

# **Réduction de modèles en mécanique non linéaire pour la construction d'abaques virtuels**

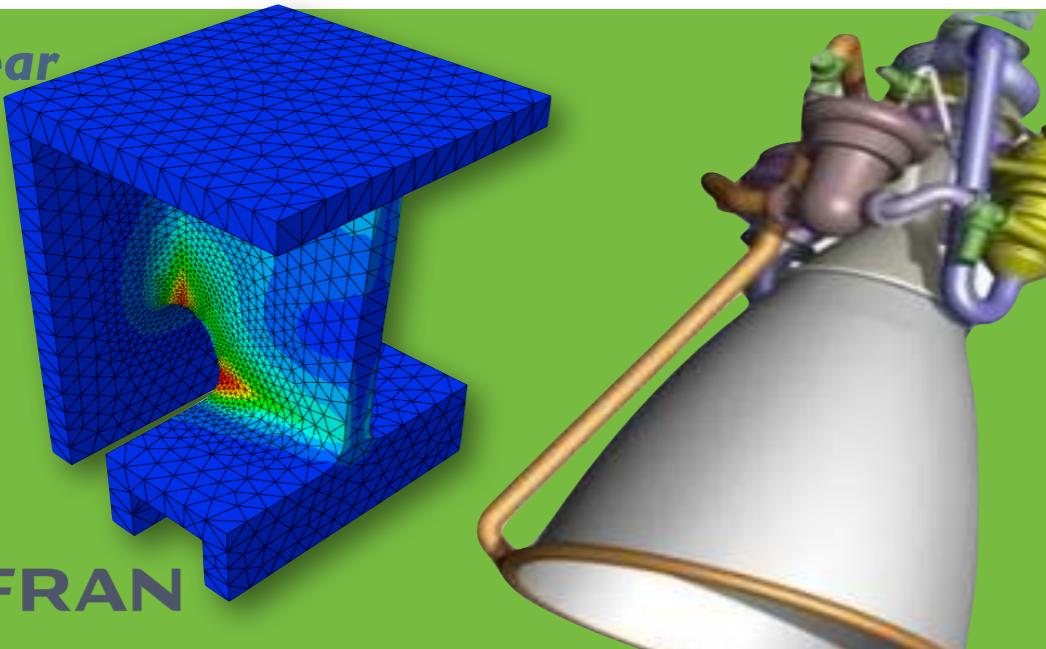
**pour les problèmes paramétrés, dynamiques,  
multiphysiques, multiéchelles...**

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David Néron

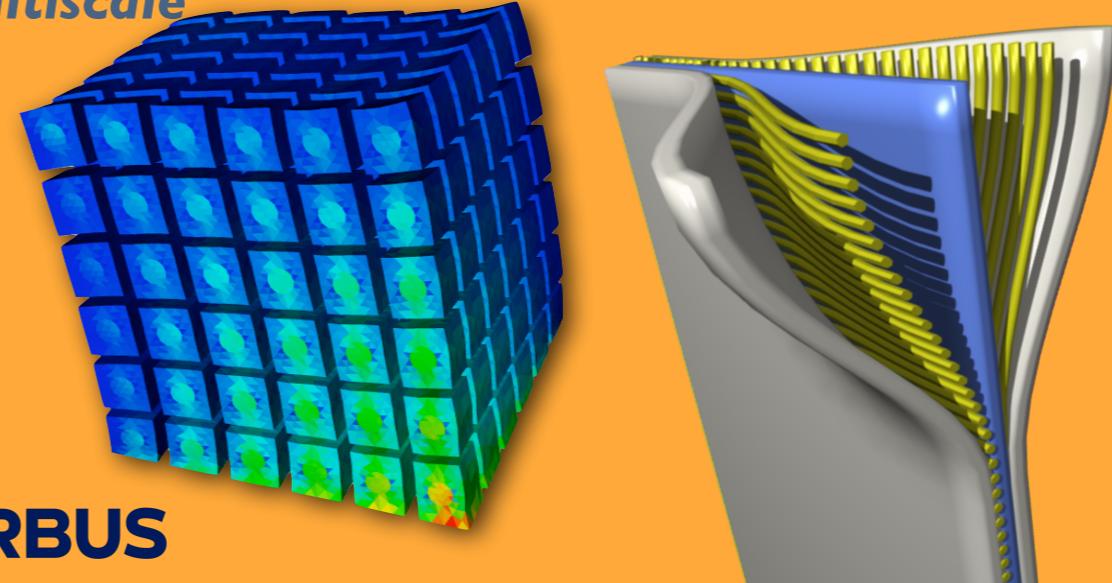
**P.-A. Boucard, A. Fau, P.-A. Guidault, P. Ladevèze, F. Louf (LMPS)  
Pierre-Etienne Charbonnel (CEA), F. Feyel (SAFRAN), R. Scanff (SIEMENS)  
A. Daby-Seesaram, E. Foulquier, P.-E. Malleval, V. Matray, N. Relun, F. Wurtzer...**

### Nonlinear



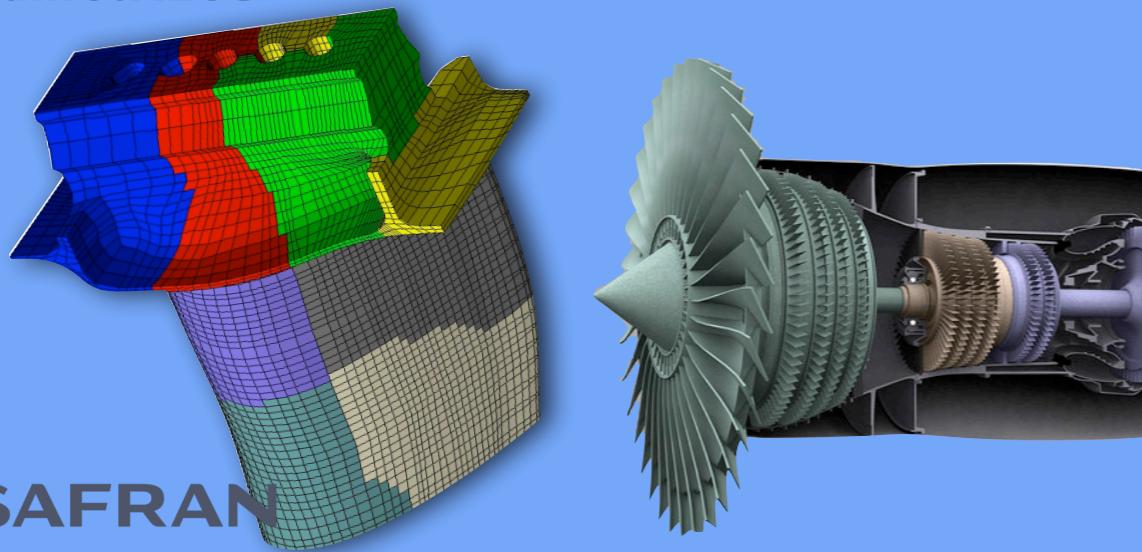
 **SAFRAN**

### Multiscale



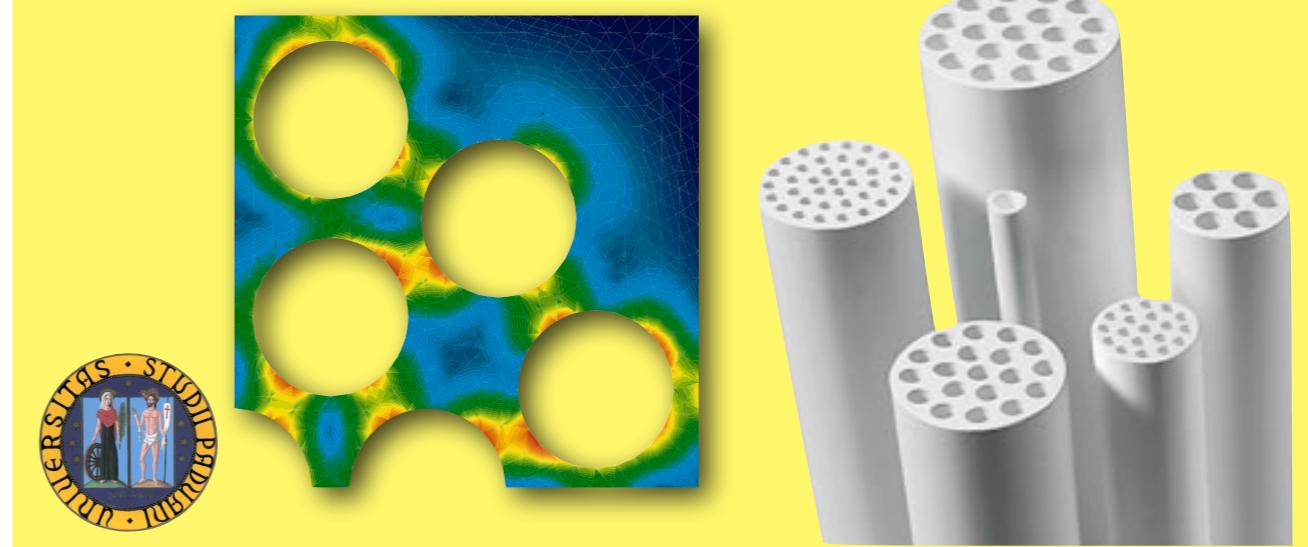
**AIRBUS**

### Parametrized

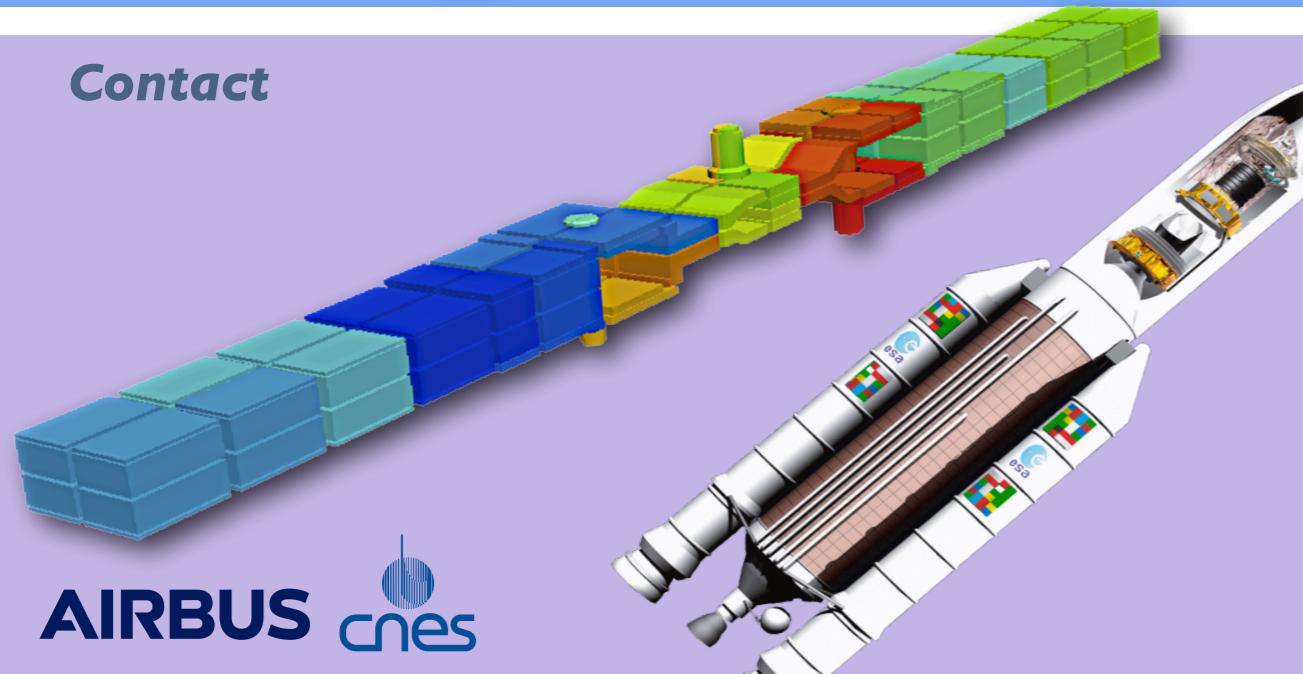


 **SAFRAN**

### Coupled

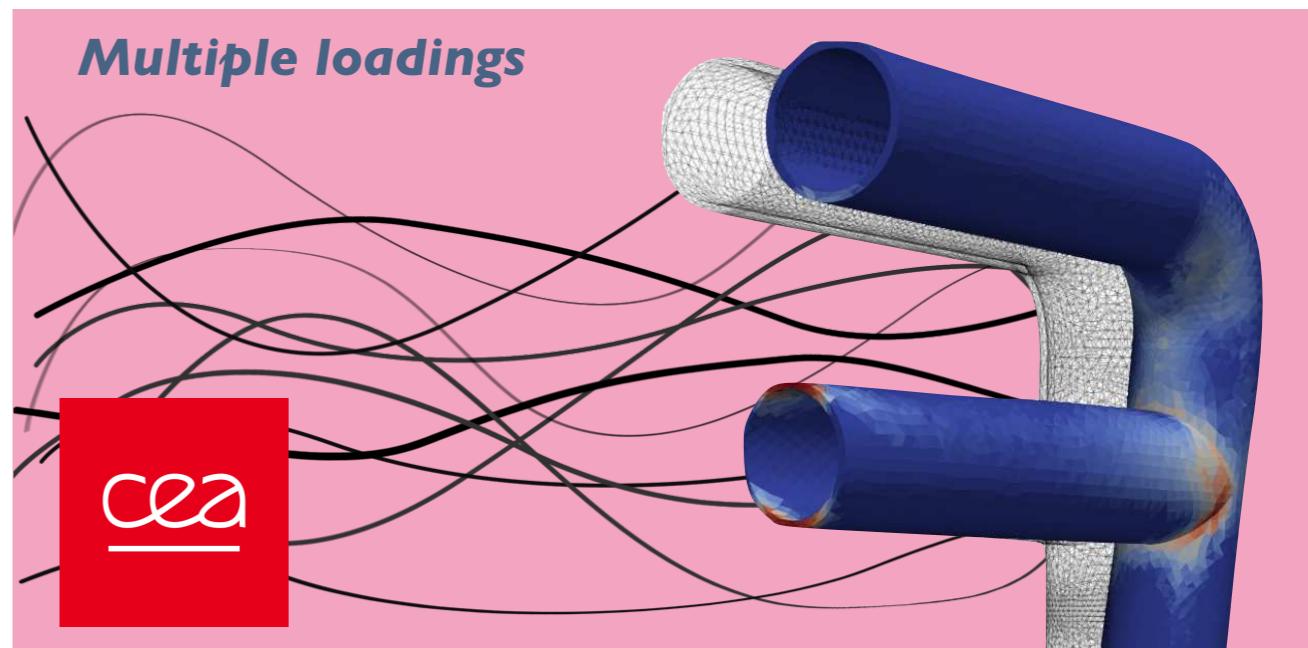


### Contact



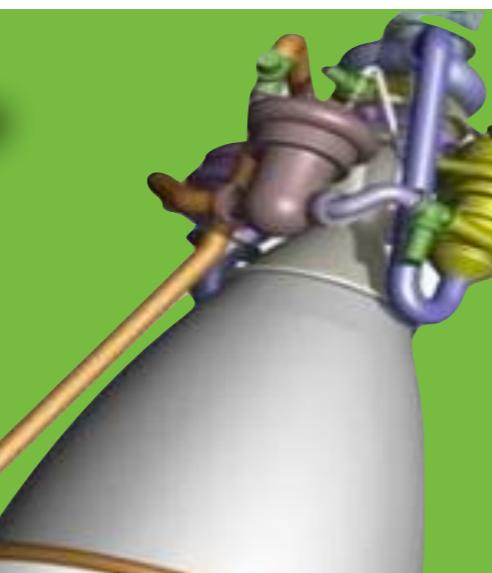
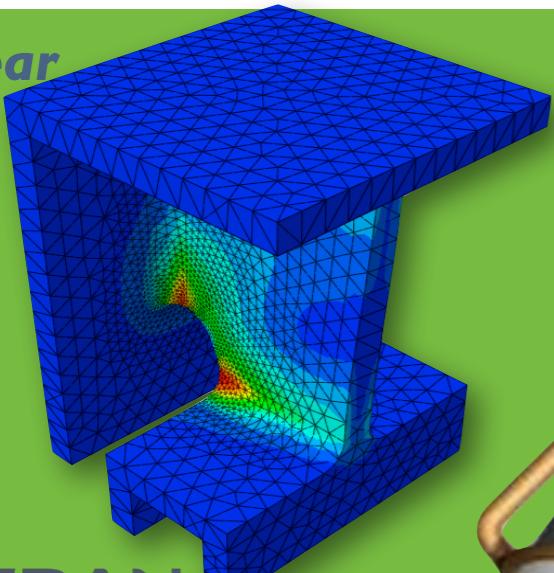
**AIRBUS** 

### Multiple loadings

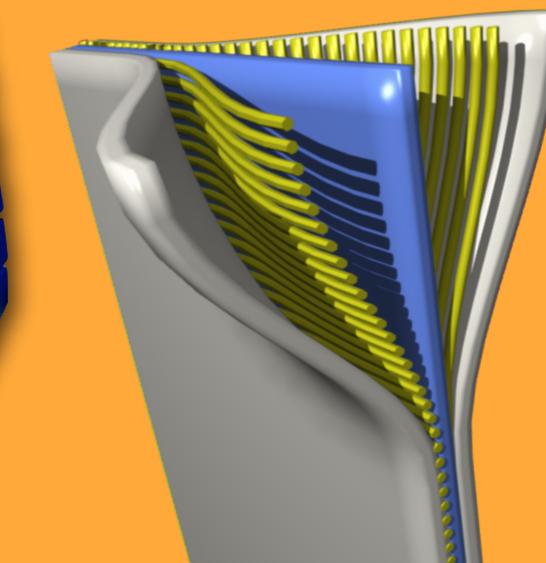
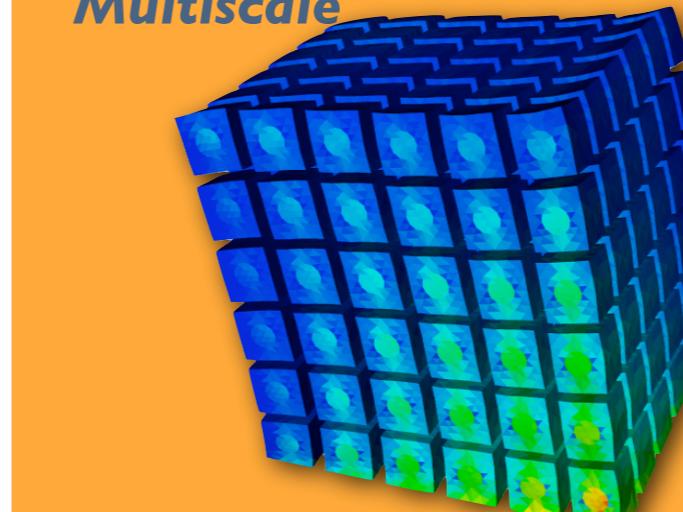


 **cea**

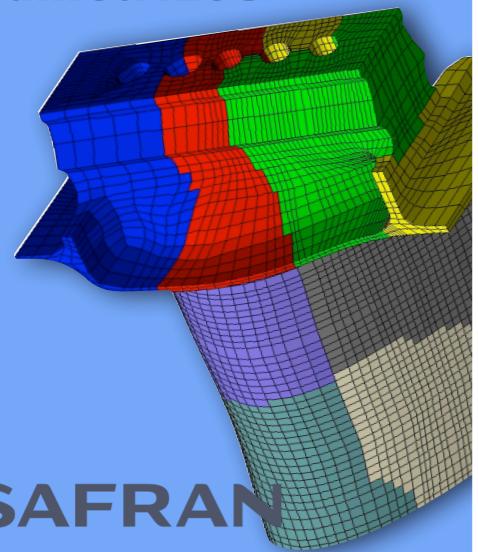
**Nonlinear**



**Multiscale**



**Parametrized**



In our team, model reduction by;

**LATIN**

**+**

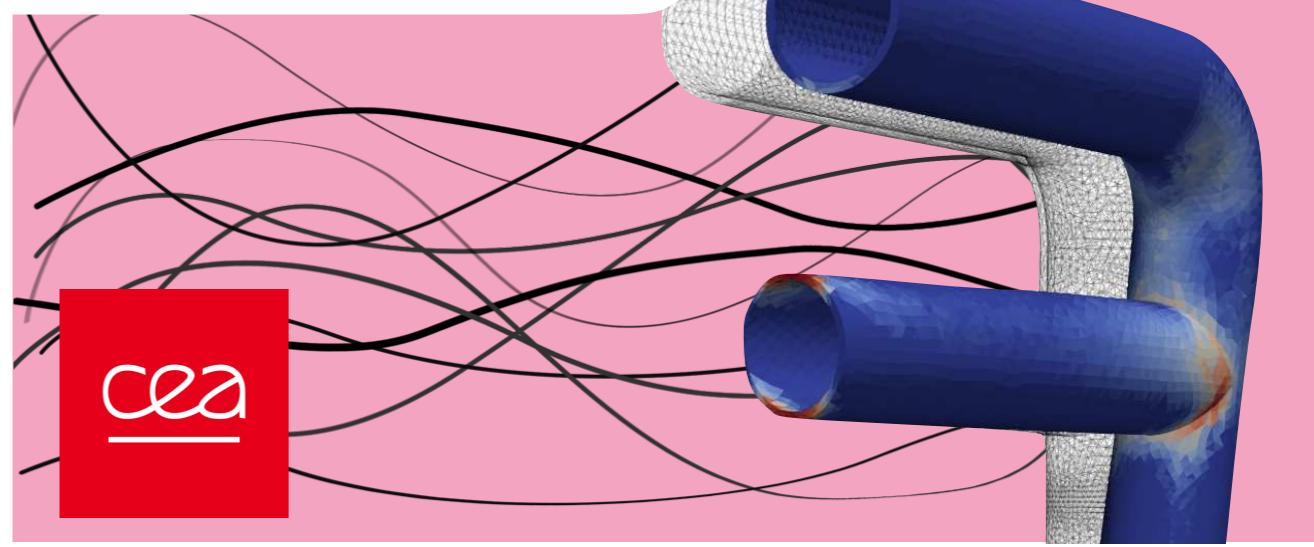
**Proper Generalized Decomposition (PGD)**

Initially introduced for the nonlinear problems  
many works for more than 30 years



Since adapted to many other situations  
using the same initial « spirit »

**Contact**



# Outline

- 1. The LATIN method and Proper Generalized Decomposition**
- 2. Solving parametrized problems to build virtual charts**
- 3. Many queries in multiphysics problems**
- 4. Conclusion**

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- I. The LATIN method and Proper Generalized Decomposition**
- 2. Solving parametrized problems to build virtual charts**
- 3. Many queries in multiphysics problems**
- 4. Conclusion**

# Reduced-Order Modeling (ROM)

## ■ Tentative definition

- capture **main features** of the behavior, retaining the **accuracy** of the approximation
- use the **redundancy** of information
- possibility of approximating a **complex system** using only a **handful of DOFs**

## ■ The behavior can be defined

- explicitly

**Given:**  $u(t, M)$

or implicitly

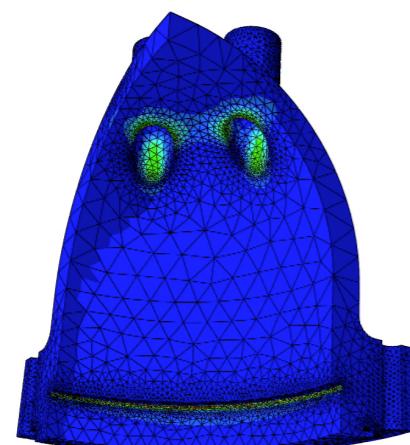
**PDE:**  $\mathcal{L}(u(t, M)) = 0$

## ■ Separation of variables

- best finite sum decomposition

i

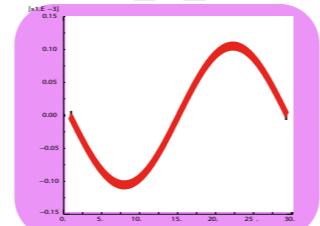
$$u(t, M) \approx \sum_{i=1}^m \lambda_i(t) \Lambda_i(M)$$



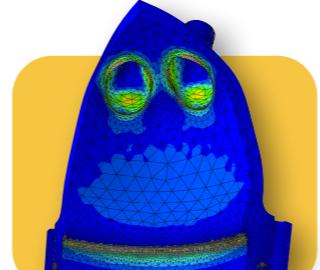
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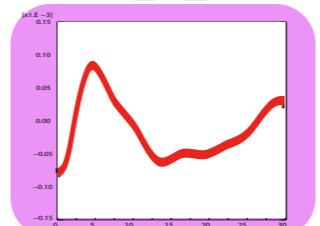
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X



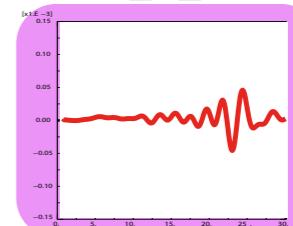
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X



+

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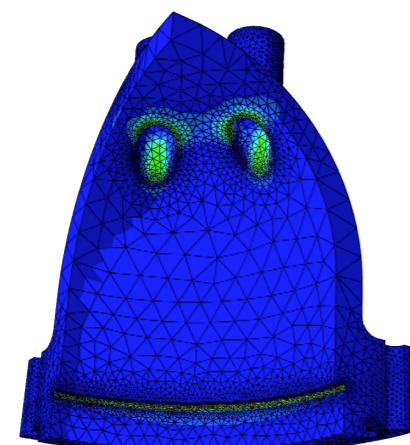
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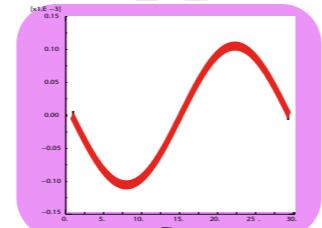
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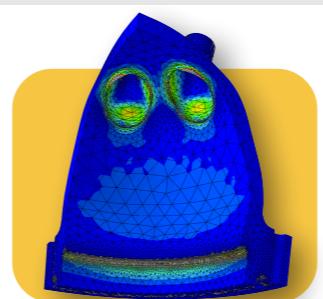
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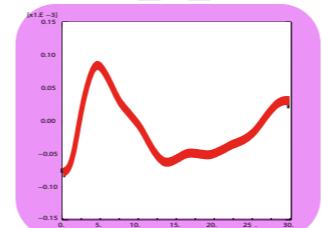
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+



X



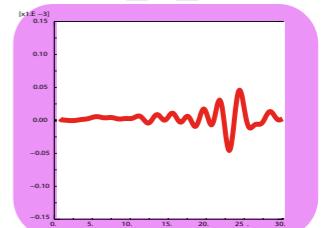
+

...

