

PAUL SCHERRER INSTITUT



Laboratory for



Reactor Physics and Thermal-Hydraulics



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# Development of Advanced Methodologies for Monitoring & Modelling of Neutron Noise in Modern Nuclear Reactors

PhD Public Defense, Zoom Video-Conference, September 16<sup>th</sup> 2020



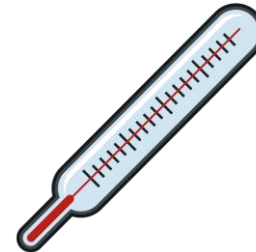
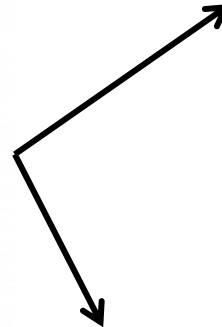
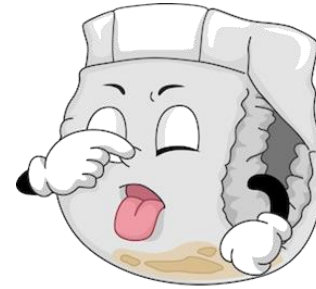
- Noise is everywhere
- It disturbs us
- It deteriorates the useful information of a signal

*Does noise always have a negative nature?*

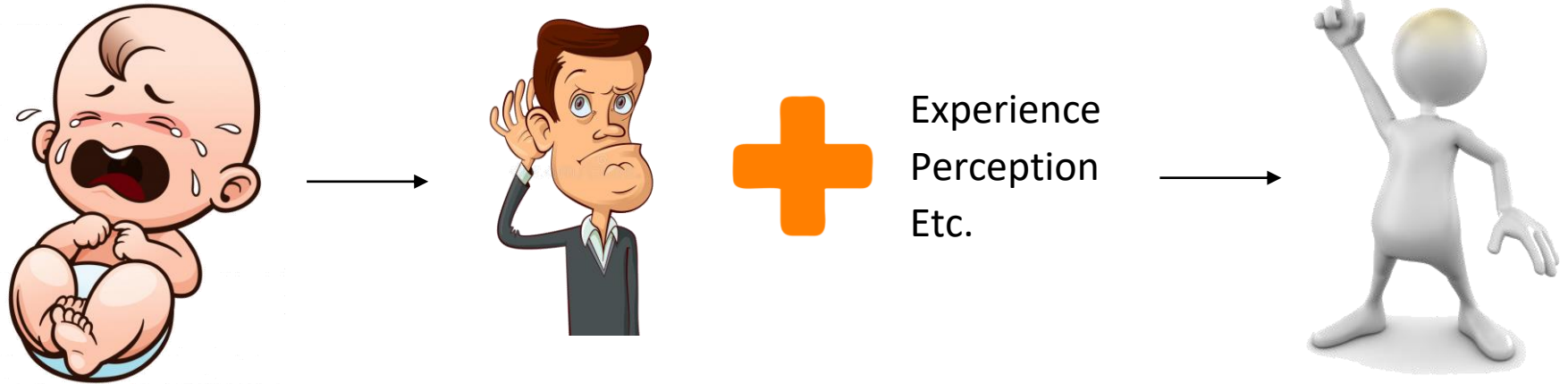
Can noise be useful ?

...

An everyday example ... :



➤ Extract useful information from noise:



*By analyzing noise coming from a nuclear reactor we can assess the reactor behavior*

➤ Extract useful information from noise:



Experience  
Perception  
Etc.



*By analyzing noise coming from a nuclear reactor we can assess the reactor behavior*

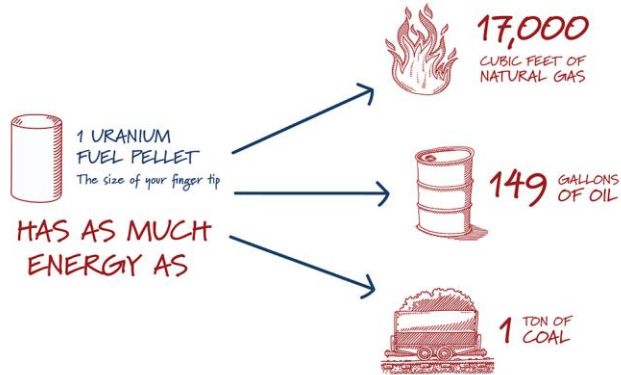
## ➤ Nuclear reactor: 24/7 reliable production of CO2-free energy



Nuclear fuel pellet

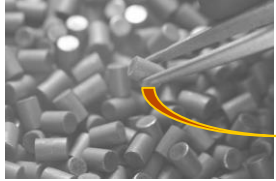
made of uranium

- 2 cm diameter
- 1 cm height
- 10 g weight





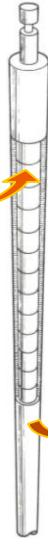
## ➤ Nuclear reactor: 24/7 reliable production of CO2-free energy



