



Probabilistic analysis of an asymmetric bistable energy harvester

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Third International Nonlinear Dynamics Conference (NODYCON 2023)

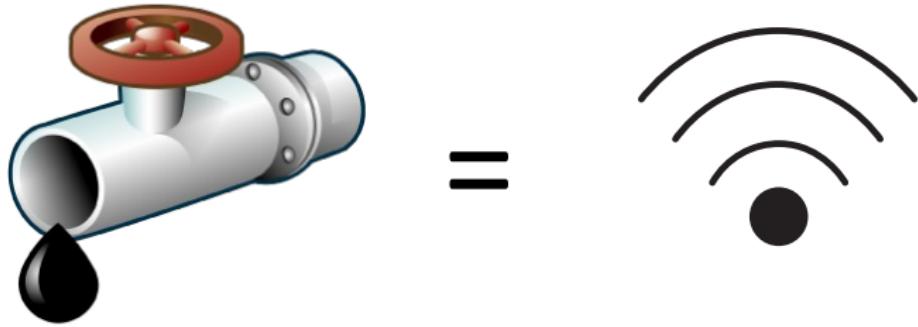
Rome, Italy, June 19-22, 2023

Is data (in fact) the new oil?

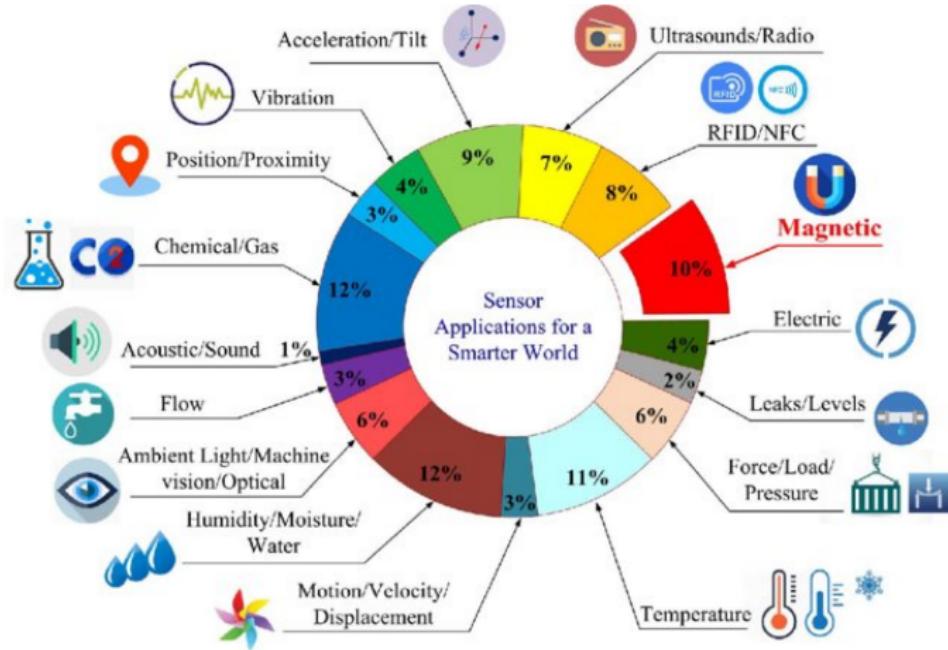


<https://www.economist.com/leaders/2017/05/06/the-worlds-most-valuable-resource-is-no-longer-oil-but-data>

If so, sensors are the new pipeline!



IoT will demand more than a trillion sensors by 2025



L. Xuyang et al., Overview of Spintronic Sensors With Internet of Things for Smart Living,

IEEE Transactions on Magnetics, 0018-9464, 2019.

Up to 78 million batteries will be discarded daily by 2025, researchers warn

An EU-funded project makes it plain: batteries need to live longer than the Internet of things (IoT) devices they power. A position paper published by the project outlines the key actions to power IoT devices reliably and sustainably.



CLIMATE CHANGE AND
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ENERGY

SCIENTIFIC ADVANCES



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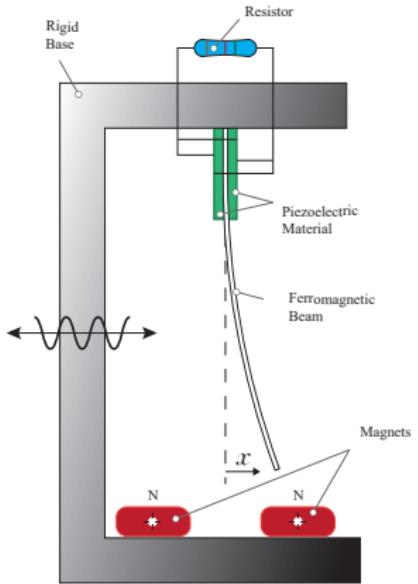
CORDIS — European Commission, *Up to 78 million batteries will be discarded daily by 2025, researchers warn* (July 23, 2021)

