



**AREVA**

# Application of Probabilistic Methods to Fuel Rod Design Evaluation

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Fuel Rod Designs for Water Cooled Reactors"

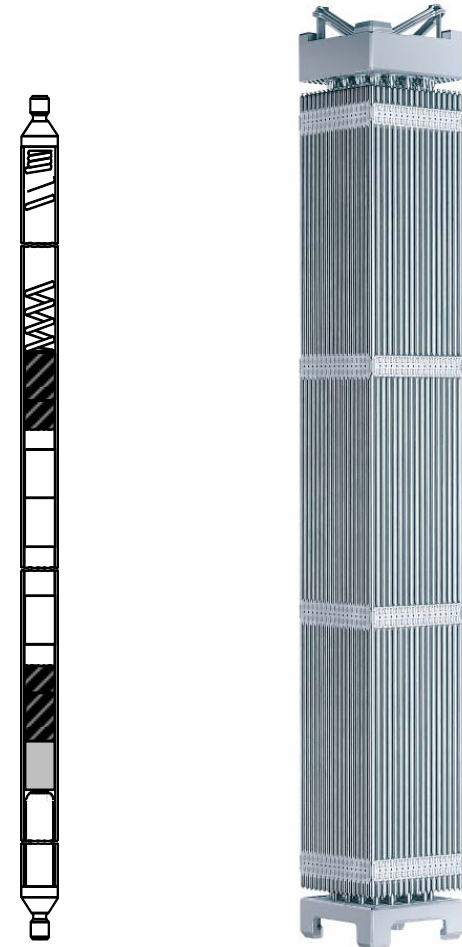


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# Introduction

- ▶ **Safety concept of nuclear power plants**
  - ◆ Relies on a system of multiple barriers
  - ◆ Preclude the release of radioactive material
- ▶ **Fuel rods**
  - ◆ Gas-tight welded fuel rods
  - ◆ First and important barrier of this concept
  - ◆ Confine uranium and/or plutonium fuel
  - ◆ Confine solid and gaseous radioactive fission products
- ▶ **Demands on fuel rod design**
  - ◆ Preclude systematic defects by limitation of temperature, strain, internal pressure, ...
  - ◆ Proof is performed by applying appropriate codes and methods



Fuel rod (up to ca. 80000 per core)

Fuel assembly (up to ca. 840 per core)

- ▶ **Fuel rod design and probabilistic methods – a brief history**
  - ◆ **First-of-a-kind application of probabilistic methods under plant normal operation conditions to cope with advanced demands**
  - ◆ **Developed by the predecessor of today's AREVA NP GmbH, the Siemens AG since late 1980s**
  - ◆ **Applied to licensing issues since 1995**
  - ◆ **Proven to be a very stable, powerful, and flexible tool.**
- ▶ **Probabilistic methods in general**
  - ◆ **Illustration of the potential and benefit**
  - ◆ **Description of fundamental mathematical aspects**



**Introduction of probabilistic methods in fuel rod design is an excellent demonstration of a successful introduction of an advanced method to cope with new challenges.**

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# Evolution of Demands

## ► Significant drivers for improved methodologies in the nuclear industry

### ◆ Economic reasons

- Economically optimized plant and fuel utilization of existing nuclear power plants
- Power uprates of plants (up to 20% in thermal power) → increased power density
- Increased enrichment approaching and reaching the limit of 5 w/o U235 for commercial LWRs
- Extended rod burnups up to 75 MWd/kg(HM)

