# Optimization of Heterogeneous Arrays of Wave Energy Converters 

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## Background/Research Question

- The WEC dimensions are usually designed for the prevailing sea conditions in a particular location.


Control co-design is desired.

- WEC arrays usually contain identical devices

Can we optimize the dimensions and control to maximize the overall power absorption?

- How can we further improve performance by optimizing the number of devices in the array?


## Dynamic Model: Spring-Mass-Damper Approximation

Water surface

## Array dynamics

$$
\left(M+M_{\infty}\right) \ddot{\vec{x}}+C_{r} \dot{\vec{x}}+K \vec{x}=\vec{f}_{e}-\vec{u}
$$

> Hydrodynamic coefficients

$$
\begin{aligned}
M_{\infty} & =\left[\begin{array}{ccc}
m_{\infty 11} & \cdots & m_{\infty 1 n} \\
\vdots & \ddots & \vdots \\
m_{\infty n 1} & \cdots & m_{\infty n n}
\end{array}\right] \\
C r_{\omega} & =\left[\begin{array}{ccc}
C r_{\omega 11} & \cdots & C r_{\omega 1 n} \\
\vdots & \ddots & \vdots \\
C r_{\omega n 1} & \cdots & C r_{\omega n n}
\end{array}\right]
\end{aligned}
$$

$>$ A simple point absorber WEC

$$
\left(m+m_{\infty}\right) \ddot{x}+C_{r} \dot{x}+k x=f_{e}-u
$$

$$
\mathrm{q}-\text { factor }=\frac{P_{\text {array }}}{N * P_{\text {isolated }}}
$$

## Problem I: Homogenous array optimization

## Homogenous array

$$
\text { Maximize: } q=\frac{P_{\text {array }}(R, D)}{N * P_{\text {isollated }}(R, D)}
$$



## Problem II: Heterogenous array optimization



Maximize: $p=\frac{P_{\text {heterogeneous }}}{P_{\text {homogeneous }}}$
Subject to:
$R_{i} \in\left[R_{\text {min }}, R_{\text {max }}\right], D_{i} \in\left[D_{\text {min }}, D_{\max }\right]$
Total Vol. of Het array $\leq$ Total Vol.of Hom.array.

## WEC Array Hydrodynamics

> We need to compute added mass, radiation damping coefficients, and excitation force coefficients.
> Boundary Element Methods tools vs. an approximate analytic method
> GA needs objective values only; qualitative conclusions on the objective values of different solutions are okay


## Approximate analytic coefficients computation

$$
\emptyset(r, \theta, z)=\overbrace{\emptyset_{0}(r, \theta, z)+\emptyset_{7}(r, \theta, z)}^{\text {Diffraction }}+\underbrace{\sum_{q=1}^{6} \emptyset_{q}(r, \theta, z)}_{\text {Radiation }}
$$



Fluid Domain.

## Validation of hydrodynamics




## Validation of hydrodynamics




## Validation of hydrodynamics




Computational speed

2 device array

|  | Semi Analytic | Nemoh |
| :--- | :--- | :--- |
| 2 | 4.18226 s | 113.814748 s |

The radii are, $r=5 m, R=8 m$, draughts $\mathrm{h}=8 \mathrm{~m}, \mathrm{H}=7 \mathrm{~m}$.

7 device array

|  | Semi Analytic | Nemoh |
| :--- | :--- | :--- |
| 7 | 13.9748 s | $2912.662 \mathrm{~s}(48 \mathrm{mins})$ |



## Control Force

> The objective function:

$$
\begin{equation*}
\text { Mininimze: } J\left(u(t), x_{2}(t)\right)=\sum_{n=1}^{N} \int_{0}^{t}\left\{-u_{n}(t) * x_{2 n}(t)\right\} d t \tag{3}
\end{equation*}
$$

Subject to EOM:

$$
\begin{gathered}
\dot{\vec{x}}_{1}=\vec{x}_{2} \\
\dot{\vec{x}}_{2}=\frac{1}{M}\left(\vec{f}_{e}\left(x_{3}\right)-C \vec{x}_{2}-K \vec{x}_{1}-\vec{u}\right) \\
x_{3}=1
\end{gathered}
$$

$>$ The power constraints and control constraints:

$$
\vec{u}(t) * \vec{x}_{2}(t) \geq-\vec{\epsilon}, \quad|\vec{u}(t)| \leq \vec{\Gamma}
$$

## Control Force and Power Computation




Energy extracted when using ORL and PCBSB.