### Nuclear fuel pellet

made of uranium

- 2 cm diameter
- 1 cm height
- 10 g weight



### Nuclear fuel rod

containing 300 fuel pellets

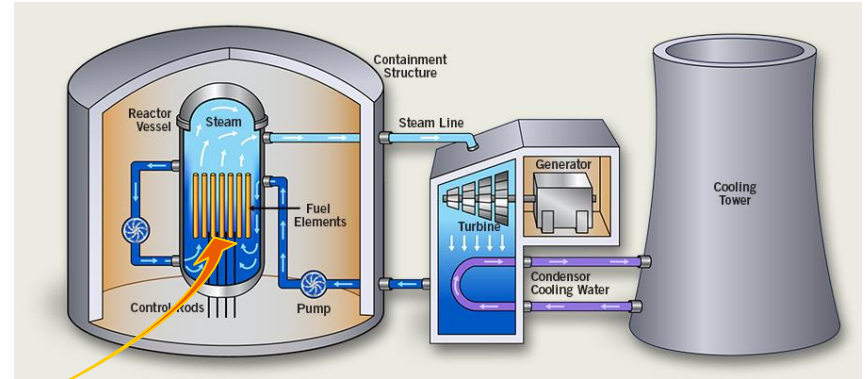
- ~3 m height
- ~4 kg weight



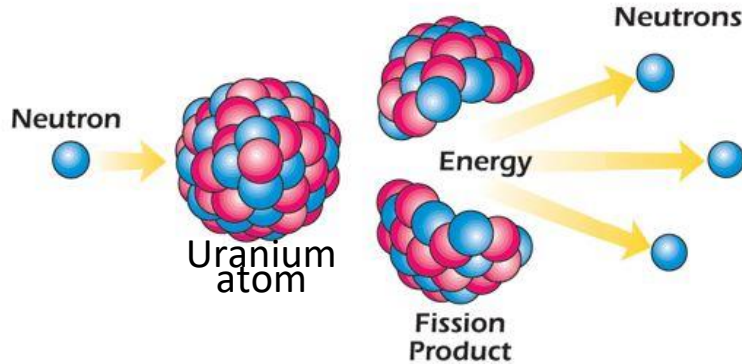
### Nuclear fuel assembly

containing 100-300 fuel rods

- 20 cm across
- ~4 m height
- ~600 kg weight



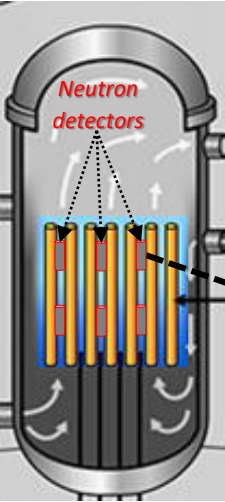
- Neutrons interact with uranium atoms (nuclear fuel)
- Fission of uranium generates energy/heat
- Heat warms water
- Water turns into steam
- Steam turns a turbine
- Turbine turns a generator
- Electricity is produced



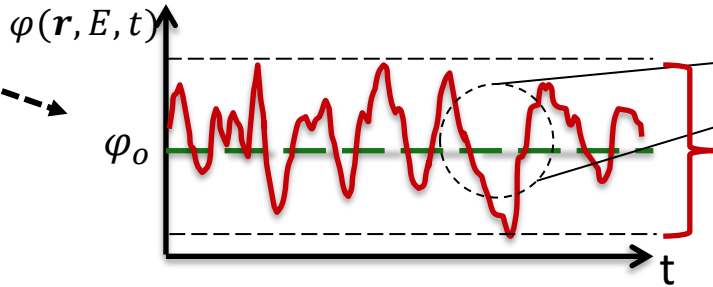
- Energy from fission -> Power of a nuclear reactor
- By controlling the number of available neutrons, the released energy from fission can be controlled  
-> control the reactor power
- The number of available neutrons (per unit volume & time) depends on many parameters:
  - Temperature of nuclear fuel
  - Temperature of water (coolant)
  - Surrounding environment/materials
  - Etc.



# Noise in Nuclear Reactors



$\varphi$ : **neutron flux** (number of neutrons per unit volume & time)  
has a **fluctuating behavior**



Neutron flux  
fluctuations  
↓  
**Neutron noise**



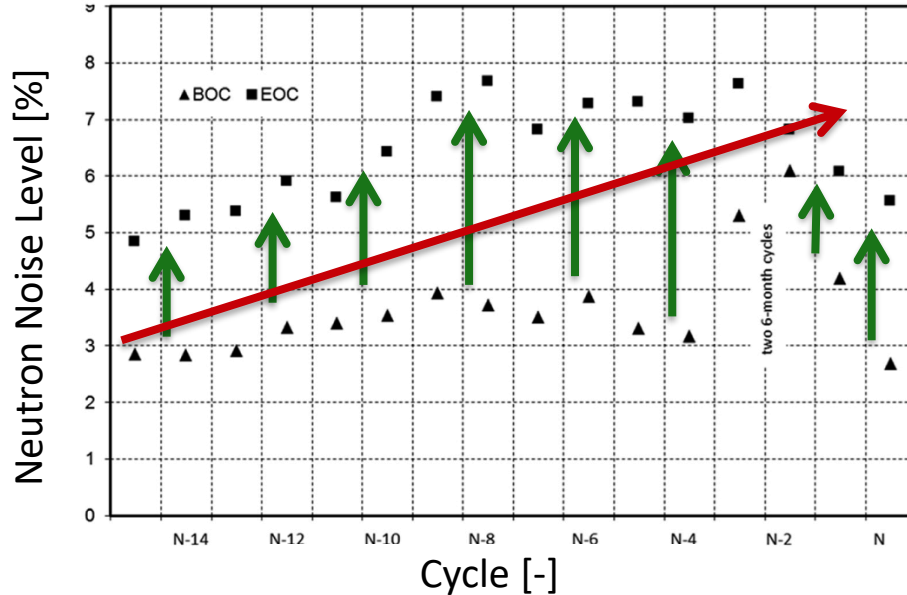
- reactor behavior
- reactor dynamics
- malfunctions' detection

$$\frac{1}{v(E)} \frac{\partial}{\partial t} \varphi(\mathbf{r}, E, t) - \nabla \cdot D(\mathbf{r}, E, t) \nabla \varphi(\mathbf{r}, E, t) + \Sigma_t(\mathbf{r}, E, t) \varphi(\mathbf{r}, E, t) = \int_0^\infty \Sigma_s(\mathbf{r}, E' \rightarrow E, t) \varphi(\mathbf{r}, E', t) dE'$$

$$+ \frac{\chi^p(E)}{4\pi} \int_0^\infty v(\mathbf{r}, E') \Sigma_f(\mathbf{r}, E', t) \varphi(\mathbf{r}, E', t) dE' + \sum_{i=1}^{N^d} \frac{\chi^{d,i}(E)}{4\pi} \lambda_i C_i(\mathbf{r}, t) + Q(\mathbf{r}, E, t)$$



neutrons **gaining** rate  
=  
neutrons **losing** rate



M. Seidl et al., PNE vol. 85, pp. 668-675 (2015)

\*Cycle: Operational period of 11 months  
 BOC: Beginning of cycle  
 EOC: End of cycle