+



X



+

## ■ Particular cases

- if one imposes to one of the families  $\lambda_i$  or  $\Lambda_i$  to be orthogonal

**POD** (Proper Orthogonal Decomposition)

also known (depending on the community) as

**KLD** [Karhunen 43] [Loeve 55], **PCA** [Pearson 1901] [Hotteling 33]

- in finite dimension (our case after discretization)

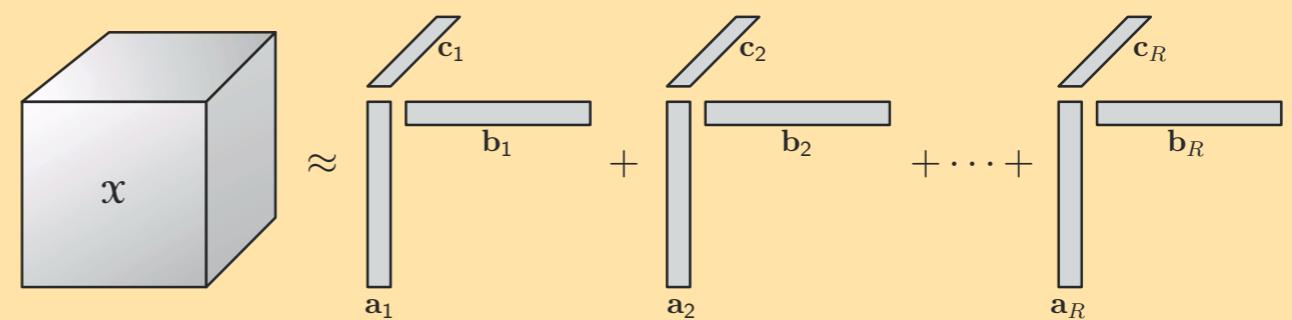
**SVD** [Eckart & Young 39]

**matlab**

```
[U,S,V] = svd(X)
X = U*S*V'
```

- in finite dimension but with more than two variables

**HOSVD** [Baranyi et al. 06]



## ■ More generally

- linear algebra of tensor decomposition

► 1st-order = vector, 2nd-order = matrix, >2-order = high-order tensors

# How to chose/build the ROB?

## ■ Building a given ROB before solving the PDE (a posteriori method)

- principle: **offline/online computations, learning phase**

### ● Proper Orthogonal Decomposition (POD)

[Sirovich 87] [Holmes et al. 93] [Krysl et al 00] [Kunisch and Wolkwein 02]

[Willcox et al. 02] [Picinbono et al. 03] [Bergmann et al. 05] [Lieu et al. 06]

[Gunzburger et al. 06] [Niroomandi et al. 08] [Farhat et al. 08] [Matthies et al. 10] ...

### ● Reduced-Basis (RB) especially for parametrized problems

[Maday et al. 02] [Patera et al. 02] [Rozza et al. 07] [Haasdonk et al. 08] [Boyaval et al. 09] ...

## ■ Without assuming any ROB before solving the PDE (a priori method)

- principle: **automatic generation of the most relevant ROB**

### ● Proper Generalized Decomposition (PGD)

[Ladevèze 85, 99] ... [Ladevèze et al. 99-11] [Nouy and Ladevèze 03, 04]

[Ladevèze et al. 08, 09, 10] [DN and Dureisseix 08] [Boucard, DN 11-13] ...

[Chinesta 06-] [Nouy et al. 07-] [Ammar and Chinesta 06] [Leygue et al 10-]

[Ryckelynck 06] [Beringhier et al. 10] ...

## ■ Idea

- minimization of a residual, Galerkin formulation, Petrov-Galerkin formulation

**PDE:**  $\mathcal{L}(u(t, M)) = 0$

ex: linear elasticity  $\mathbf{u}^{\star T} [\mathbf{Ku}(t) - \mathbf{f}(t)] = 0$

## ■ Reformulation in the separated-variable framework

$$\mathbf{u}^{\star T} [\mathbf{Ku}(t) - \mathbf{f}(t)] = 0$$

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$$\mathbf{u}^{\star} = \mathbf{f}(t)$$

$$\mathbf{u}^{\star} = \mathbf{g}(\mathbf{u}^{\star})$$

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## ■ Reformulation in the separated-variable framework

$$\int_0^T \left[ \mathbf{A} + \mathbf{A}^T \right]^T \left[ \mathbf{f} - \mathbf{g} \right] = 0$$

$\mathbf{f} = f(\cdot)$     $\mathbf{g} = g(\cdot)$

**Fixed-point method**

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$\mathbf{f} = f(\mathbf{u})$        $\mathbf{g} = g(\mathbf{u})$        $\mathbf{f} \circ \mathbf{g} = f \circ g(\mathbf{u})$

**Fixed-point method**

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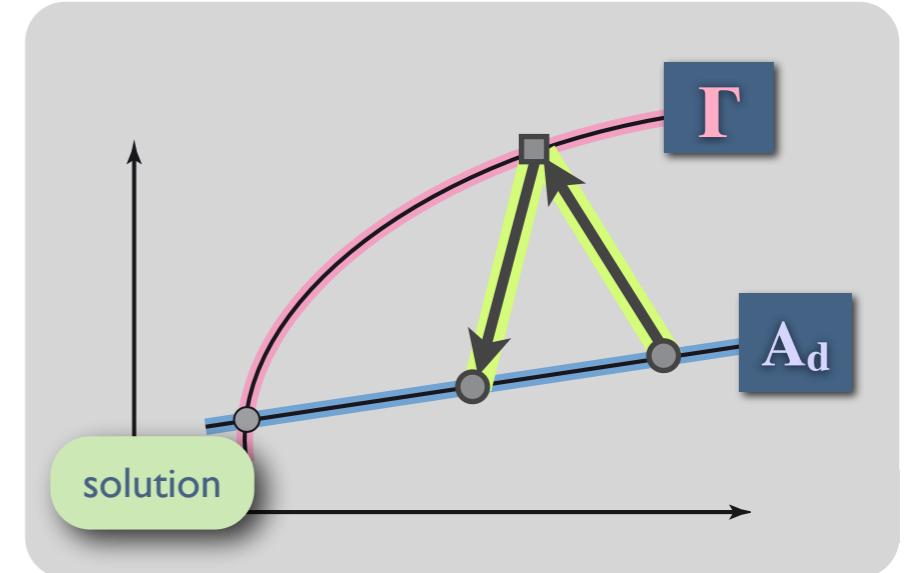
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$\mathbf{f} = f(\quad)$        $\mathbf{g} = g(\quad)$        $\mathbf{f} \circ \mathbf{g} = f \circ g(\quad)$   
**Fixed-point method**      **Eigenvalue problem**

# PGD in the LATIN framework

## ■ LATIN

- non incremental computational strategy
- books [Ladevèze 85] [Ladevèze 99]
- originally designed for nonlinear problems
  - separation between nonlinear and linear equations
- since used for coupled problems
  - separation between coupled and uncoupled equations
- or for multiscale problems
  - separation between equations defined at the scale of subdomains and equation which link subdomains...



## ■ Model reduction method PGD

- formerly « radial loading approximation »
- renamed in 2010 by P. Ladevèze and F. Chinesta
- Proper Generalized Decomposition (PGD) to show the link with POD



$$u(t, M) \approx \sum_{i=1}^m \lambda_i(t) \Lambda_i(M)$$

# Mechanical problem

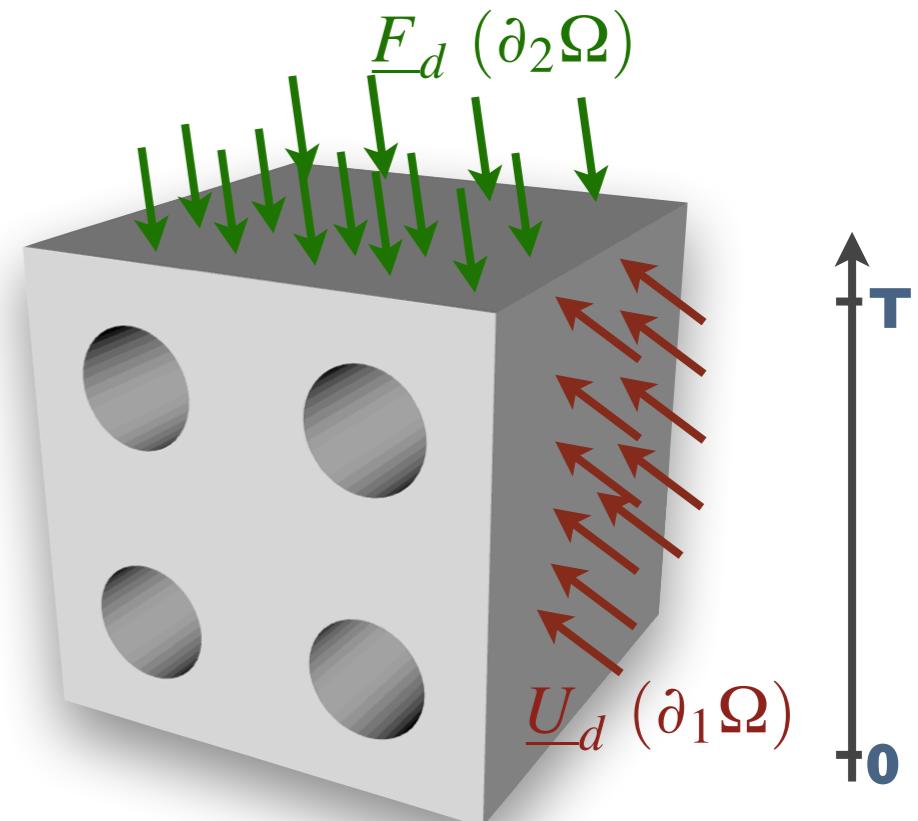
## ■ Framework

- small perturbation, quasi-static evolution, isothermal

## ■ State of the structure

- defined by  $\mathbf{s} = (\varepsilon_p, X, \sigma, Y)$

- ▶  $\varepsilon_p$  inelastic part of strain field
- ▶  $X$  remaining internal variables
- ▶  $\sigma$  stress field
- ▶  $Y$  variables conjugate of  $X$



# Mechanical problem

## ■ Framework

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## ■ Governing equations

### ● kinematic admissibility

*compatibility of strain*

*prescribed displacement*

### ● static admissibility

*equilibrium equation*

### ● nonlinear material behavior (Marquis-Chaboche elastic-viscoplastic material)

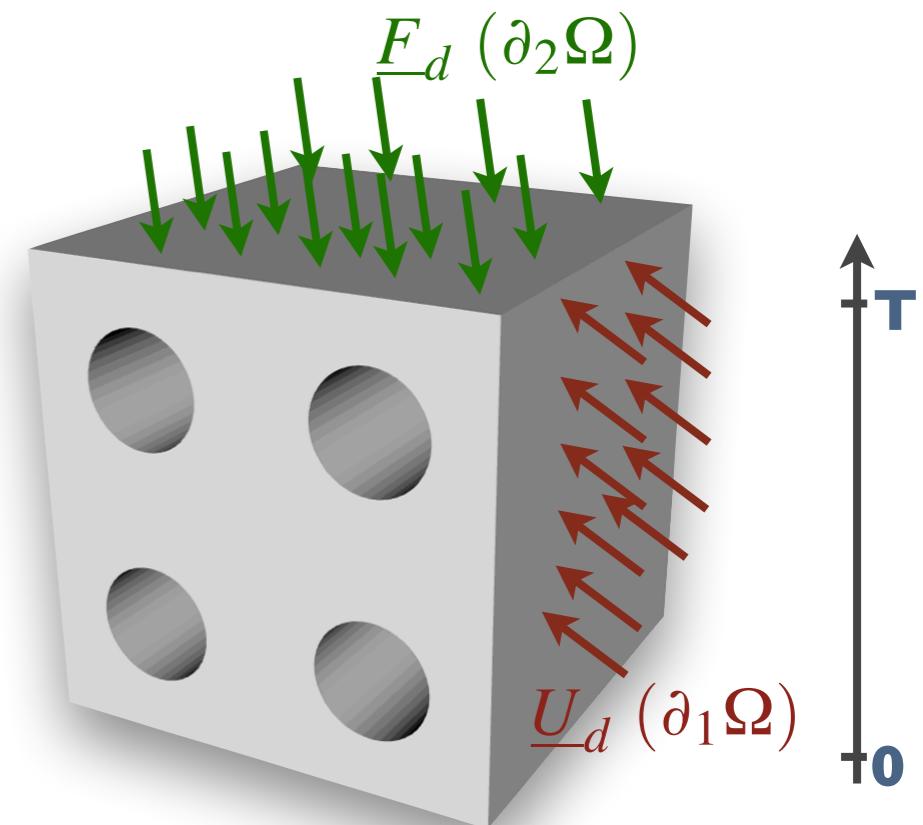
*state equations*

$$\sigma = K\varepsilon_e \quad Y = \frac{2}{3}CX$$

*evolution laws*

$$\dot{\varepsilon}_p = \frac{3}{2} \left\langle \frac{\phi}{K} \right\rangle^n_+ \frac{\sigma^D - Y}{(\sigma - Y)_{eq}}$$

$$\dot{X} = \dot{\varepsilon}_p - \frac{3}{2} \gamma C^{-1} Y$$



linear



nonlinear

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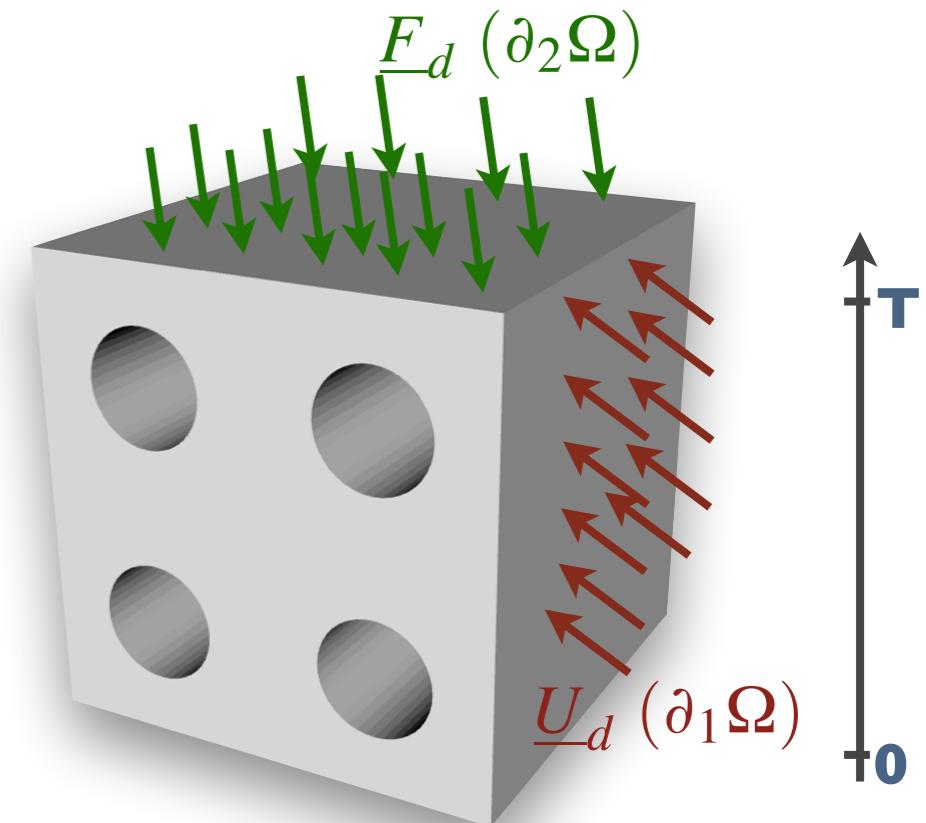
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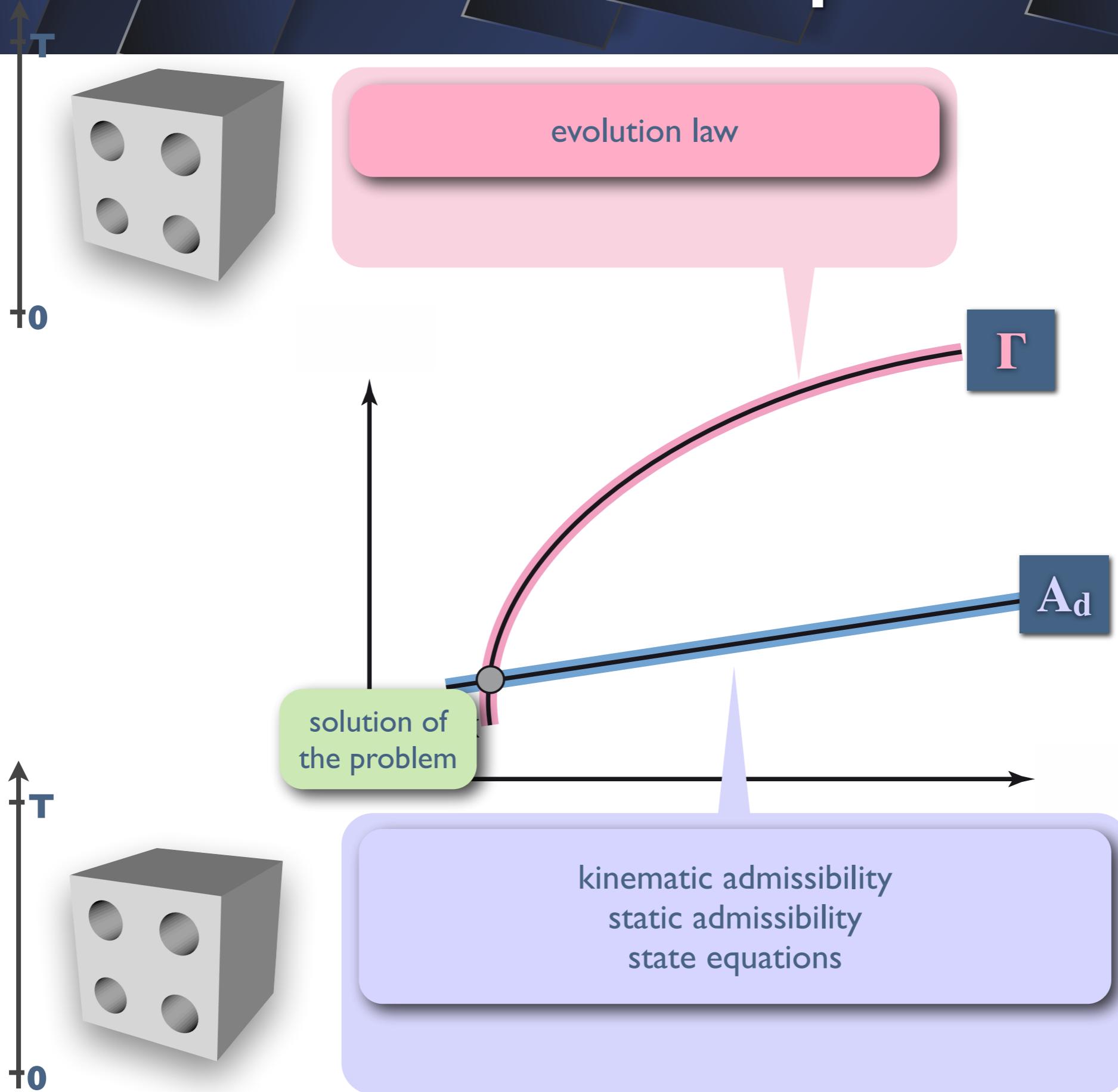
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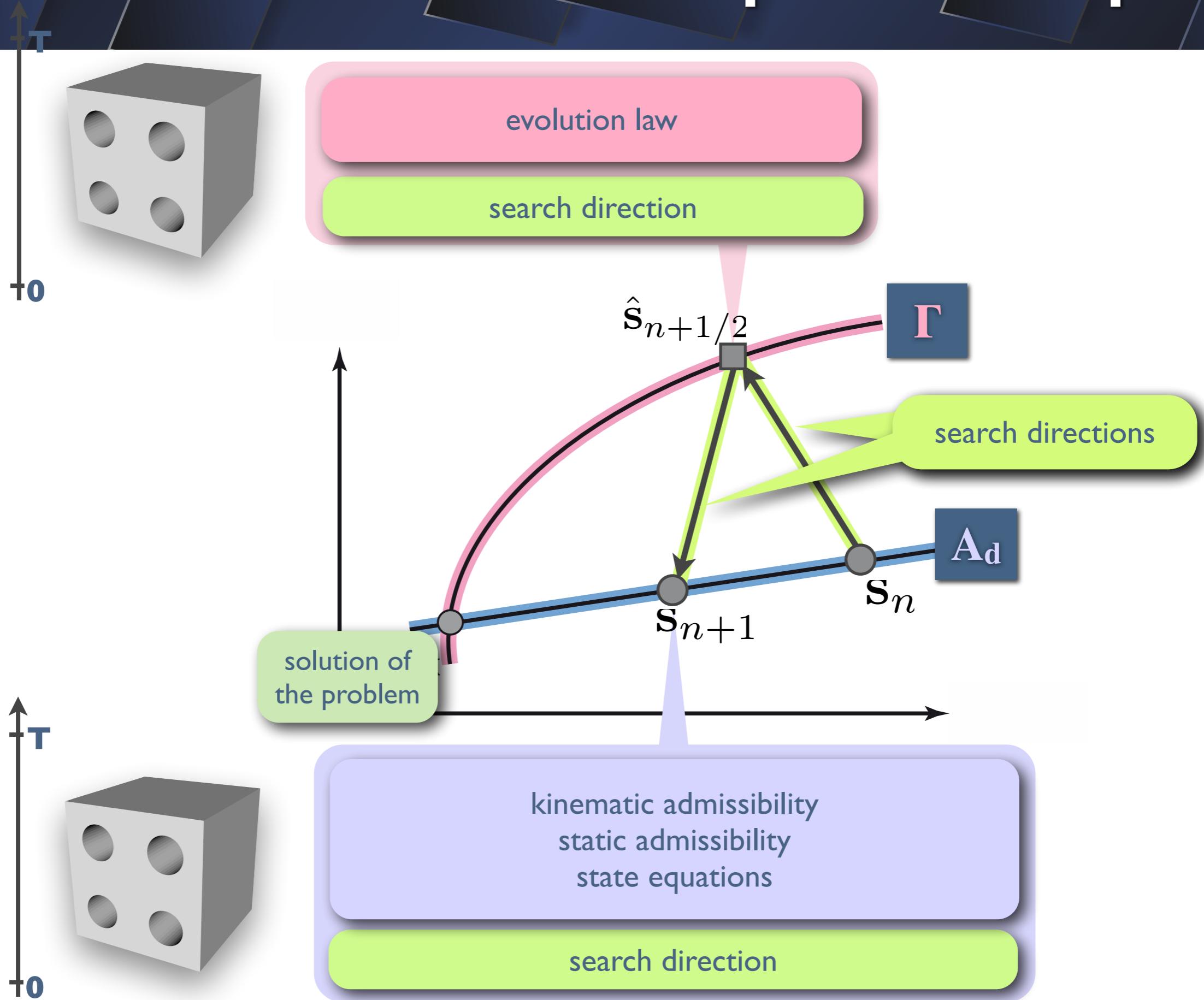
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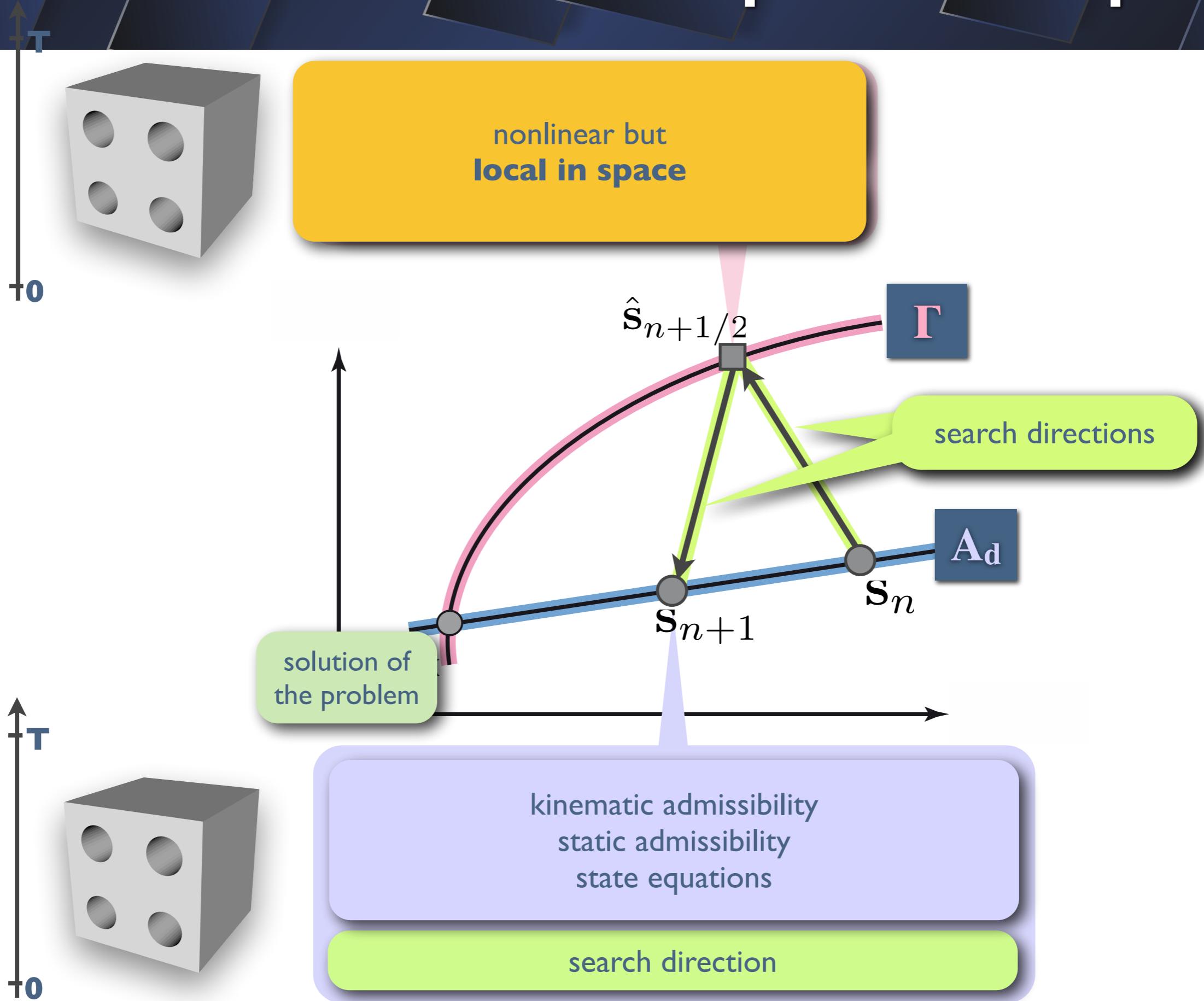
# Computational aspects