### ◆ Ecological reasons

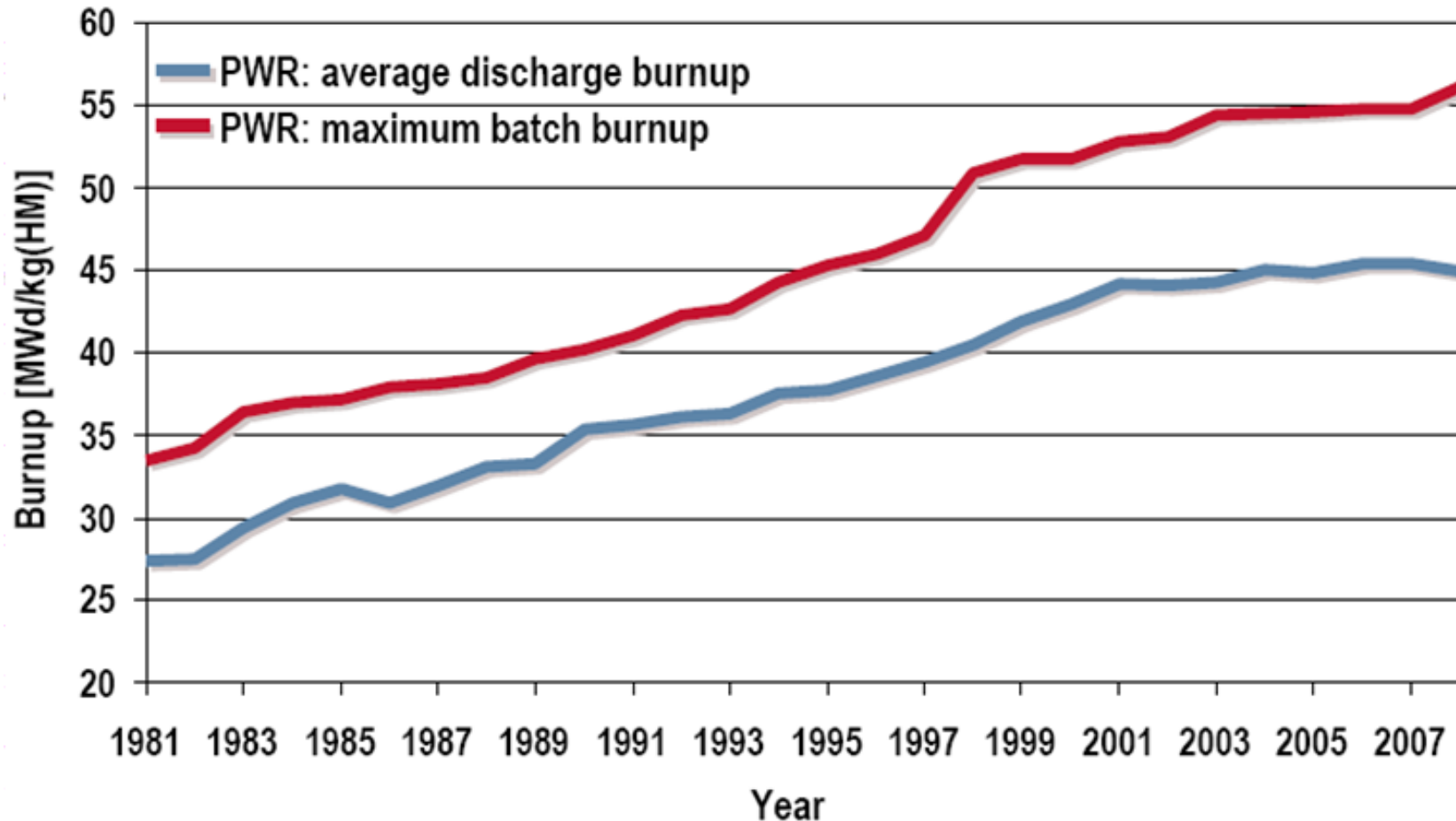
- Improved fuel utilization reduces reload and discharge batches
- Decreased amount of spent fuel what can be directly related to the average fuel assembly burnup of discharge batches (see next two slides)



# Evolution of Demands

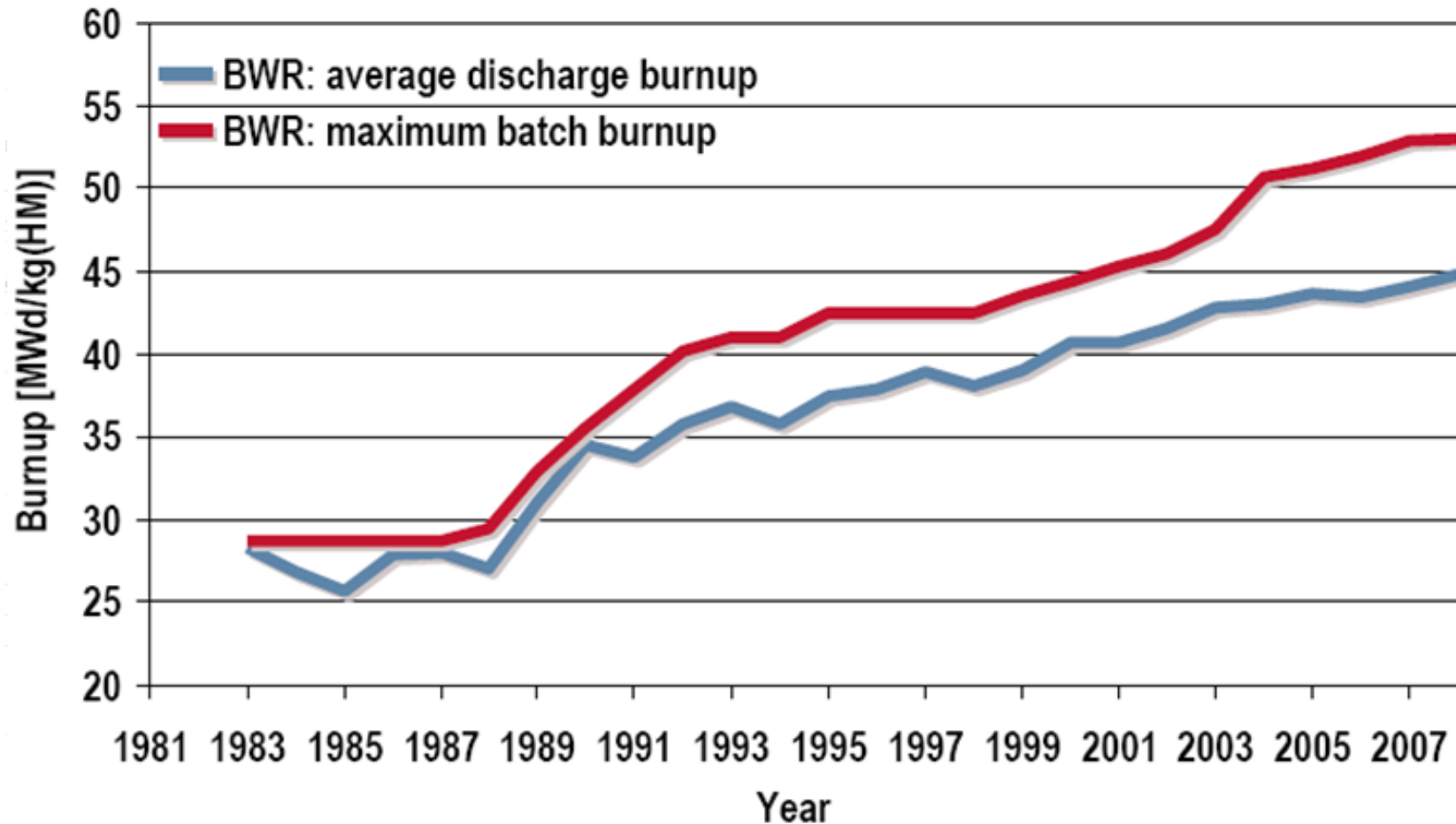
## PWR:

