Sensitivity Analysis

- Definition
 - Influence of uncertainty in input on the uncertainty of the output

- Applications
 - Robustness test in the presence of uncertainty
 - Increased understanding on the relations between input and output variables
 - Uncertainty reduction

- Main methods
 - One-at-a-time (OAT)

- Main methods
 - Scatter plots

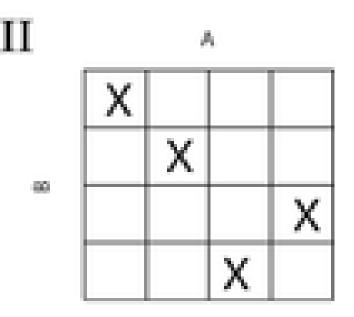
- Main methods
 - Design of experiments
 - Full factorial design
 - Fractional factorial design

- Main methods
 - Design of Experiments (DOE)
 - Plackett-Burman design (1946)

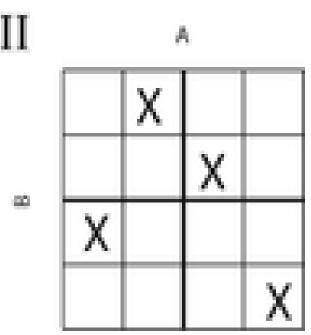
Plackett–Burman design for 12 runs and 11 two-level factors^[2] For any two X_i, each combination (--, -+, +-, ++) appears three - i.e. the same number of times.

Run	X 1	X2	X 3	X4	X 5	X ₆	X7	X 8	X ₉	X ₁₀	X ₁₁
1	+	+	+	+	+	+	+	+	+	+	+
2	-	+	-	+	+	+	-	-	-	+	-
3	-	-	+	-	+	+	+	-	-	-	+
4	+	-	-	+	-	+	+	+	-	-	-
5	-	+	-	-	+	—	+	+	+	-	—
6	-	-	+	-	-	+	-	+	+	+	-
7	-	-	-	+	-	-	+	-	+	+	+
8	+	-	-	-	+	-	-	+	-	+	+
9	+	+	-	-	-	+	-	-	+	-	+
10	+	+	+	-	-	-	+	-	-	+	-
11	-	+	+	+	-	-	-	+	-	-	+
12	+	-	+	+	+	_	_	-	+	-	-

- Main methods
 - Design of Experiments (DOE)
 - Latin Hypercube sampling (LHS)



- Main methods
 - Design of Experiments (DOE)
 - Orthogonal sampling



General SA Methods

- Constraints in selecting SA methods
 - Computational expense
 - Correlated inputs
 - Nonlinearity
 - Interactions among factors
 - Complicated output

General SA Methods

- General SA methodology
 - 1) Quantify the uncertainty in each input factor, including ranges, probability distribution
 - 2) Identify the model output to be analyzed
 - 3) Run the model using the sampled cases
 - 4) Analyze the sensitivity measures

General SA Methods

- General SA results
 - The most and least influential factors
 - Uncertainty in output associated with the uncertainty in inputs
 - Possible interaction of varied factors

Reading Material for SA

• SA on HM:

<u>https://www.onepetro.org/download/conference-paper/SPE-6102-MS?id=conference-paper%2FSPE-6102-MS</u>

- SA methods: <u>http://web.engr.oregonstate.edu/~hambydm/papers/s</u> <u>enscomparison.pdf</u> <u>http://dpannell.fnas.uwa.edu.au/dpap971f.htm</u>
- DOE methods

https://en.wikipedia.org/wiki/Design of experiments