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# Development and Validation of an Inverted Pendulum Wave Energy Converter Model

Elaine Liu

08/12/2025



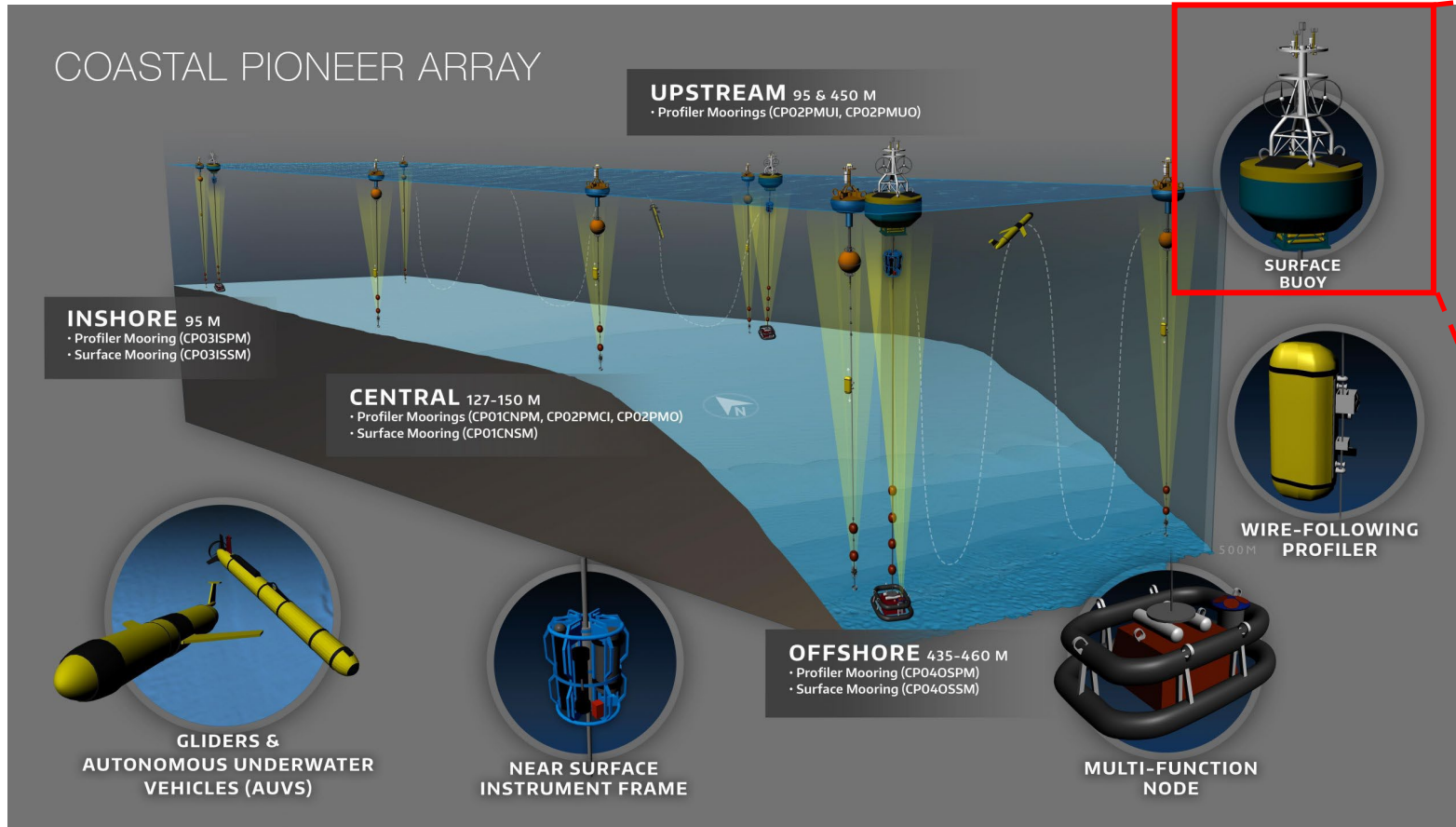
SNL399589

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# Introduction: Coastal Pioneer Array