Increase in average and maximum discharge burnup over the last decades



# Evolution of Demands

► **BWR:**  
Increase in average and maximum discharge burnup over the last decades



# Evolution of Demands

## ► Increasing technical challenges in view of economical and ecological demands

### ◆ Technical safety-related reasons

- High power at high burnup for  $\text{UO}_2$  fuel with high enrichment or MOX fuel with high fissile plutonium content
- New regimes were continuously approached by the lead test assemblies programs accompanied by comprehensive inspection campaigns
  - Pool measurements
  - Post irradiation examination
- The latest experience for fuel rods is very challenging
  - Not preconceived from established codes and methods
  - Example: fission gas release database for  $\text{UO}_2$  rods irradiated in commercial PWRs in the mid 1990s and today (see next slide)

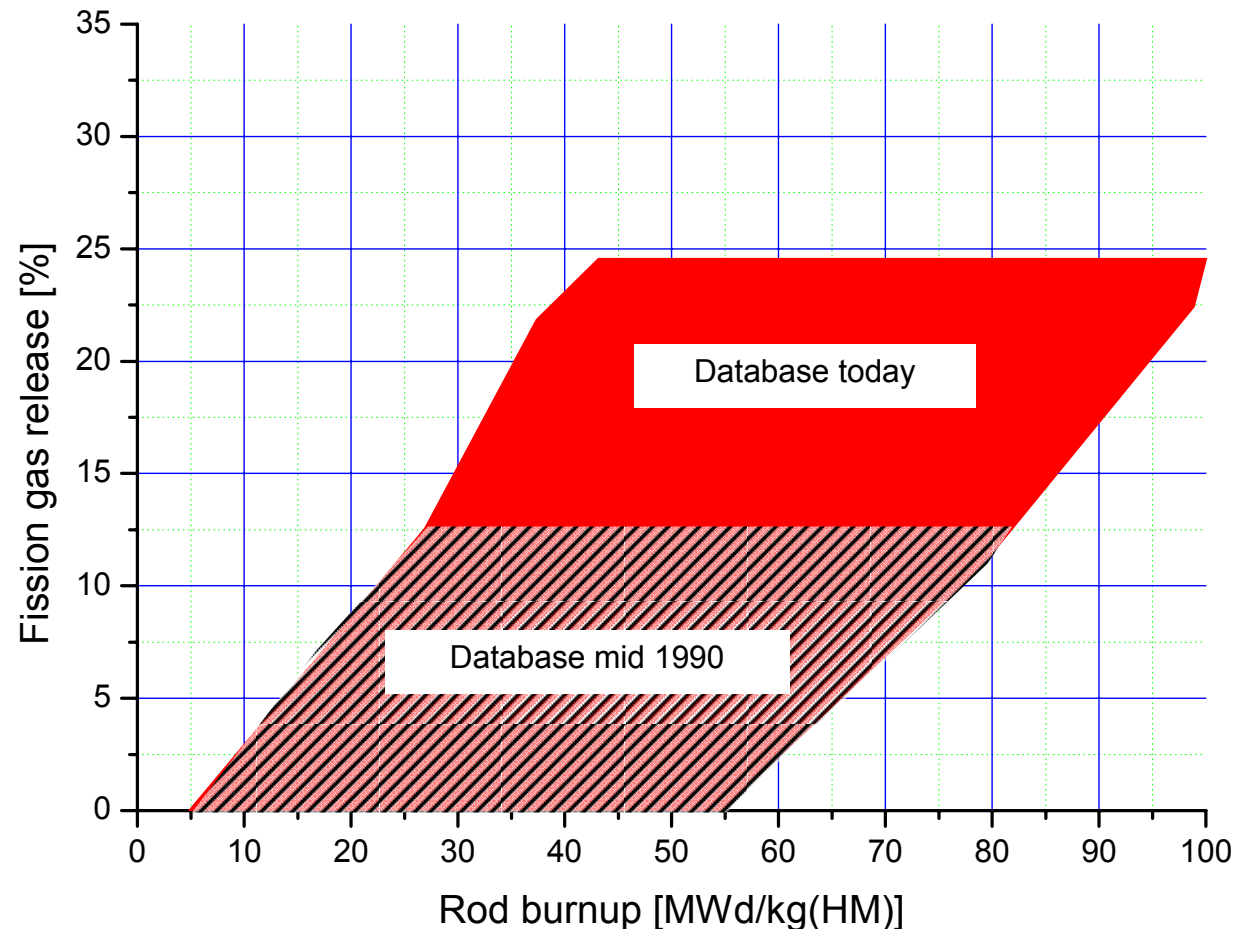
►► Facing the new challenges all stakeholders of the licensing process were prompted to reflect the potential of the traditional approaches in the light of current and future demands.