### Noise increase trend:

- *observed in several European reactors*
- *operational burden for the utilities*

### Noise characteristics:

- ✓ *within-the-cycle increase*
- ✗ *cycle-to-cycle increase*

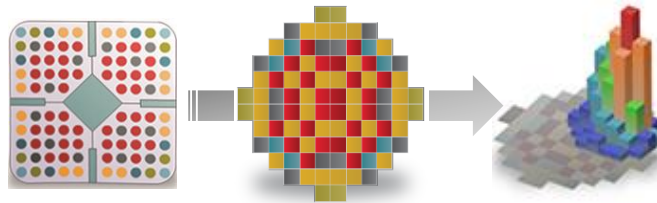


*Need for better & deeper  
 understanding of  
 neutron noise phenomena*

Study neutron noise phenomena and examine the stochastic behavior of a nuclear reactor with a dual approach



Improving  
**signal analysis**  
techniques



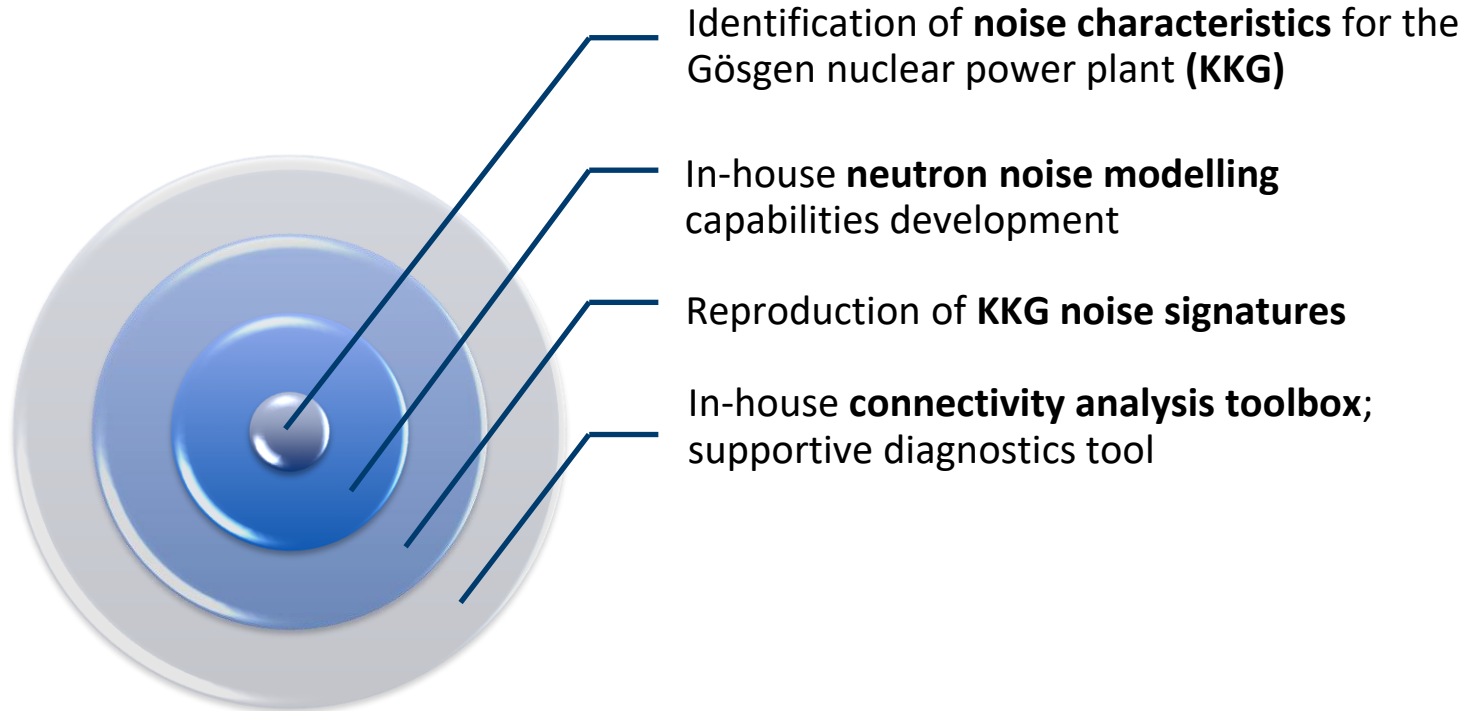
Developing numerical models &  
**core simulation methods**  
to reproduce plant measurements



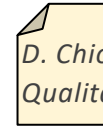
*Explaining the neutron noise  
phenomenology in operating  
reactors*