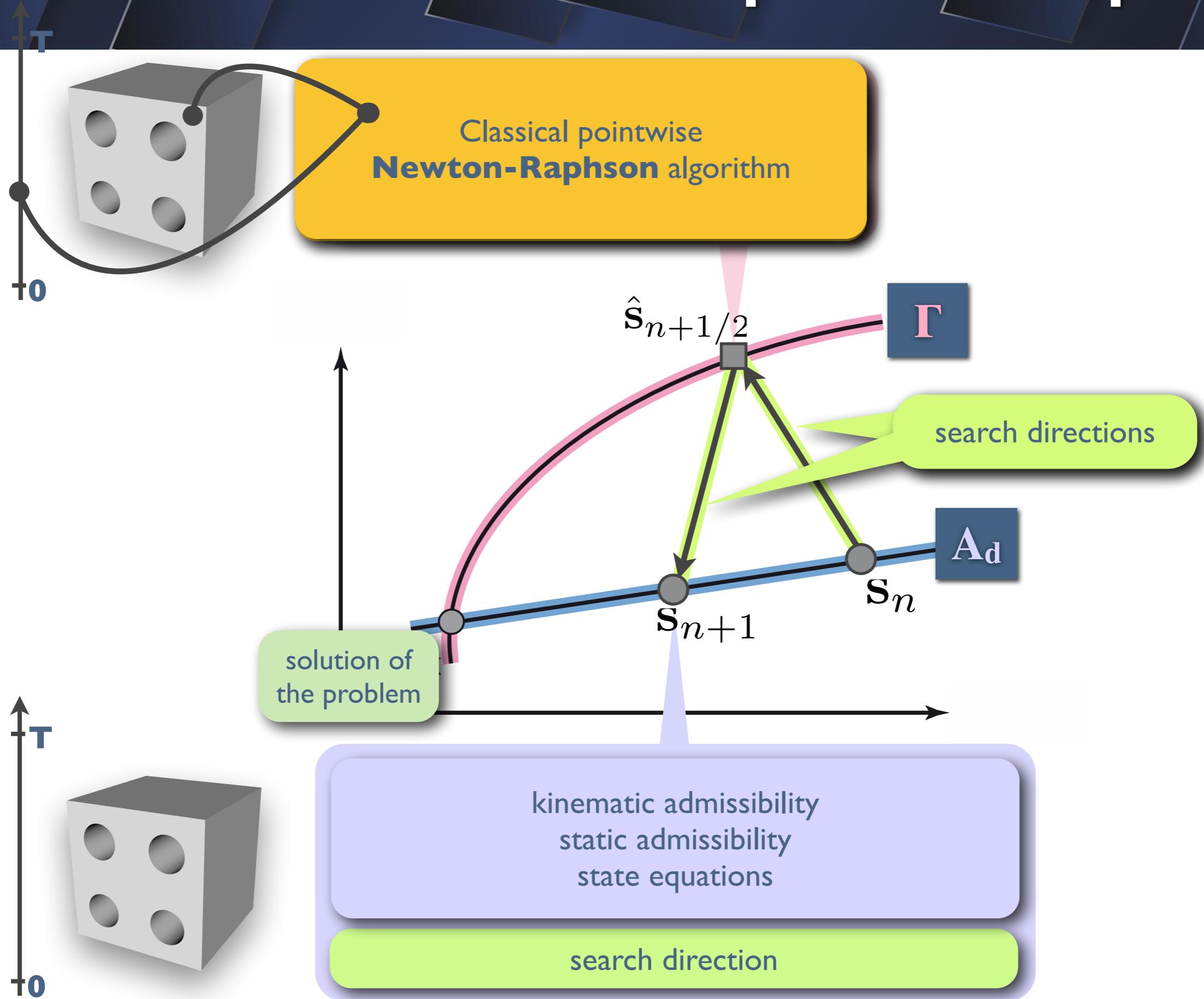
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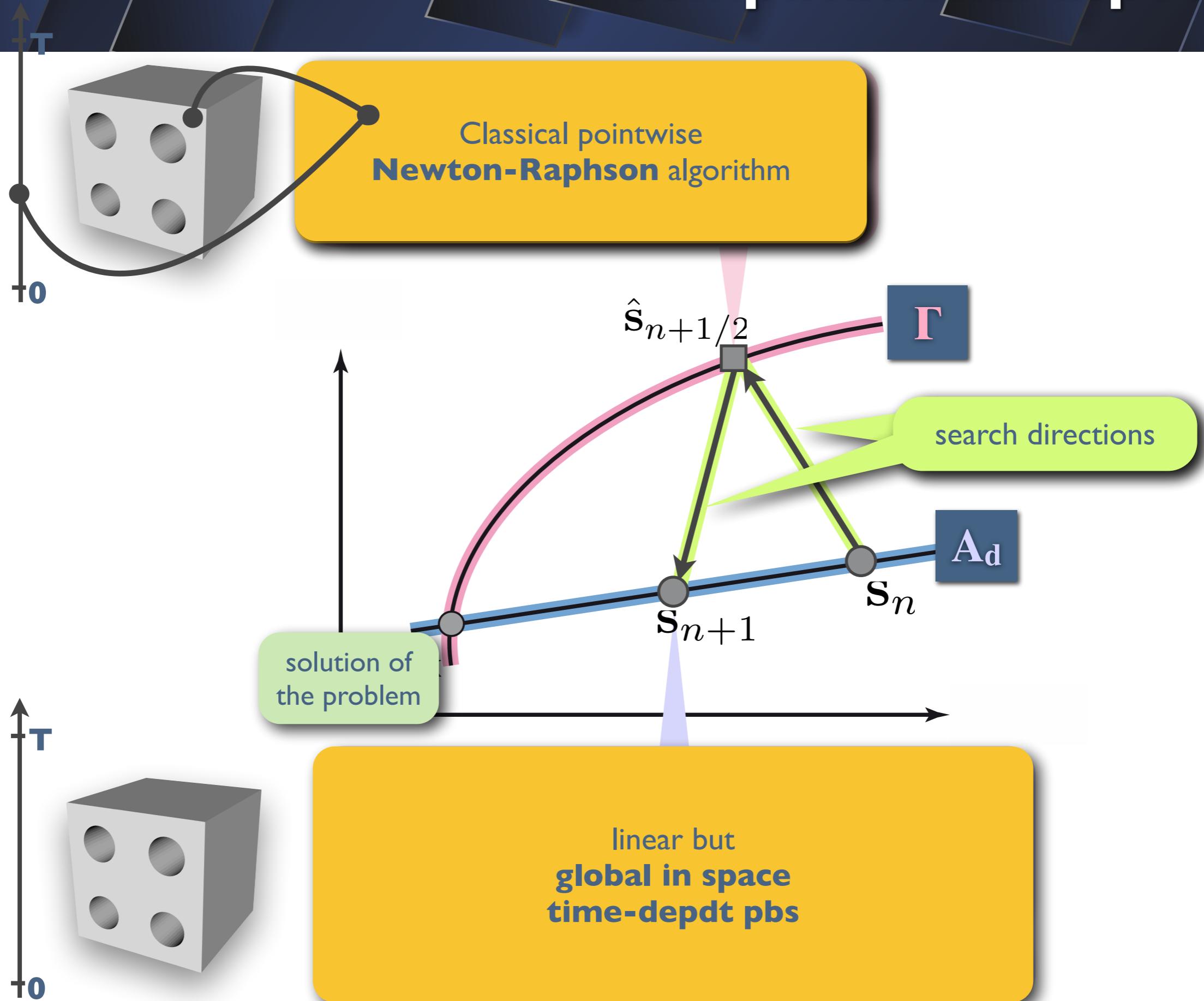
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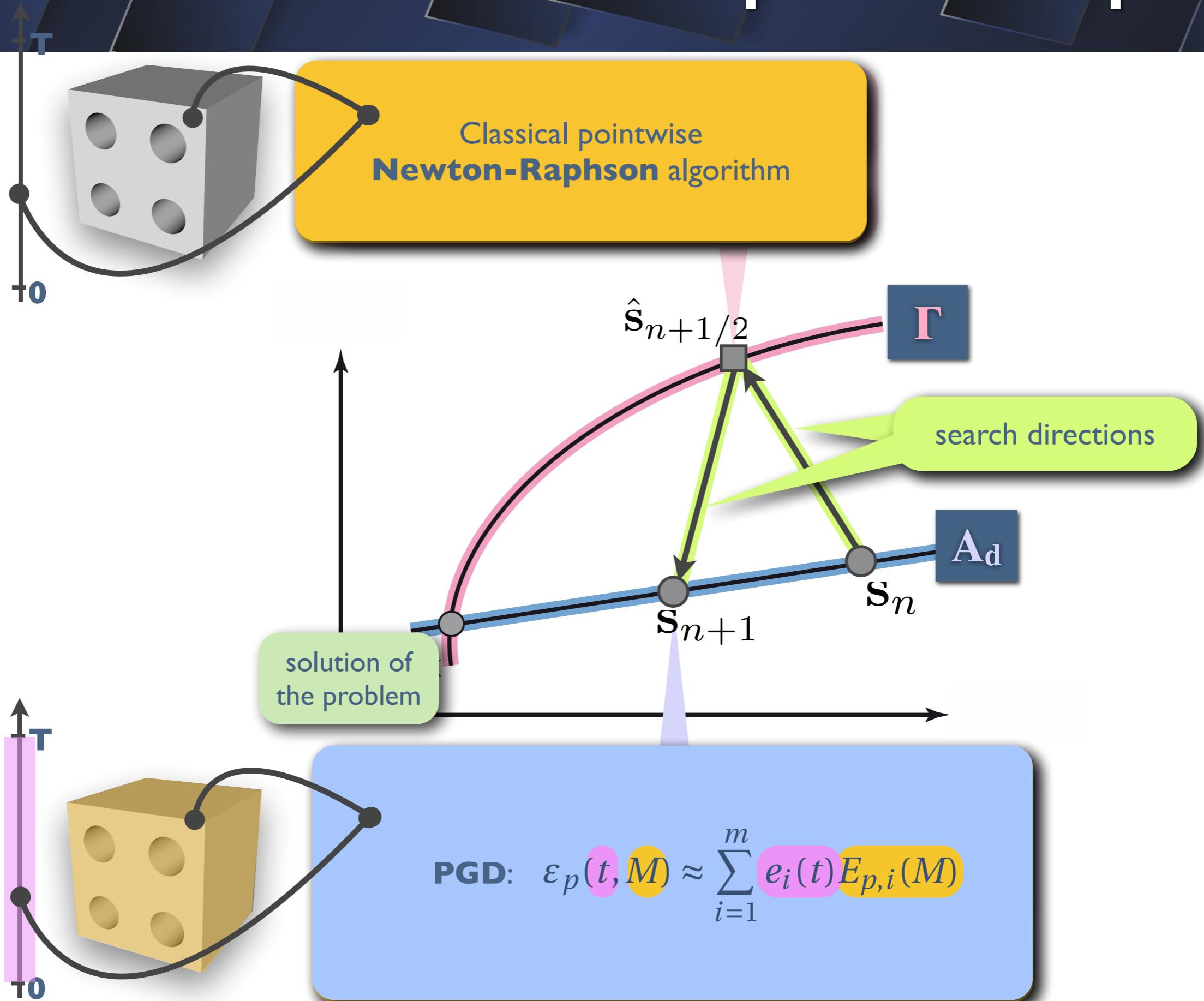
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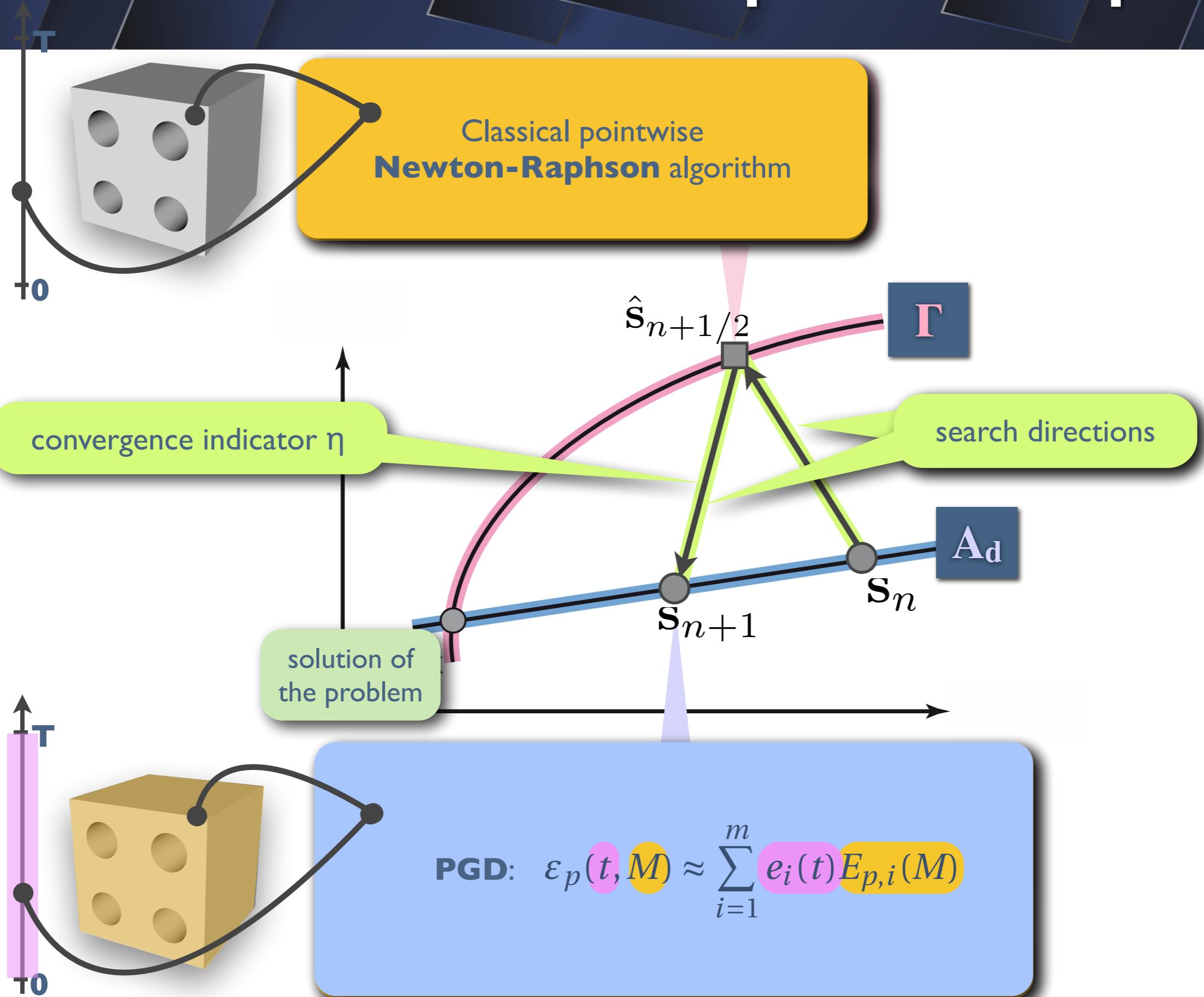
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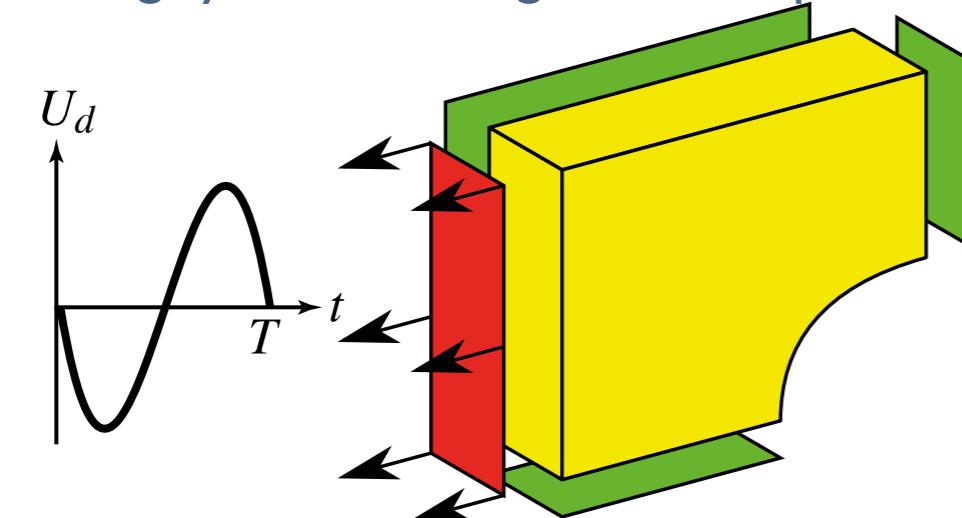