# Evolution of Demands

► Schematic range of the fission gas release database for  $\text{UO}_2$  rods irradiated in commercial PWRs: comparison between the mid 1990s and today

► New challenges, but also a good message

- ◆ Generally positive experience with lead test assemblies shows technical feasibility
- ◆ To be taken into account in design codes
- ◆ Realization of optimized fuel management schemes is possible



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# Traditional Approaches

- ▶ **Traditional proofs in the field of nuclear engineering**
  - ◆ **Based on a conservative-deterministic approach**
  - ◆ **Make use of an unfavorable combination of input parameters with respect to interesting quantities**
  - ◆ **Well founded within the frame of the boundary conditions of the past**
  - ◆ **Example: Highest fuel temperature in the core is at position of maximum LHGR due to**
    - Low enrichments
      - maximum rod burnups below 40 MWd/kg(HM)
      - decrease of reactivity led to decreasing rod powers
    - Fuel with low dimensional stability
      - open-gap situation
    - Almost no dependencies and interactions between different models
    - Degradation of fuel thermal conductivity is still unknown but also irrelevant due to low power at higher burnups

# Traditional Approaches

## ▶ Boundary conditions of the past are not fulfilled any longer

- ◆ Increased enrichment up to 5 w/o U235 and MOX fuel
- ◆ Burnups up to 70 MWd/kg(HM) and beyond
- ◆ Increased LHGR even in the medium- and high-burnup range
- ◆ Increased knowledge on fuel properties e.g. degradation of fuel thermal conductivity with burnup

## ▶ State-of-the-art knowledge

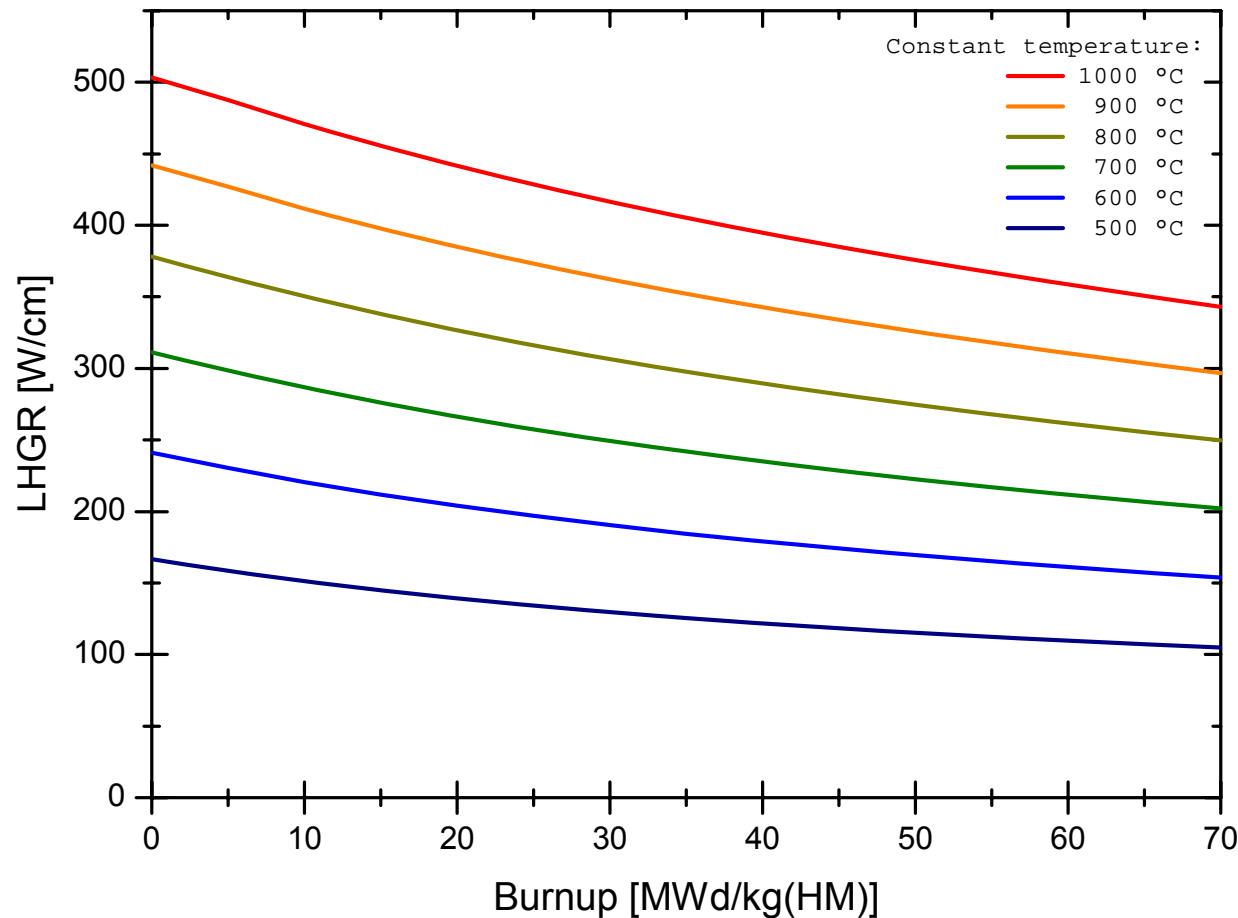
- ◆ Basic sensitivity of fuel temperature on LHGR and irradiation (see next slide)
- ◆ Certain decrease of LHGR has to be assumed to keep the temperature constant with increasing burnup



