



**International Experts' Meeting on Strengthening Research and
Development Effectiveness in the Light of the Accident at the
Fukushima Daiichi Nuclear Power Plant**
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*Implementation of External Event Modeling in Advanced
PSA Studies*

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- **Combination** of correlated external hazards
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- Complementary use of **PRA** and more “**classical**” deterministic principles in **risk-informed** approach
- PSA or (PRA) has evolved over many years, and in various jurisdictions, as a useful *tool* to evaluate NPP risk and support risk-informed decision making
 - e.g., providing insights on design vulnerabilities
- By means of PSA, established **safety goals** have been quantitatively analyzed as one method of demonstrating reactor safety
- **Probabilistic Risk Analysis**
 - Comprehensive treatment of operating states
 - Comprehensive treatment of internal and **external hazards**

- **Lessons learned** from Fukushima event for **PSA**
- **Gaps** in PSA state of practice, e.g.
- PSA for **extreme** external events
- **Site-wide** risk
 - **Multiple units**
 - Spent fuel pools
- **Extended** accident scenarios
 - **Long-term** station blackout
 - Loss of **ultimate** heat sink
- Performance assessment of **passive systems** to mitigate the consequences of events initiated by external hazards
- The role of operator under extreme harsh conditions (**human reliability**)

- Relevant factors pertinent to PSA studies
- PSA for **external events**
 - Dependencies between certain **classes of hazards**
 - Dependencies between **seismic events** and **tsunamis**
 - **Modeling** in PSA framework
- **Implementation** of PSA **models** to incorporate the hazards **combination**
- Requirement to consider **correlated hazards** as emphasized by Fukushima accident, e.g.
 - **Combination of extreme hazards**, between seismic events and tsunamis
 - **External hazard-induced initiating events**, e.g. tsunami induced flooding
- Simplifying assumption of **independence** to be avoided
- **Models** suitable to describe the **correlation** mechanisms

- Common Cause **Initiators**, like e.g.
 - Seismic hazard and tsunamis, as events **sharing the same source** of origin
 - Strong winds and heavy rain, as **phenomenological correlated** events
 - Seismic hazards and seismically induced fire, as **induced hazards**
- Not **site-specific** analysis
- “Technology **neutral** framework”
- **Frequency** assessment of correlated hazards
 - Available site-specific information
 - Uncertainties

- **Easiest** and “uncomplicated” way to assess the frequency of two or more external events occurring simultaneously
 - independent events
 - overall frequency as the product of the single frequencies
- Single frequencies actually not suitable to be chosen independently of each other, e.g. because of **synergism** between different events
 - **Synergistic effects** trigger an accident sequence with the potential to challenge the system performance and safety at a more severe degree and extent
- Implementation of the initiating event quantification process
- **Interaction** between the **frequencies** of the single events

- **Dependent** external events
- **Joint pdf** (probability distribution function) of single frequencies
- Simple case of two dependent events with frequencies x_1 and x_2 and distributions $f(x_1)$ and $f(x_2)$

$$f(x_1, x_2) \neq f(x_1) * f(x_2)$$

$$f(x_1, x_2, \dots, x_n) \neq f(x_1) * f(x_2) * \dots * f(x_n) \text{ for } n \text{ events}$$

- Application of the **conditional probability** concept to include the dependencies between the events
 - **marginal** distributions relative to the conditioning and conditioned events

- **Conditional** probability for events A and B

$$P(A / B) = \frac{P(AB)}{P(B)}$$

- **Conditional** probability **density function**

$$f(y / x) = \frac{f(x, y)}{f_x(x)}$$

- **Marginal** density f_x

$$f_x(x) = \int_{-\infty}^{\infty} f(x, y) dy$$

- **Conditional** probability

$$F(y / x) = P(y < Y / x = X) = \int_{-\infty}^y f(y / x) dy$$

Illustrative example

- **Exemplary** application for combination of two events, e.g earthquake and tsunami

Normal pdfs

$$f(x) = (1/\sigma\sqrt{2\pi}) \exp - ((x - \mu)^2/2\sigma^2)$$

Standard form **N(0,1)**

$$f(t) = (1/\sqrt{2\pi}) \exp - (t^2/2) \quad t = (x - \mu)/\sigma$$

Parameter	Range (a-b, 1/year)	Characteristics (1/year)
x_1	3-7 E-1	$\mu = 5.0E-1$ $\sigma = 1.0E-1$
x_2	2-6 E-1	$\mu = 4.0E-1$ $\sigma = 1.0E-1$

Parameter characteristics

2 σ range corresponding roughly to **95%** of confidence interval

- **Joint probability distribution** of two normal random variables x and y (standard form): **general** expression

$$f(x, y) = (1/2\pi(1 - \rho^2)^{1/2}) \\ \times \exp - ((x^2 + y^2 - 2\rho xy)/2(1 - \rho^2))$$

$$\rho = \sigma_{12}/(\sigma_1 \sigma_2) \quad \text{correlation coefficient}$$

$$\sigma_{12} = \text{COV} \quad \text{covariance}$$

$$\rho = 0 \quad \text{bivariate distribution of uncorrelated normal variables}$$