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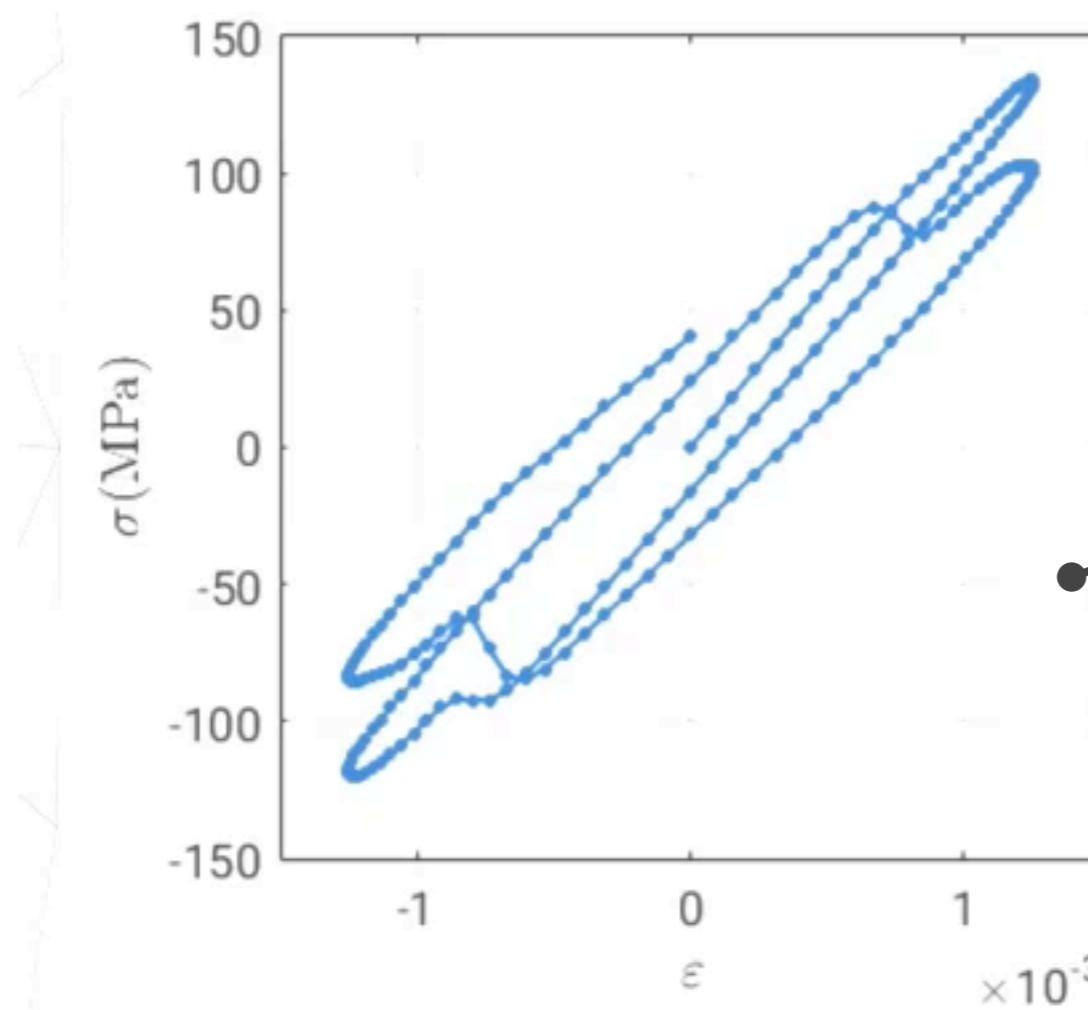
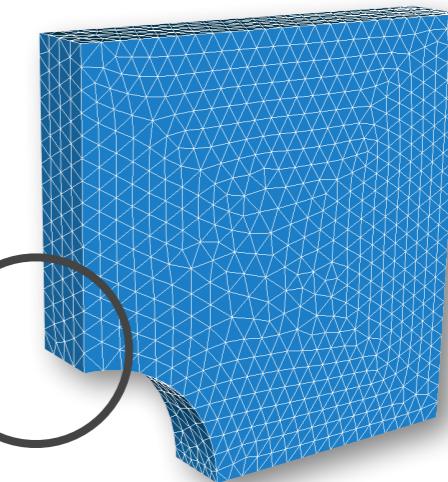
## ■ Open hole plate

- using symmetries: eighth of the plate



■ symmetry condition  
■ prescribed displacement

36,954 DOFs  
120 time steps



Evolution equations  
 Kinematic admissibility  
 Static admissibility

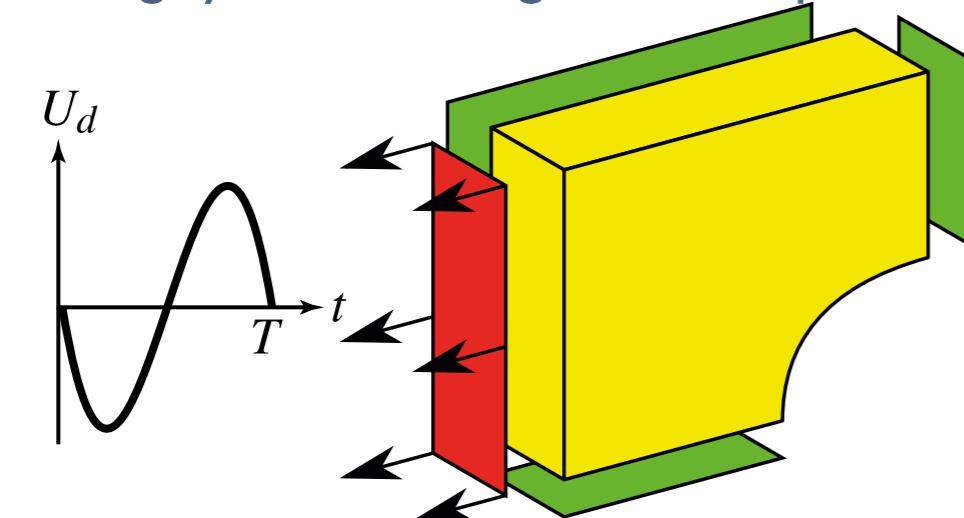
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$\Gamma$

$A_d$

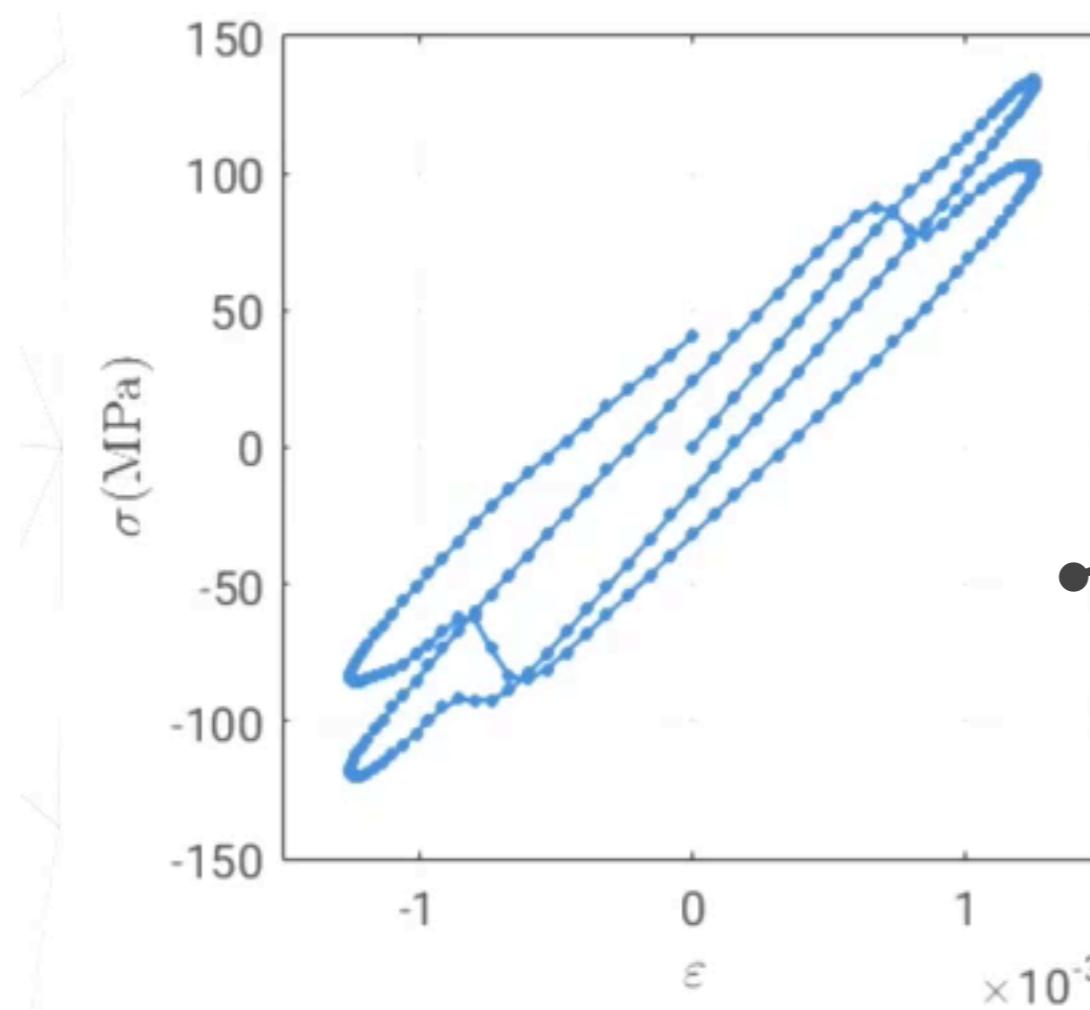
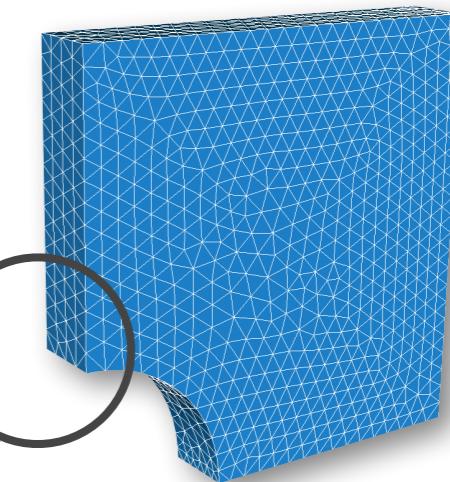
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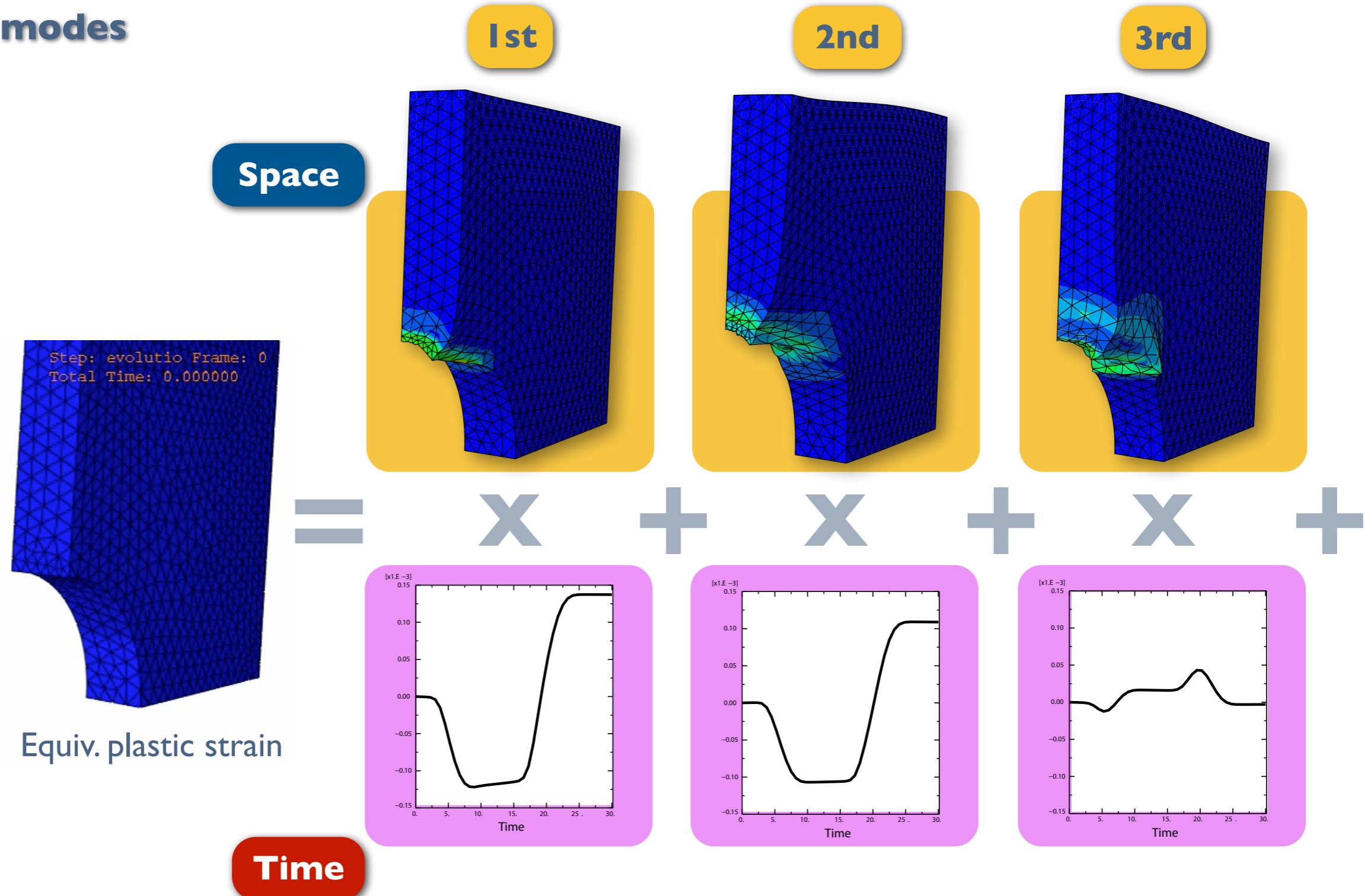


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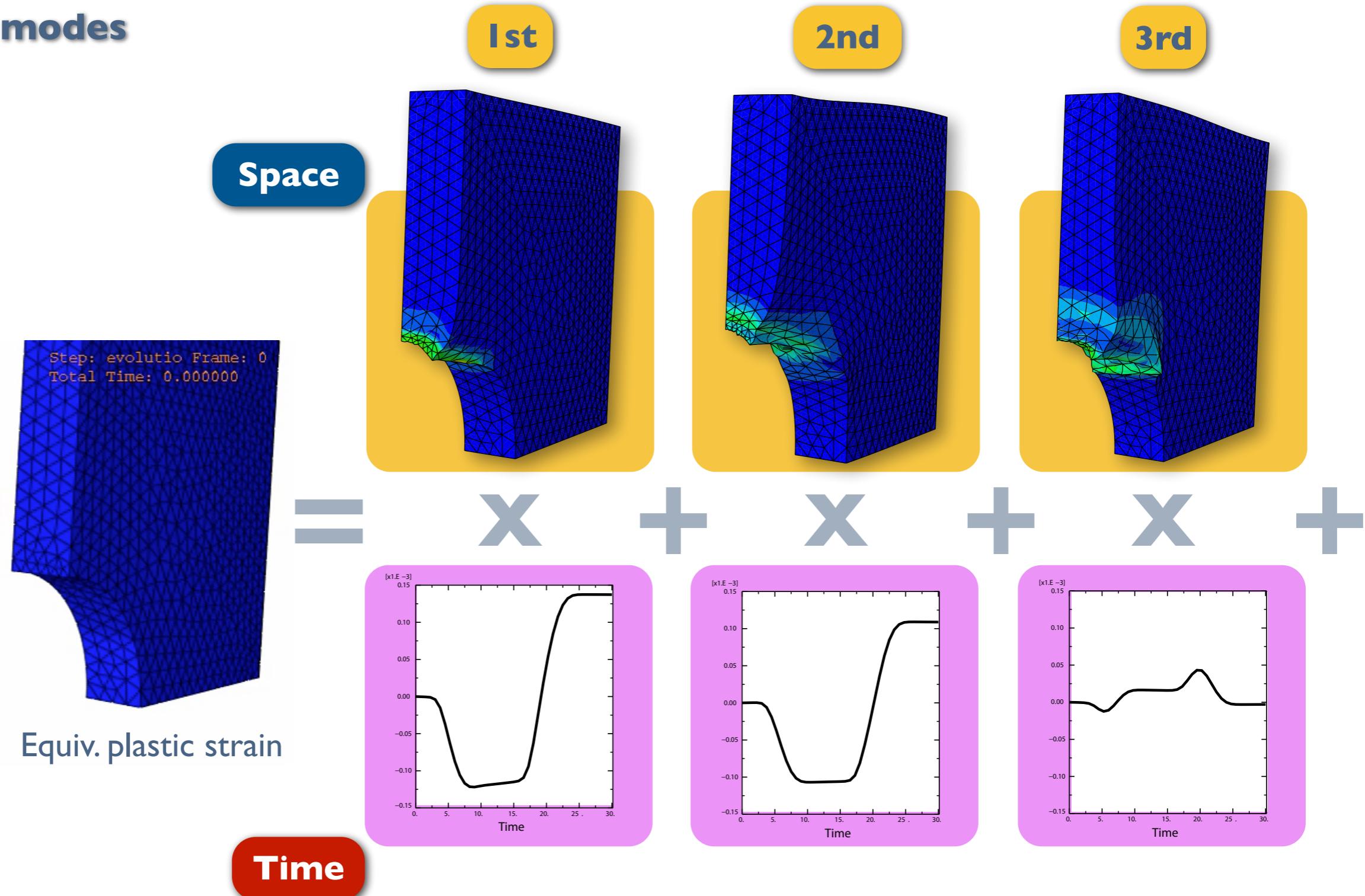
# Mini example

## ■ PGD modes



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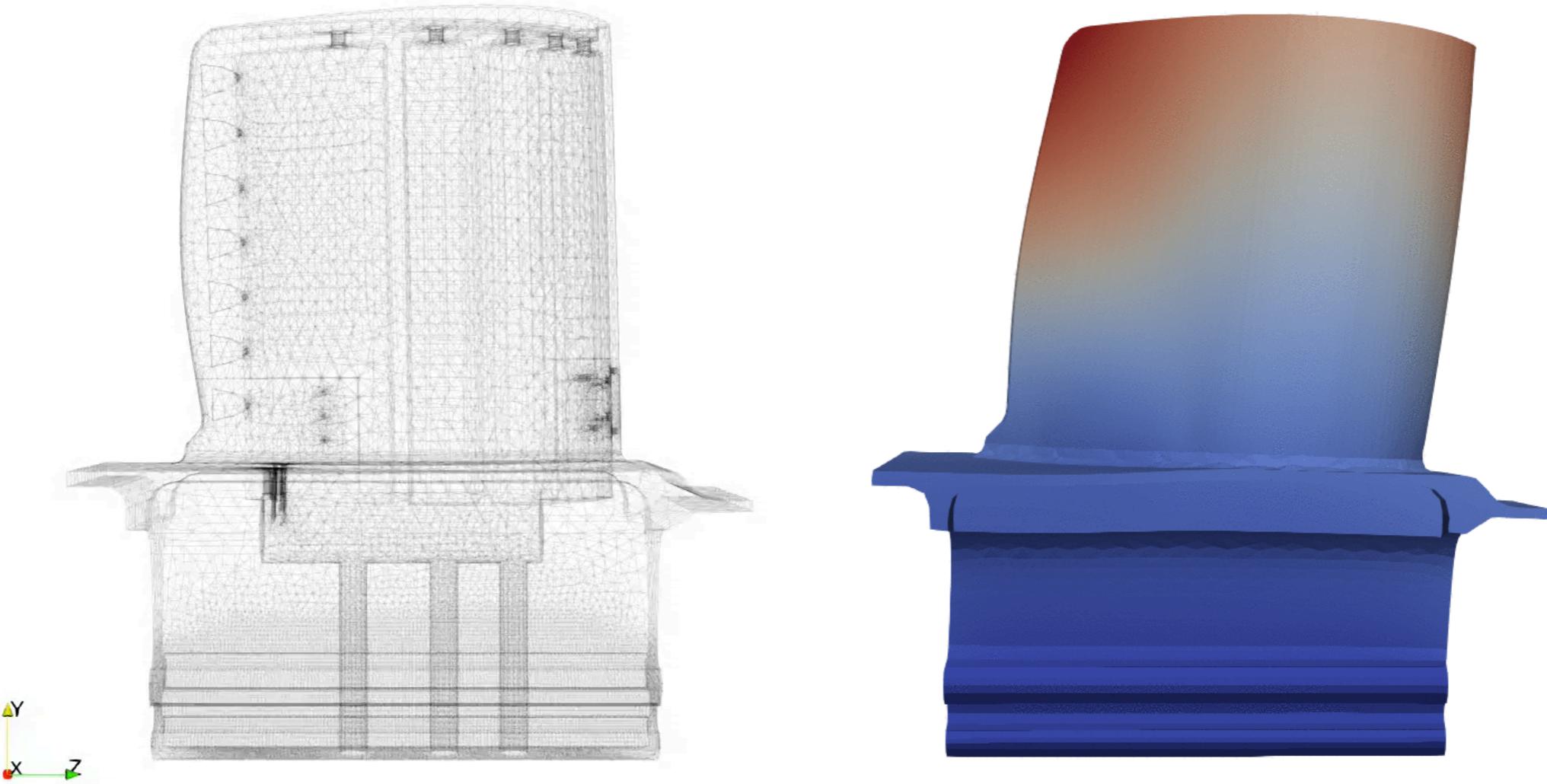
## ■ PGD modes



## ■ Blade of an aircraft engine

- Chaboche elasto-visco-plastic law with temperature dependence
- 5 MDOFs, 31 time steps, centrifugal inertial forces (rotational speed of 15,000 tr/min)
- [Nachar, Scanff, Ladevèze, Boucard, DN, 2022]