**Originally conservative-deterministic approaches may lack conservatism due to continuously changing boundary conditions.  
→ Continuous review of original assumptions is crucial.**

# Traditional Approaches

- Necessary decrease of LHGR to keep the average fuel temperature constant with increasing burnup (example for  $\text{UO}_2$ )





# Traditional Approaches

- ▶ **Opposite case can also occur:  
Existing methods exhibit a degree of conservatism which is not required to comply with the safety guidelines**

▶▶ **Existent margins should be exhausted to realize the most economical fuel management with reduced reload batches, and consequently, a reduced number of spent fuel assemblies.**

# Traditional Approaches

## ► Increased mathematical complexity of codes

### ◆ Due to recent experience feedback

### ◆ Example

- Latest fission gas release data
  - indicates the well known dependence on burnup
  - reveals a pronounced sensitivity on LHGR (or fuel temperature)
- Effect was not included in the validation database of old fuel rod codes and could not be anticipated either
- Introducing the temperature sensitivity into a fuel rod code means that the non-linear effect in the fission gas release model of state-of-the-art-codes will be additionally stressed



**It has to be reviewed whether simplified approaches relying on error propagation based on linear dependence are still appropriate for fuel rod code models with increased complexity.**

# Traditional Approaches

## ► Example: error propagation based on linear dependence

### ◆ Consider two functions

- $f_1 : (x_1, x_2) \mapsto 0.5 \cdot x_1 + 0.8 \cdot x_2$
- $f_2 : (x_1, x_2) \mapsto 0.5 \cdot x_1 + 0.8 \cdot x_2 + x_1 \cdot x_2$
- depending on two normally distributed ( $\mu = 0$ ,  $\sigma = 1/3$ ) parameters  $x_1, x_2$

### ◆ Application of error propagation based on linear dependence:

- 95%-quantiles of the input parameters yield a 95%-quantile of 0.51 for the resulting distribution for both functions

### ◆ Direct integration

- 95%-quantile is 0.51 for  $f_1(x_1, x_2)$   
in agreement with error propagation based on linear dependence
- 95%-quantile is 0.61 for  $f_2(x_1, x_2)$   
as consequence of non-linear effects

►► This example shows that the potential of error propagation is limited whenever the model response is governed by nonlinear effect which cannot be properly addressed in this approach.

# Traditional Approaches

## Example: selection of input parameters

- ◆ High degree of complexity in fuel rod codes' models
- ◆ Which set of input parameters
  - roughly 10 to 20 for models and geometry
  - state-points defining the power history

can be still justified to be conservative in all possible cases?

- ◆ Each result requires an individual set of conservative input parameters
- ◆ Are there possible combinations which yield more unfavorable results?

“ The basic questions to be answered by probabilistic methods are:

What is the degree of conservatism of the conservative-deterministic approach?

How to achieve a compromise which allows for an appropriate consideration of the combination of economical, ecological and technical safety-related requirements?

