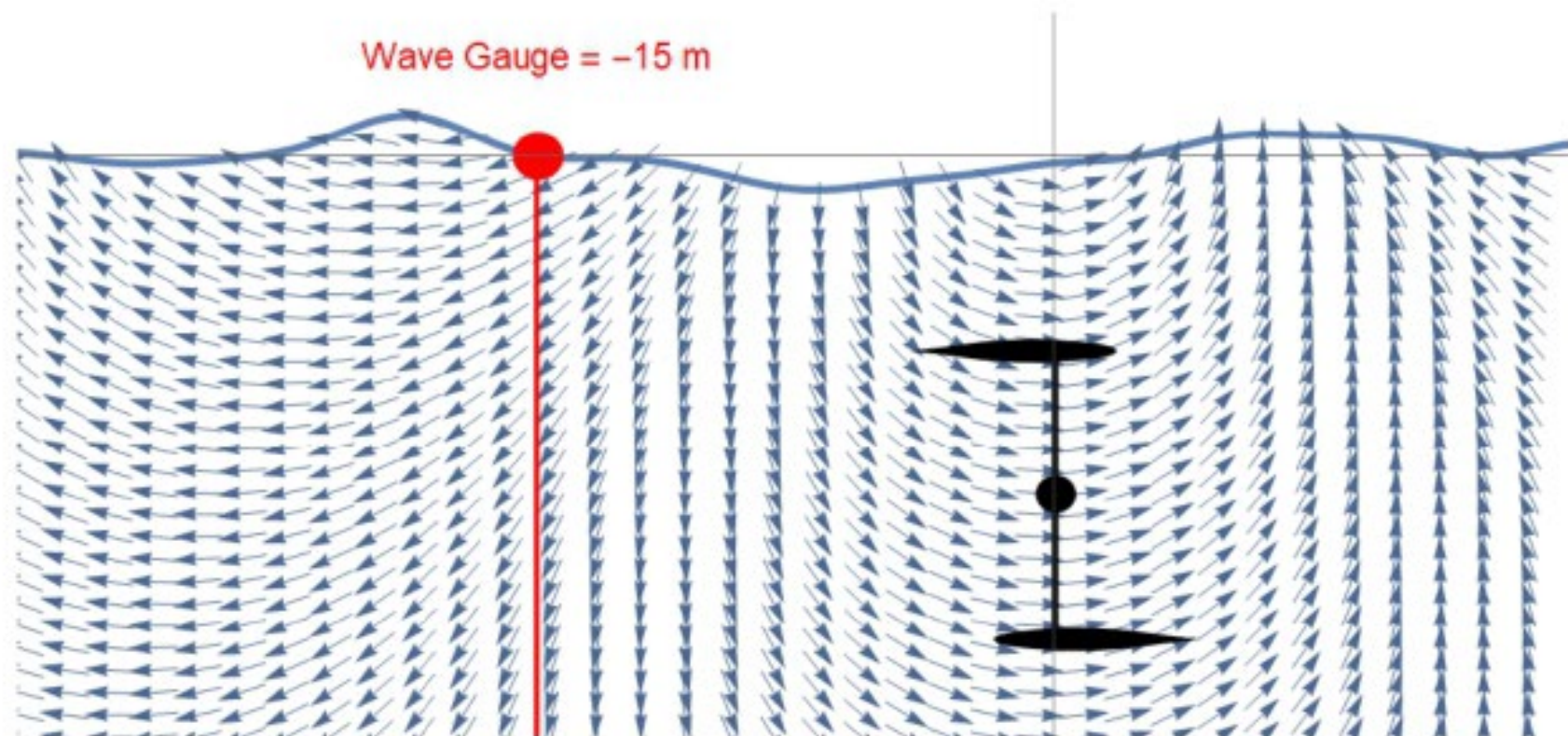


Figure 9: Irregular wave-induced fluid velocity vector field, cyclorotor WEC, and location of the up-wave free surface elevation gauge.

- ▶ The training data is generated in MATLAB using simulations of a cyclorotor WEC similar to the one suggested by the Atargis Energy Corporation, with the same parameters as before.

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- ▶ The LSTM RNN model is trained and tested in PYTHON, using TensorFlow and Keras libraries.