Pioneer oceanographic buoy



## Motivation: Reliable Power for Buoys



Current power supply can only generate  
**70%** of power demand <sup>[1]</sup>



Need sustainable energy resource for  
*continuous* operation



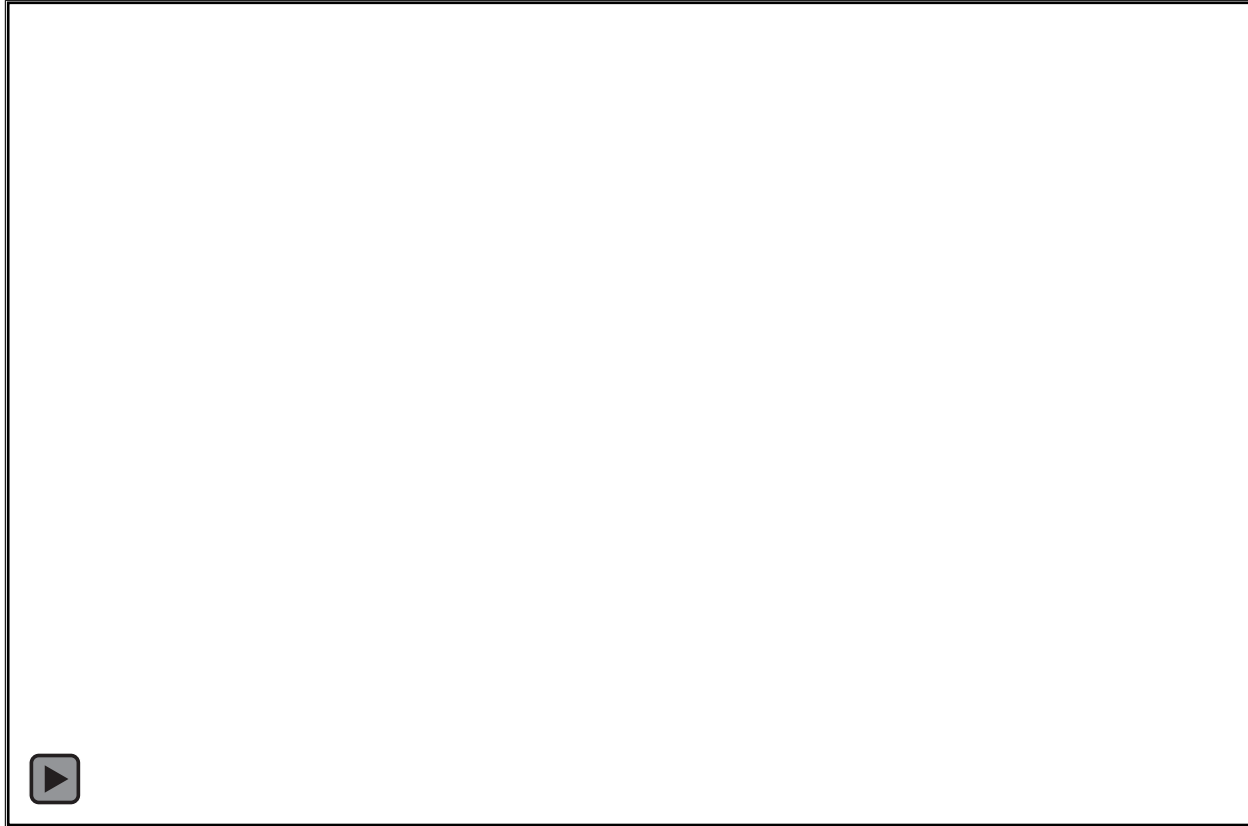
Solution: Incorporate wave energy  
converter



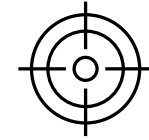
Pioneer Buoy deployed in the ocean



# Inverted Pendulum WEC Design



Sandia National Labs Pioneer Array [4]