# Thesis Accomplishments

## Noise in Nuclear Reactors



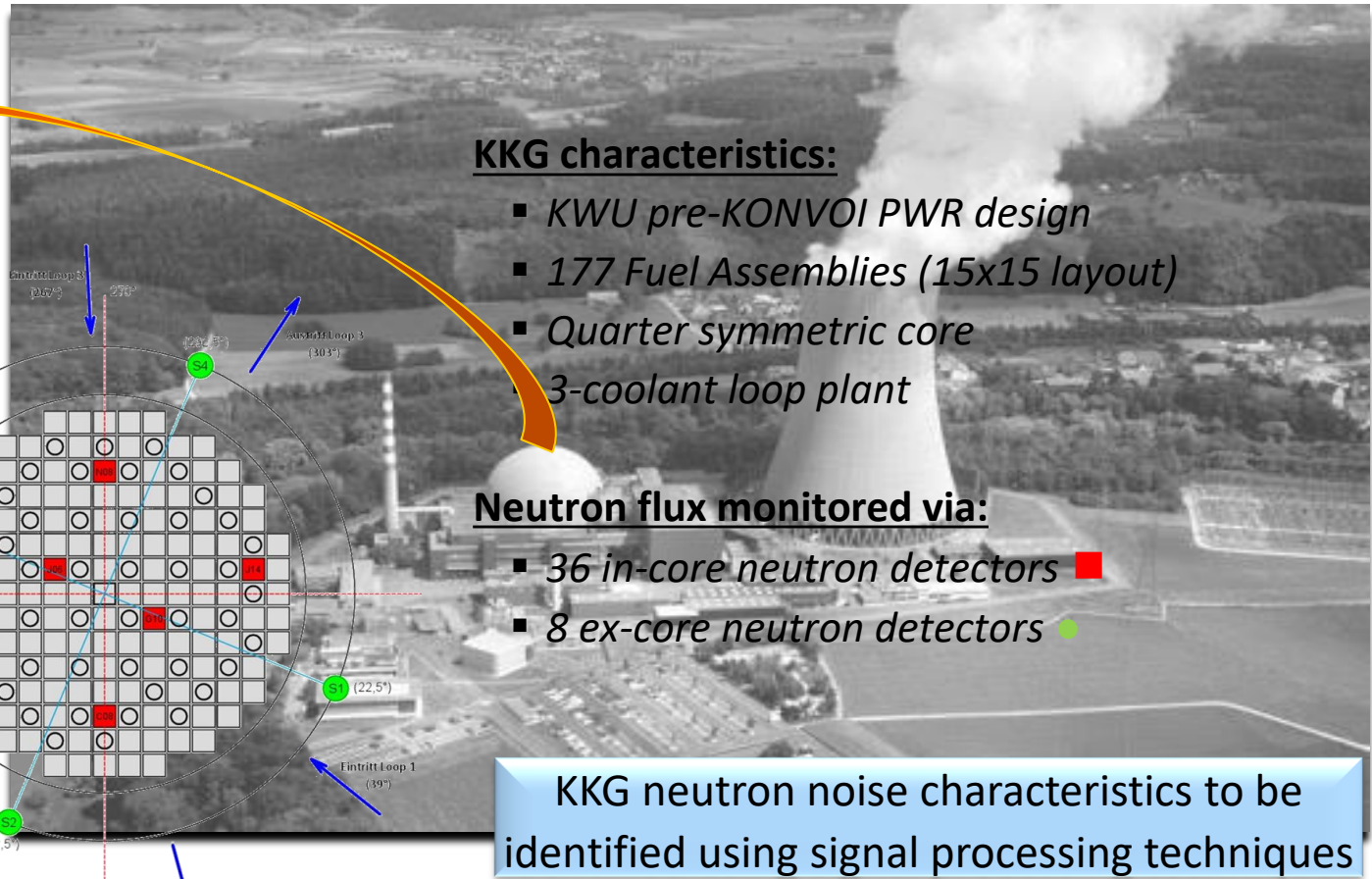
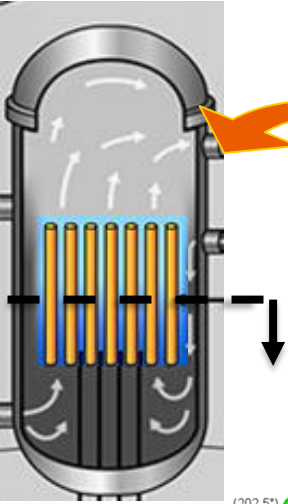
- **Signal analysis of plant data from the Gösgen nuclear power plant (KKG)**



*D. Chionis et al., "PWR neutron noise phenomenology: Part II – Qualitative comparison against plant data", Physor '18 (2018)*

- **PSI neutron noise modelling methodology**
- **PSI connectivity analysis methodology**

# Nuclear Power Plant Gösgen (KKG)



## KKG characteristics:

- KWU pre-KONVOI PWR design
- 177 Fuel Assemblies (15x15 layout)
- Quarter symmetric core
- 3-coolant loop plant

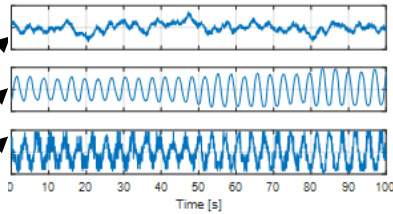
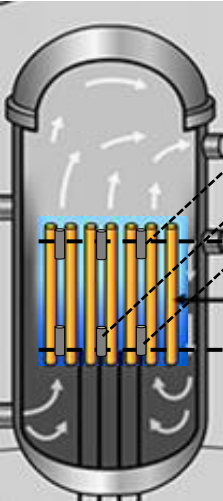
## Neutron flux monitored via:

- 36 in-core neutron detectors ■
- 8 ex-core neutron detectors ●

KKG neutron noise characteristics to be identified using signal processing techniques



