



## OTC-27039-MS Efficient Environmental and Structural Response Analysis by Clustering of Directional Wave Spectra

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#### OUTLINE

- Motivation
- Cluster Analysis Methodology
- Case study BC-10 Offshore Brazil
- Discussion and Conclusions

#### **MOTIVATION**

- Estimation of environmental and complex structural responses, such as fatigue for risers on deepwater floating production systems, is a critical and generally computationally intensive process.
- Long term damage estimates require the determination of host vessel motions used for riser stress calculations.
- In principle, riser stress could be calculated for each of a large number of directional sea states, a considerable computational burden.



#### CLUSTER ANALYSIS METHODOLOGY

- Cluster analysis provides a way of grouping a (typically large) number of individuals (such as directional spectra for consecutive sea states) into a (typically small) number of clusters.
- All members of the same cluster have similar characteristics.
- Each cluster has a cluster center, or centroid.
- All members of a given cluster are more similar to the cluster centroid for that cluster than to any other cluster centroid.

Non-hierarchical K-MEANS clustering: to find cluster allocations and centroid estimates such that the within-cluster sum of squares is minimized:  $\underline{m}$ 

$$I_{G}^{2} = \sum_{j=1}^{N} \sum_{X_{i} \in C_{j}} \|G(X_{i}) - G(\mu_{j})\|^{2}$$

#### WIND AND WAVE MEASUREMENT – BC10



#### **OBSERVED WAVE CLIMATE**



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#### **OBSERVED WAVE CLIMATE – TYPICAL WAVE SPECTRUMS**



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#### **RESPONSE ANALYSIS**



#### **CLUSTER ANALYSIS – WAVE SPECTRA**



#### **CLUSTER ANALYSIS – WITHIN-CLUSTER TOTAL RMS**



#### **CLUSTER ANALYSIS – EMPIRICAL CDFS**



#### **CLUSTER ANALYSIS – MAX CDF DIFFERENCE**



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#### **DISCUSSION AND CONCLUSIONS**

- For regions with dynamic and multi-modal seas, such as offshore Brazil, more sophisticated techniques are needed to identify a small yet relatively representative set of directional wave spectra.
- We demonstrated that the representative sea states provide an efficient basis for estimation of overall sea state bulk, wind sea and swell characteristics.
- K-MEANS is a computationally efficient algorithm.
- We evaluated the effect of cluster size on the performance of the representative sea states, 100-cluster solution provides a relatively good approximation at BC-10 area offshore Brazil.
- Guidelines for the application of the methodology are provided.
- The linear transfer function (RAOs) approach may not be as appropriate for extreme environmental conditions and highly non-linear systems, for which full time-domain hydrodynamic response analysis might be required.

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### **Questions?**

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