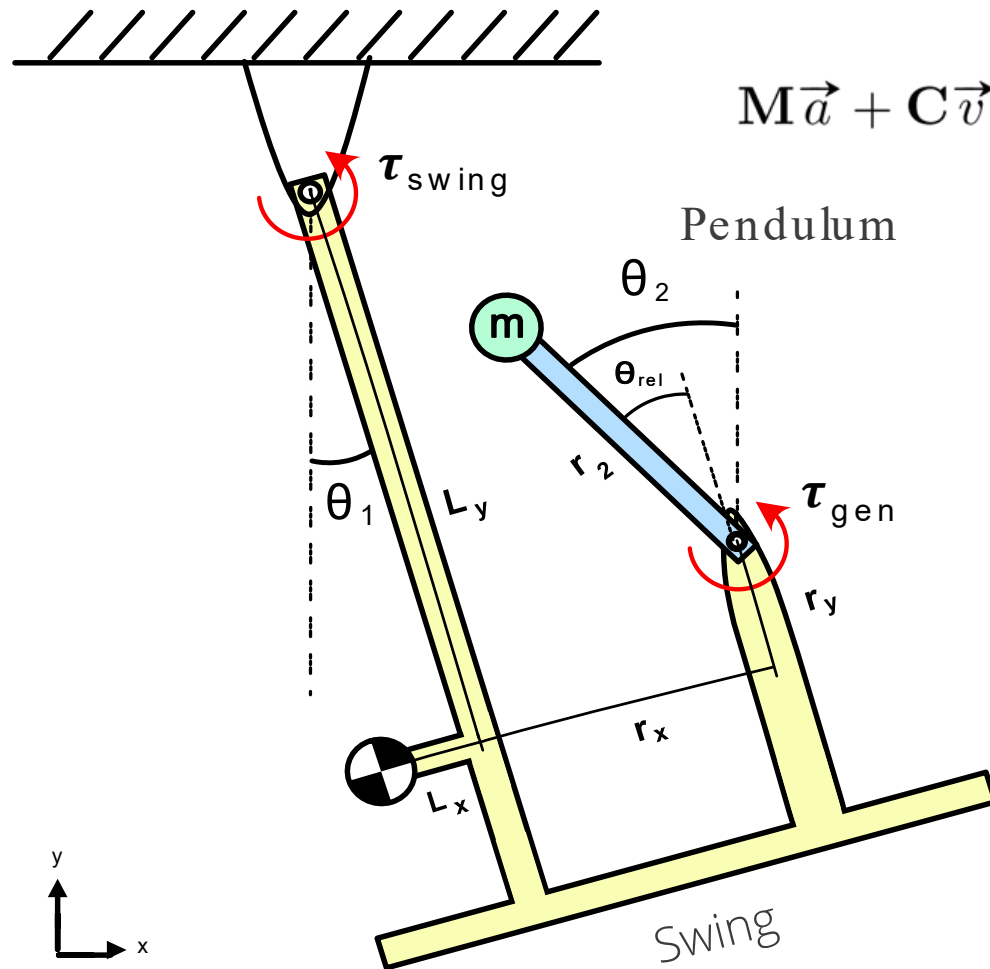
## Objective

Develop **nonlinear** and **linear** models to predict system dynamics

Assess range of applicability for **linear** model



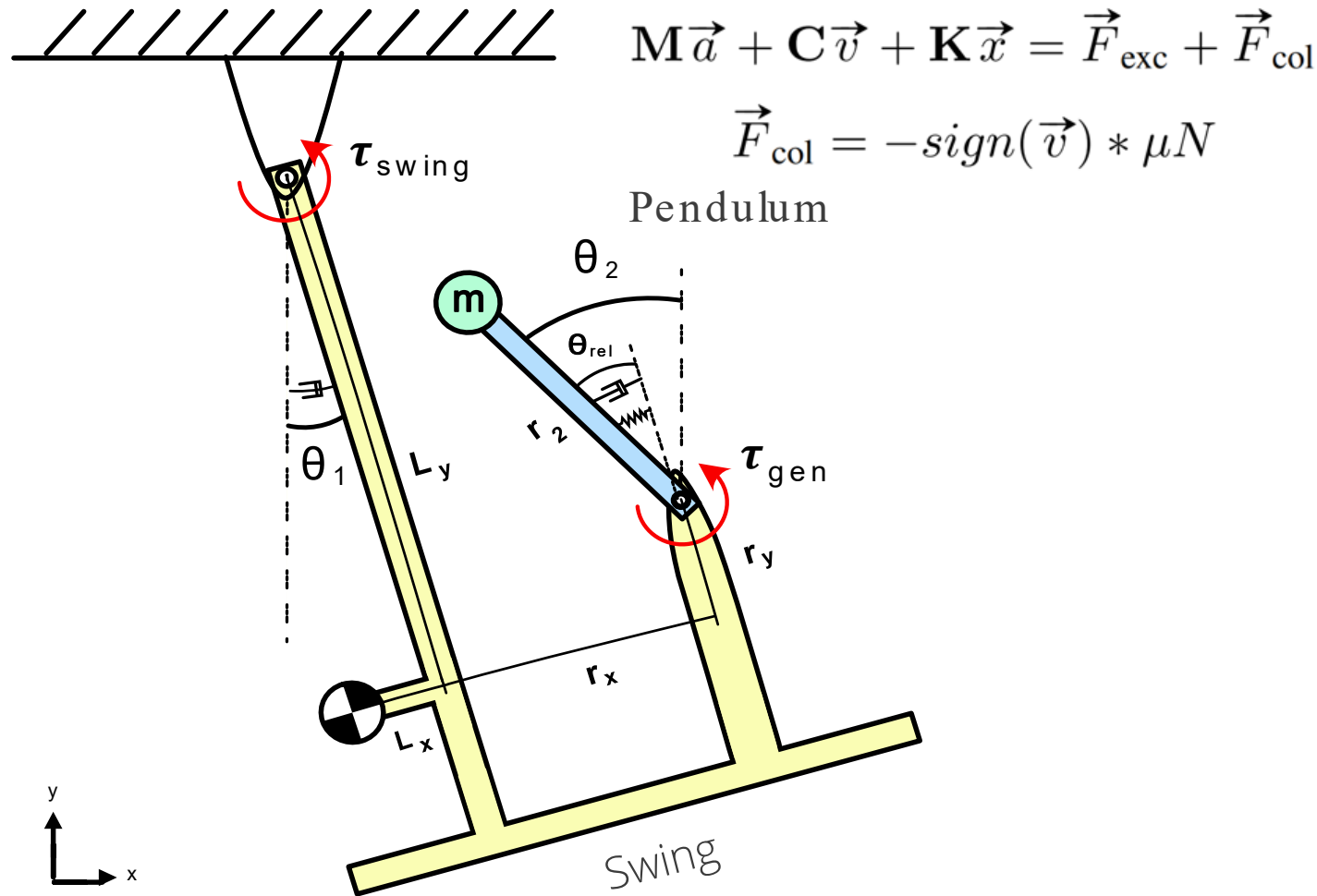
# Numerical Model Derivation



$$\mathbf{M}\ddot{\mathbf{x}} + \mathbf{C}\dot{\mathbf{x}} + \mathbf{K}\mathbf{x} = \vec{F}_{exc} + \vec{F}_{col}$$