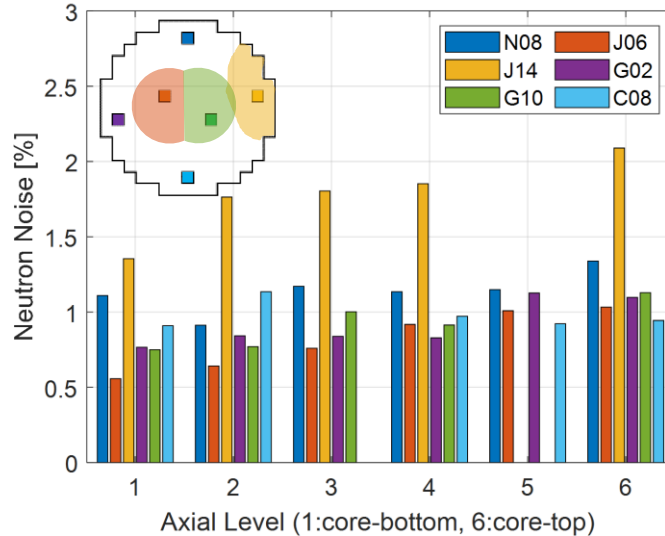
# Noise Analysis for KKG [time domain]



## Neutron Noise

$$CV_i = 100 \cdot \frac{\sigma_i}{\Phi_i}$$

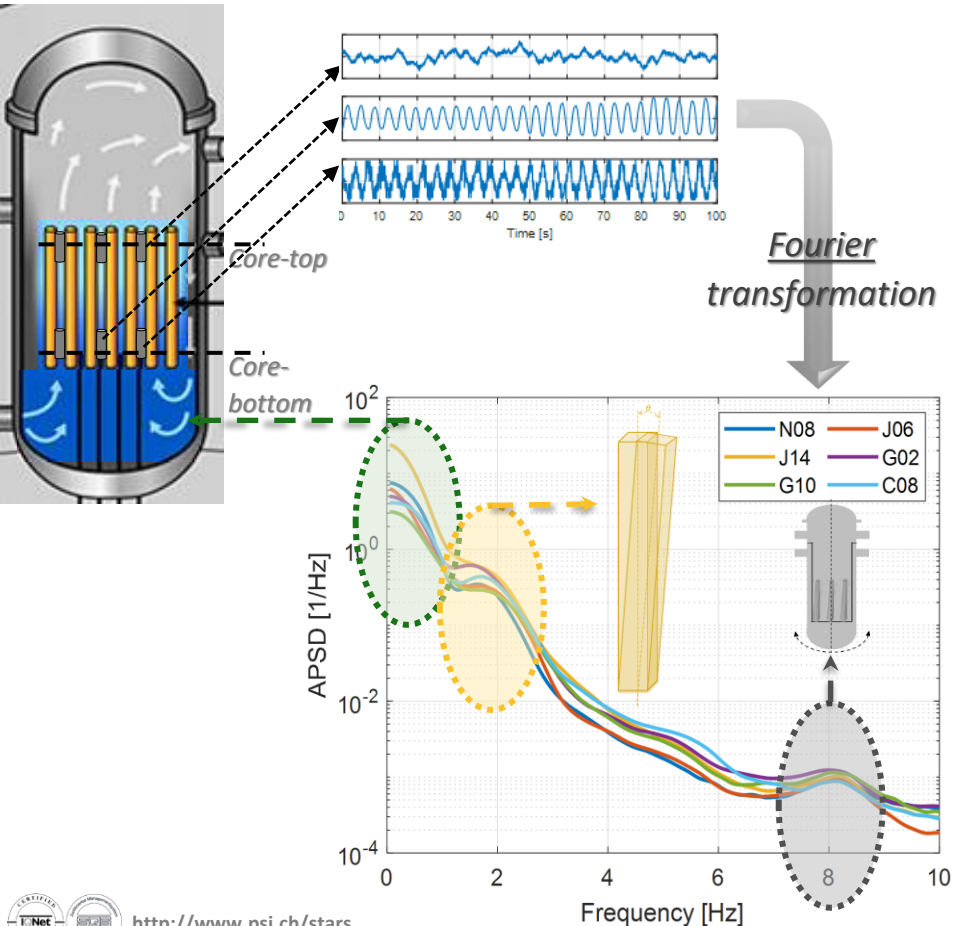
\*i: neutron detector



- **core-east** side exhibits **highest noise level**  
⇒ unique KKG characteristic
- **central region** exhibits **lowest noise levels**
- Slight shift of higher noise towards core-bottom as the End of Cycle approaches

KKG **noise** behavior is rather **spatial inhomogeneous** in both axial & radial directions

# Noise Analysis for KKG [freq. domain]



- Stronger spectrum at **<math>< 1.5\text{ Hz}</math>**  
 ⇒ coolant properties fluctuations
- Spectral peak at **<math>1.5-2.0\text{ Hz}</math>**  
 ⇒ fuel assemblies vibration  
 with an indication of a noise source at the core center
- Spectral peak at **<math>8.0\text{ Hz}</math>**  
 ⇒ global character of the core barrel pendular movement

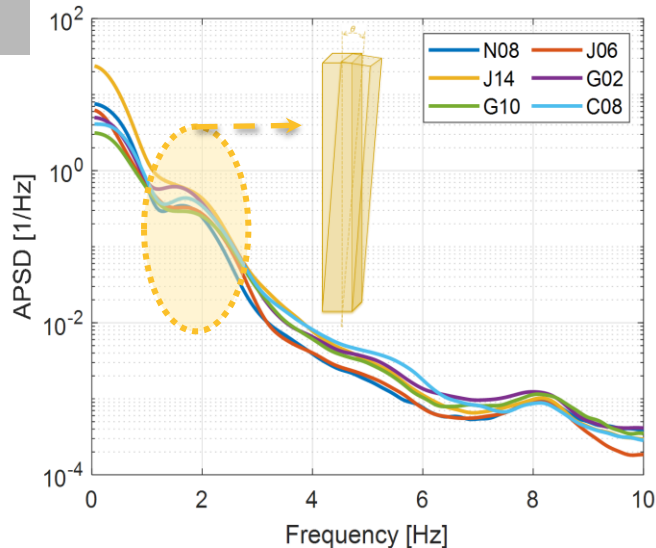
- Signal analysis of plant data from the Gösgen nuclear power plant (KKG)