Research objectives

Study variability effects on an asymmetric bistable energy harvester with nonlinear transduction, seeking to find paths to optimize the energy-recovering process

- ▶ Global sensitivity analysis:
 1. Extract features of the dynamic behavior
 2. Identifies the most sensitivity parameters
- ▶ Uncertainty quantification:
 1. Parametric variability modeling
 2. Low-dimensional probabilistic models
 3. Probabilistic maps addressing uncertainty

Bistable harvester: symmetric + linear coupling



$$\ddot{x} + 2\xi\dot{x} - \frac{1}{2}x(1-x^2) - \chi v = f \cos(\Omega t)$$

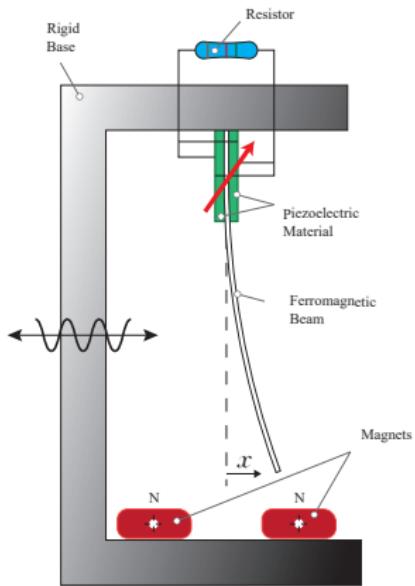
$$\dot{v} + \lambda v + \kappa \dot{x} = 0$$

+ initial conditions



A. Erturk, J. Hoffmann and D. Inman, *A piezomagnetoelastic structure for broadband vibration energy harvesting*,
Applied Physics Letters, 2009

Bistable harvester: symmetric + nonlinear coupling



$$\ddot{x} + 2\xi\dot{x} - \frac{1}{2}x(1-x^2) - \widehat{\Theta}(x)\chi v = f \cos(\Omega t)$$
$$\dot{v} + \lambda v + \widehat{\Theta}(x)\kappa \dot{x} = 0$$

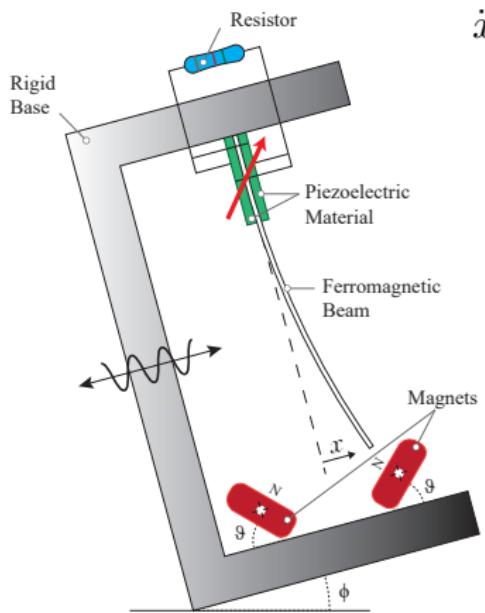
+ initial conditions

$$\widehat{\Theta}(x) = (1 + \beta |x|)$$



A Triplet, DD Quinn, *The effect of non-linear piezoelectric coupling on vibration-based energy harvesting*, *Journal of Intelligent Material Systems and Structures*, 2009.

Bistable harvester: asymmetric + nonlinear coupling



$$\ddot{x} + 2\xi\dot{x} - \frac{1}{2}x(1 + 2\delta x - x^2) - \hat{\Theta}(x)\chi v =$$

$$f \cos(\Omega t) + p \sin(\phi)$$

$$\dot{v} + \lambda v + \hat{\Theta}(x)\kappa \dot{x} = 0$$

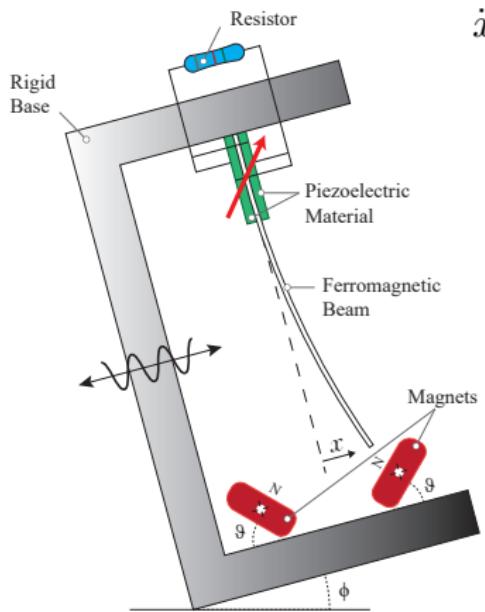
+ initial conditions

$$\hat{\Theta}(x) = (1 + \beta |x|)$$



W. Wang et al., *Performance enhancement of nonlinear asymmetric bistable energy harvesting from harmonic, random and human motion excitations*. *Applied Physics Letters*, 2018