Governing Equations of Motion Derivation

# Numerical Model Derivation

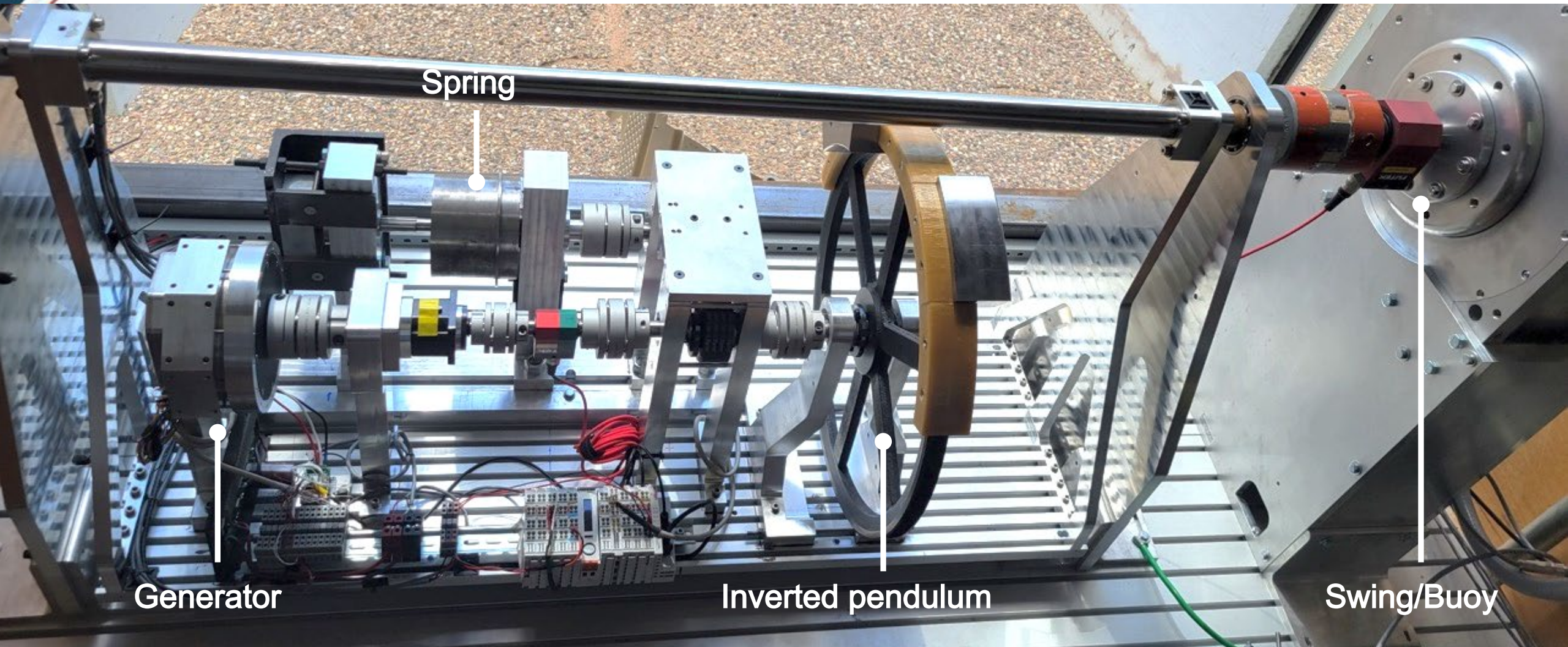


Governing Equations of Motion Derivation

MATLAB® Simscape Multibody Simulation



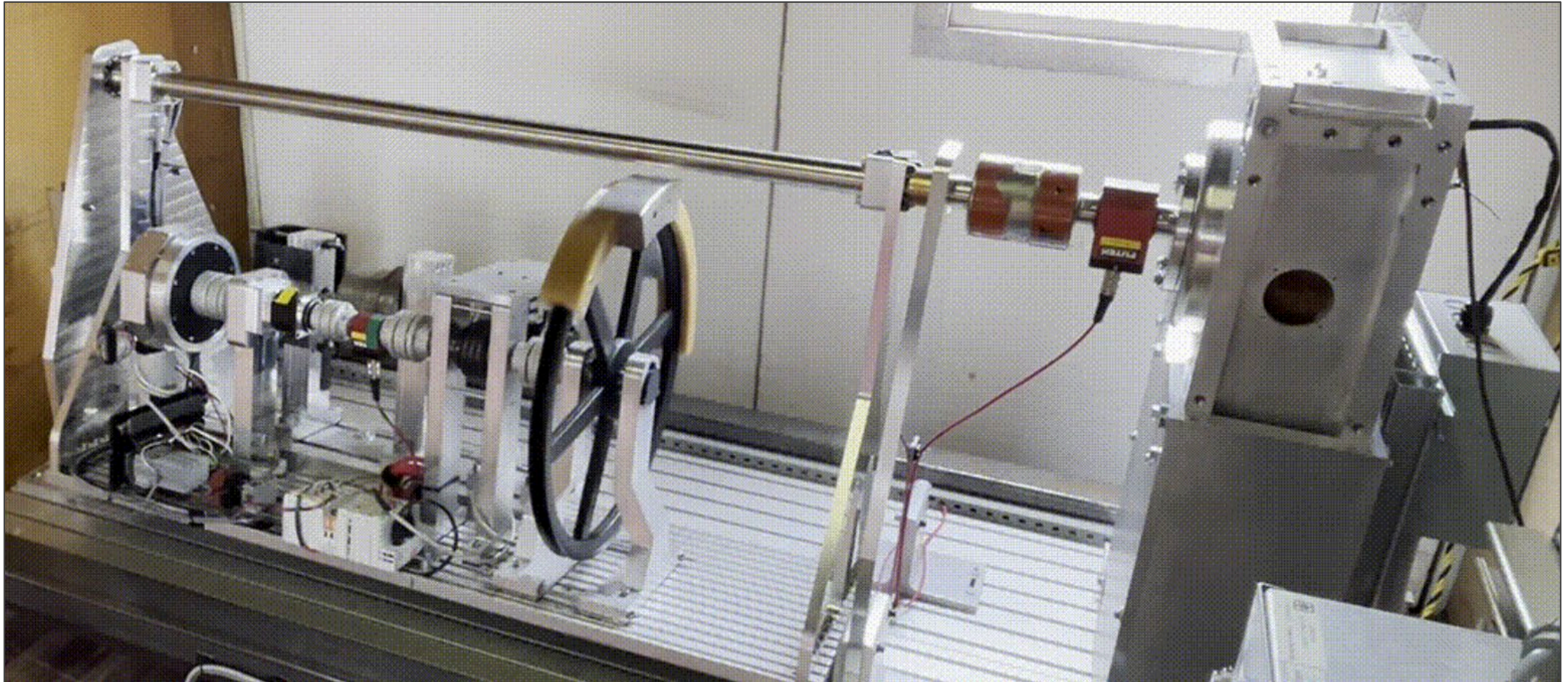
# Experimental Test Setup







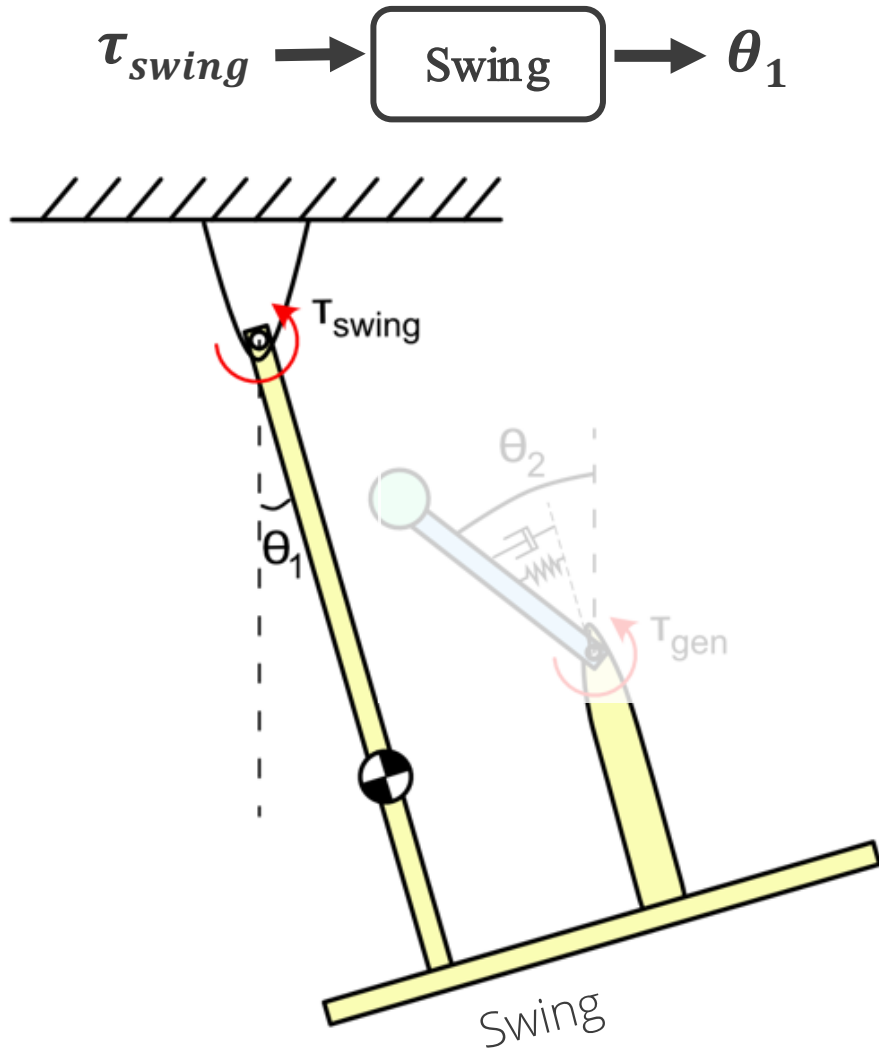
## Experiment Motion Demonstration





# 1DOF Swing Joint Experimental Data

Rotation at Swing Joint under Applied  $\tau_{swing}$



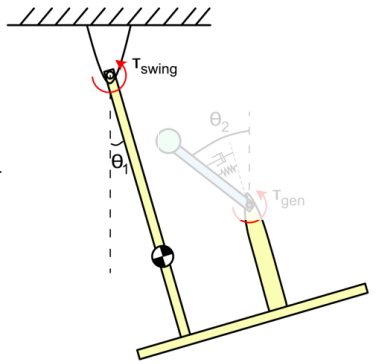
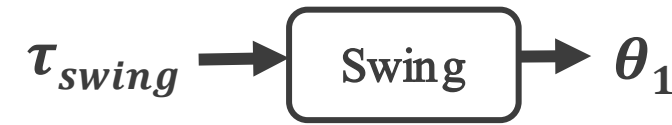
---- Numerical estimates