- **PSI neutron noise modelling methodology**

*D. Chionis et al., "Development and verification of a methodology for neutron noise response to fuel assembly vibrations", submitted to ANE (2020)*

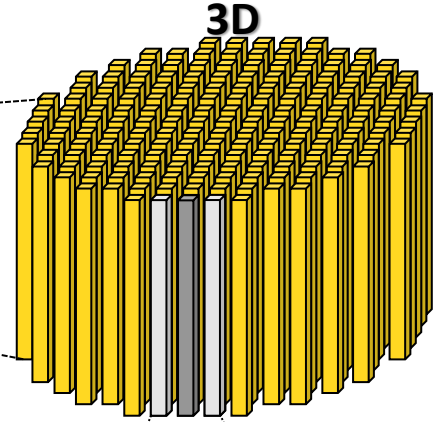
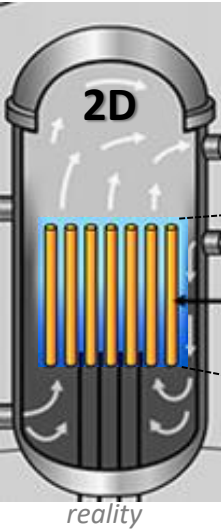
*D. Chionis et al., "SIMULATE-3K analyses of neutron noise response to fuel assembly vibrations and thermal-hydraulics parameters fluctuations", M&C'17 (2017)*

*D. Chionis et al., "PWR neutron noise phenomenology: Part I – Simulation of stochastic phenomena with SIMULATE-3K", Physor '18 (2018)*



- **Fuel assembly vibration**  $\Rightarrow$  key noise source  
 $\Rightarrow$  key contributor to noise increase
- Use of state-of-the-art simulation codes  
**CASMO-5/SIMULATE-3/SIMULATE-3K**
- In-house process development for **automatizing, extending**  
and **improving** the fuel assembly vibration modelling
- Systematic investigation
- Reproduction of KKG noise sources

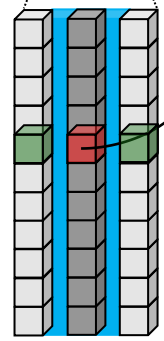
# Noise Modelling Methodology



computational modelling using  
the state-of-the-art codes  
CASMO-5/SIMULATE-3/SIMULATE-3K

In-house **MATLAB**  
**scripts** development  
allowing all types of  
fuel vibration

Solution of  
time-dependent **neutron diffuse**  
in every core **node**

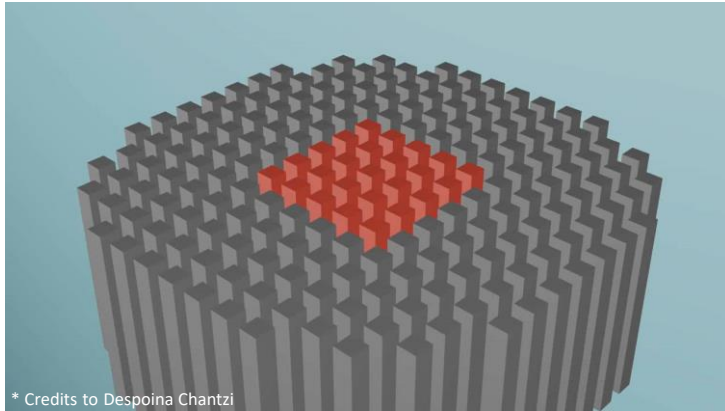


**Modelling approximation**

fuel node vibration  
⇒  
time-dependent modification of  
**water gaps**  
between a **node** & its **neighbors**

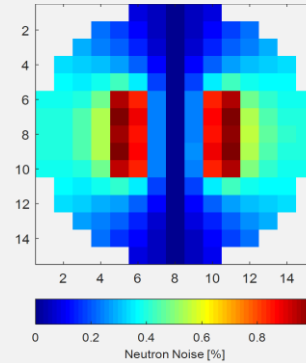
# PSI Noise Modelling Methodology Application

*central cluster vibration &  
coolant properties fluctuation*



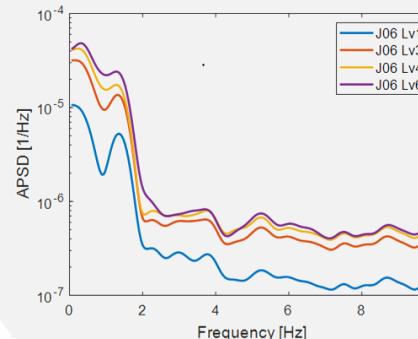
\* Credits to Despoina Chantzi

## ***Time domain analysis of simulated nodal responses***



- Synchronized fuel vibration results to two peaking noise areas
- Unsynchronized vibration explains high local noise areas

## ***Frequency domain analysis of simulated detectors responses***

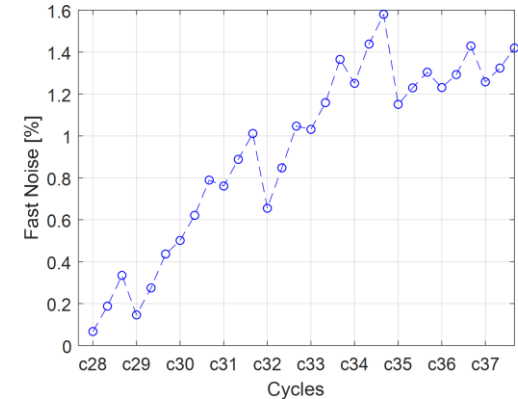
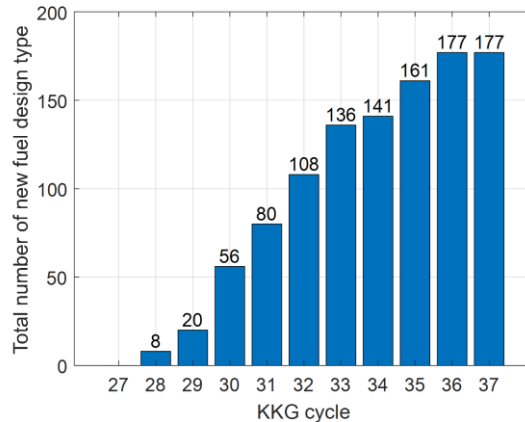