Bistable harvester: asymmetric + nonlinear coupling



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$$f \cos(\Omega t) + p \sin(\phi)$$

$$\dot{v} + \lambda v + \hat{\Theta}(x)\kappa \dot{x} = 0$$

+ initial conditions

$$\hat{\Theta}(x) = (1 + \beta |x|)$$

$$P_{avg} = \frac{1}{T} \int_{t_0}^{t_0+T} \lambda v(t)^2 dt$$



W. Wang et al., *Performance enhancement of nonlinear asymmetric bistable energy harvesting from harmonic, random and human motion excitations*. *Applied Physics Letters*, 2018



- ▶ Insight about nontrivial parameters interactions
- ▶ Construction of simpler probabilistic models
- ▶ Important step for design and optimization

Mathematical Model:

$$Y = \mathcal{M}(\mathbf{x}) , \quad x_i \sim \mathcal{U}(0, 1)$$

Hoeffding-Sobol decomposition:

$$Y = \mathcal{M}_0 + \sum_{i=1}^k \mathcal{M}_i(x_i) + \sum_{i < j} \mathcal{M}_{ij}(x_i, x_j) + \dots + \mathcal{M}_{1\dots k}(x_1 \dots x_k)$$

An **orthogonal decomposition** in terms of conditional expectations:

- ▶ $\mathcal{M}_0 = \mathbb{E}\{Y\}$
- ▶ $\mathcal{M}_i(x_i) = \mathbb{E}\{Y|x_i\} - \mathcal{M}_0$
- ▶ $\mathcal{M}_{ij}(x_i, x_j) = \mathbb{E}\{Y|x_i, x_j\} - \mathcal{M}_i - \mathcal{M}_j - \mathcal{M}_0$
- ▶ ...

Sobol' indices

First-order Sobol' indices:

$$S_i = \text{Var}[\mathcal{M}_i(x_i)] / \text{Var}[\mathcal{M}(\mathbf{x})]$$

(quantify the additive effect of each input separately)

Second-order Sobol' indices:

$$S_{ij} = \text{Var}[\mathcal{M}_{ij}(x_i, x_j)] / \text{Var}[\mathcal{M}(\mathbf{x})]$$

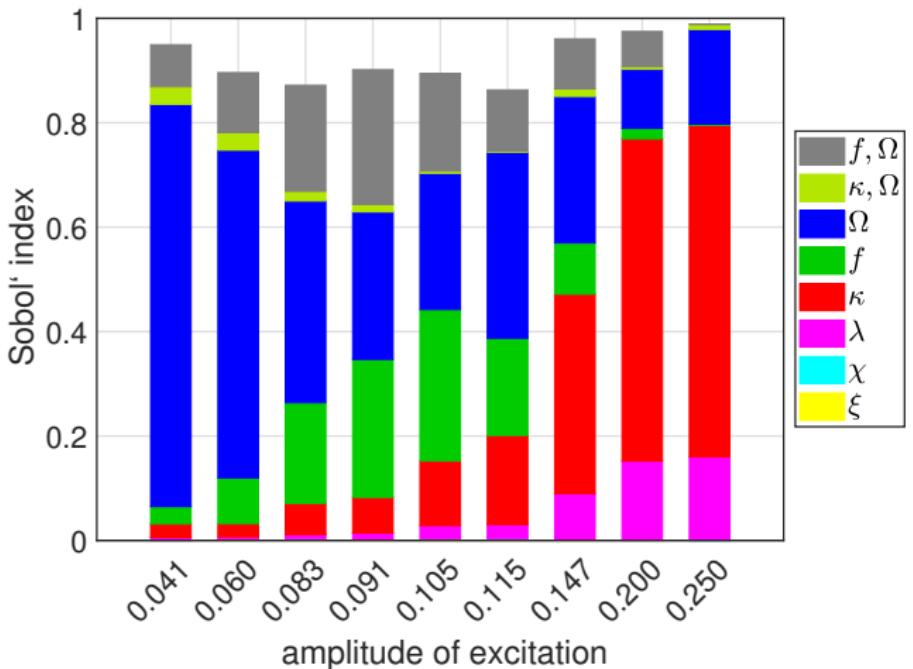
(quantify interaction effect of inputs X_i and X_j)