— Experimental Data

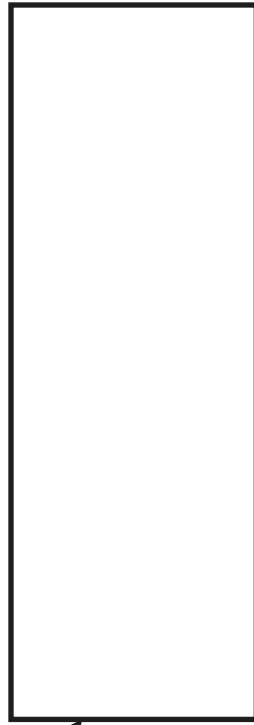
# 1DOF Swing Joint Model Analysis

**Linear** model obtained via small angle approx.

$$\sin\theta \approx \theta$$
$$\cos\theta \approx 1$$



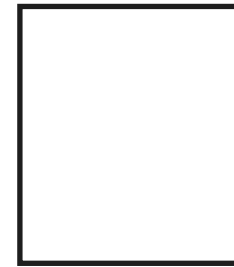
RMS of **Linear** against **Nonlinear** Swing model



Resonant  
Frequency  $\approx 0.77\text{Hz}$

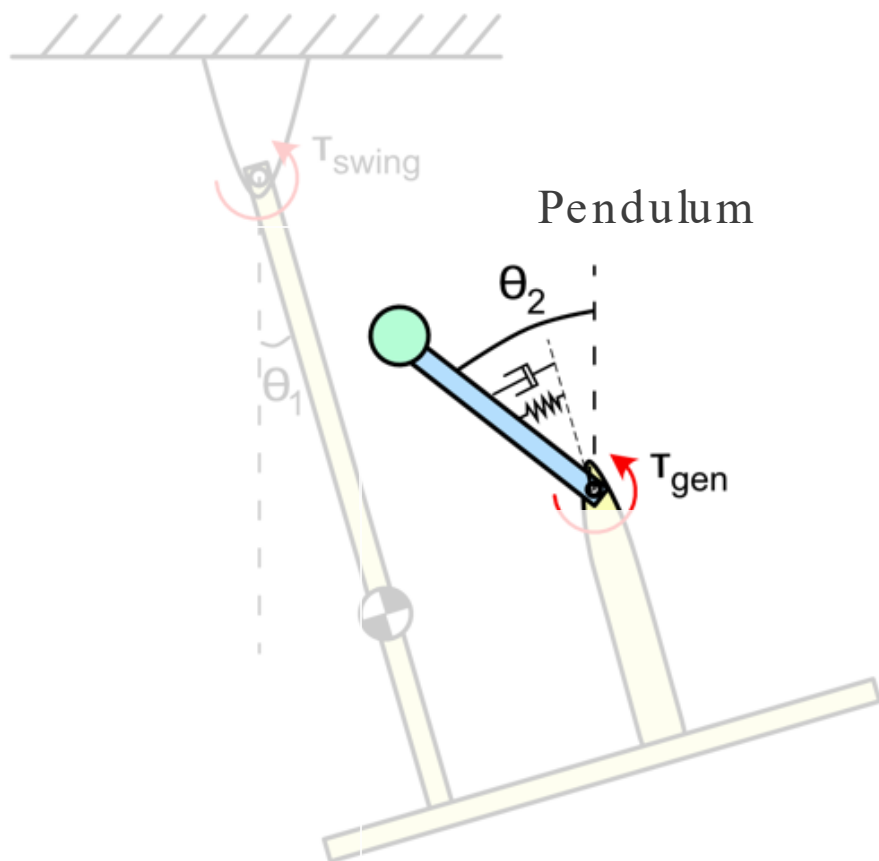
Lower amp./freq.

Total Harmonic Distortion of **Nonlinear** Swing model



# 1DOF Pendulum Experimental Data

Rotation at Pend. Joint under Applied  $\tau_{gen}$



---- Numerical estimates



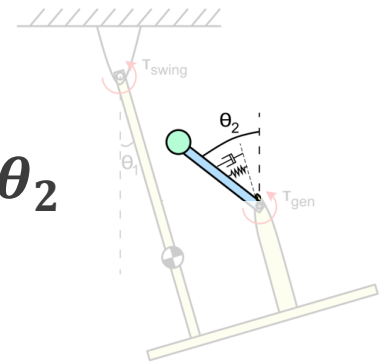
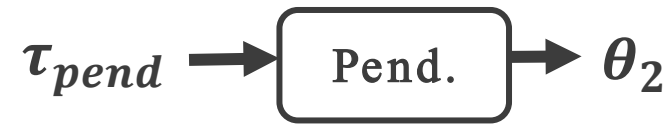
— Experimental Data



# 1DOF Pendulum Joint Model Analysis

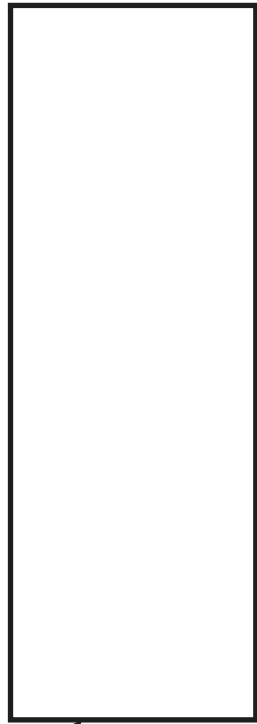
**Linear** model obtained via small angle approx.