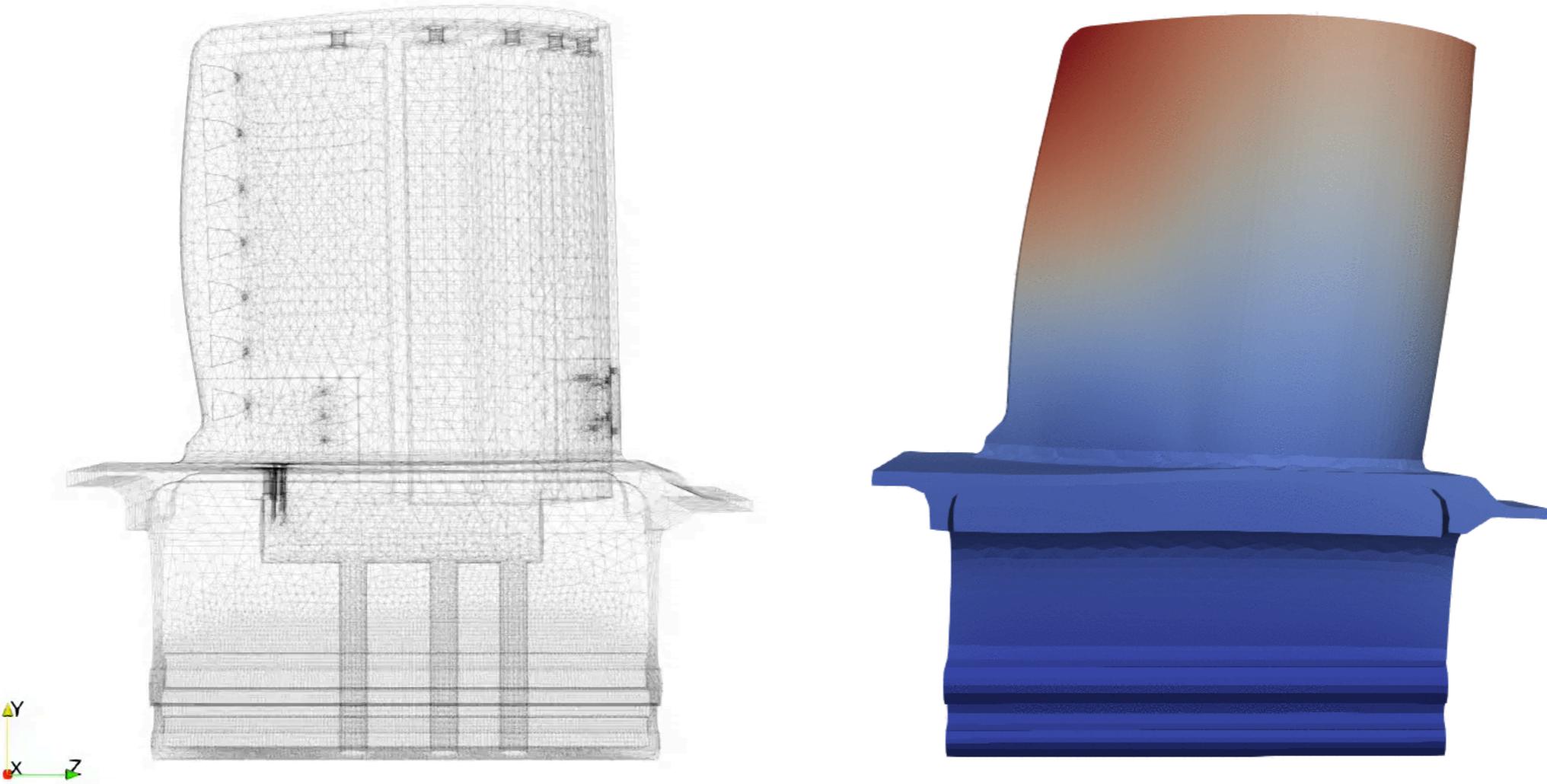
SIEMENS



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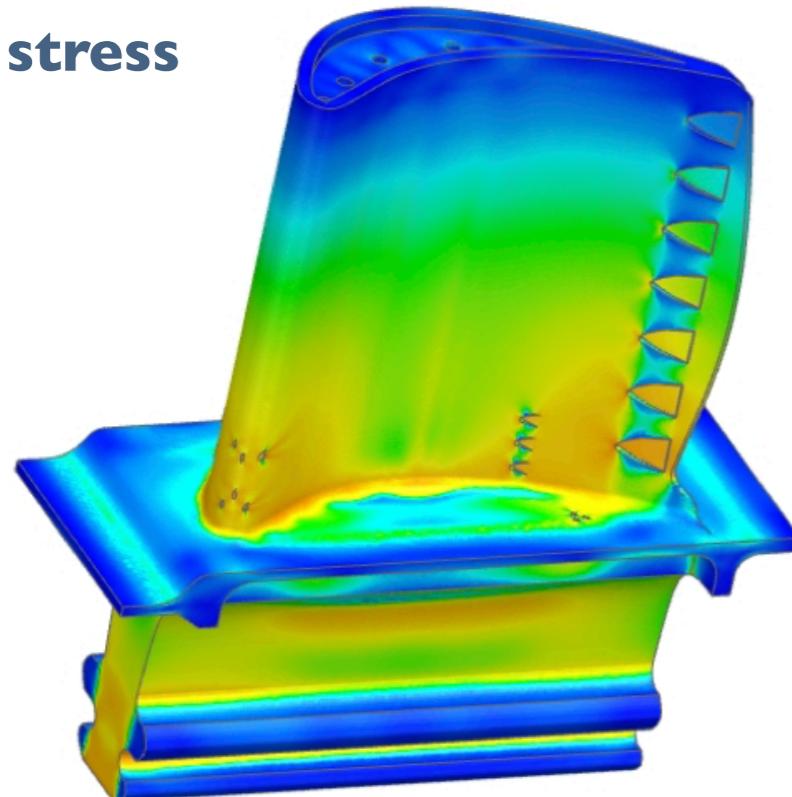


# Bigger example

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Mises stress



Space  
ROB

Time  
funct.

1st

2nd

3



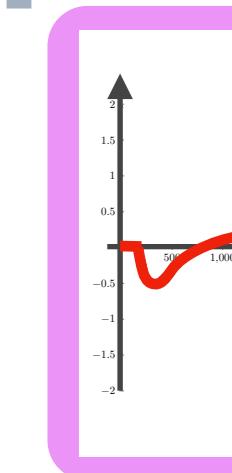
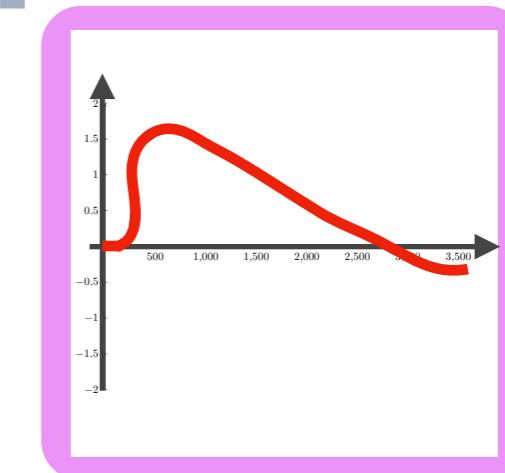
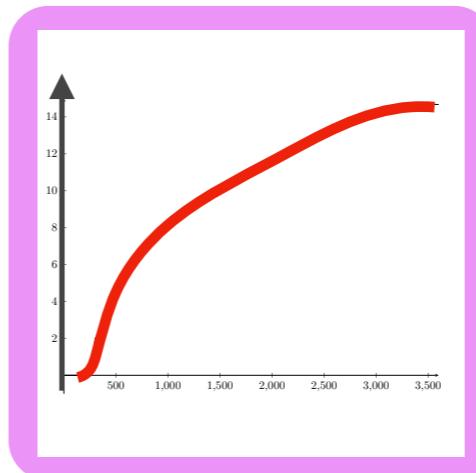
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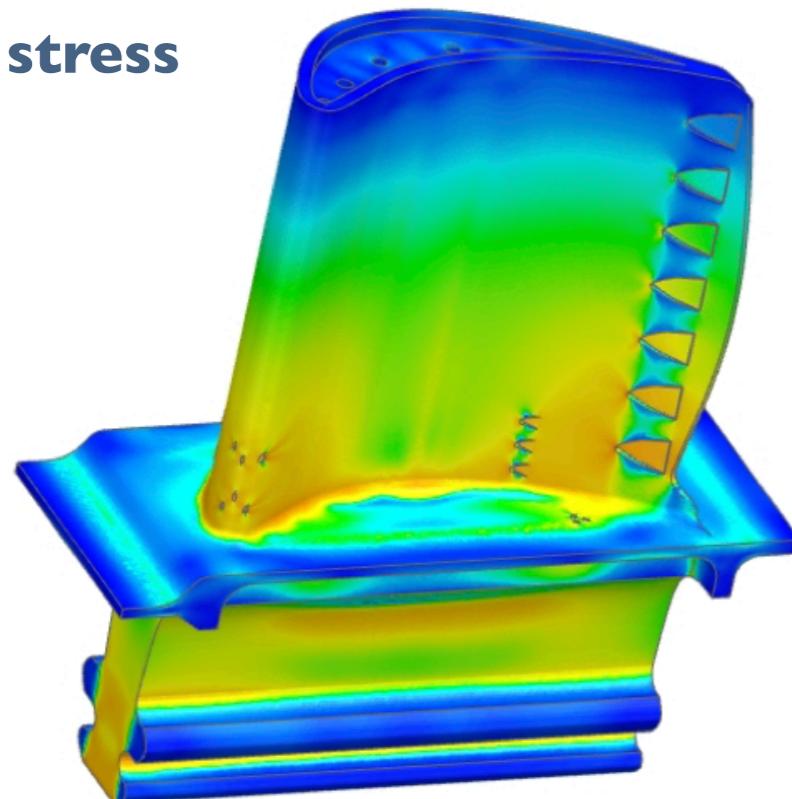


# Bigger example

## ■ Blade of an aircraft engine

- Chaboche elasto-visco-plastic law with temperature dependence
- 5 MDOFs, 31 time steps, centrifugal inertial forces (rotational speed of 15,000 tr/min)
- [Nachar, Scanff, Ladevèze, Boucard, DN, 2022]

Mises stress



Space  
ROB

Time  
funct.

1st

2nd

3



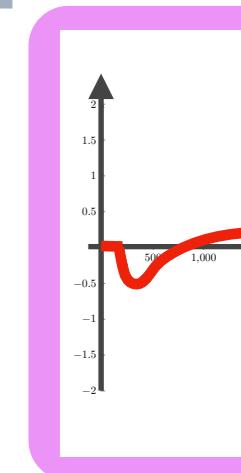
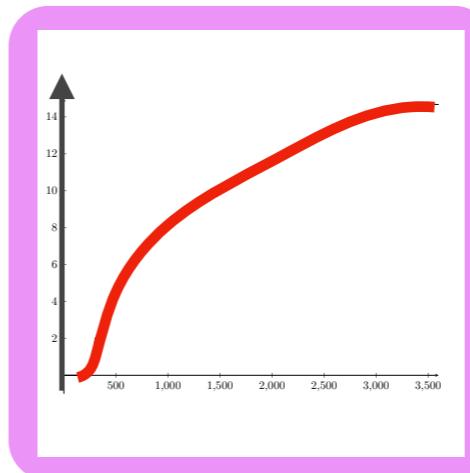
X



X



X



# Outline

- 1. The LATIN method and Proper Generalized Decomposition**
- 2. Solving parametrized problems to build virtual charts**
- 3. Many queries in multiphysics problems**
- 4. Conclusion**

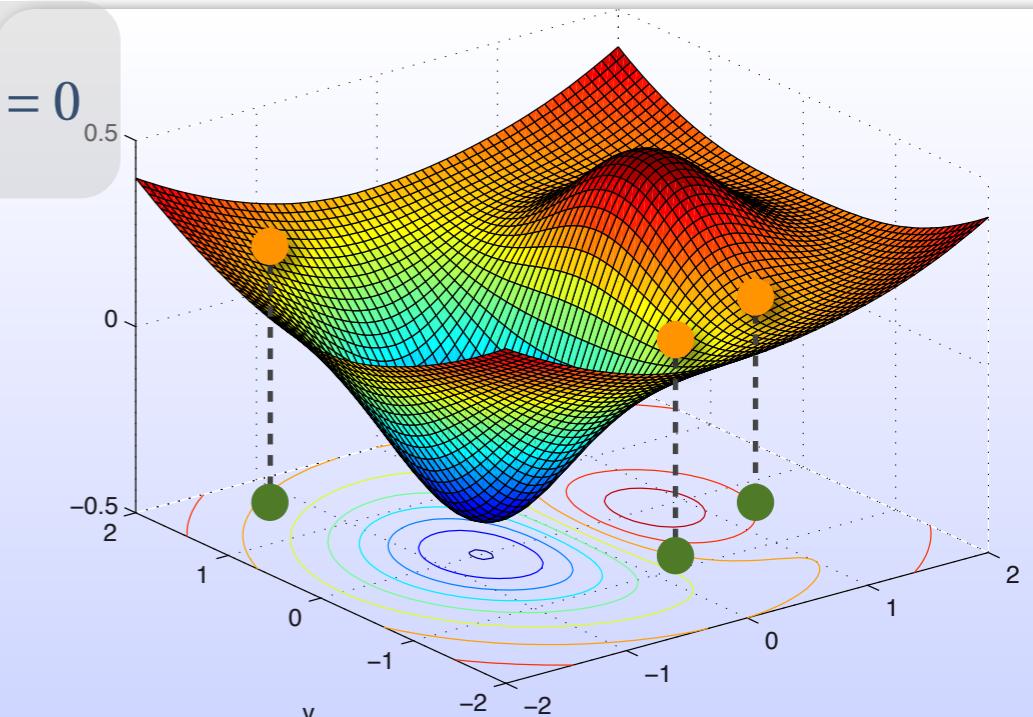
# Parametrized problems

**PDE:**  $\mathcal{L}(u(t, M)) = 0$

**$\mu$ PDE:**  $\mathcal{L}(u(t, M), \mu_1, \mu_2) = 0$

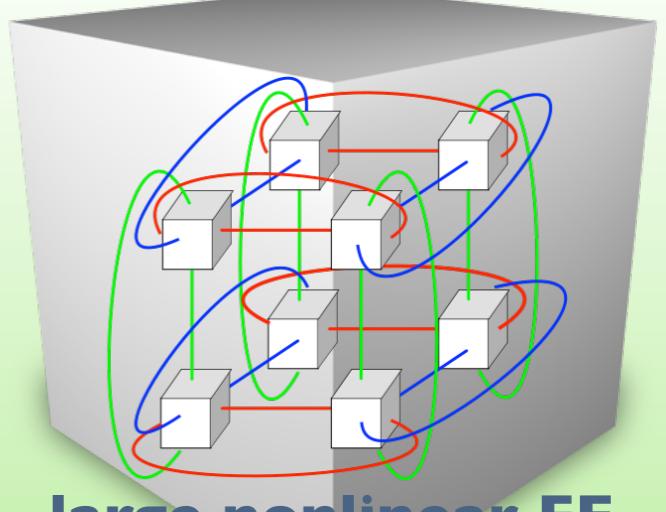
## ■ External driver algorithm

- reliability method
- optimization algorithm
- construction of a metamodel
- ...



## ■ Many queries

- same large nonlinear problem
- multiple runs for different sets of parameters
- very high CPU cost



large nonlinear FE computations

# Parametrized problems

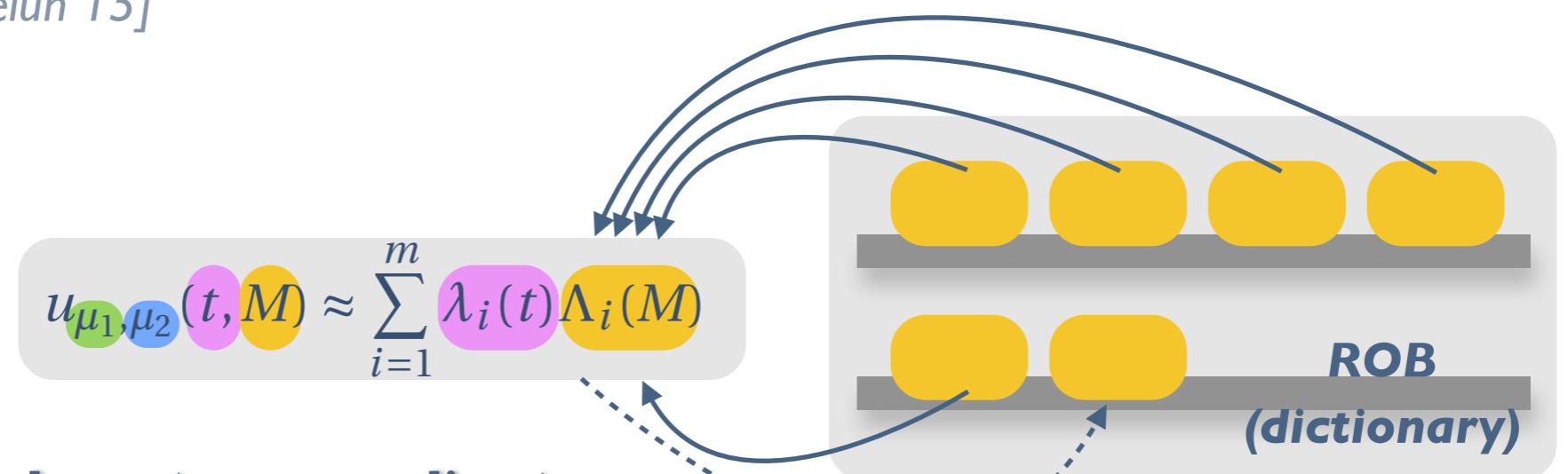
**PDE:**  $\mathcal{L}(u(t, M)) = 0$

**μPDE:**  $\mathcal{L}(u(t, M), \mu_1, \mu_2) = 0$

## ■ First approach: building a dictionary

- construction of a ROB common to all the sets of parameters

[Boucard, Ladevèze 99] [DN, Boucard et al. 12-14] [Heyberger, Boucard, DN 13]  
[DN, Boucard, Relun 15]



## ■ Second approach: extra-coordinates

- introduction of parameters as new coordinates

[Chinesta, Ammar, Cueto, Huerta, Diez, Gonzalez, Leygue, Bordeu ... 12-]

$$u(t, M, \mu_1, \mu_2) \approx \sum_{i=1}^{m'} \lambda_i(t) \Lambda_i(M) \alpha_i(\mu_1) \beta_i(\mu_2)$$

# Second approach

## ■ Parametrized PDE

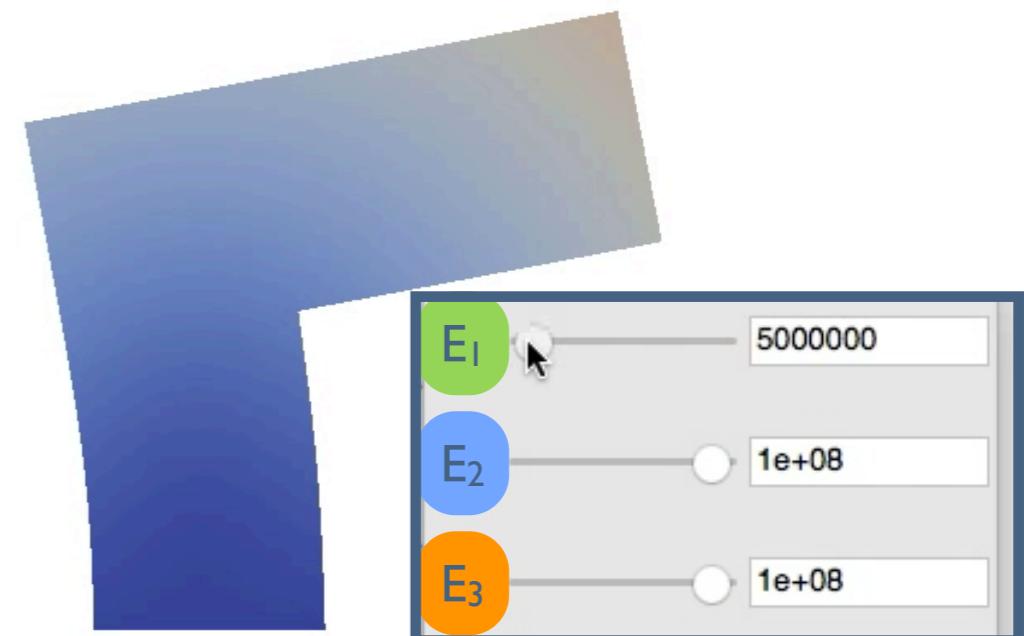
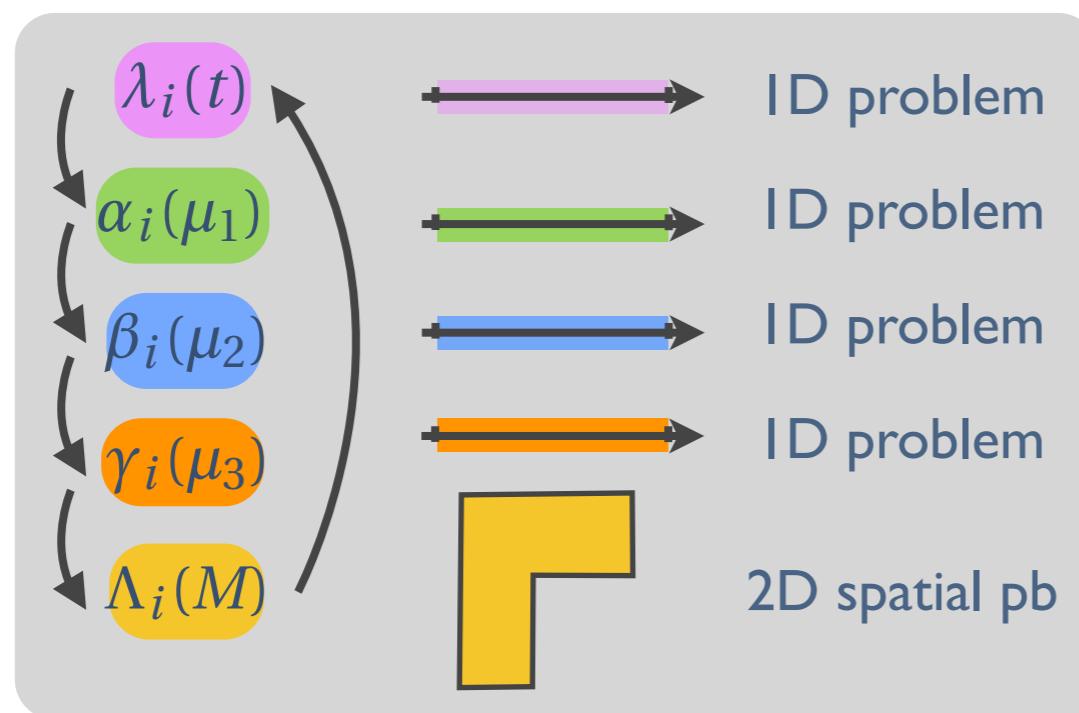
- with 3 Young moduli as parameters



**μPDE:**  $\mathcal{L}(u(t, M), \mu_1, \mu_2, \mu_3) = 0$

## ■ Separation of variables

**i**  $u(t, M, \mu_1, \mu_2, \mu_3) \approx \sum_{i=1}^{m'} \lambda_i(t) \Lambda_i(M) \alpha_i(\mu_1) \beta_i(\mu_2) \gamma_i(\mu_3)$