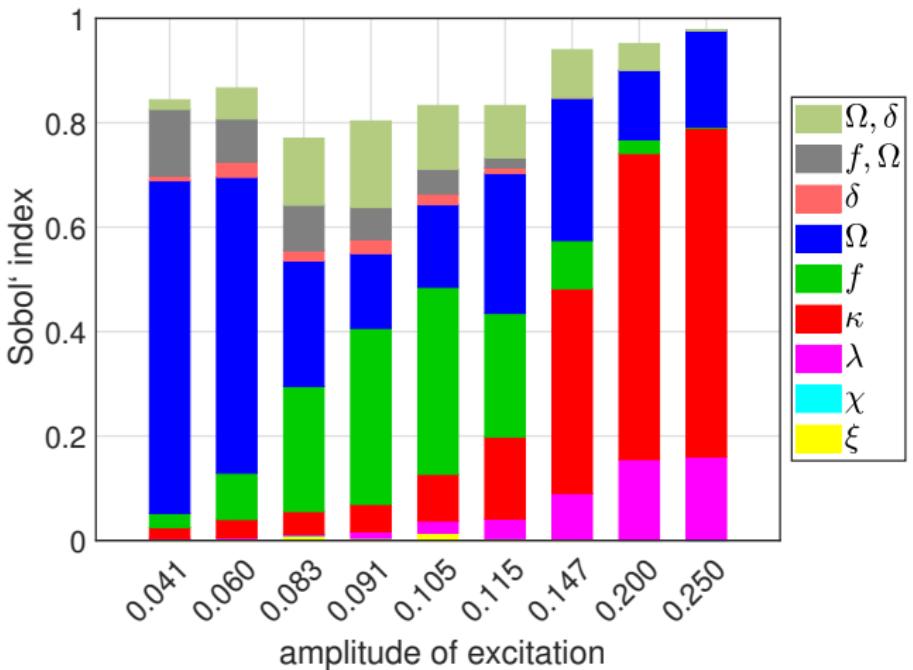
I.M. Sobol' *Global sensitivity indices for nonlinear mathematical models and their Monte Carlo estimates*. **Mathematics and Computers**

in *Simulation*, 55(1-3): 271-280, 2001.

Mean power sensitivity: symmetric system



Mean power sensitivity: asymmetric system



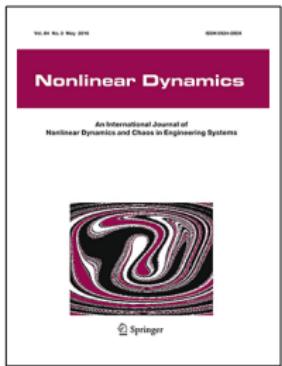
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Nonlinear Dyn (2022) 109:443–458
<https://doi.org/10.1007/s11071-022-07563-8>

ORIGINAL PAPER

Global sensitivity analysis of asymmetric energy harvesters

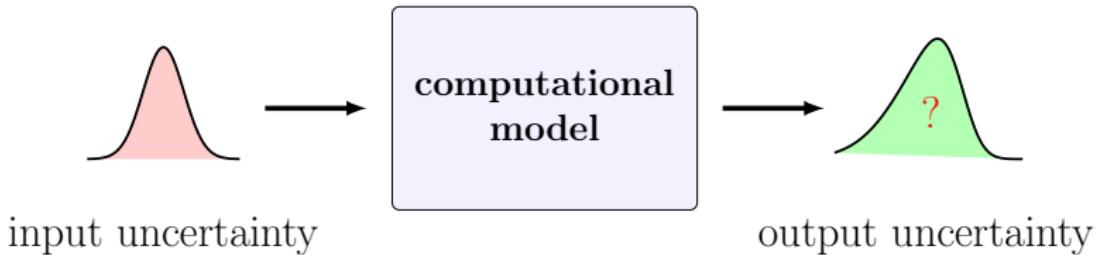


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Received: 9 July 2021 / Accepted: 23 May 2022 / Published online: 7 June 2022
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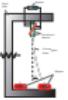
Seek to quantify how parameters variability influences the recovered power uncertainty