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Lower amp./freq.

RMS of **Linear** against **Nonlinear** Pend. model



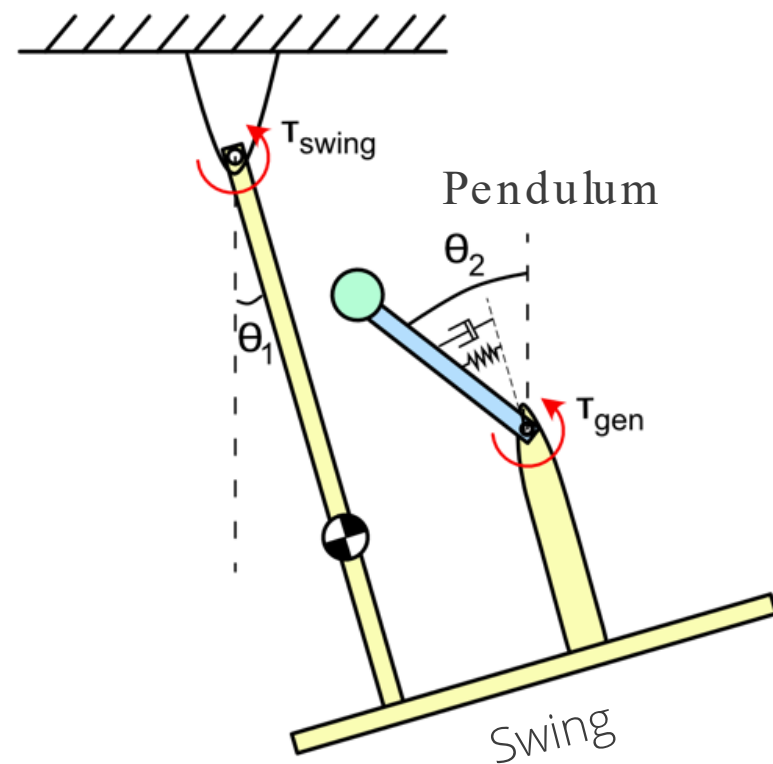
Total Harmonic Distortion of **Nonlinear** model



Resonant  
Frequency  $\approx 0.35\text{Hz}$



## 2DOF System Experimental Data

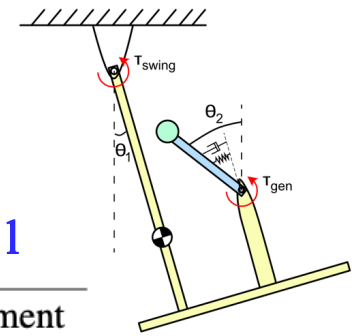


---- Numerical estimates

— Experimental Data



# Comparison of Nonlinear and Linear Models



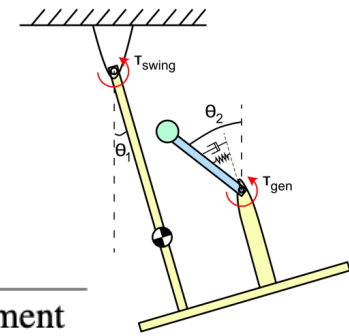
Nonlinear Swing model

		Trained Experiments Average	Validation Experiment
1DOF Swing Model	Nonlinear Model RMS for Swing Angle [deg]	0.41	0.23
	Linear Model RMS for Swing Angle [deg]	3.13	1.18
	Nonlinear Model RMS for Swing Velocity [deg/s]	2.35	1.24
	Linear Model RMS for Swing Velocity [deg/s]	14.09	5.29
1DOF Pendulum Model	Nonlinear Model RMS for Pend. Angle [deg]	4.28	8.82
	Linear Model RMS for Pend. Angle [deg]	8.83	8.82
	Nonlinear Model RMS for Pend. Velocity [deg/s]	9.11	9.60
	Linear Model RMS for Pend. Velocity [deg/s]	24.99	24.97
2DOF System Model	Nonlinear Model RMS for Swing Angle [deg]	0.37	0.42
	Linear Model RMS for Swing Angle [deg]	1.76	1.96
	Nonlinear Model RMS for Swing Velocity [deg/s]	1.51	1.91
	Linear Model RMS for Swing Velocity [deg/s]	7.53	8.41
	Nonlinear Model RMS for Pend. Angle [deg]	3.39	3.06
	Linear Model RMS for Pend. Angle [deg]	12.89	13.30
	Nonlinear Model RMS for Pend. Velocity [deg/s]	7.05	7.48
	Linear Model RMS for Pend. Velocity [deg/s]	37.71	39.65

Linear Swing model



# Comparison of Nonlinear and Linear Models



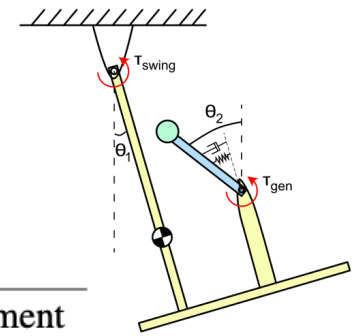
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Nonlinear Swing model