# Second approach

## ■ Parametrized PDE

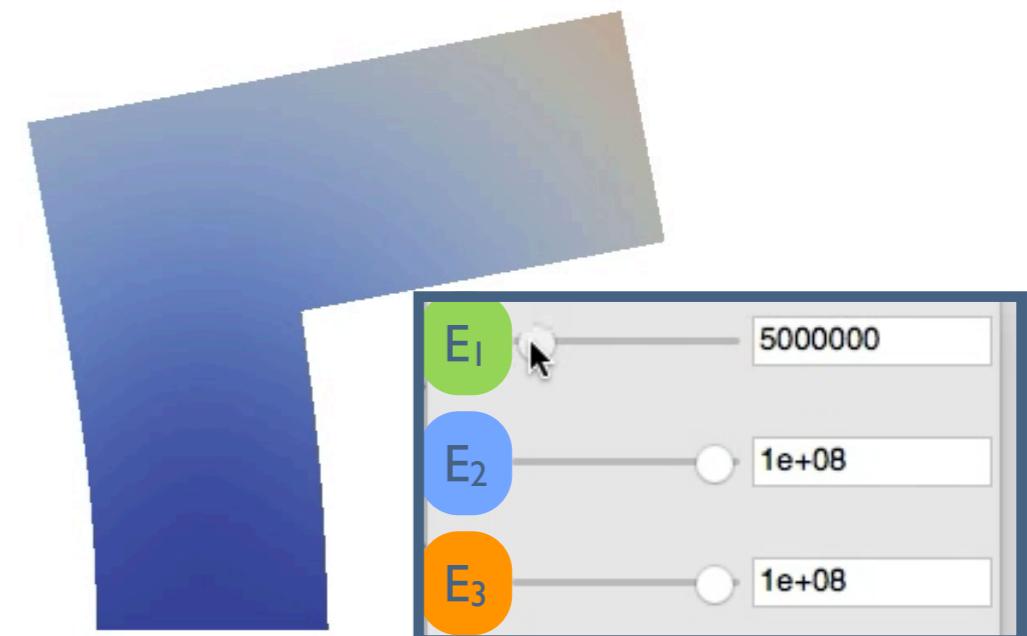
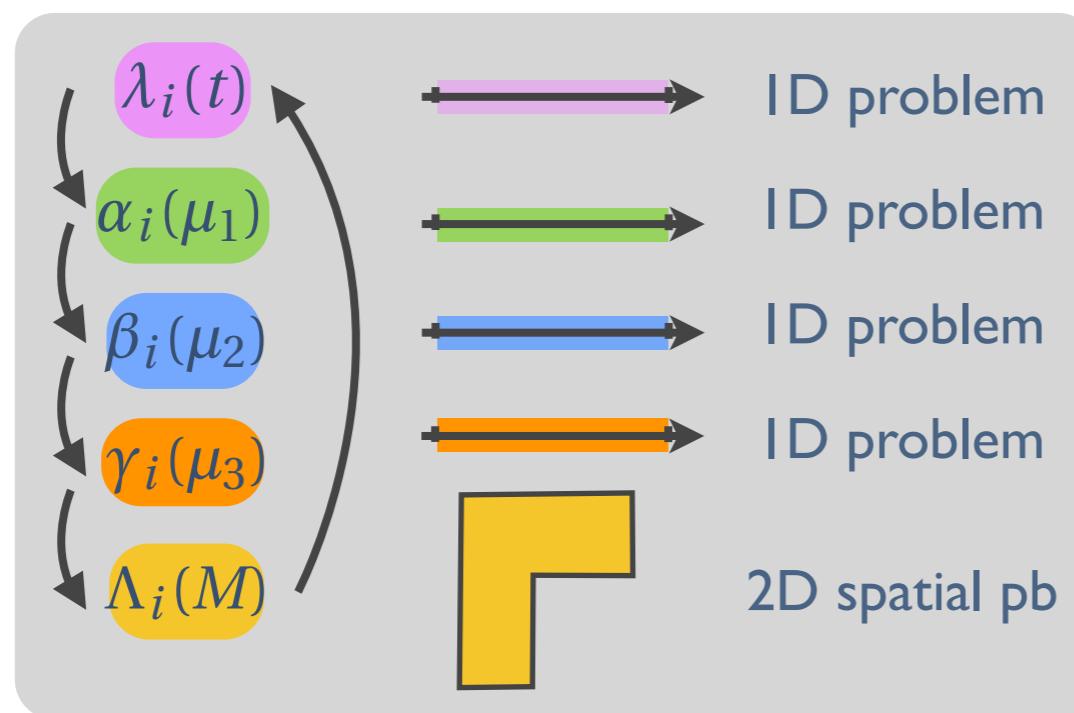
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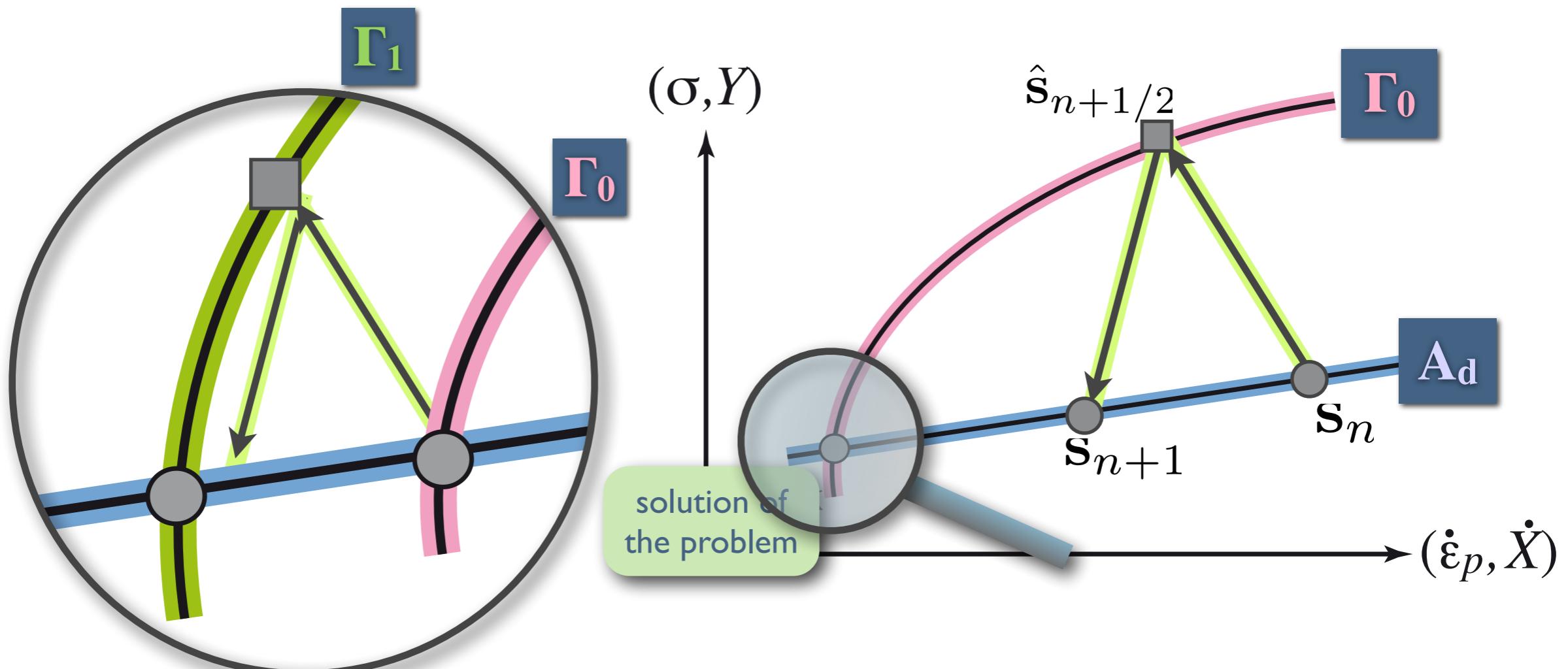


## ■ Taken into account variability of parameters

- for example: variation of a material parameter of the nonlinear law
- first computation for value  $k_1$ : space  $\Gamma_0$
- new computation for value  $k_2$ : space  $\Gamma_1$

→ reuse of the reduced model obtained from the PGD

→ addition of new pairs only if needed

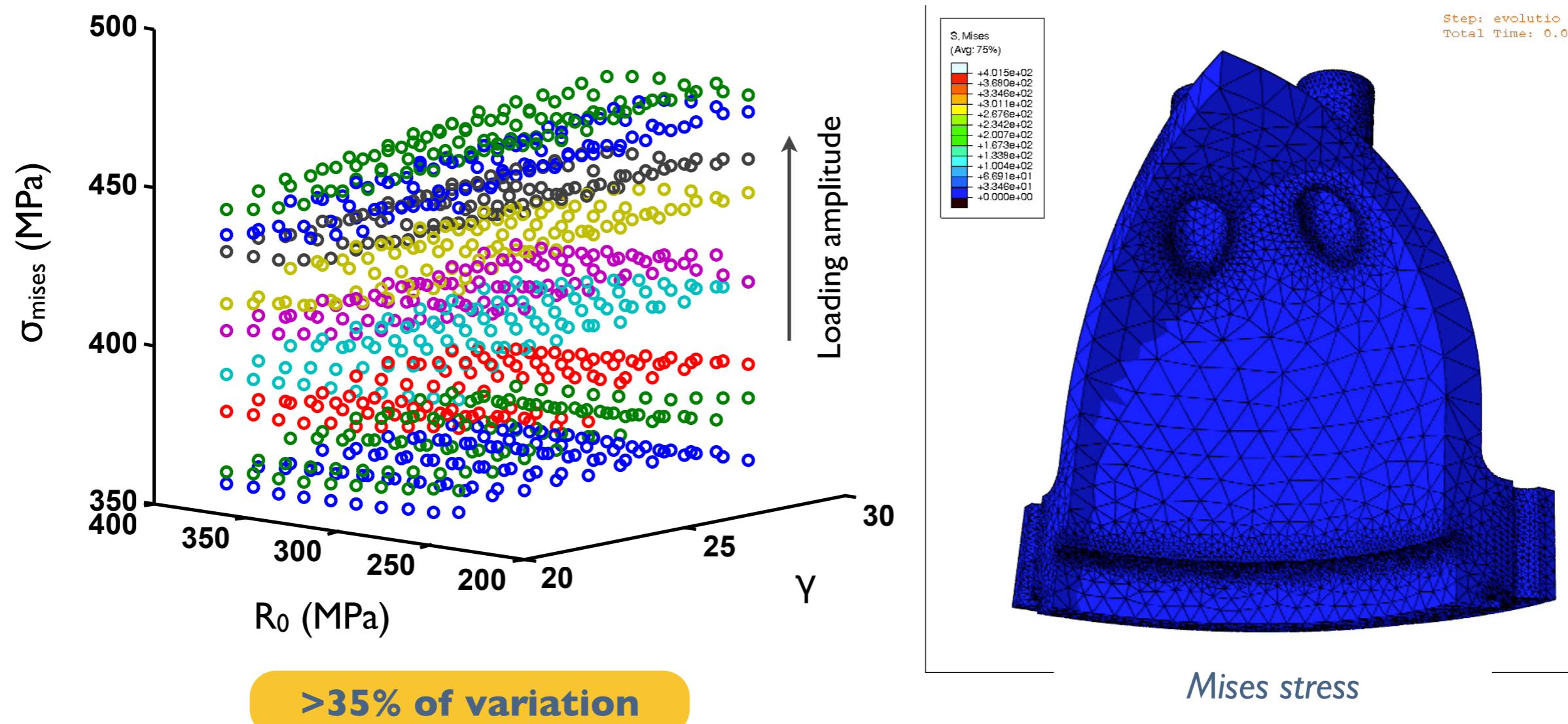


# Vessel head of nuclear reactor

## ■ Parametric study

- parameters: loading amplitude and material characteristics ( $R_0, \gamma$ )
- 1,000 sets of parameters (**range of variation  $\pm 30\%$** )
- wallclock time for 1 run: **LATIN (2.5 hours)** **ABAQUS (3.5 hours)**
- influence on the maximum value of the  $\sigma_{\text{Mises}}$

**740,000 DOFs**  
**60 time steps**

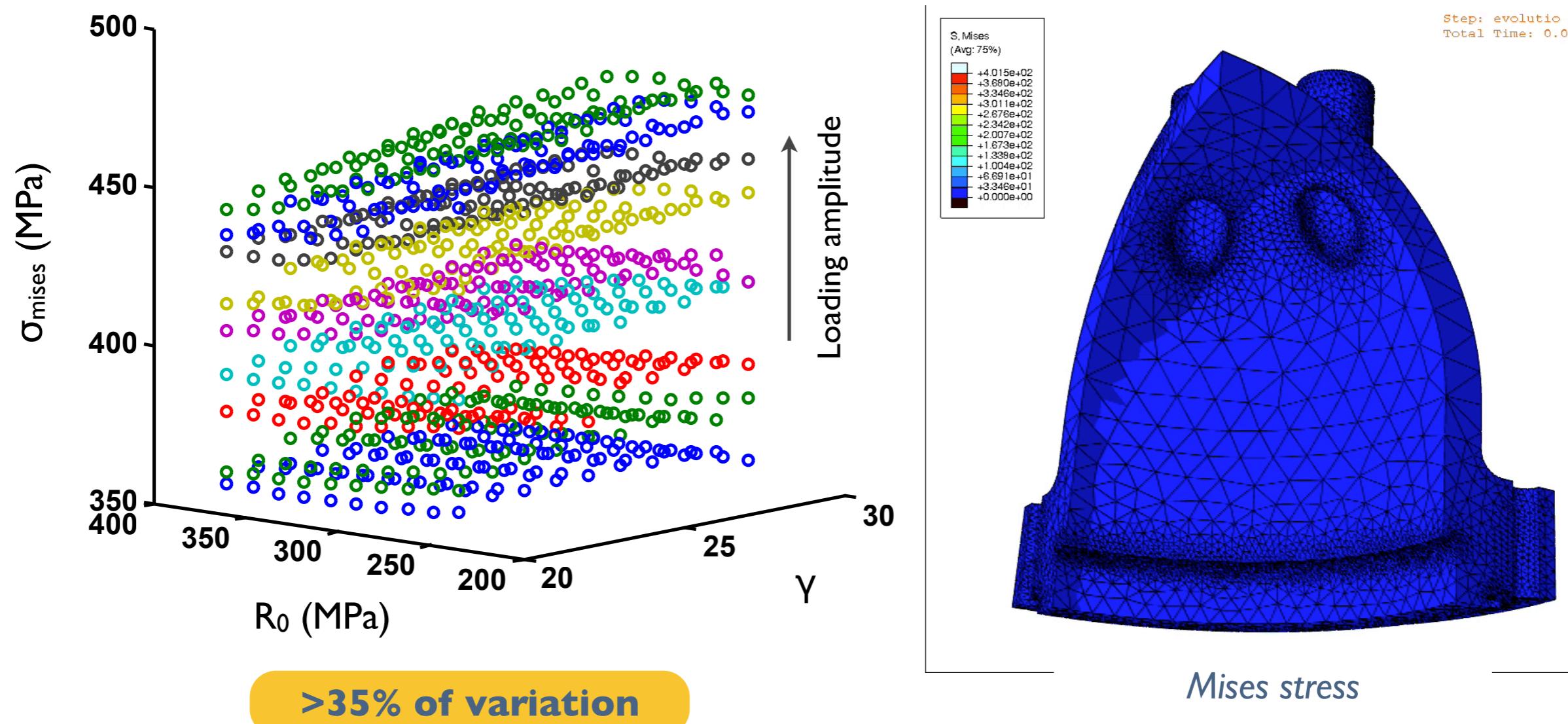


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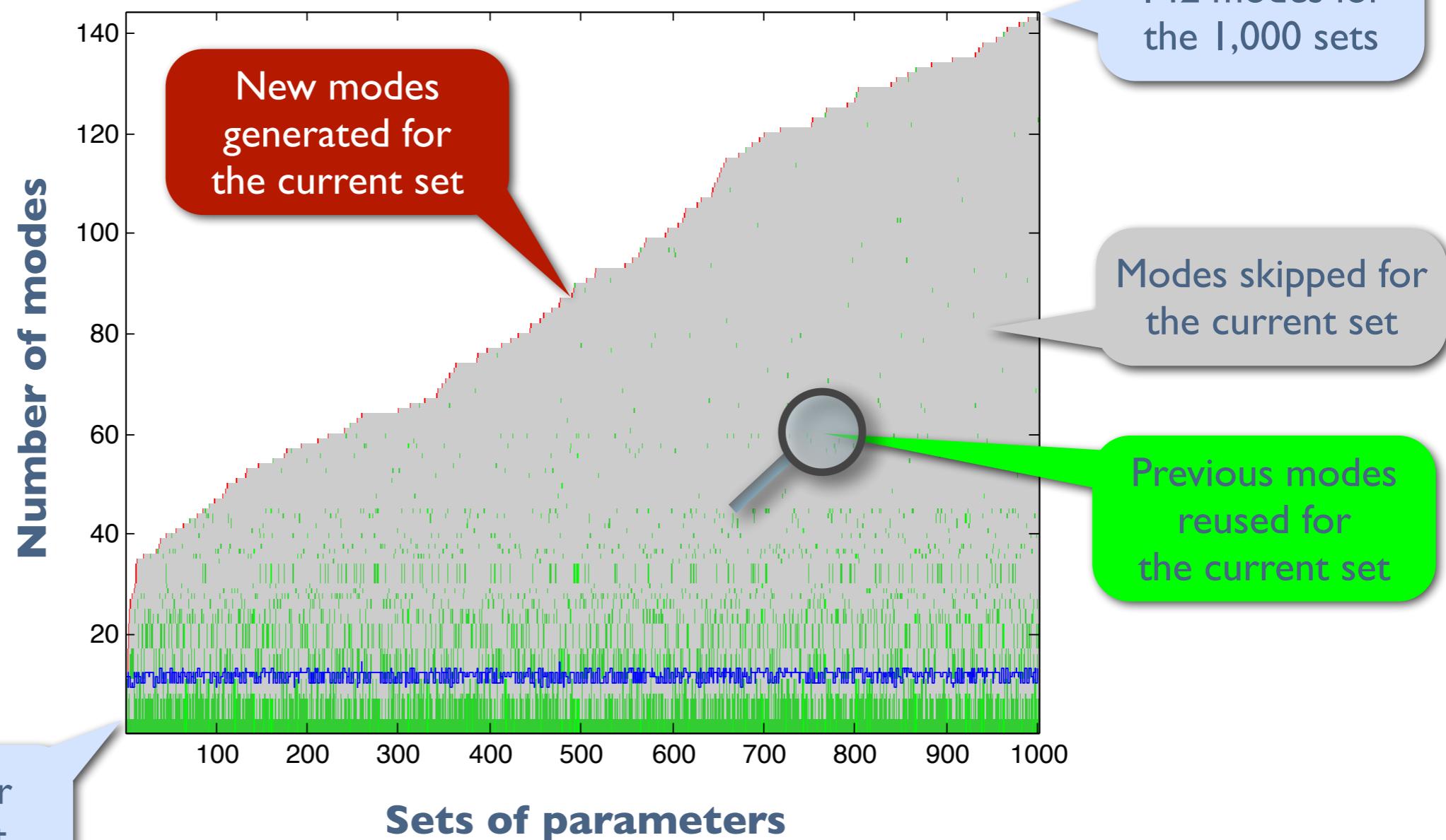


4 months  
with ABAQUS



LATIN+PGD  
1 week (gain: 12)

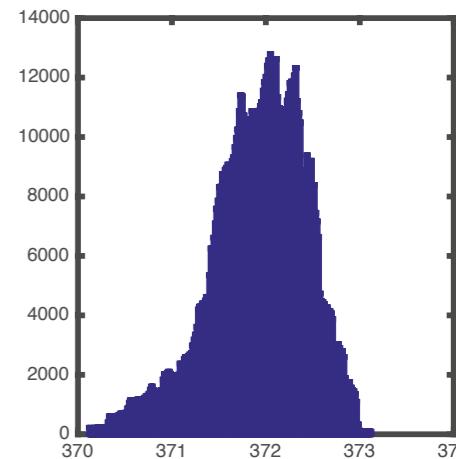
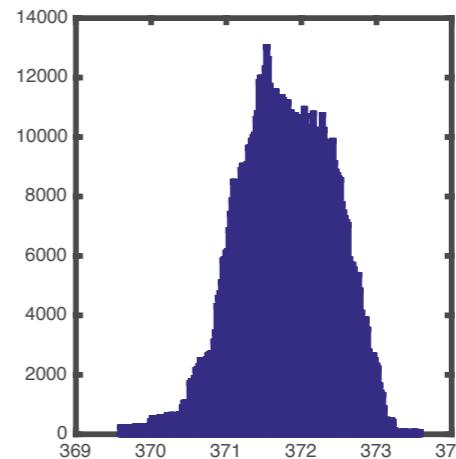
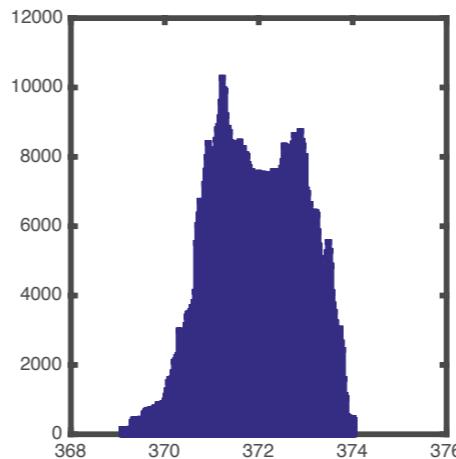
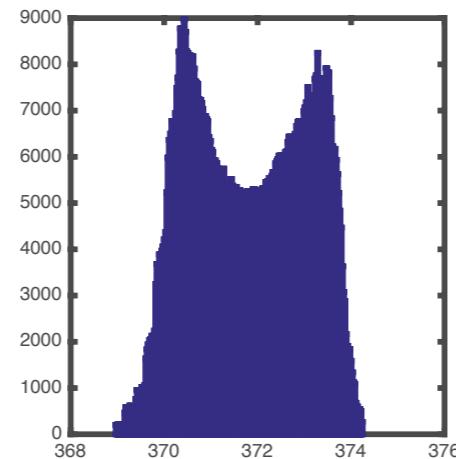
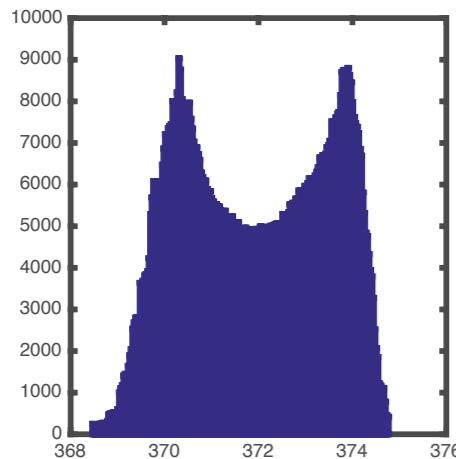
8 modes for  
the first set



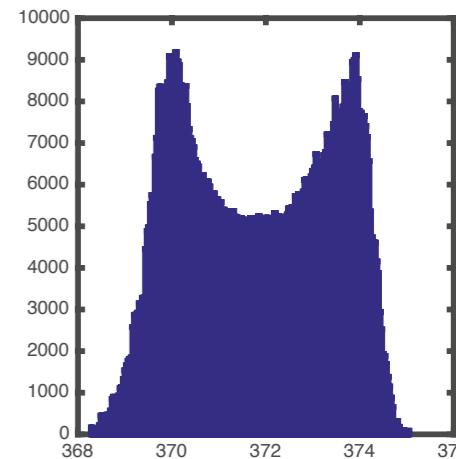
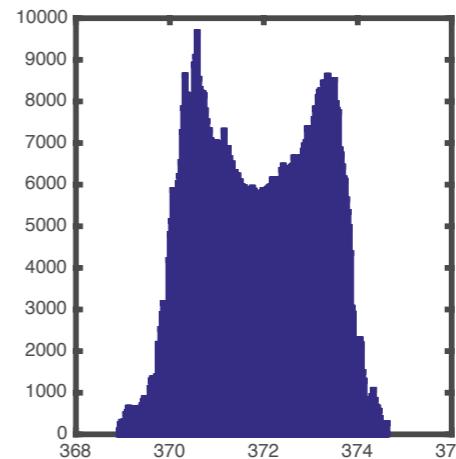
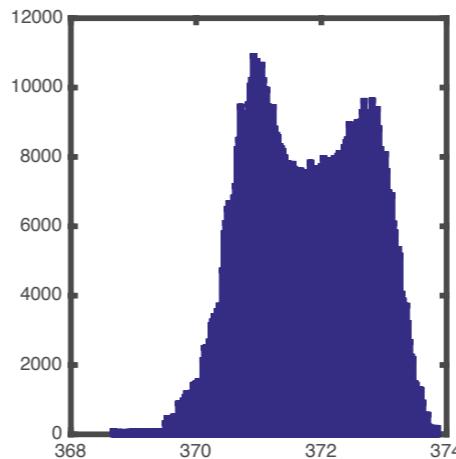
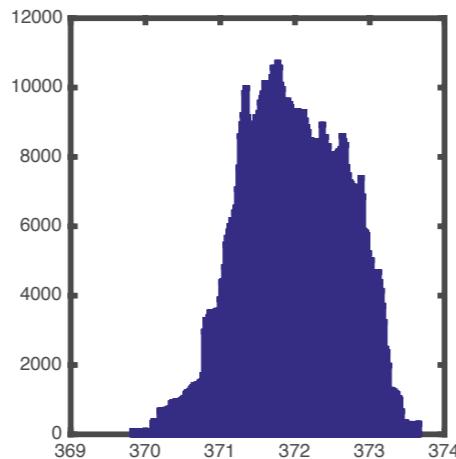
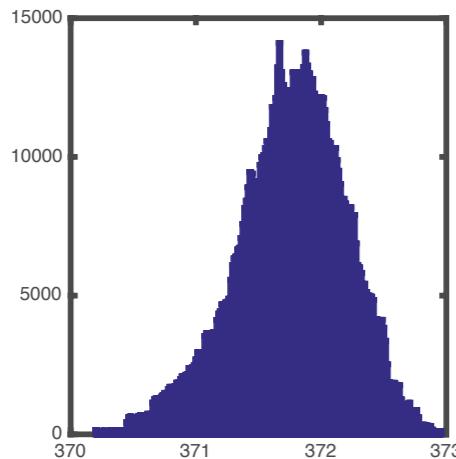
# Post-treatment of virtual charts

