### Uncertainty Analysis of Commonly Reported Wave Energy Converter Performance Metrics

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### Outline

Intro to uncertainty analysis in experimental testing

Define metrics of interest and nonlinearities

Present case study WEC and tank

Oiscuss & quantify sources of uncertainty

A Results on wave power uncertainty

Conclusions and future work



# Uncertainty Background



#### IEC TS 62600-103

Edition 1.0 2018-07

#### TECHNICAL SPECIFICATION

NTERNATIONAL TOWING TANK CONFERENCE	ITTC – Recommended Procedures and Guidelines	7.5-02 -07-03.12 Page 1 of 13	
	Uncertainty Analysis for a Wave En- ergy Converter	Effective Date 2017	Revision 00

	INTERNATIONAL TOWING TANK CONFERENCE	ITTC – Recommended Procedures and Guidelines	<b>7.5-02</b> -01-01 Page 1 of 17	
		Guide to the Expression of Uncertainty in Experimental Hydrodynamics	Effective Date 2008	Revision 01

Marine energy – Wave, tidal and other water current converters – Part 103: Guidelines for the early stage development of wave energy converters – Best practices and recommended procedures for the testing of pre-prototype devices

Coleman, H. W., & Steele, W. G. (2009). *Experimentation, Validation, and Uncertainty Analysis for Engineers* (3rd ed.). John Wiley & Sons, Inc.



### Uncertainty Background – Model Experiments

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#### Orphin et al. (2017-2021) – Oscillating Water Column

- J. Orphin, J. Nader, and I. Penesis, "Uncertainty analysis of a WEC model test experiment," Renew. Energy, vol. 168, pp. 216–233, 2021, doi: 10.1016/j.renene.2020.12.037.
- J. Orphin, "Uncertainty in Hydrodynamic Model Test Experiments of Wave Energy Converters," Australian Maritime College, University of Tasmania, 2020.
- J. Orphin, I. Penesis, and J.-R. Nader, "Uncertainty Analysis for a Wave Energy Converter: the Monte Carlo Method," AWTEC 2018 Proc., pp. 1–10, 2018.
- J. Orphin, J. Nader, I. Penesis, and D. Howe, "Experimental Uncertainty Analysis of an OWC Wave Energy Converter," Eur. Wave Tidal Energy Conf., no. August, pp. 1–11, 2017.

 Example of wave gauge uncertainty

- ± 30% uncertainty in capture width ratio
- Demonstrated Monte Carlo Method
- General and detailed uncertainty analysis





# Motivation

- Uncertainty analysis...
  - Is expected by IEC standards
  - Is important for confidence in performance metrics
  - Has not been demonstrated on many WEC devices or testing tanks
  - Lacks discussion of nonlinear effects

Focus: How do wave nonlinearities affect the uncertainty of incident wave power? And thus, capture width?



### Capture Width

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$$L = \frac{P_{WEC}}{P_{W}} = \frac{WEC \ power}{Wave \ energy \ flux \ (power)}$$

$$P_W = Ec_g = wave \ energy \ * \ group \ velocity$$

International Electrotechnical Commission. (2012). *IEC/TS* 62600-100, *Marine energy – Wave, tidal and other water current converters – Part 100: Electricity producing wave energy converters – Power performance assessment.* 





## Incident Wave Energy Equations

Linear wave energy

$$E = \frac{1}{8}\rho g H^2 \quad \left[\frac{J}{m^2}\right]$$

#### wave height only







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Linear wave energy

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# Mohtat et al. derived the equations for nonlinear wave energy

$$\overline{PE} = \rho g \left\{ \frac{1}{2} h^2 + H^2 \left( \frac{1}{16} - \frac{1}{1024} \varepsilon^2 \underline{M_4} + \frac{1}{131,072} \varepsilon^4 \underline{M_6} \right) \right\}$$
(12)  
$$\overline{KE} = \frac{\rho g}{4} H^2 \left\{ \frac{1}{4} + \varepsilon \underline{KE_3} + \varepsilon^2 \underline{KE_4} - \varepsilon^3 \underline{KE_5} + \varepsilon^4 \underline{KE_6} + \varepsilon^5 \underline{KE_7} \right\}$$
$$M_x(T,h) \text{ and } KE_x(T,h)$$
(14)

wave height, water depth, and wave period

Mohtat, A., Yim, S. C., & Osborne, A. R. (2022). Energy Content Characterization of Water Waves Using Linear and Nonlinear Spectral Analysis. *Journal of Offshore Mechanics and Arctic Engineering*, *144*(1). https://doi.org/10.1115/1.4051860