- Spectral phenomenology in low frequencies is driven by inlet coolant temp. fluctuations
- Above 2 Hz, fuel assembly vibration has leading role



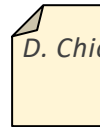
# PSI Noise Modelling Methodology Application

- Gradual loading of new fuel design in KKG, susceptible to lateral vibration, during the last decade
- Spacers' stress relaxation is assumed to be reduced due to irradiation damage



*The simulation methodology  
can successfully capture the  
studied phenomena*

- Signal analysis of plant data from the Gösgen nuclear power plant (KKG)
- PSI neutron noise modelling methodology
- **PSI connectivity analysis methodology**

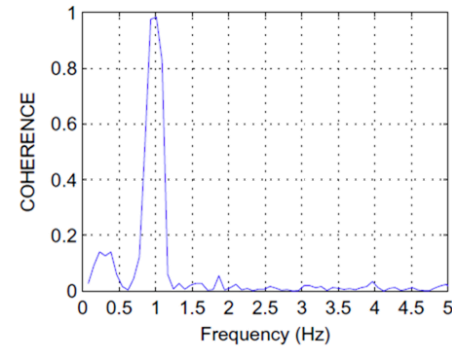
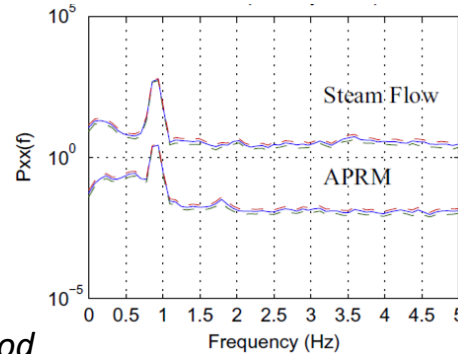


*D. Chionis et al., "Application of causality analysis on nuclear reactor systems" CHAOS vol. 29, issue 4 (2019)*

# A need for advanced signal processing tools

## ■ Coherence analysis

- commonly utilized method
- easy formulation
- computationally inexpensive method
- **but, can only estimate the correlation level of two signals**



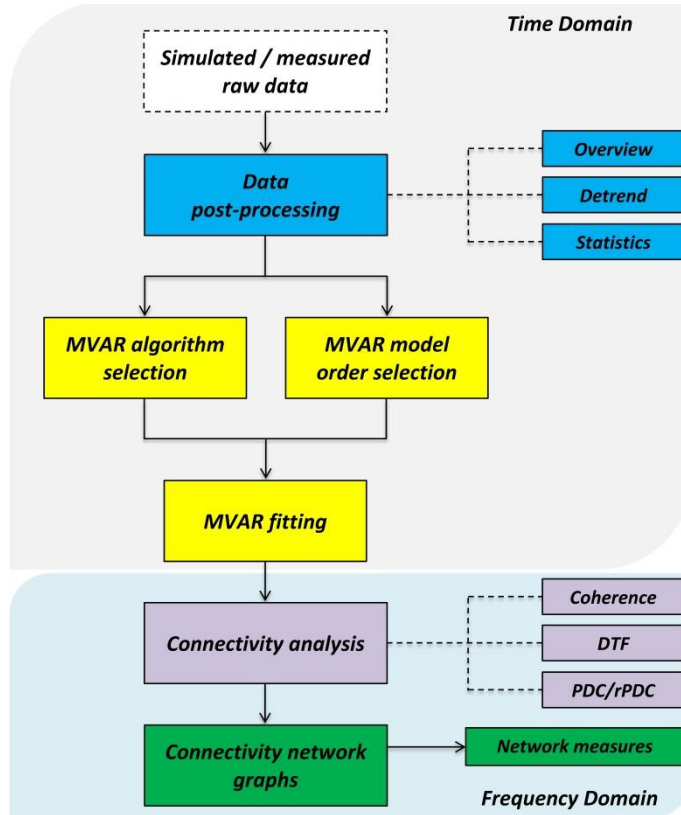
Demeshko M. et al., ANE vol. 75, pp. 645-657 (2015)

**In abnormal events, there is a need for identifying the root-cause.**

## ■ Causality analysis

- originates from the neuroscience field
- treats the entire system at once
- identifies cause-and-effect signals' relationships
- identifies information flow paths
- **indicates root-cause of a perturbation**





- Simultaneously recorded signals:

$$\mathbf{y}(t) = [y_1(t), y_2(t), \dots, y_m(t)]^T$$

- Fitted in a Multivariate Autoregressive Model:

$$\mathbf{y}(t) = \sum_{k=1}^p \boldsymbol{\alpha}(k) \mathbf{y}(t-k) + \boldsymbol{\varepsilon}(t)$$