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# Probabilistic Methods

## ► Elements of probabilistic methods

- ◆ Fuel rod code and database
- ◆ Treatment of uncertainties
- ◆ Mathematical foundation of methodology

## ► Results

- ◆ Realistic assessment (“best-estimate scenario”) when omitting the uncertainties
- ◆ Conservative assessment with a well defined degree of conservatism in terms of an appropriate quantile (safety and confidence level)

# Probabilistic Methods

## ► Requirement for fuel rod codes to be applied for probabilistic methods

- ◆ **Best-estimate code**
- ◆ **Validated against a comprehensive, representative, reliable database**
  - from pool campaigns and post-irradiation examination
  - encloses all important validation parameters (e.g. temperatures, strains, fission gas release, etc.)
  - fulfills today's and future demands (traditional and modern fuel management schemes, high power densities, high enrichments up to 5 w/o U235, high burnups up to 100 MWd/kg(HM), UO<sub>2</sub>, MOX, and UO<sub>2</sub>/Gd<sub>2</sub>O<sub>3</sub> fuel, modern fuel types)
- ◆ **Excellent run-time to be able to perform up to 10<sup>3</sup> ... 10<sup>5</sup> calculations in several hours on a Linux cluster or multi-processor workstation**
- ◆ **Excellent numerical stability without any aborts**
- ◆ **Reliable error management to detect numerical problems and warn users if any problems should occur**

# Probabilistic Methods

- ▶ **Current AREVA NP codes available and licensed for probabilistic methods**
  - ◆ **CARO-E3 for PWR and BWR application in Europe (Erlangen market)**
  - ◆ **RODEX4 for BWR application in USA**
- ▶ **Future AREVA NP code for probabilistic methods:**
  - ◆ **COPERNIC3 will replace the current codes**
  - ◆ **AREVA NP advanced global fuel rod code for PWR and BWR application**
  - ◆ **International experience is accounted for which has been gained with the advanced method for more than 14 years**



# Probabilistic Methods

## ► Treatment of uncertainties of input parameters

### ◆ Fabrication uncertainties

- Probability distributions derived from an analysis of manufacturing procedures including specifications and processes
- In most of the cases main input parameters of fuel rod codes as pellet diameter, clad inner and outer diameter are normally distributed.

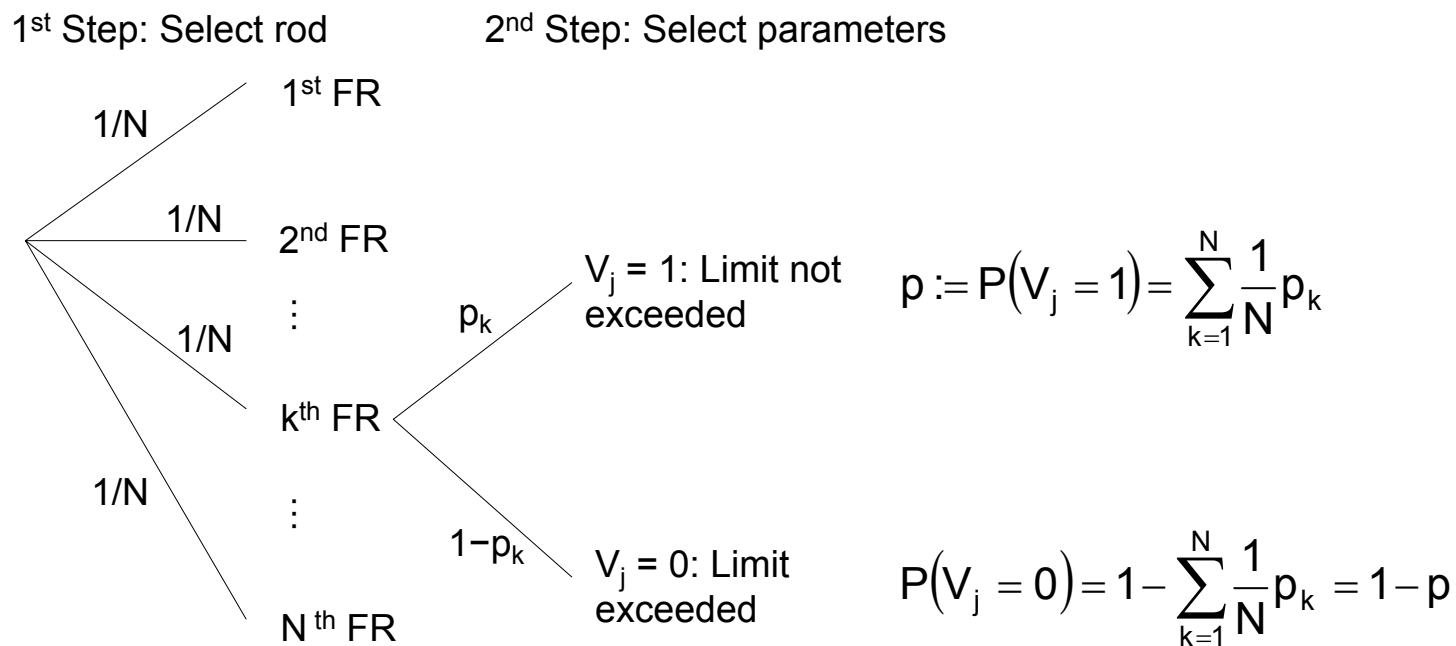
### ◆ Model uncertainties

- More thorough analysis is required due to model sensitivity
- Resulting model parameter probability distributions have to map the probability of a code over-prediction or under-prediction.