# Wave Nonlinearity





### Case Study WEC: Laboratory Upgrade Point Absorber (LUPA)

• Open-source

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- Two-body point absorber
- Realtime PTO damping and stiffness control
- Moored 6 DOF

O.H. Hinsdale Wave Research Laboratory Large Wave Flume Oregon State University Corvallis, OR, USA



Photo by Samantha Quinn





# Wave Conditions

- Regular waves of varying degrees of nonlinearity
- Scaled from PacWave Test Site on Oregon Coast
- 3.7 m tank water depth

Wave Period (s)	Wave Height (m)	Steepness (m/m)	2 <sup>nd</sup> Order wave height percent of 1 <sup>st</sup> order (%)
1.75	0.15	0.099	4.9
2.35	0.15	0.055	2.8
2.35	0.05	0.018	0.9
1.75	0.10	0.066	3.3





# Sources of Uncertainty

- Measurement uncertainty (Type A and Type B)
  - Gravity
  - Water density
  - Wave gauges
  - Pressure sensor for water depth
  - Tank floor variations
  - Wave maker consistency

- Nonlinear effects
  - Skewness
  - Asymmetry (steepness)



### Monte Carlo Method



J. Orphin, "Uncertainty in Hydrodynamic Model Test Experiments of Wave Energy Converters," Australian Maritime College, University of Tasmania, 2020.





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### Type A: statistical

"variability in repetition"

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$$u_A = \frac{\sigma}{\sqrt{n}}$$

 $\sigma = standard \ deviation$  $n = number \ of \ observations$ ITTC n > 10



### Type A: statistical

"variability in repetition"

$$u_A = \frac{\sigma}{\sqrt{n}}$$

 $\sigma = standard \ deviation$  $n = number \ of \ observations$ ITTC n > 10

#### Example: Wave height from gauge

- Desired wave:
  - H = 0.15 m
  - T = 1.75 s
- 10 trials, >20 regular waves each
- Nominal measured:
  - H = 0.13 m
  - T = 1.75 s
- $\pm 2 mm$  observed wave heights

 $u_A(H) = \pm 0.23 mm$  (0.18%) Normally distributed



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### Type B: epistemic

"lack of information"

$$u_B = \sqrt{\frac{\left(y_j - \widehat{y}_j\right)^2}{M - 2}}$$

 $y_j - \hat{y}_j = difference between measured and fitted value$ <math>M = number of calibration points



# Example: Wave height from gauge

- 1. Calibrate wave gauge on tank fill and drains
- 2. Plot voltage vs pressure sensor water depth
- 3. Find error of linear fit
- 4. Combine type B wave gauge & pressure sensor

 $u_B(H) = \pm 0.21 \, mm$  (0.16%) Normally distributed

### Type B: epistemic

"lack of information"

$$u_B = \sqrt{\frac{\left(y_j - \widehat{y}_j\right)^2}{M - 2}}$$

 $y_j - \hat{y}_j = difference between measured and fitted value$ <math>M = number of calibration points

























# Expanded Uncertainty

- 95% confidence interval
- Uncertainty in wave power is ±1-2.3%
- Orphin et al. ~7%







### Large Wave Steepness

- Nonlinear energy and power uncertainty slightly greater than linear
- Higher order nonlinear terms have greater effect at large steepness





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### Large Wave Steepness

Calculated wave power • uncertainty 11%

$$P_L = 107 \frac{W}{m}$$
$$P_{NL} = 95 \frac{W}{m}$$

m





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#### Conclusions

- For this experiment, wave power uncertainty was below 3%
- 2. High wave steepness (>0.2) has slightly more uncertainty in nonlinear estimation
- 3. Linear estimation overestimates regular wave power by 11%
  - Capture width is then underestimated in linear assumption





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#### **Future Work**

- Steeper wave experiments to find type A
- Irregular wave analysis
- Uncertainty analysis of WEC power for full capture width analysis
- Temperature dependencies on WEC power uncertainty



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# Extra slides



### Discussion

 Low wave steepness has the same uncertainty in linear and nonlinear wave power

$$P_L = E(H) * c_g(T, h)$$
$$P_{NL} = E(H, T, h) * c_g(T, h)$$

 For high wave steepness uncertainty is higher in nonlinear wave power estimation

steepness = 
$$\varepsilon(H, T, h) = \frac{\pi H}{L(T, h)}$$



### Large Steepness



 High wave steepness >0.2 has more uncertainty in nonlinear estimation

