

Summer PhD School in

Uncertainty Quantification and Reliability Assessment of Offshore Wind Turbines

LEARNING OBJECTIVES

- 1) Understand the wind turbine design assessment process and be familiar with the major standards and the prescriptions (load cases, limit states) defined in them
- 2) Know the building elements and the modelling chain required to set up a reliability assessment for offshore wind turbines (e.g. limit states, system variables, environmental variables and uncertainties)
- 3) Identify key variables and describe them through probability distributions
- 4) Select appropriate sampling strategies depending on the problem at hand (space-filling vs. for numerical integration)
- 5) Assess model uncertainty through comparing models of different fidelity
- 6) Carry out uncertainty propagation and numerical integration to compute reliability indexes
- 7) Train several types of surrogate models and carry out global sensitivity analysis
- 8) Know how to implement reliability and UQ problems in Python using existing frameworks

PRACTICAL DETAILS:

Time: 28-31 August 2023 (4 days with physical presence)

Location: DTU Wind Energy campus, Frederiksborgvej 399, 4000 Roskilde, Denmark

Price: free for participants among project partners.

Included with registration: lunches, coffee and refreshments

Day 1: Monday 28-08-2023

| Time | Title | Presenter | Notes |
|---------------|---|--|---|
| 09:00 - 09:15 | Welcome and intro | N. Dimitrov | |
| 09:15 – 09:45 | Introduction to probabilistic design | N. Dimitrov, Mark Kelly (DTU) | Introduction to the main elements of Prob. Design – potential applications, benefits over classical design. Illustrative examples from wind energy. |
| 09:45 – 10:30 | Uncertainty quantification basics – part 1 | S. Marelli (ETHZ) | Different ways of dealing with uncertainty: - Uncertainty propagation - Reliability analysis - Sensitivity analysis |
| 10:30 – 10:45 | Coffee break | | |
| 10:45 – 11:30 | Uncertainty quantification basics – part 2 | S. Marelli (ETHZ) | Different ways of dealing with uncertainty – continued. Concept of surrogate models. |
| | | | Practical example with UQLab |
| 11:30 – 12:15 | Uncertainties inherent for the wind turbine design process (modelling chain) | Alexis Cousin (IFPEN) (online) | Discuss the types of uncertainty, how they affect the design and how they could potentially be estimated |
| 12:15 – 13:15 | Lunch | | 5: |
| 13:15 – 14:00 | Uncertainties inherent in atmospheric modelling and their effect on loads and reliability | Mostafa Paskyabi (UiB) (online) | Discuss the types of uncertainty affecting the atmospheric models (e.g. multi-scale models) and how they propagate to wind turbine loads. |
| 14:00 – 14:45 | Introduction to popular UQ frameworks | Vincent Chabridon, Elias Fekhari (EDF) | Introduction to OpenTURNs - on-screen examples |
| 14:45 – 15:15 | Coffee break | | |
| 15:15 – 17:00 | Introduction to the study cases and programming environments. Form groups, initialize group work. Group work, initialize and test the study case, data loading and visualization. | Group work supported by teachers | Intro to study cases. Help with programming environments and running test scripts. |

Day 2: Tuesday 29-08-2023

| Time | Title | Presenter | Notes |
|---------------|-------------------------|------------------|----------------------------|
| 09:00 - 09:45 | Introduction to | J.D.Sørensen | Guest lecturer. IEC |
| | probabilistic design | (AAU) | Standard design basis, |
| | guidelines and the | | meaning of safety factors. |
| | IEC standards system | | |
| 09:45 – 10:30 | Distribution fitting – | Erik Vanem | Joint distribution fits, |
| | part 1 | (DNV) | copulas, isoprobabilistic |
| | | | transformations |
| | | | (Rosenblatt, Nataf) |
| 10:30 – 10:45 | Coffee break | | |
| 10:45 – 11:30 | Distribution fitting – | Erik Vanem | Extreme distributions, |
| | part 2 | (DNV) | environmental contours |
| 11:30 – 12:15 | Model uncertainties | Christian Agrell | Introduction to Gaussian |
| | characterization using | (DNV) | processes and how to use |
| | Gaussian models | | that to create emulators |
| | | | and surrogate models |
| 12:30 – 13:30 | Lunch | | |
| 13:30 – 15:00 | Group exercise: fitting | Group work | |
| | of environmental | supported by | |
| | distributions | teachers | |
| 15:00 – 15:30 | Coffee break | | |
| 15:30 – 17:30 | Group exercise: limit | Group work | |
| | state formulation, | supported by | |
| | choice of variable | teachers | |
| | distributions | | |

Day 3: Wednesday 30-08-2023

| Time | Title | Presenter | Notes |
|---------------|---|---|---|
| 09:00 – 10:15 | Inspiration with advanced UQ topics – part 1 | Vincent Chabridon, Elias Fekhari (EDF) | Advanced sensitivity analysis (Vincent Chabridon) Advanced sampling with Kernel herding (Elias Fekhari) |
| 10:15 – 11:00 | Common reliability assessment methods | Nikolay Dimitrov (DTU) | Overview of common reliability methods |
| 11:00 – 11:15 | Coffee break | | |
| 09:45 – 11:00 | Exercise – simple MC-FORM-IS analysis | Emmanuel Ardillon (EDF) | Includes a description of advanced FORM-IS analysis |
| 12:30 - 13:30 | Lunch | | |
| 13:30 – 14:15 | Inspiration with advanced UQ topics – part 2 | Nikolay Dimitrov (DTU) | The Hiperwind project: learnings and inspiration for practical UQ and reliability assessment |
| 14:15 – 14:30 | Closing and wrap-up of the lecture-based part of the course | | |
| 14:30 – 15:00 | Coffee break | | |
| 15:00 – 17:30 | Group exercise: fitting an uncertainty model between a data-driven surrogate model and aeroelastic load simulation data | | Group work supported by teachers |

Day 4: Thursday 31-08-2023

| Time | Topic | | |
|---------------|--|--|--|
| 09:00 – 15:00 | Main theme: course work, programming | | |
| | Main goal: complete reliability assessment in ULS | | |
| | Finalize the limit state definition | | |
| | Populate the uncertainty models | | |
| | Choose appropriate reliability assessment methods and run analysis | | |