# Probabilistic Methods

## Objective of probabilistic methodologies

- ◆ Perform  $n$  simulations
- ◆ Estimate the fraction of fuel rods in a population (e.g. core, reload or discharge batch) not exceeding the given limit
- ◆ The random selection of a fuel rod (FR) is implemented in two steps



# Probabilistic Methods

## ► Notes related to previous figure

- ◆ Let us consider the  $j^{\text{th}}$  simulation (or calculation) ( $1 \leq j \leq n$ ). In the first step one fuel rod (we assume the  $k^{\text{th}}$  FR) out of  $N$  fuel rods in the population is randomly selected. Thus, all rod-specific quantities (power history, materials, input parameter distributions) are uniquely determined. The probability for each rod to be selected is  $1/N$  as we are dealing with a Laplace experiment.
- ◆ In the second step the parameters are randomly selected with respect to the underlying distribution. The randomly chosen parameter combination will yield a value  $y \leq y_L$  with probability  $p_k$  (fuel rod does not exceed the limit,  $V_j = 1$ ) and a value  $y > y_L$  with probability  $1-p_k$  (fuel rod exceeds limit,  $V_j = 0$ ).  $V_j$  is the random variable describing the result of the  $j^{\text{th}}$  simulation.

►► Therefore we can identify  $V = V_1 + \dots + V_n$  as a Bernoulli chain with probability  $p$ , length  $n$  and expected value  $E(V) = n \cdot p$ .

# Probabilistic Methods

## ► Statistical evaluation by standard methods (e.g. DIN 53804/Part 4)

- ◆  $p$  is estimated from  $n$  simulations from  $v/n$
- ◆ with the confidence interval  $[p_L, 1]$  corresponding to the confidence level  $(1-\alpha)$

$$p_L = \frac{v}{v + (n - v + 1) \cdot F_{2(n-v+1), 2v; 1-\alpha}}$$

- ◆  $F_{a,b;1-\alpha}$  are the quantiles of the Fisher distribution.

### “ Two equivalent interpretations:

“The fraction of fuel rods in the population not exceeding the given limit is at least  $p_L$  with a confidence level of at least  $(1-\alpha)$ .”

“The expected value of the number of fuel rods in the core not exceeding the given limit is at least  $N \cdot p_L$  with a confidence level of at least  $(1-\alpha)$ .”

# Probabilistic Methods

## ► Required number of calculations

$$n \approx \frac{1}{1 - p_L} (n - v + 1) \cdot F_{2(n-v+1), \infty; 1-\alpha}$$

- ◆ Depends only on the desired quantile
- ◆ Does not depend on the number of input parameters
  - approach appropriate for a large number of input parameters
  - tedious sensitivity analysis of parameter combinations not necessary

## ► No further requirements necessary like

- ◆ Linear dependency from input parameters
- ◆ Normal distribution of input parameters

## ► Relevance of input parameters and their sensitivity with respect to all different output parameters is inherently mapped onto the resulting distributions

## ► The same set of calculations can be used to analyze all interesting output parameters (e.g. rod internal pressure, strain, temperature) simultaneously.

# Probabilistic Methods

- ▶ **Preclusion of systematic fuel rod failures is the crucial objective of verification in fuel rod design**
- ▶ **Identification of an appropriate combination of**
  - ◆ **Underlying population**
  - ◆ **Quantile**
  - ◆ **Pertaining criterion**
- ▶ **Not only one unique constellation which complies with the requirements**
- ▶ **Historical reasons impact licensing boundary conditions which developed differently and this effect can be still observed today**

# Probabilistic Methods

► **Suitable combinations which fulfill the requirement and are established in fuel rod design design licensing with respect to internal pressure in Germany and USA**

## ◆ Germany

- Population: complete core
- Quantile: 95%/1-1/N (“one-rod quantile”), requires a minimum of 3N calculations
- Criterion: Preclude rod failure by thermal feedback by limitation of the reopening of the gap due to internal overpressure; criteria derived from rod overpressure experiments

## ◆ USA

- Population: reload batch
- Quantile: 95%/99.9%, requires a minimum of 2996 calculations
- Criterion: system pressure plus 55 bar