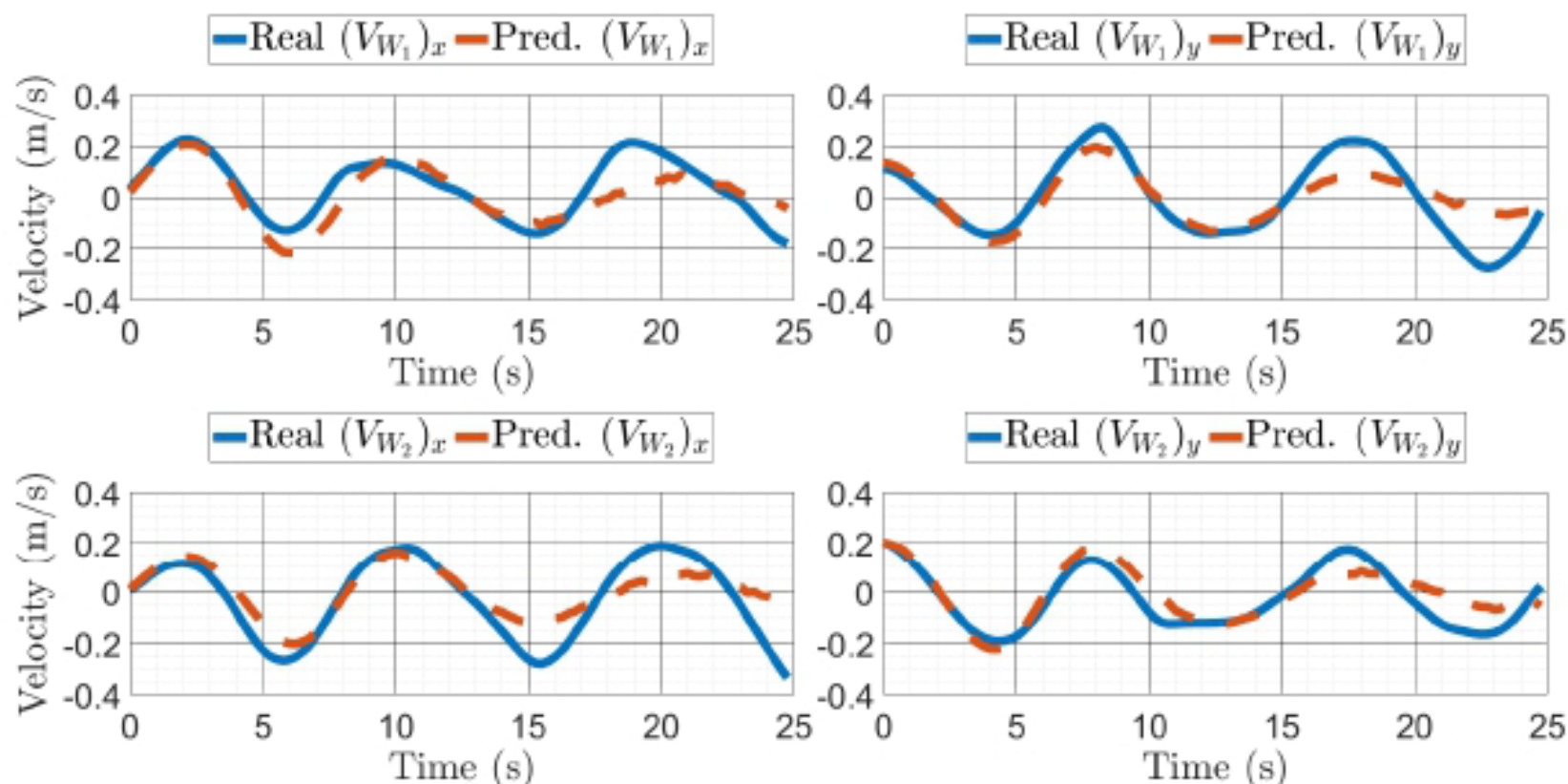


Figure 10: Comparison between the actual and predicted x and y components of the wave-induced fluid velocity vector \mathbf{V}_W for both hydrofoils.

Similar approach to the one proposed in ⁸.