Bivariate normal distribution cont'd



- **Bivariate** distribution of **correlated** normal variables ($\rho \neq 0$)

– **Average** matrix

$$\begin{bmatrix} \mu_1 \\ \mu_2 \end{bmatrix}$$

– **Variance-covariance** matrix

$$\begin{bmatrix} \sigma_1^2 & \sigma_{12} \\ \sigma_{21} & \sigma_2^2 \end{bmatrix} \quad \sigma_{12} = \sigma_{21} = \text{COV}(x, y)$$

$$\begin{bmatrix} \mu_1 \\ \mu_2 \end{bmatrix} = \begin{bmatrix} 5^* \\ 4^{**} \end{bmatrix} \quad \begin{bmatrix} \sigma_1^2 & \sigma_{12} \\ \sigma_{21} & \sigma_2^2 \end{bmatrix} = \begin{bmatrix} 1^* & 0,9^{**} \\ 0,9^{**} & 1^* \end{bmatrix}$$

* read as 5.0E-1
** read as 4.0E-1

*read as 1.0E-2
**read as 0.9E-2

$\rho = 0,9$
 $\text{COV} = 0,9 \text{ E-}2$

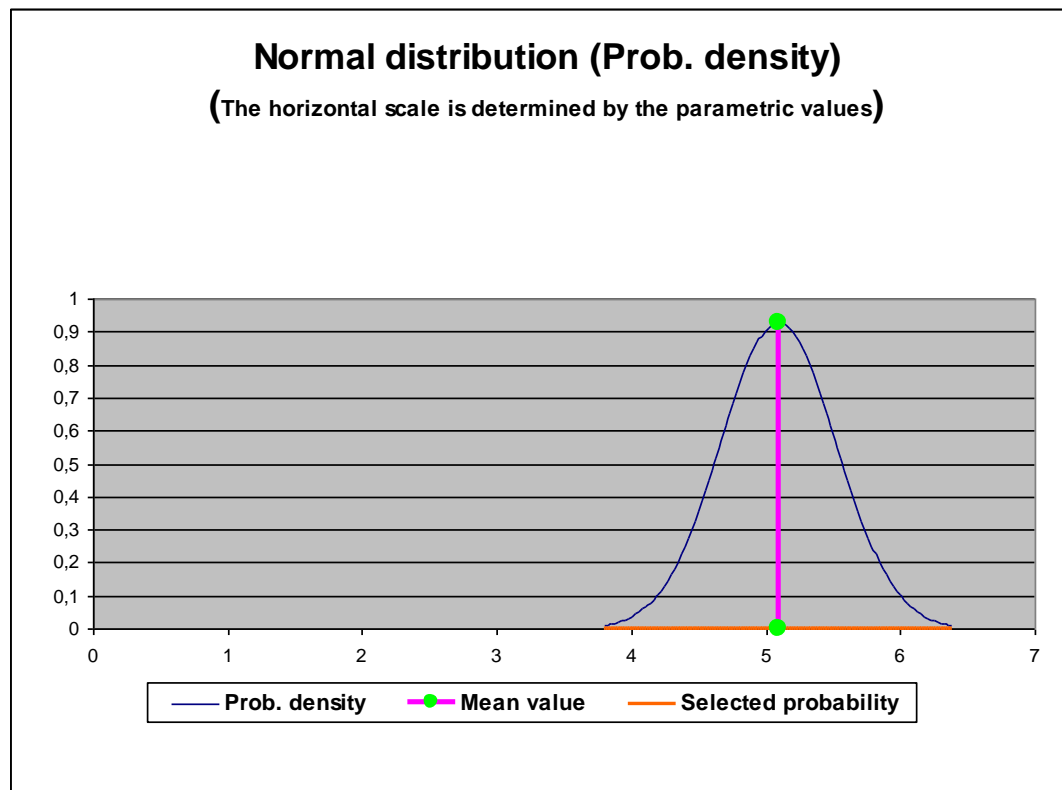
- $P = \int \int f(x,y)$
- Numerical integration techniques required
- **Conditional** distribution of y , given $x = X$
 - **normal** distribution

$$f(y/x=X) = \text{Nor} (\mu_y + \rho(\sigma_y / \sigma_x)(x - \mu_x), \sigma^2_y(1 - \rho^2))$$

- **Probability of the correlated events** (y and x), given a certain frequency value for one of them, let's say x

