Treatment of uncertainties in multi-physics model for wind turbine asset management

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"Good" properties

[Curse of dim / Sequential / Deterministic]

Gauss-Kronrod

Monte Carlo

Quasi-Monte Carlo and Koksma-Hlawka inequality

1.3.2 Numerical design of experiments

Space-filling metrics

[MinMax / PhiP / MaxMin / Discrepancies]

"Good" properties

[Curse of dim / Projections in sub-spaces / Sequential / Deterministic]

Monte Carlo, quasi-Monte Carlo, randomized quasi-Monte Carlo designs

LHS, optimized LHS designs

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Iso-probabilistic transformation

Central tendency estimation is a probabilistic integration

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FORM/SORM

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