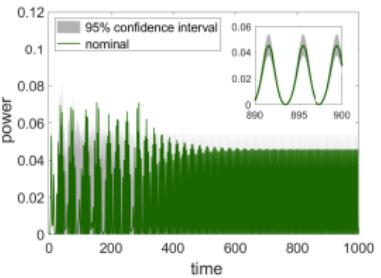
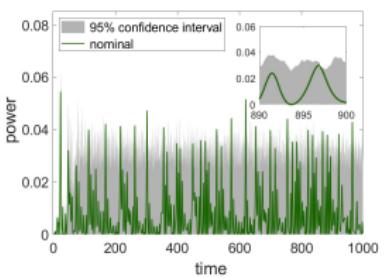
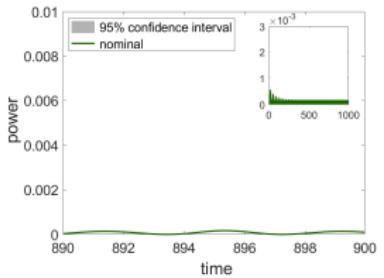
input uncertainty

output uncertainty

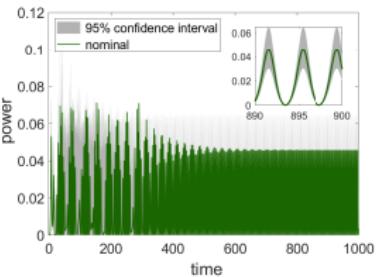
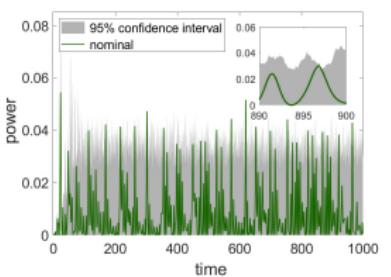
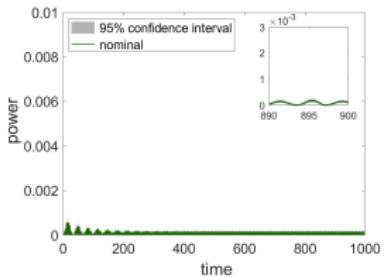
Recovered power evolution: symmetric system



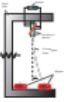
$$\lambda \sim \text{Uniform}(c.v. = 20\%)$$



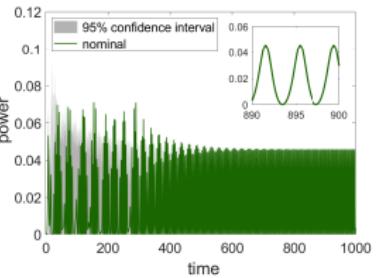
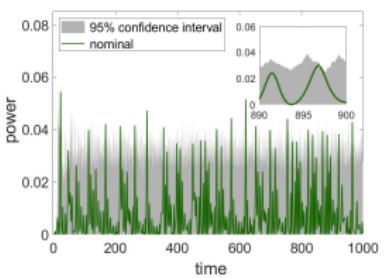
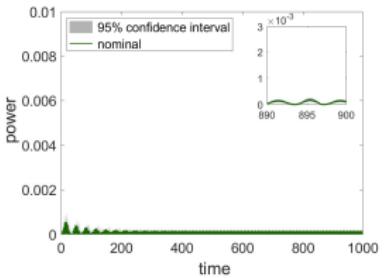
$$\kappa \sim \text{Uniform}(c.v. = 20\%)$$



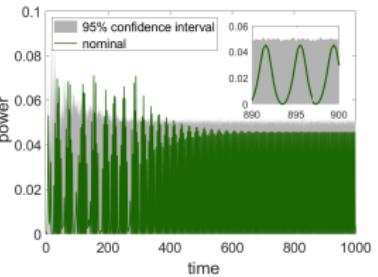
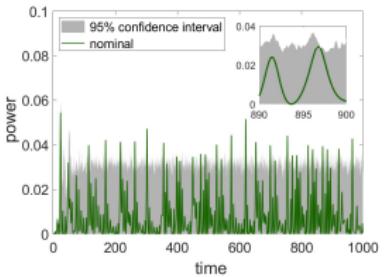
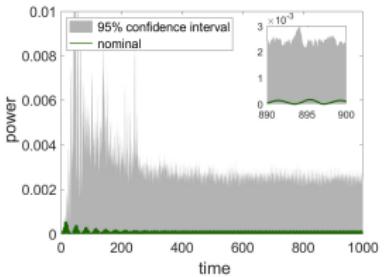
Recovered power evolution: symmetric system



$$f \sim \text{Uniform}(c.v. = 20\%)$$



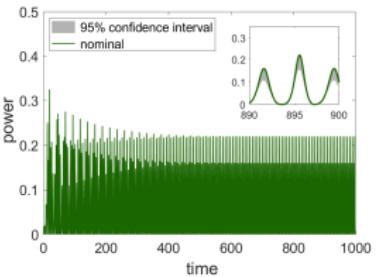
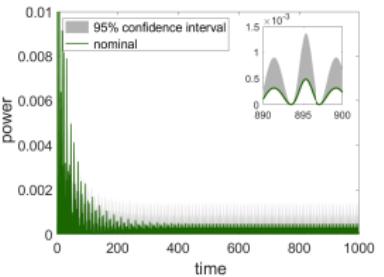
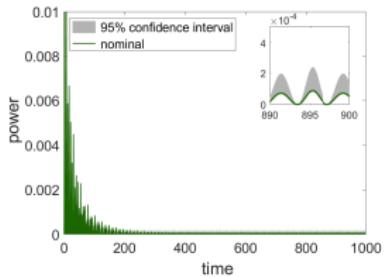
$$\Omega \sim \text{Uniform}(c.v. = 20\%)$$