NMPC formulation

$$\min_{\dot{\theta}(t), \gamma_1(t), \gamma_2(t)} J = \frac{1}{T_0} \int_0^{T_0} \left(-\mathcal{T}_{PTO}(t) \dot{\theta}(t) + \mu \Delta \mathcal{T}_{PTO}^2(t) \right) dt,$$

$$\text{s.t. } (0.2H_s + 0.6)\omega_p \leq \dot{\theta}(t) \leq (0.2H_s + 1)\omega_p,$$

$$-15^\circ \leq \{\gamma_1(t), \gamma_2(t)\} \leq 15^\circ.$$

⁸I. Stasinopoulos, A. Ermakov, and J. V. Ringwood, “Nonlinear model predictive control strategies for a cyclorotor wave energy device,” in *Proc. 23rd Eur. Control Conf. (ECC)*, Thessaloniki, Greece, 2025.

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- ▶ MATLAB script communicates with the PYTHON-based predictor using the `pyenv` interface.

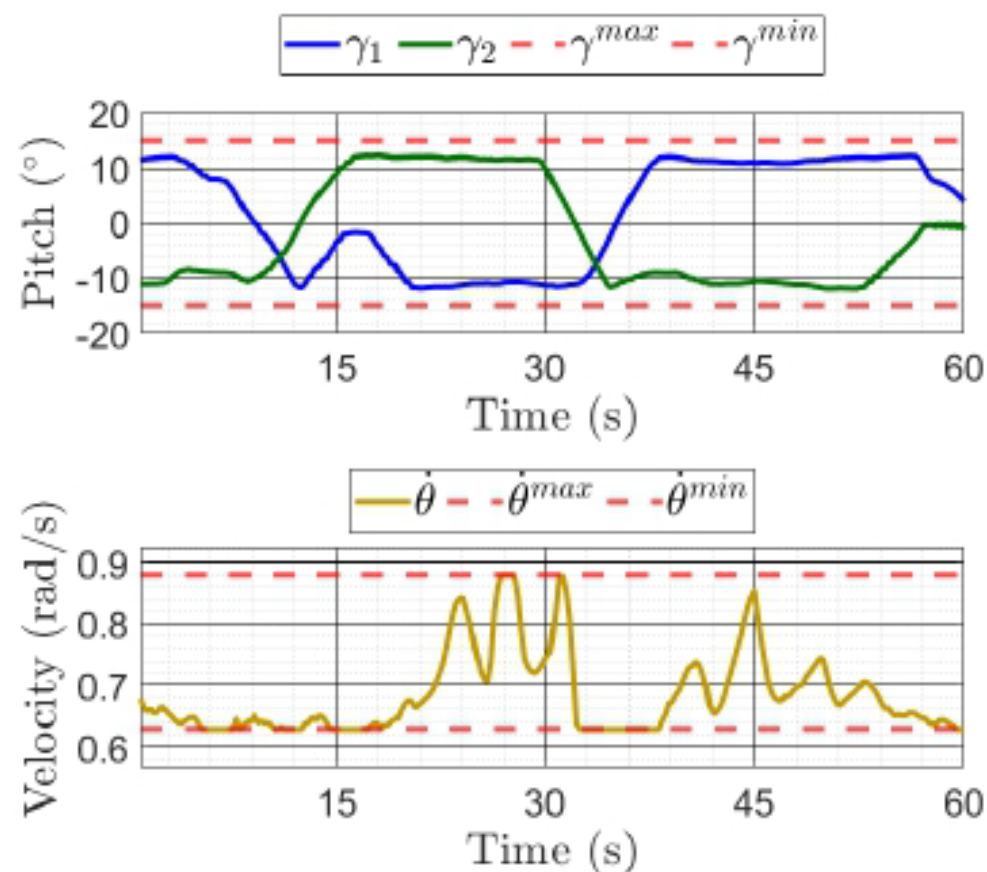
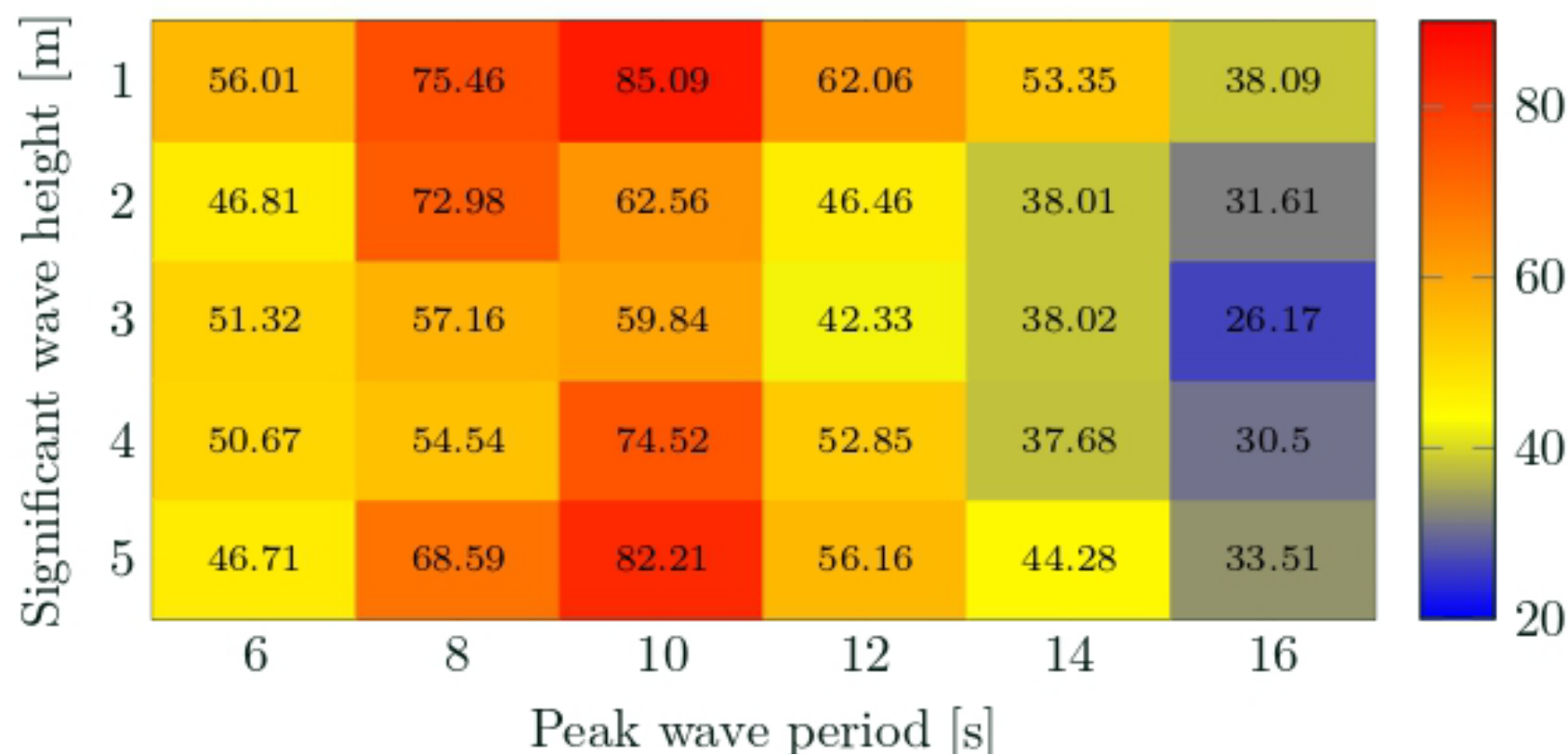
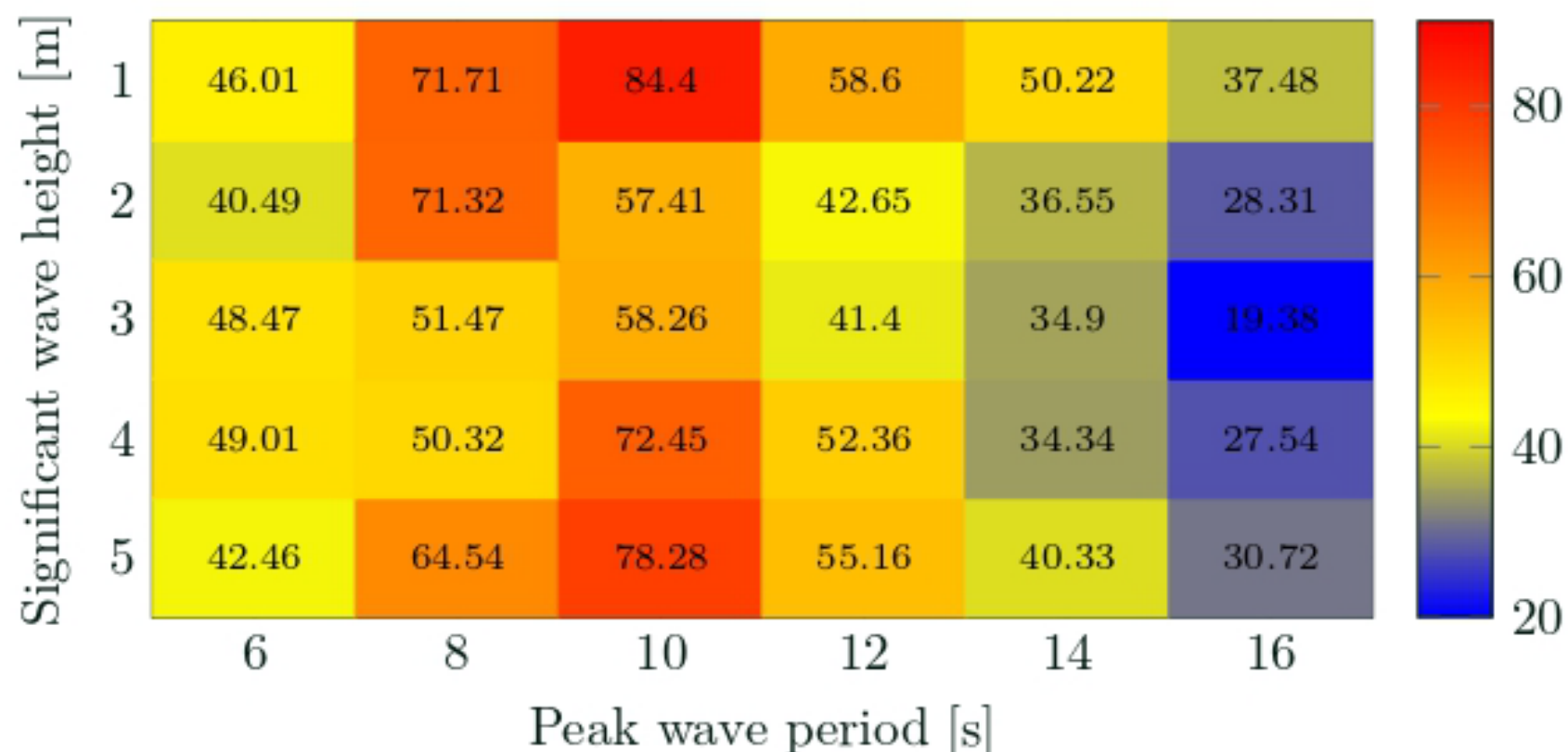