## ■ Uncertainties

- material characteristics ( $R_0, \gamma$ ) are **stochastic**
- loading parameter is described by an **interval**



*PDFs of the maximum of sigma Mises max*

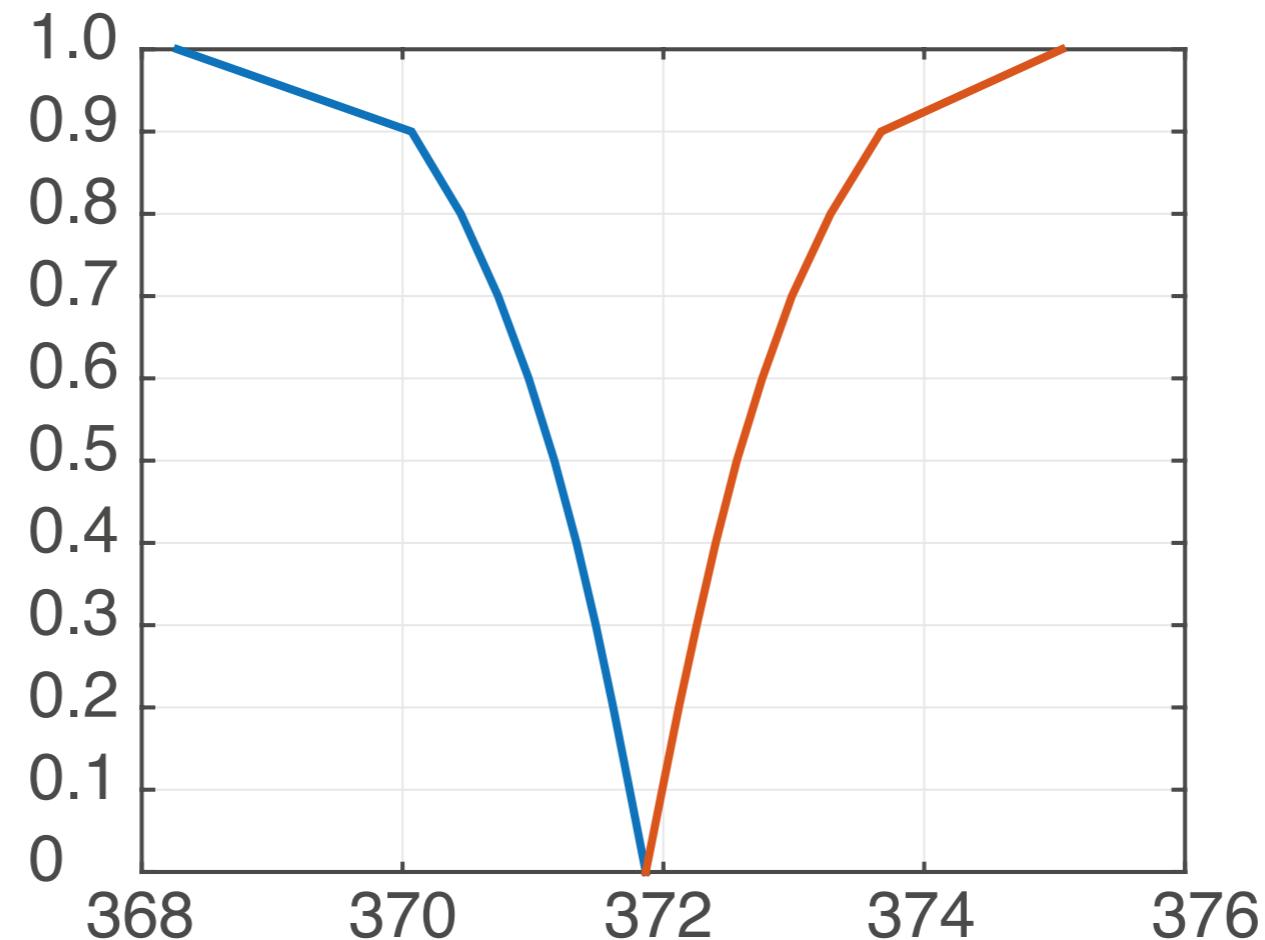


~ 5 s for 10 millions of Monte-Carlo calls

# Post-treatment of virtual charts

## ■ Uncertainties

- material characteristics ( $R_0, \gamma$ ) are **stochastic**
- loading parameter is described by an **interval**



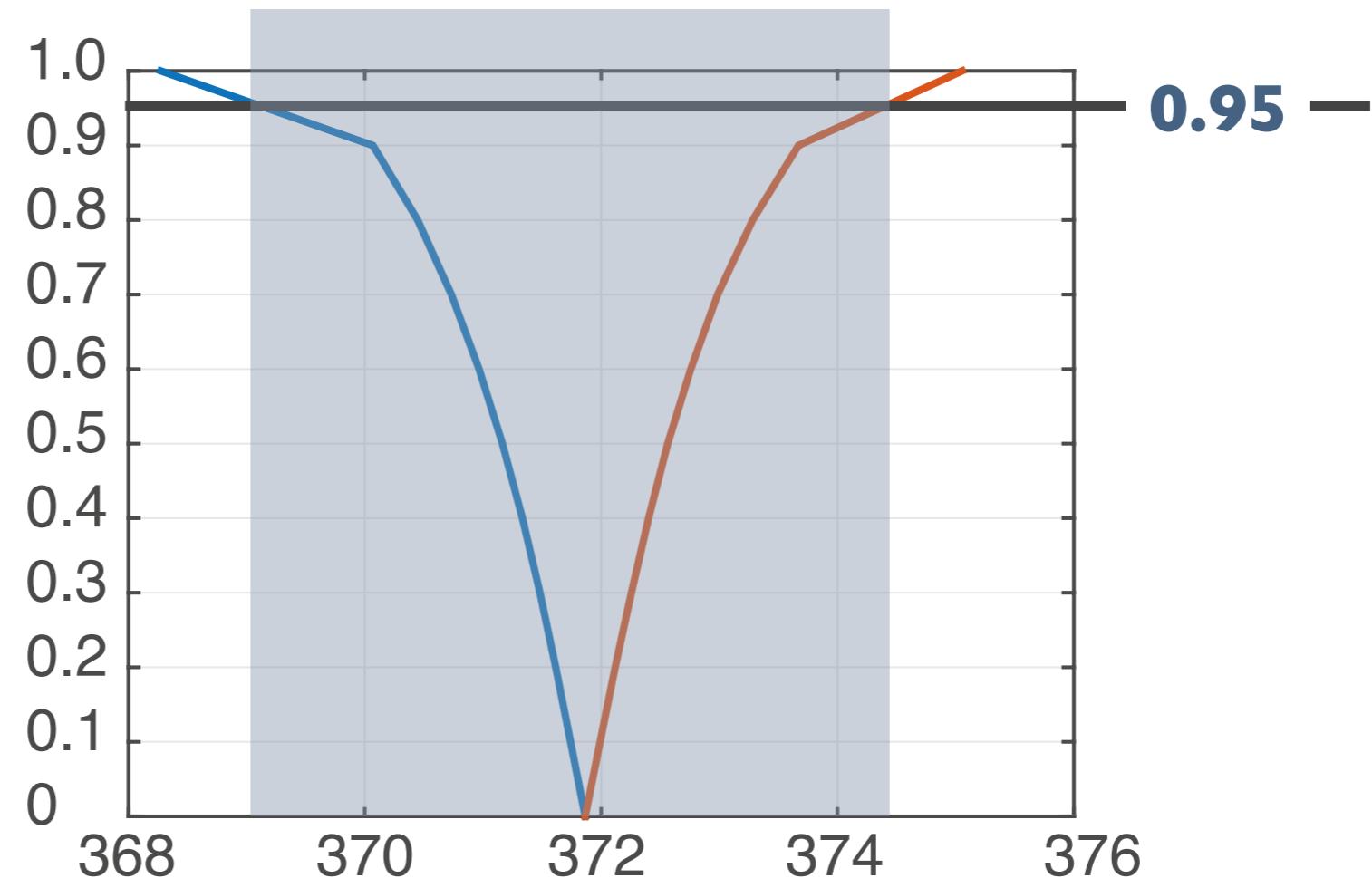
*Interval with stochastic bounds  
for the maximum of sigma Mises max*

# Post-treatment of virtual charts

## ■ Uncertainties

- material characteristics ( $R_0, \gamma$ ) are **stochastic**
- loading parameter is described by an **interval**

**369 MPa <  $\sigma_{\text{Mises}}$  < 374.5 MPa**

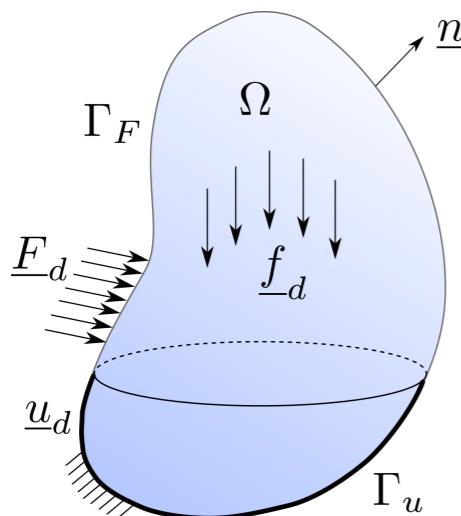


*Interval with stochastic bounds  
for the maximum of sigma Mises max*

# Outline

- 1. The LATIN method and Proper Generalized Decomposition**
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## ■ Simple problem: thermoelasticity



💡 Assumptions: quasi-static evolution, small strains, small temperature changes, homogeneous and isotropic material

### Mechanical equilibrium

- Stress equilibrium
- Strain compatibility
- Boundary conditions

$$\nabla \cdot \boldsymbol{\sigma} + \underline{f}_d = 0 \text{ in } \Omega$$

$$\boldsymbol{\varepsilon} = \frac{1}{2}(\nabla \underline{u} + {}^T \nabla \underline{u}) \text{ in } \Omega$$

$$\underline{u} = u_d \text{ on } \Gamma_u \text{ and } \boldsymbol{\sigma} \underline{n} = \underline{F}_d \text{ on } \Gamma_F$$

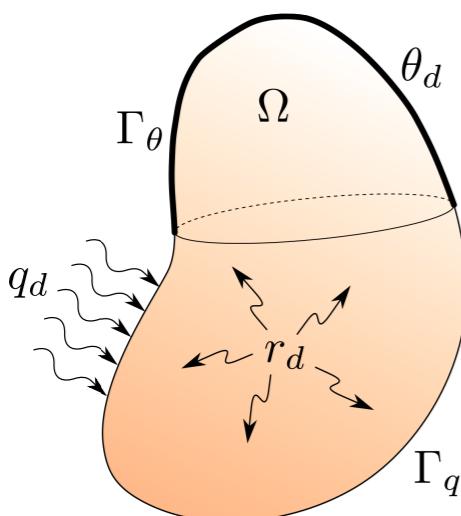
### Strongly coupled constitutive equations

- Hooke's law
- Fourier's law
- Mechanical heat source

$$\boldsymbol{\sigma} = \mathcal{K} : \boldsymbol{\varepsilon} - \beta \theta \mathbf{I}$$

$$\underline{q} = -k \nabla \theta$$

$$\underline{r}_m = T_0 \beta \text{Tr } \dot{\boldsymbol{\varepsilon}}$$



### Thermal equilibrium

- Heat equation
- Temp. grad. compatibility
- Boundary conditions

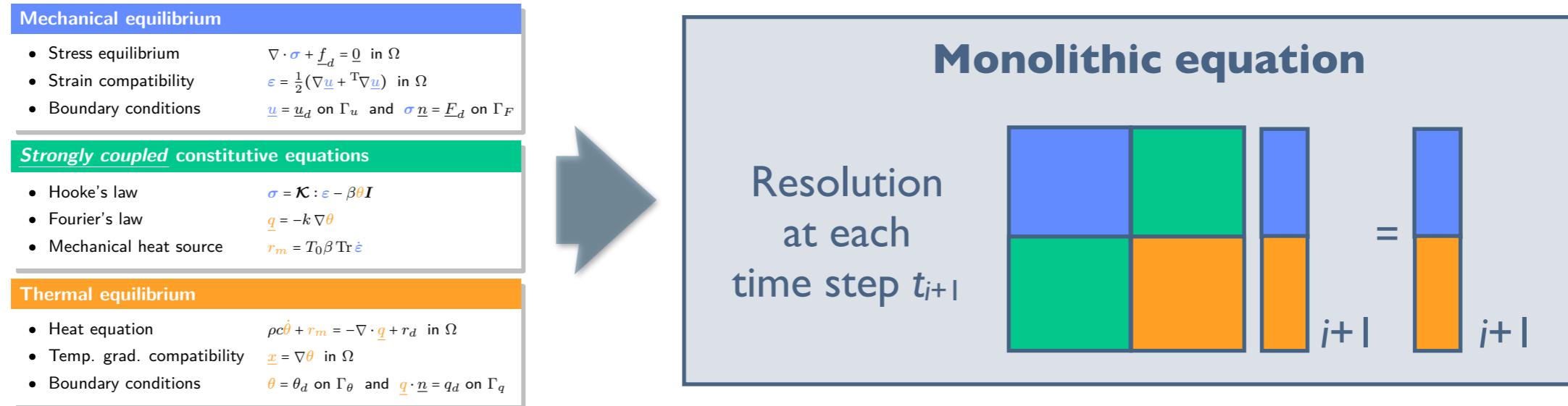
$$\rho c \dot{\theta} + \underline{r}_m = -\nabla \cdot \underline{q} + r_d \text{ in } \Omega$$

$$\underline{x} = \nabla \theta \text{ in } \Omega$$

$$\theta = \theta_d \text{ on } \Gamma_\theta \text{ and } \underline{q} \cdot \underline{n} = q_d \text{ on } \Gamma_q$$

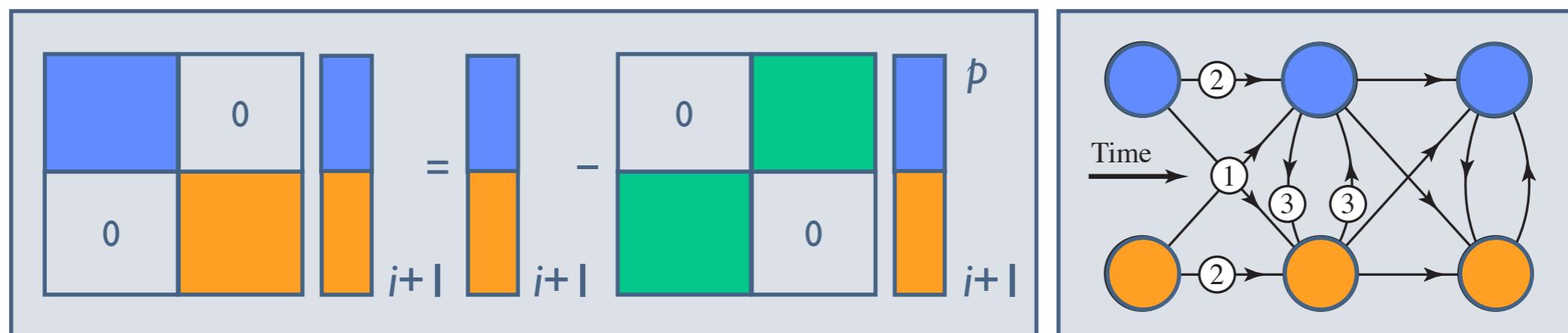
## ■ Monolithic coupled resolution

- direct resolution of the system: a priori CPU expensive



## ■ Partitioned procedures

- decoupled resolution of the physics [Felippa and Park 80, Belytschko and Hugues 83, Shrefler et al. 87, Zienkiewicz et al. 88, Farhat et al. 95, Morand and Ohayon 95, Lewis and Schrefler 98, ...]



## ■ Natural separation of the equations

linear decoupled  
but  
global-in-space

### Mechanical equilibrium

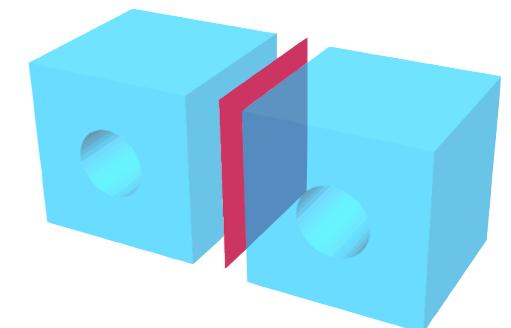
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Interface  
between  
physics

local in space  
but  
coupled

similar to



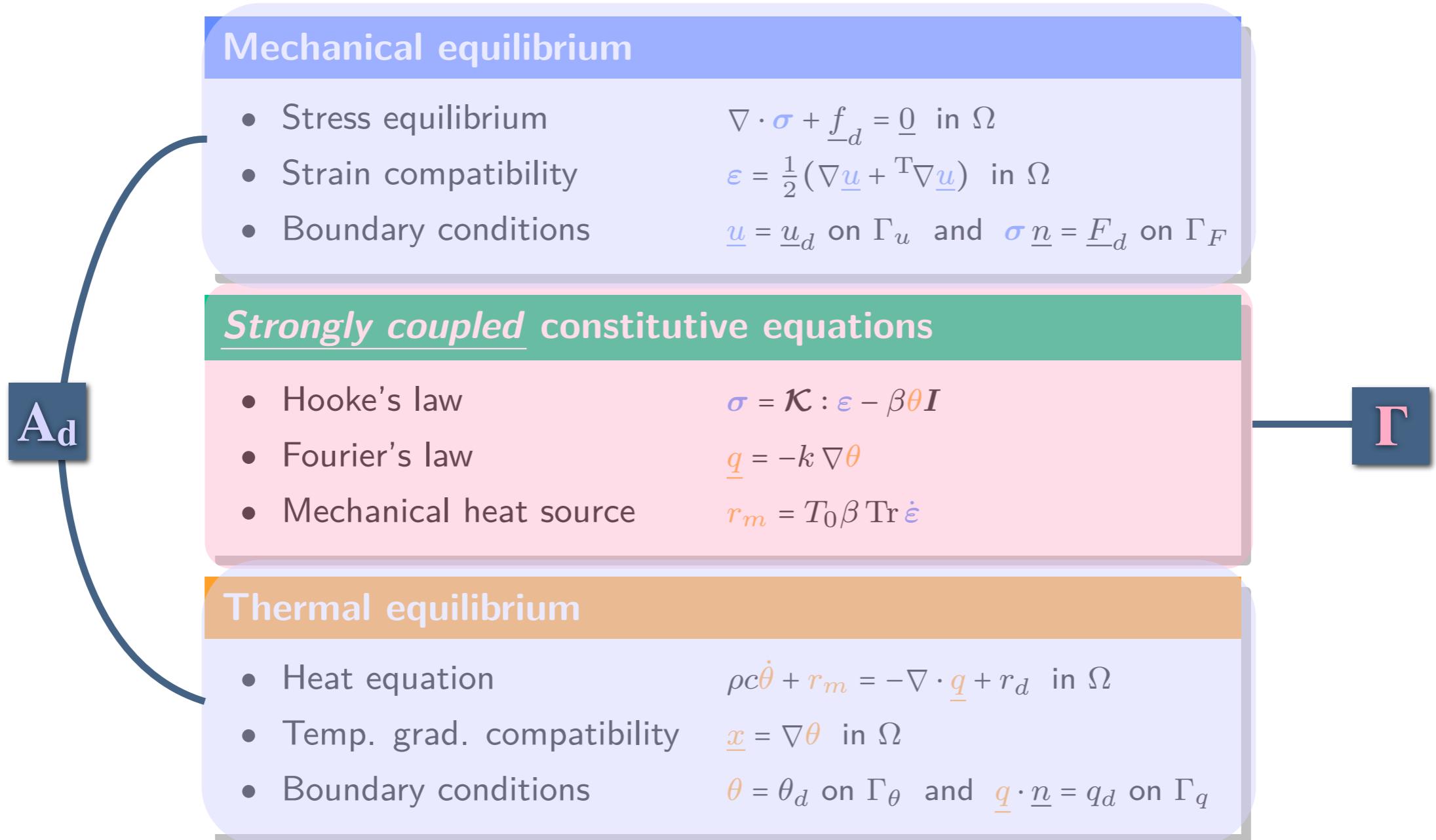
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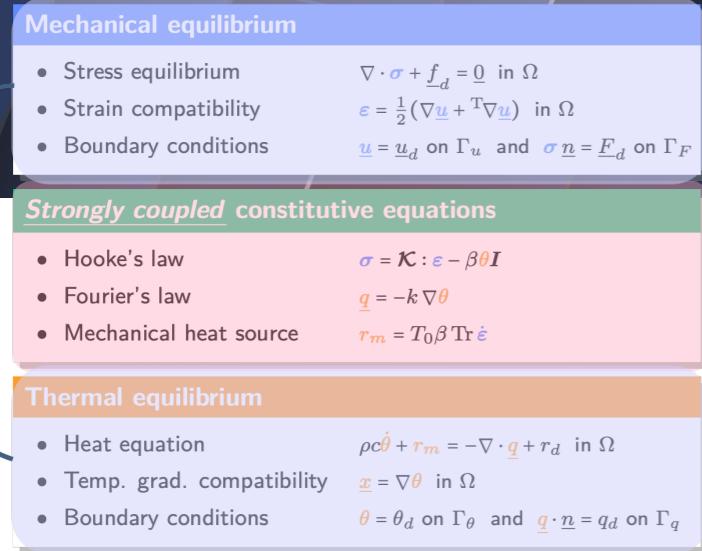
- Heat equation
- Temp. grad. compatibility
- Boundary conditions

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## ■ Natural separation of the equations



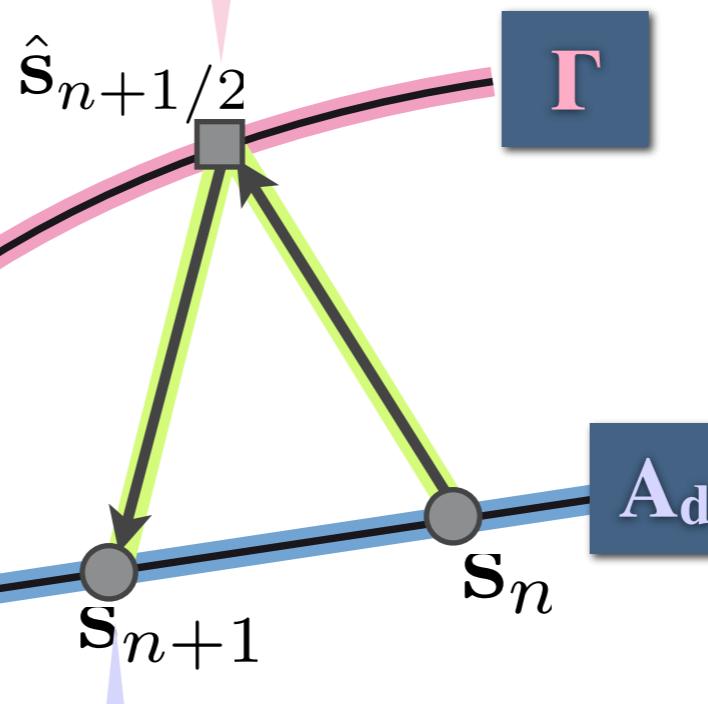
# LATIN framework



$\Gamma$

## Interface behavior

## Search direction



Mechanical adm.