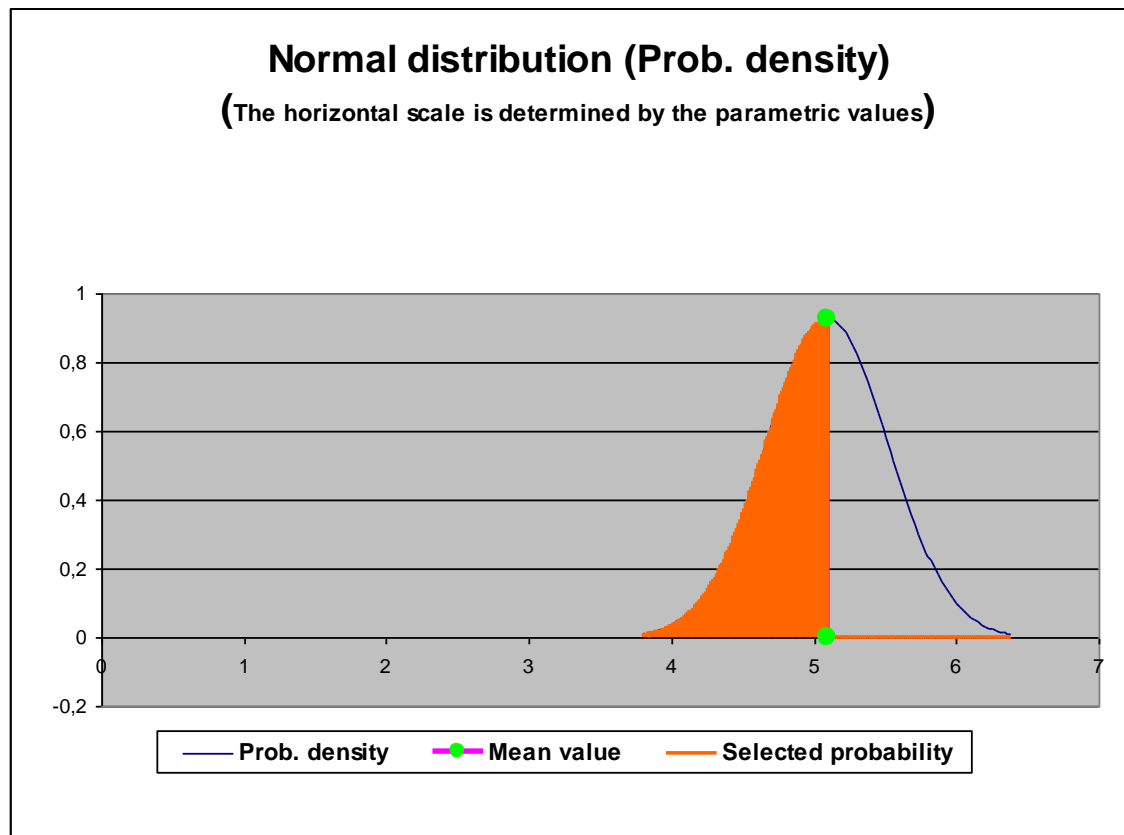
Illustrative example results

- **Correlated** external events probability distribution, upon one single external event frequency assuming a value of $4.1E-1/\text{year}$
- $E(y/x=4,1 * E-1/\text{year}) = 5,09E-1/\text{year}$
- $\sigma(y/x=4,1 * E-1/\text{year}) = 0,43E-1/\text{year}$
- $f(y/x=4,1 * E-1/\text{year}) = \text{Nor}(5,09 * E-1/\text{year}, 0,43 * E-1/\text{year})$



Illustrative example results cont'd

- Probability of **both** events, with frequency $5.1E-1/\text{year}$ and $4.1E-1/\text{year}$
- $P(y \leq 5,1 * E-1 / x = 4,1 * E-1) = \Phi(0,023) = 0.5$



- Approach relevance
 - **Induced** accidents, as e.g. external hazard induced initiating events, as earthquake-induced fire or tsunami-induced flooding
- Inclusion of more external events, by **multivariate** (normal) distributions
- **Whole probabilistic** safety analysis
 - External events **PSA models** for safety systems to assure critical functions in case of
 - Loss of AC power to safety equipments
 - Loss of cooling capability
 - Conditional probability as a **measure** of the protection systems availability

- **Risk** associated to the correlation of hazards **underestimated** by many PSA teams
- **Lack** of scientific understanding of the correlation of hazards with other hazards or events
- Lack of **site specific** data on which estimations for those correlations could be based
- Correlated or simultaneous events perceived as **very unlikely**
- **Dismissed** in the **screening process** as minor contributors for core damage

- **Models** to address the **combination** of **correlated external events** in a PSA framework
 - Joint pdf of event frequencies
- **Dependence** between the marginal distributions
 - **Correlation** coefficient
 - **Conditional** distribution
- **Exploratory** study
 - PSA issue as emerging from Fukushima accident
 - Results are shown for illustrative purposes
 - Generic numerical values
 - No **site-specific** data for statistical inference

Thank you for your attention!