Figure 11: Pitch angles and angular velocity time-series with active upper and lower constraints over a one-minute interval, under the proposed realistic control, for a representative irregular sea state, with $T_p = 10$ s and $H_s = 2$ m.

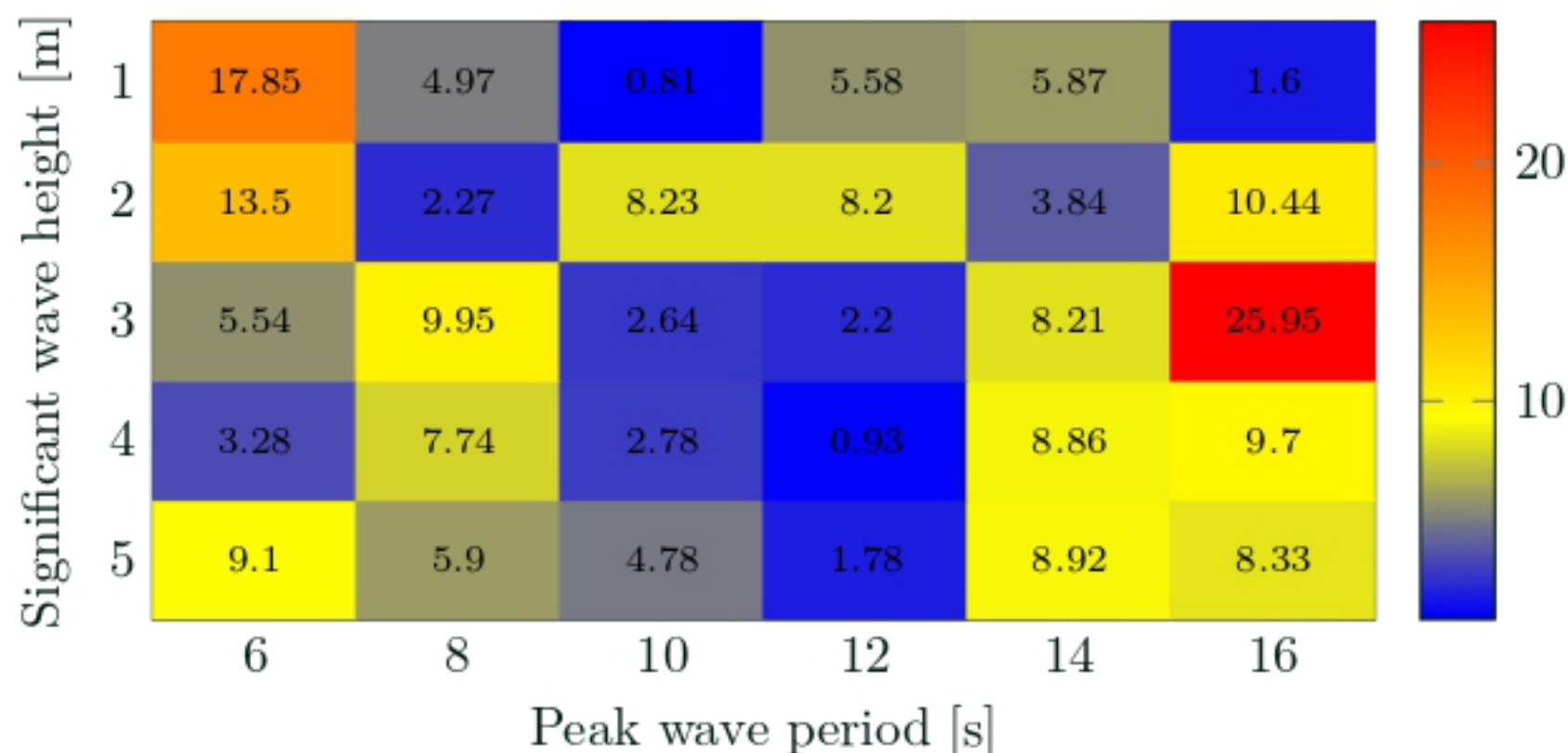
Results



Mechanical power generation in CWR [%] across sea states, assuming ideal estimation and perfect knowledge of the relative foil-fluid velocity.



Mechanical power generation in CWR [%] across sea states, incorporating estimator and predictor of the relative foil-fluid velocity.



Relative difference in CWR [%] across sea states between the idealised and the realistic case.

Table 2: Idealized and realistic total annual mechanical energy production for different locations in MWh per hydrofoil span meter.

Wave climate location	Idealized control	Realistic control
Humboldt Bay	101.57 MWh/m	95.98 MWh/m
Bay of Biscay	74.21 MWh/m	70.27 MWh/m

- ▶ Total annual mechanical energy is calculated based on wave data obtained from ERA5 for the year 2024.
- ▶ The overall loss due to estimation and prediction inaccuracies is just **under 6%** for both regions.

Conclusions and discussion

- ▶ The energy capture losses due to estimation and prediction errors are quantified, and found to be within acceptable limits.

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- ▶ At present, the implementation of the proposed control system does not yet achieve real-time performance.
- ▶ No pitch actuation and PTO system are included, which could account for pitch position and torque errors, respectively.

Thank you!

Happy to answer your questions





“Realistic energy-maximising control of cyclorotor wave energy converters using estimator, predictor, and nonlinear MPC.”


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Acknowledgements: This work was supported in part by a research grant from Taighde Éireann (Research Ireland) and the Sustainable Energy Authority of Ireland under the Pathway Programme (22/PATH-S/10793).