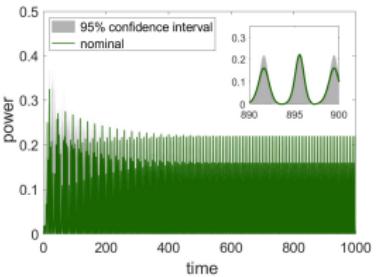
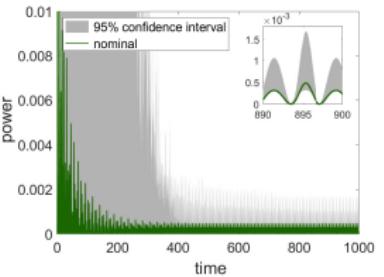
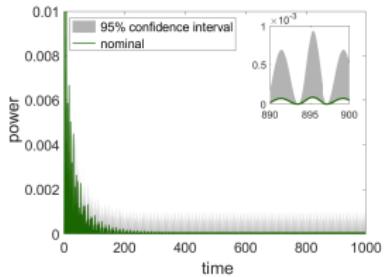
Recovered power evolution: asymmetric system



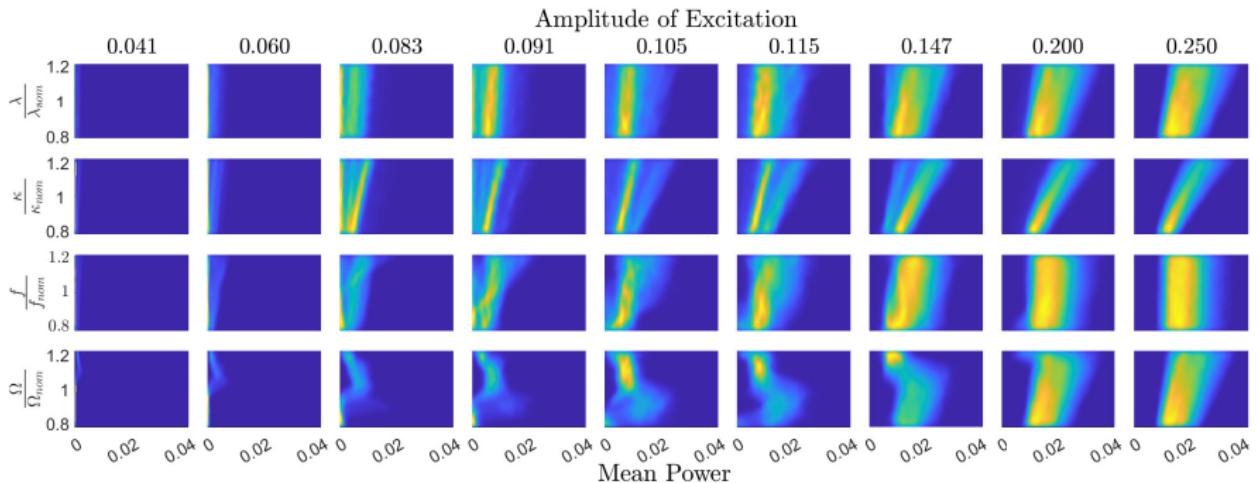
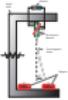
$$\delta \sim \text{Uniform } [-0.15 \ 0.15]$$