## Simulation

The simulation parameters are as follows:

- Wave condition: $T=6 s, H=0.8222 \mathrm{~m}$. (site: Newport, Oregon)
- (Radius and draught) Upper Bound $=10 \mathrm{~m}$.
- (Radius and draught) Lower Bound $=1 \mathrm{~m}$.
- Hydrodynamic parameters are calculated using the approximate analytic method.
- Power from the array is computed using the constrained control PCBSB


## Homogenous array result - 3 Devices



## Homogenous array result - 5 Devices



## Heterogeneous array result: 3 devices



- Optimized dimensions
- Homogeneous: $R=7.2249 m$

| R1 | $\mathbf{R 2}$ | $\mathbf{R 3}$ | $\mathbf{p}$ |
| :---: | :---: | :---: | :---: |
| 7.7297 | 6.6232 | 6.6095 | 1.0668 |
| 7.7527 | 6.6143 | 6.6214 | 1.0667 |
|  |  |  |  |

Heterogeneous array result: 3 devices


## Heterogeneous array result: 5 devices



## Heterogeneous array result: 5 devices



## Problem III: HGGA-Heterogenous array optimization

## Heterogeneous array



Maximize: $p=\frac{P_{\text {heterogeneous }}}{P_{\text {homogeneous }}}$

Subject to:

$R_{i} \in\left[R_{\min }, R_{\max }\right], D_{i} \in\left[D_{\text {min }}, D_{\text {max }}\right], N \in\left[1, N_{\text {homogenous }}\right]$

Total Vol.of Het array $\leq$ Total Vol.of Hom.array.

## Problem III: HGGAHeterogenous array optimization



## Hidden Genes GA (HGGA)



## HGGA

- A variation on GA that allows optimizing the number of design variables, simultaneously with the variables.



## Example of 4 WECs

A maximum of 4 WECs
Variables: Radius R1 - R4, Draughts D1 - D4, and tags.


## Homogeneous Array from literature



Test case from Giassi 2018.
$R=2 \mathrm{~m}$, draft $\mathrm{d}=0.5 \mathrm{~m}$, and water depth $\mathrm{h}=25 \mathrm{~m}$.
Wave site in Lysekil on the Swedish west coast.

- Regular wave, wave height $\mathrm{H}=1.53 \mathrm{~m}$, period $\mathrm{T}=5.01 \mathrm{~s}$.
- Wave propagating along the x-axis.

$$
\text { Maximize: } p=\frac{P_{\text {heterogeneous }}}{P_{\text {homogeneous }}}
$$

HGGA-Heterogeneous array result



## Conclusion

- Investigated increasing power by allowing devices of different dimensions in the same array.
- Could allow the number of devices to vary during optimization
- Heterogenous arrays can produce more power while reducing total volume of buoys.


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Questions

## Semi-analytic hydro coefficients

$>$ In the whole fluid domain, the governing equation $\nabla^{2} \emptyset=0$
> Boundary conditions:
> Free surface boundary conditions

$$
\omega^{2} \emptyset-\left.g \frac{\partial \phi}{\partial z}\right|_{z=0}=0
$$

> Seabed condition $\left.\quad \frac{\partial \phi}{\partial z}\right|_{z=-d}=0$
$>$ Impermeable surface condition on the body surface

$$
\frac{\partial \phi}{\partial r}=0,(r=a,-h \leq z \leq 0), \frac{\partial \phi}{\partial z}=0,(0 \leq r \leq a, z=-h)
$$

> Summerfeld radiation condition $\quad \lim _{x \rightarrow \infty} \sqrt{r}\left(\frac{\partial \phi}{\partial r}-i k_{n} \varnothing\right)=0$

## Radiation: exterior potential functions

> The homogenous potential function
$\emptyset_{3, h}^{E}=D_{R 0} \frac{H_{m}\left(k_{0} r\right)}{H_{m}\left(k_{0} a\right)}+\sum_{q=1}^{\infty} D_{R q} \frac{K_{m}\left(k_{q} r\right)}{K_{m}\left(k_{q} a\right)}$
Progressive and evanescent waves.

$$
\emptyset_{3, p}^{E}=0
$$


(a) $m=0, n=0$


$$
\text { (d) } m=0, n=1
$$


(e) $|m|=1, n=1$
(f) $|m|=2, n=1$

(b) $|m|=1, n=0$


## Radiation: Interior potential functions

> Based on the methods of variable separation and matching eigenfunction expansion for the velocity potential.
> Separation of variables: $\emptyset_{3, m}^{I}(r, z)=\varnothing_{3, h}^{I}+\emptyset_{3, p}^{I}$
> The homogenous potential function

$$
\emptyset_{3, h}^{I}=\frac{C_{R 0}}{2}\left(\frac{r}{a}\right)^{m}+\sum_{n=1}^{\infty} C_{R n} \frac{I_{m}\left(\frac{n \pi r}{(d-h)}\right)}{I_{m}\left(\frac{n \pi a}{(d-h)}\right)} \cos \left(\frac{n \pi z}{(d-h)}\right)
$$

> The particular solution

$$
\emptyset_{3, p}^{I}=\frac{1}{2(d-h)}\left[(z+d)^{2}-\frac{r^{2}}{2}\right]
$$

## Continuity conditions

> In both the radiation and diffraction problems, the matching conditions represent the continuity of mass flux, pressure and normal velocity.
> The velocity potentials between interior and exterior domains are matched at the imaginary boundary $(r=a)$.
$\emptyset^{I}=\emptyset^{E}, \frac{\partial \phi^{E}}{\partial r}=\frac{\partial \phi^{I}}{\partial r}(-h \leq z \leq-d), \quad \frac{\partial \phi^{E}}{\partial r}=0,(-h \leq z \leq 0)$,
$>$ The unknown Fourier coefficients $C_{n}, D_{n}, C_{R n}, D_{R n}$ are solved using the matching conditions.
> The hydrodynamic coefficients are found by integrating the potential functions over their corresponding area.