# Probabilistic Methods

## ► **Mathematically extensions: additional refined statements underline**

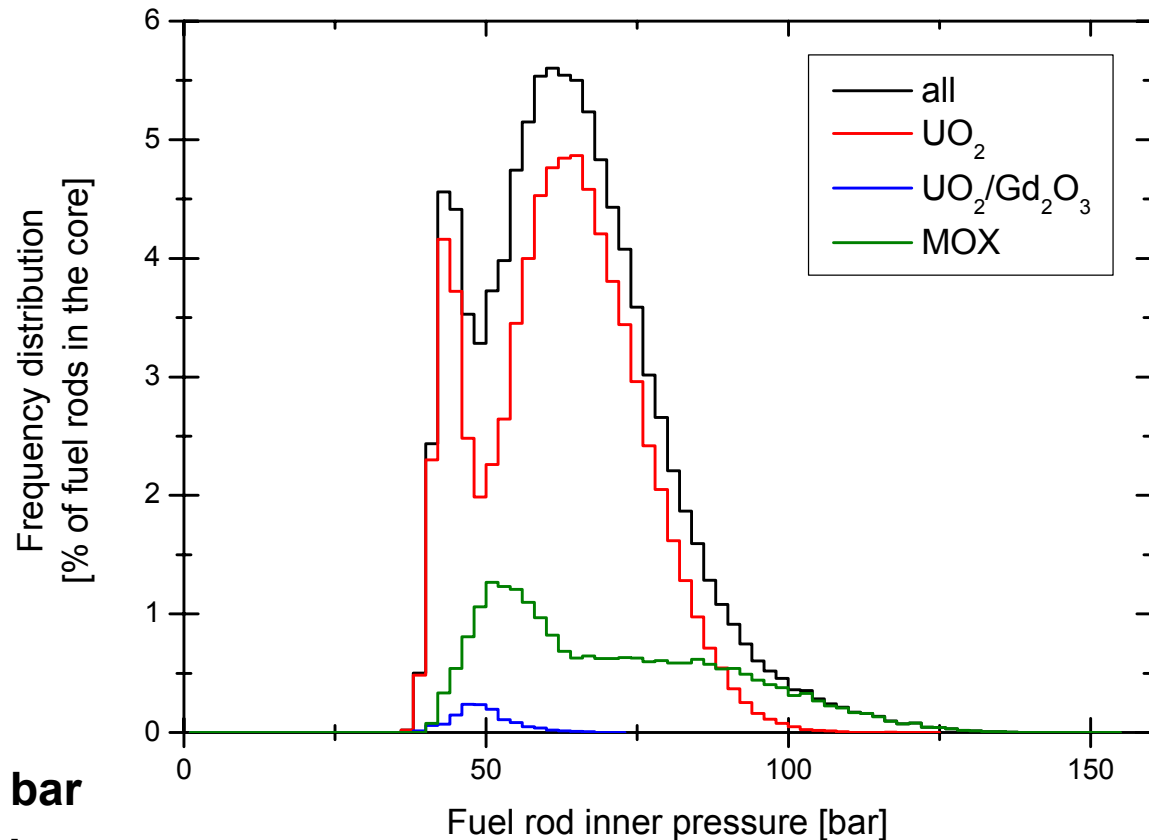
- ◆ **That the new approach is consistent and target-oriented to preclude systematic fuel failures**
- ◆ **That the probabilistic approach can be also applied to a mixed core**
  - Usual situation in plants
  - Fuel rods partly treated by new and by traditional methods



# Probabilistic Methods

## Example: German 16x16 PWR, rod internal pressure distribution

- ◆ Population: all the rods ( $\text{UO}_2$ ,  $\text{UO}_2/\text{Gd}_2\text{O}_3$ , and MOX) contained in the core
- ◆ Probabilistic assessment performed with CARO-E3
- ◆ The total number of calculations: 136110
- ◆ Results: number of calculations is sufficient to evaluate quantiles up to the one-rod quantile with a confidence level of 95%
- ◆ 95%/99.9% quantile: 126 bar
- ◆ 95%/99.9978% quantile: 154 bar



# Probabilistic Methods

► **Crucial new information compared to the traditional conservative-deterministic approaches which provide knowledge on extreme values only irrespectively how many fuel rods are in the vicinity of those extremes.**

► **Proof: no risk for systematic fuel rod failure as the majority of fuel rods in the core are far away from calculated maxima.**

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# Conclusions and Outlook

▶ **Enormous mathematical potential with respect to applicability and information density in the context of nuclear safety**

◆ **Best-estimate approach**

→ realistic results

◆ **Systematic consideration of uncertainties**

→ result with quantitatively controlled degree of conservatism

◆ **Number of calculations**

- depends on the safety level and confidence level only which are appropriately adapted to the objective of verification
- does not depend on the number of input parameters or requires linear response or certain input parameter distributions



**Probabilistic methods are an ideal tool to be applied to today's problems with high complexity depending of an increased number of input parameters.**

# Conclusions and Outlook

► **Probabilistic methods have capability to fulfill all requirements of licensing scenarios**

◆ **Well established and have been used as a direct licensing tool in fuel rod design**

- for many years in Germany, Sweden, Finland, Switzerland, Netherlands, Spain
- recently approved by NRC in the USA

◆ **Available as a benchmark for the traditional methods to prove sufficient margins**

► **Growing relevance is indicated by the extension to other areas**

◆ **LOCA**

◆ **Hold-down springs**



**Probabilistic methods turn out to be the answer how to adequately address economical, ecological, and technical safety-related aspects in nuclear industry and beyond.**

**Thank you for your attention!**





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