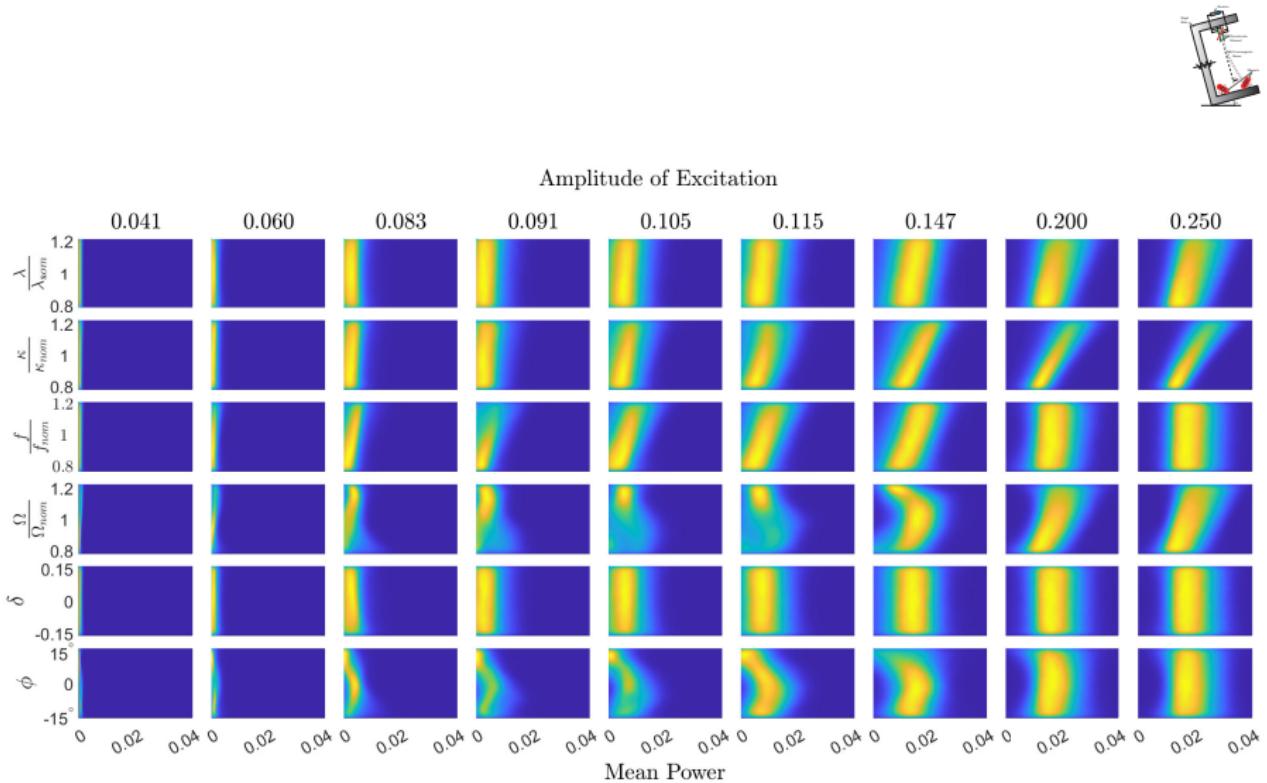
$$\phi \sim \text{Uniform } [-15^\circ \ 15^\circ]$$