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The wake-induced velocity field is modeled using a complex potential formulation ⁸:

$$\mathcal{F}(z, t) = \frac{\Gamma(t)}{2\pi i} \log \left[\frac{z - c(t)}{z - \tilde{c}(t)} \right] - \frac{2i\sqrt{g}}{\pi} \int_0^t \frac{\Gamma(\tau)}{\sqrt{i(z - \tilde{c}(\tau))}} D \left[\frac{\sqrt{g}(t - \tau)}{2\sqrt{i(z - \tilde{c}(\tau))}} \right] d\tau,$$

where $z = x + iy$ denotes the complex spatial coordinate, $c(\tau) = x(\tau) + iy(\tau)$ is the complex position of the hydrofoil at an earlier time τ , Γ is the intensity of circulation of the point vortex, and $D(x)$ is the Dawson function, defined as:

$$D(x) = e^{-x^2} \int_0^x e^{y^2} dy.$$

⁸A. Ermakov, F. Thiebaut, G. S. Payne, and J. V. Ringwood, "Validation of a control-oriented point vortex model for a cyclorotor-based wave energy device," *J. Fluids Struct.*, vol. 119, p. 103875, 2023.

The velocity field from the complex potential is extracted as:

$$V_H = \frac{\partial \mathcal{F}(z, t)}{\partial z} = (V_H)_x - i (V_H)_y.$$

The total induced velocity on hydrofoil i is calculated as:

$$V_{H_i} = V_{HM_j} + V_{HW_i} + V_{HW_j},$$

where V_{HM} is the instantaneous radiation from the moving hydrofoil and V_{HW} captures the trailing wake left by the hydrofoil.

System state vector: $x = [\dot{\theta}, (V_{W_1})_x, (V_{W_1})_y, (V_{W_2})_x, (V_{W_2})_y]$

Observation vector: $h = [\dot{\theta}, F_{T_1}, F_{R_1}, F_{T_2}, F_{R_2}]$

Control input vector: $u = [\gamma_1, \gamma_2, \mathcal{T}_{PTO}]$

Then, the model function and measurement function are given by:

$$\dot{x}(t) = f(x(t), u(t)) + w(t),$$

$$z = h(x(t), u(t)) + v(t),$$

respectively, where the random vectors $w(t) \sim N(0, Q(t))$ and $v(t) \sim N(0, R(t))$ represent the process and measurement noise respectively.

Now, the state transition matrix and the observation matrix can be found as the Jacobians:

$$F(t) = \left. \frac{\partial f}{\partial x} \right|_{x(t), u(t)}, H(t) = \left. \frac{\partial h}{\partial x} \right|_{x(t), u(t)}.$$

Finally, the predict and update phase of the EKF can be given by:

$$\dot{\hat{x}}(t) = f(\hat{x}(t), u(t)) + K(t)(z(t) - h(\hat{x}(t))),$$

where:

$$K(t) = P(t)H(t)^T R(t)^{-1},$$

$$\dot{P}(t) = F(t)P(t) + P(t)F(t)^T - K(t)H(t)P(t) + Q(t).$$

with $P(t)$ the state error covariance matrix and $K(t)$ the Kalman gain.

Supplementary material: Predictor

- ▶ Model architecture: Two bidirectional LSTM layers with 192 and 128 units, respectively, and one fully connected (dense) layer.
- ▶ Model training: Adam optimizer with a learning rate of 0.0083 and a batch size of 64.
- ▶ The time length of the input sequences is 12.5 s and the time length of the output sequences is 25 s.
- ▶ All hyperparameters optimized using Bayesian optimization via the Optuna library.

Table 3: NMPC tuning parameters ⁹

NMPC parameters		
Sampling interval T_s	0.25	[s]
Prediction horizon t_p	7.5	[s]
Weighting factor μ	10^{-5}	

⁹I. Stasinopoulos, A. Ermakov, and J. V. Ringwood, “Nonlinear model predictive control strategies for a cyclorotor wave energy device,” in *Proc. 23rd Eur. Control Conf. (ECC)*, Thessaloniki, Greece, 2025.

Supplementary material: Real-time?

- ▶ The combined estimator-predictor-NMPC execution time is approximately 14.3 s, which significantly exceeds the adopted control timestep of 0.25 s.
- ▶ Software, rather than algorithmic, limitations.
- ▶ High computational cost associated with the combined execution of the estimator and NMPC in MATLAB, together with the data-driven predictor in Python.
 - A fully compiled implementation in C/C++ is expected to reduce computation time significantly.
 - The numerical solutions, obtained using the proposed control approach, can be used to train a neural network for the development of a physics-informed neural network based control strategy.
 - Main focus for now: **Demonstrate the potential of the proposed realistic energy-maximising control for cyclorotor WECs.**