- Renormalized Partial Directed Coherence

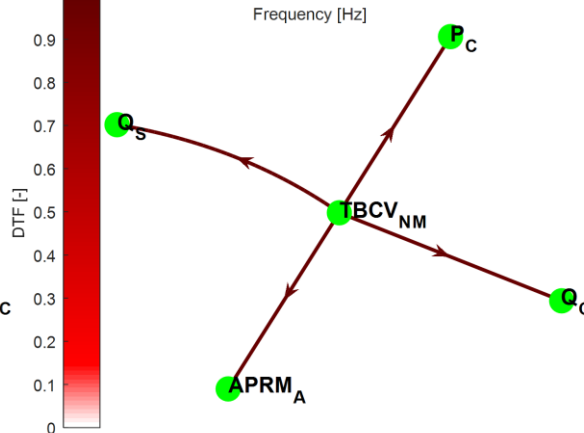
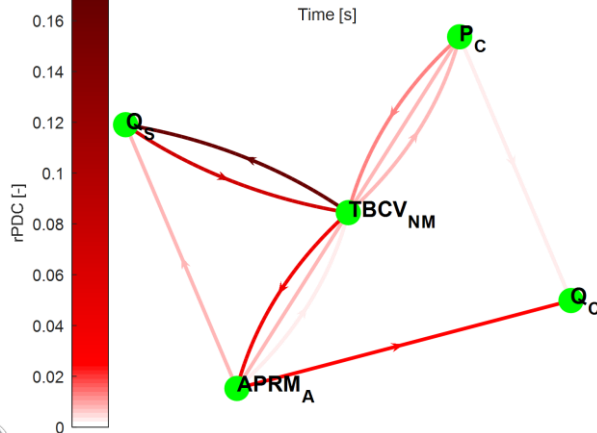
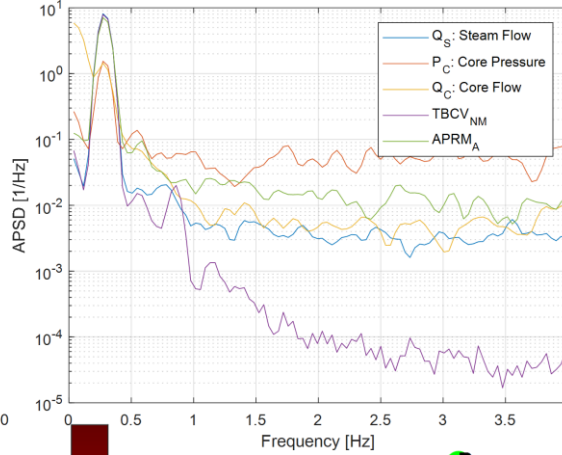
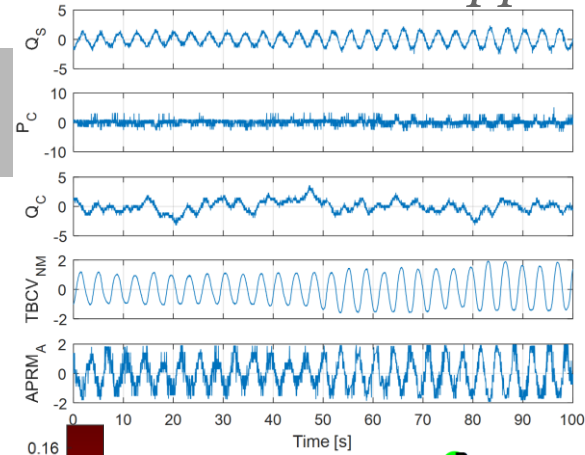
$$rPDC_{ij}(f) = \mathbf{Z}_{ij}(f)' \cdot \mathbf{V}_{ij}^{-1}(f) \cdot \mathbf{Z}_{ij}(f)$$

- Directed Transfer Function

$$DTF_{ij}(f) = \frac{|\mathbf{H}_{ij}(f)|}{\sqrt{\sum_{q=1}^m |\mathbf{H}_{qj}(f)|^2}}$$

# PSI Connectivity Analysis

## *KKL application*



- KKL cycle 33 start-up
- Unexpected high decay-ratios at low power / low flow
- Strong spectral content at  $\sim 0.3$  Hz
- Central role of turbine bypass valves (TBCVs)
- Core pressure is adjusted based on the TBCVs opening position
- System response is respectively affected

- KKG neutron noise characteristics have been identified using the PSI signal processing methodology
- The KKG neutron noise phenomenology has been reproduced using a newly developed modelling methodology
- A comparison between KKG measured and simulated results:
  - *Explained a series of measured noise observations*
  - *Few noise characteristics could not be fully identified; research continuation is needed.*
- An in-house connectivity analysis methodology has been developed and successfully applied on both simulated and measured datasets. The newly developed methodology serves as a supportive diagnostic tool.



# Future Work Recommendations

- Improvement of plant data acquisition systems  
(*e.g. measurement periodicity, sampling frequency, signals variety, etc.*).
- Further invest on advanced signal processing techniques by implementing deep-learning methods in the PSI methods.
- Verification & benchmark of developed noise simulation tools against reference results.
- Extend the noise modelling to BWR applications.



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## Development of Advanced Methodologies for Monitoring and Modelling of Neutron Noise in Modern LWR Cores

Chionis, Dionysios ; Pautz, Andreas ; Dokhane, Abdelhamid

Nuclear reactors are inherently stochastic systems, in which neutronic and thermal-hydraulic parameters fluctuate continuously even during steady-state conditions. In addition, structural components vibrate due to the coolant hydraulic forces. This stochasticity is the cause of the neutron population fluctuating behavior, a phenomenon referred as neutron noise. The neutron noise is monitored over the reactor lifetime, providing valuable knowledge of the core behavior.

## My thanks go to

- H. Dokhane, H. Ferroukhi, A. Pautz (PSI)  
*for their close and continuous supervision*
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swissnuclear  
Fachgruppe Kernenergie der swisselectric

Studsvik

Kernkraftwerk Gösigen



**Thank you for your attention!**

*I would be happy to answer your questions*