Linear Swing model



# Comparison of Nonlinear and Linear Models



	Trained Experiments Average		Validation Experiment
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Nonlinear Swing model

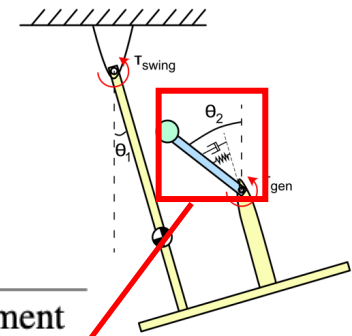
Nonlinear Swing model

Linear Swing model





# Comparison of Nonlinear and Linear Models



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Nonlinear spring stiffness



## Conclusions



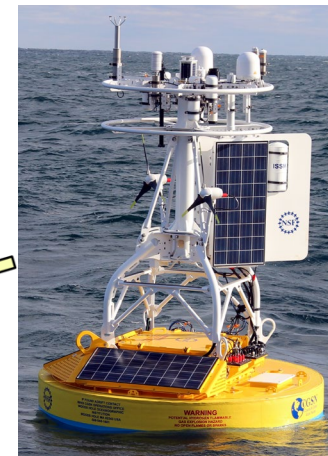
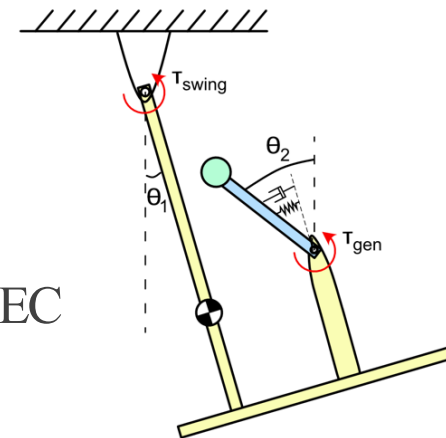
Develop **linear** and **nonlinear** models of Inverted Pend. WEC



Coulomb friction dominates in near-zero frequencies and amplitudes



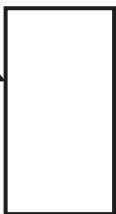
**Linear** model shows more disagreement with **nonlinear** model for high amplitudes/resonant frequencies



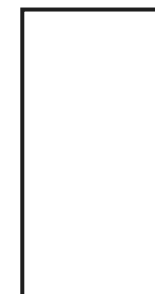
RMS of **Linear** against **Nonlinear** Swing model

THD of **Nonlinear** Swing model

Lower amp./freq. →



Res freq. →





## Acknowledgements

The authors would like to acknowledge funding support from the US Department of Energy's Water Power Technologies Office. Sandia National Laboratories is a multi-mission laboratory managed and operated by National Technology and Engineering Solutions of Sandia, LLC., a wholly owned subsidiary of Honeywell International, Inc., for the U.S. Department of Energy's National Nuclear Security Administration under contract DE-NA0003525. This paper describes objective technical results and analysis. Any subjective views or opinions that might be expressed in the paper do not necessarily represent the views of the U.S. Department of Energy or the United States Government.

Thank you for your attention!

Questions? Email me at [ejl2401@stanford.edu](mailto:ejl2401@stanford.edu)



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INSTITUTION

The slide features a central dark blue diamond shape containing the word "Appendix" in white serif font. This diamond is surrounded by a thin white border. Two diagonal lines, composed of small colored segments in shades of blue, green, orange, and purple, cross the slide from the corners. The background is a light gray with a faint, abstract pattern of dots and lines.

# Appendix





## 6DOF LAMP Testing of the WEC





## Citation

- [1] Coe, Ryan G., Lee, Jantzen, Bacelli, Giorgio, Spencer, Steven J., Dullea, Kevin, Plueddemann, Albert J., Buffitt, Derek, Reine, John, Peters, Donald, Spinnenken, Johannes, Hamilton, Andrew, Sabet, Sahand, Husain, Salman, Jenne, Dale, Korde, Umesh, Muglia, Mike, Taylor, Trip, and Wade, Eric. Pioneer WEC concept design report. United States: N. p., 2023. Web. doi:10.2172/2280833.
- [2] I.A. Antoniadis, V. Georgoutsos, A. Paradeisiotis, Fully enclosed multi-axis inertial reaction mechanisms for wave energy conversion, Journal of Ocean Engineering and Science, Volume 2, Issue 1, 2017, Pages 5-17, ISSN 2468-0133, <https://doi.org/10.1016/j.joes.2017.02.003>.
- [3] Aref Afsharfard, Inwon Lee, Kyung Chun Kim, Study application of an unmoored ocean wave energy harvester with harmonic and random excitation, Energy Conversion and Management, Volume 293, 2023, 117535, ISSN 0196-8904, <https://doi.org/10.1016/j.enconman.2023.117535>.
- [4] YouTube. (2023, November 29). *The Pioneer Array: Harnessing Wave Power to collect Ocean Data* YouTube. <https://www.youtube.com/watch?v=PsNvlGnm59o>
- [5] Olejnik, P., Ayankoso, S. Friction modelling and the use of a physics-informed neural network for estimating frictional torque characteristics. Meccanica 58, 1885–1908 (2023). <https://doi.org/10.1007/s11012-023-01716-8>