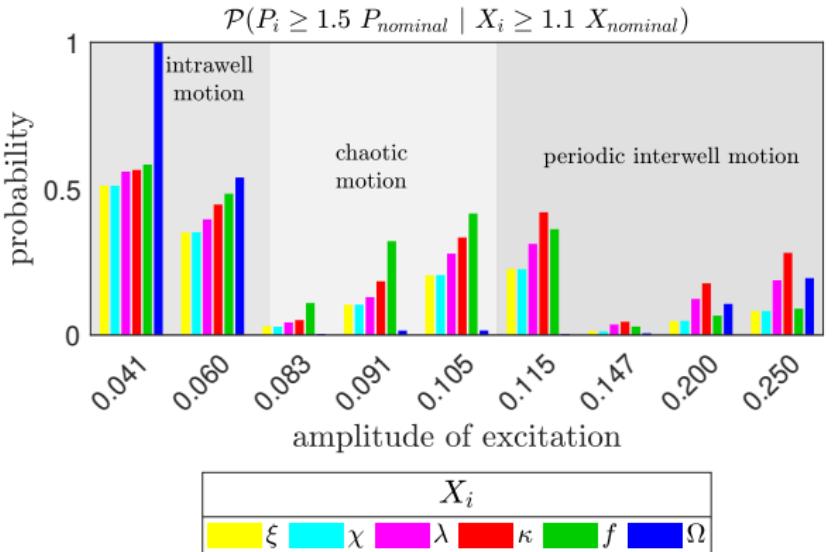
Mean power joint-CDF: symmetric system



Mean power joint-CDF: asymmetric system

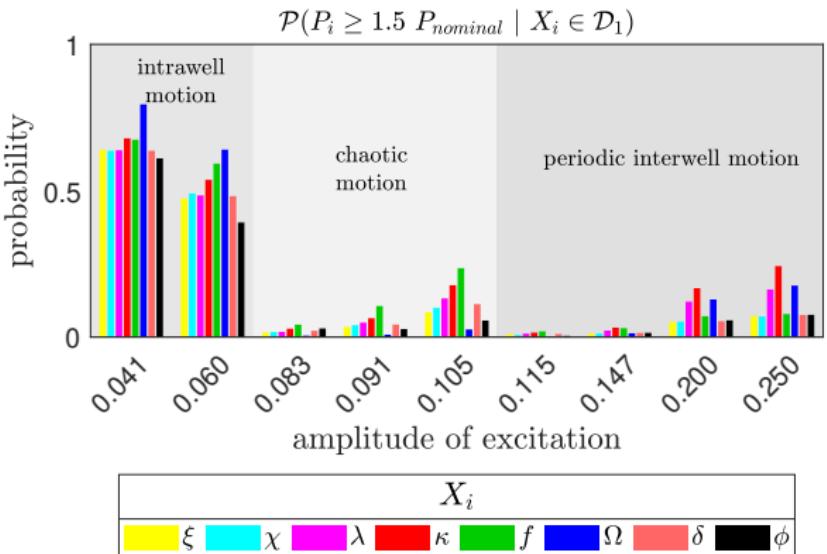


Conditional probability: symmetric system



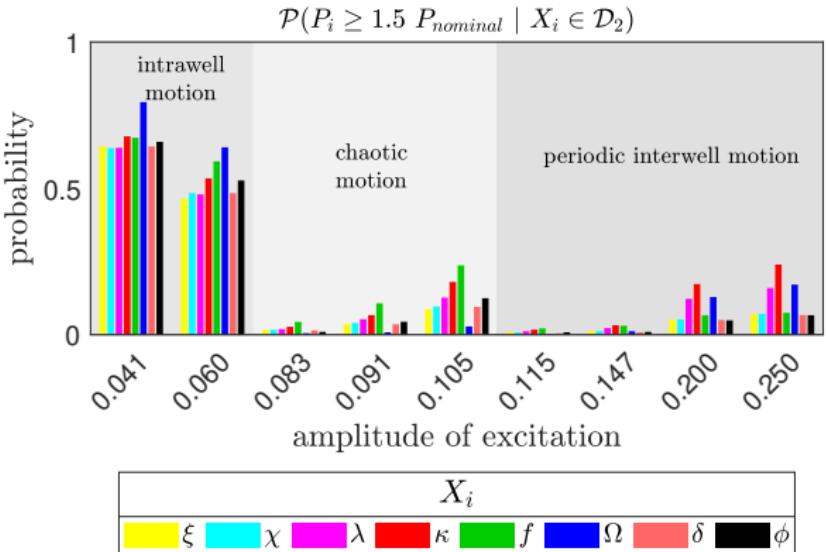
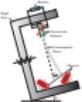
"Probability of nominal power increases by 50% given X_i increased by 10%"

Conditional probability: strongly asymmetry system



"Probability of nominal power increases by 50% given the system has strong asymmetry"

Conditional probability: weak asymmetry



"Probability of nominal power increases by 50% given the system has weak asymmetry"

Findings:

- ▶ Increasing the frequency of excitation leads to a greater probability of increasing the power harvested at introwell motion regions
- ▶ Increasing the amplitude of excitation is the best alternative to improve energy harvesting at chaotic regime
- ▶ Increasing the piezoelectric coupling showed a greater chance of increasing the power at the interwell region.
- ▶ Asymmetry configurations and the excitation condition are crucial to determine power performance

Ongoing research:

- ▶ Effect of environmental noise
- ▶ Experimental analysis

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manuscript No.
(will be inserted by the editor)



Probabilistic maps on bistable vibration energy harvesters

João Pedro Norenberg · Americo Cunha Jr. · Samuel da Silva ·
Paulo Sergio Varoto



J. P. Norenberg, A. Cunha Jr, S. da Silva, P. S. Varoto, *Probabilistic maps on bistable vibration energy harvesters*, arXiv, 2023

Download the software to play!



Software Impacts 10 (2021) 100161



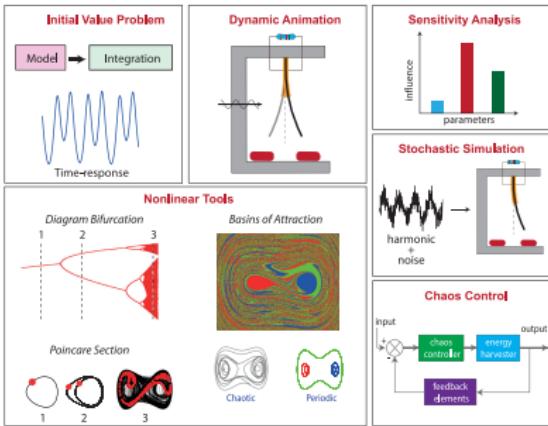
Original software publication

STONEHENGE — Suite for nonlinear analysis of energy harvesting systems

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J. P. Norenberg et al. STONEHENGE — Suite for nonlinear analysis of energy harvesting systems,
Software Impacts, 10:100161, 2021

Acknowledgments



Financial support:



Institutional support:



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