Thermal adm.

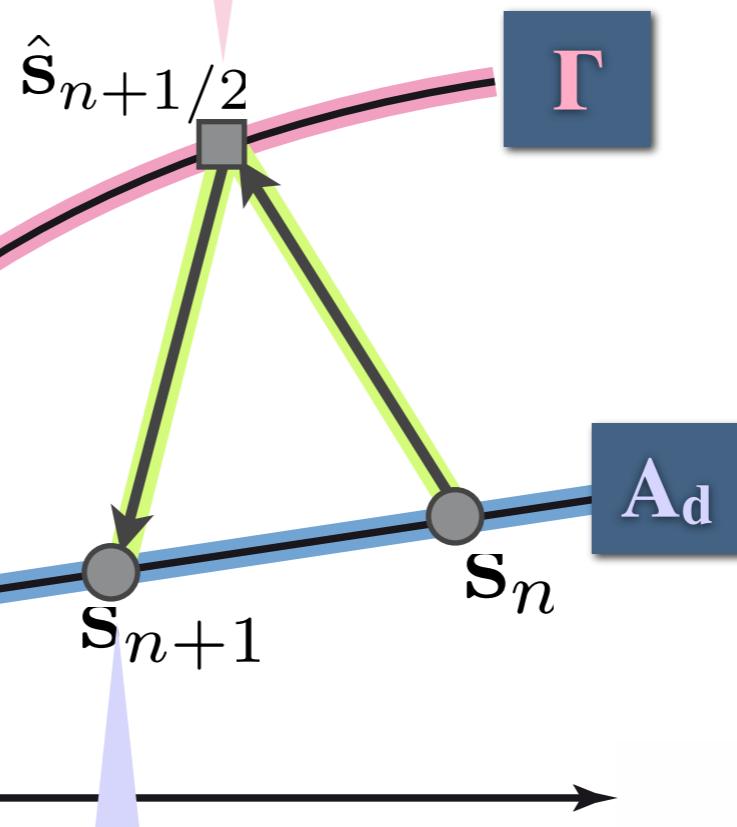
Search direction

# LATIN framework

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Ad

Coupled but local-in-space  
« interface »



Time-space **PGD**  
for **mechanics**

Time-space **PGD**  
for **thermics**

# Turbine blade

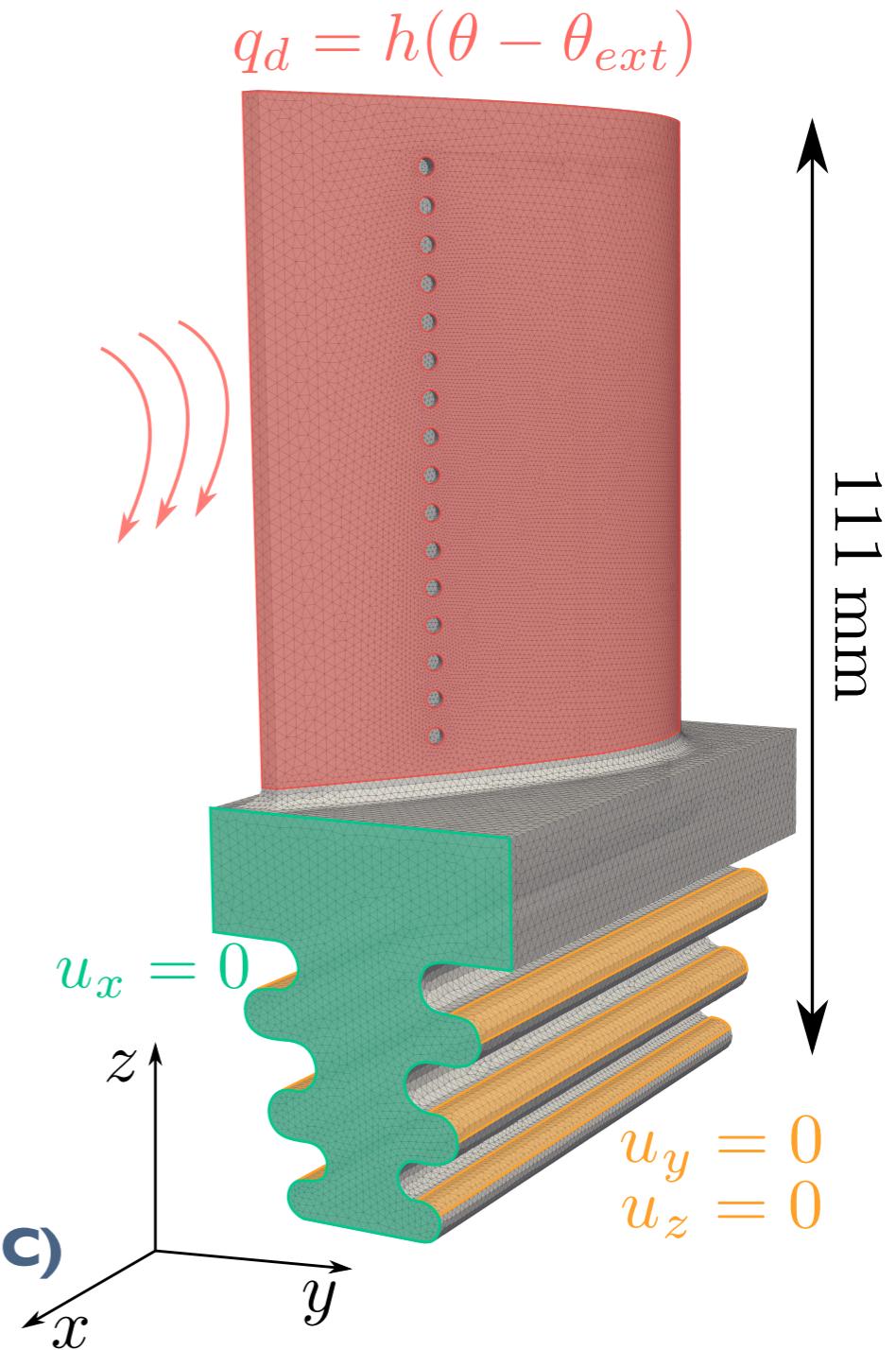


## ■ Number of DOFs

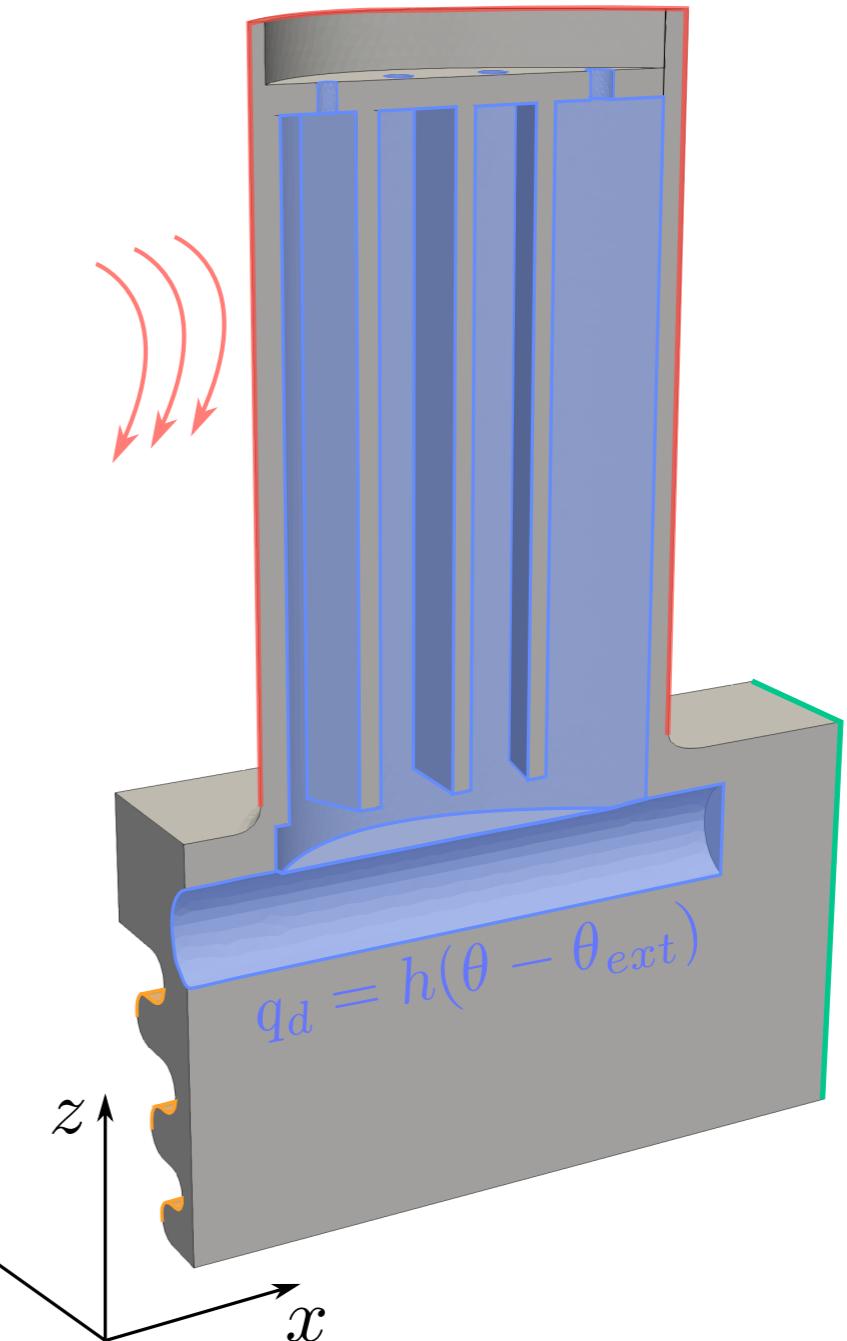
- mechanical part: 2,370,000 DOFs
- thermal part: 118,300 DOFs

## ■ Boundary conditions

- from [Kin et al., AIAA Journal, 2018]
- **clamped on the lower tree root**
- **centrifugal load up to 15,000 rpm**
- **forced convective flux on airfoil surface (270°C)**
- forced convective flux on cooling holes (40°C)



# Turbine blade



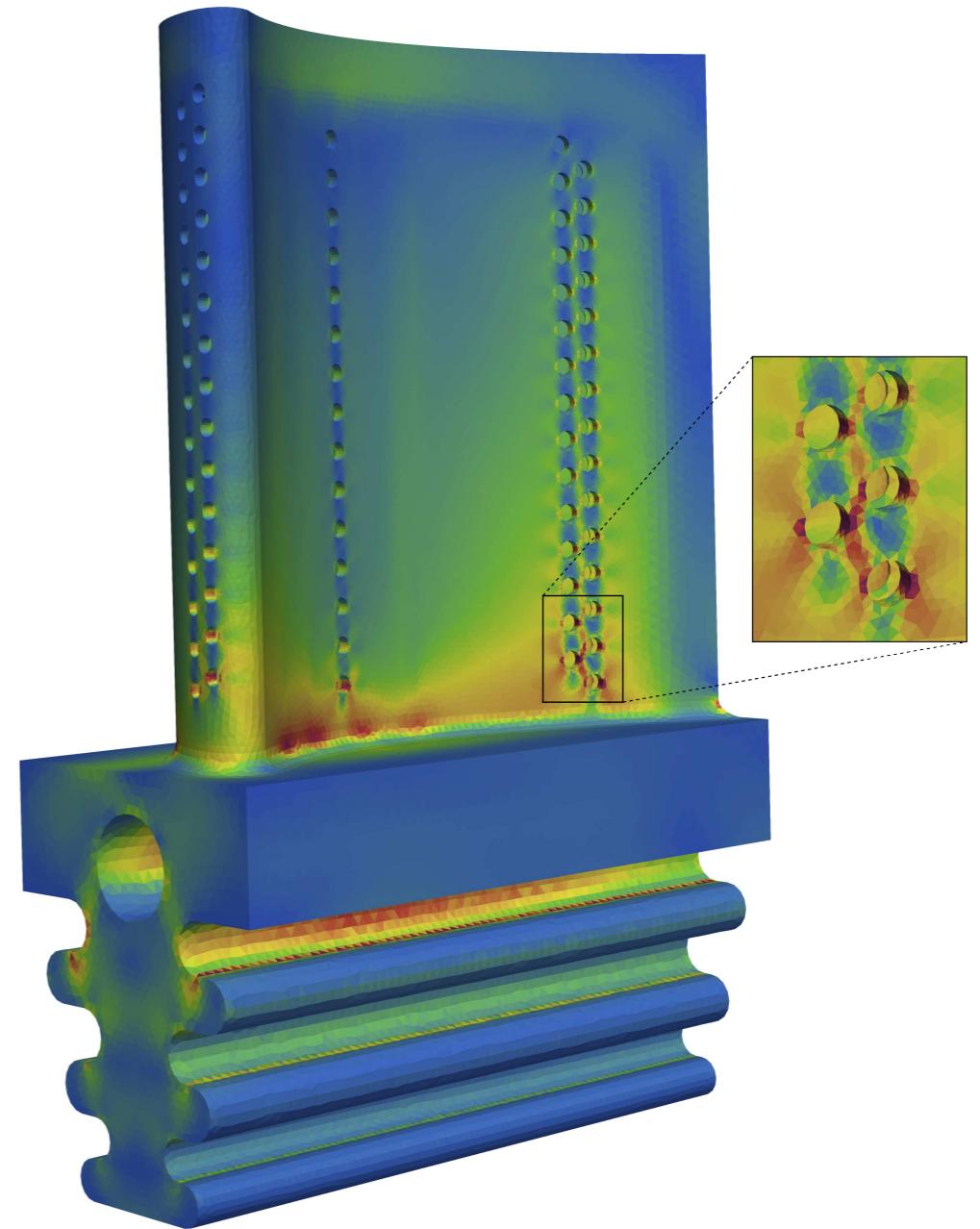
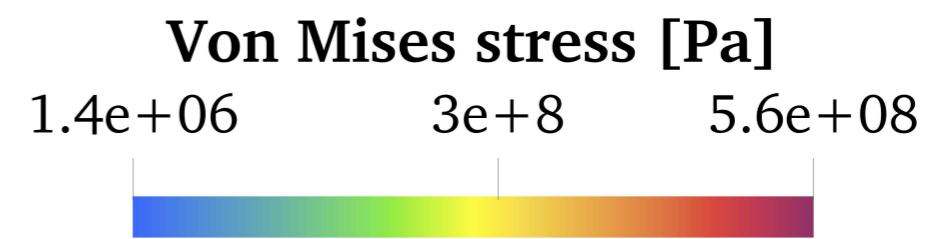
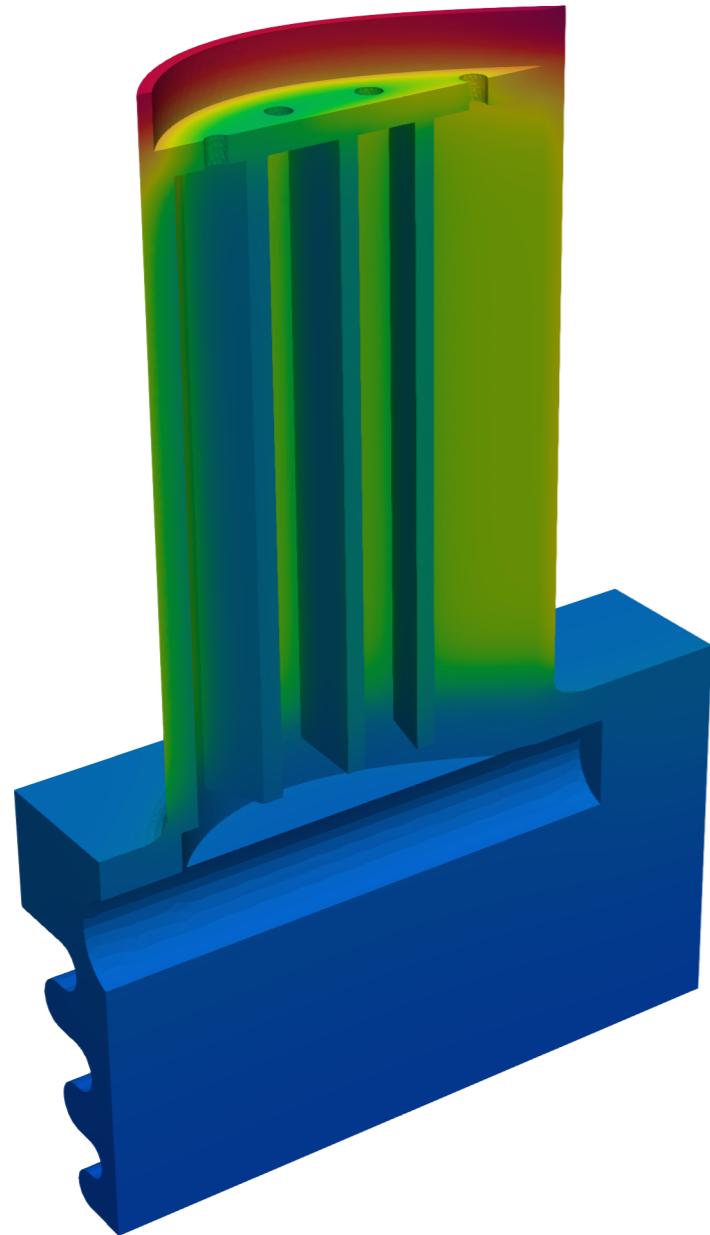
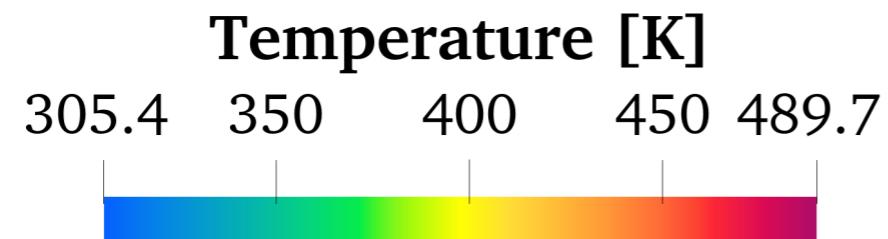
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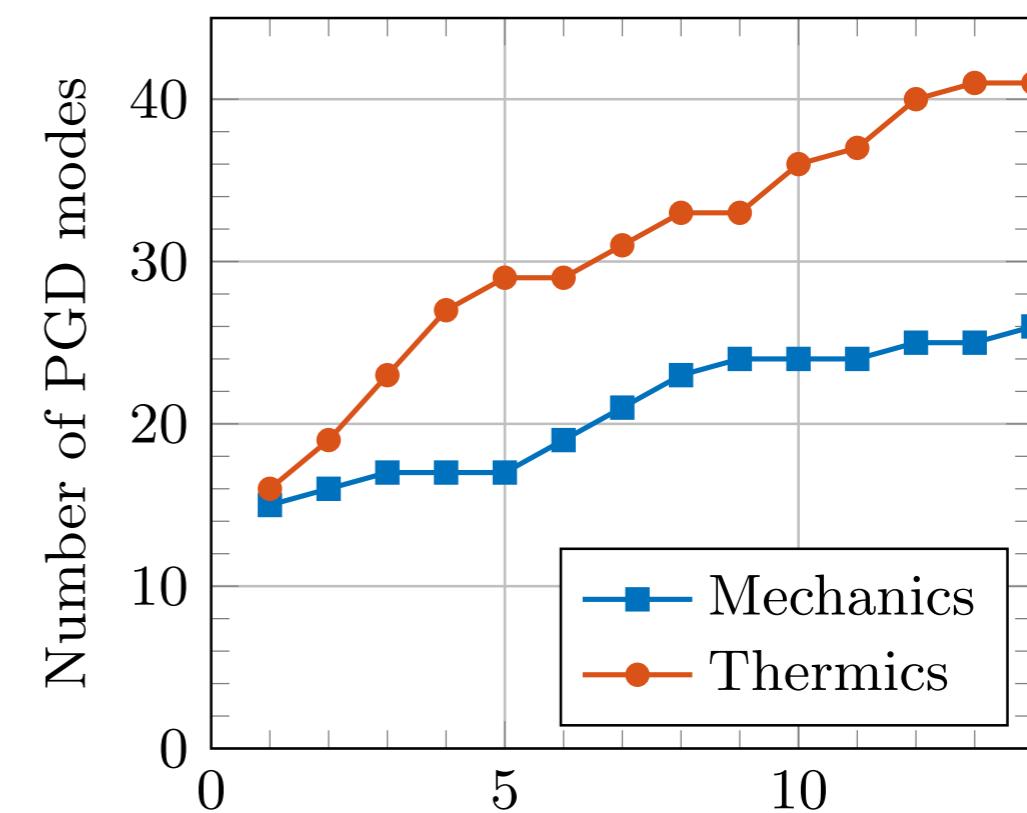
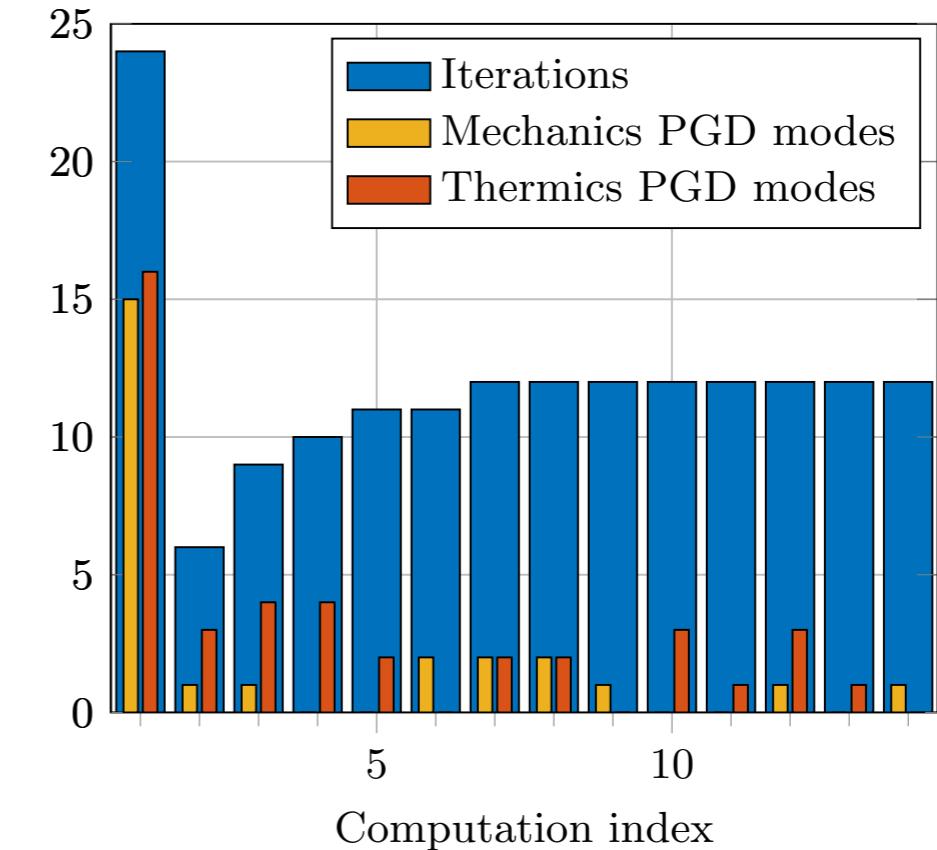
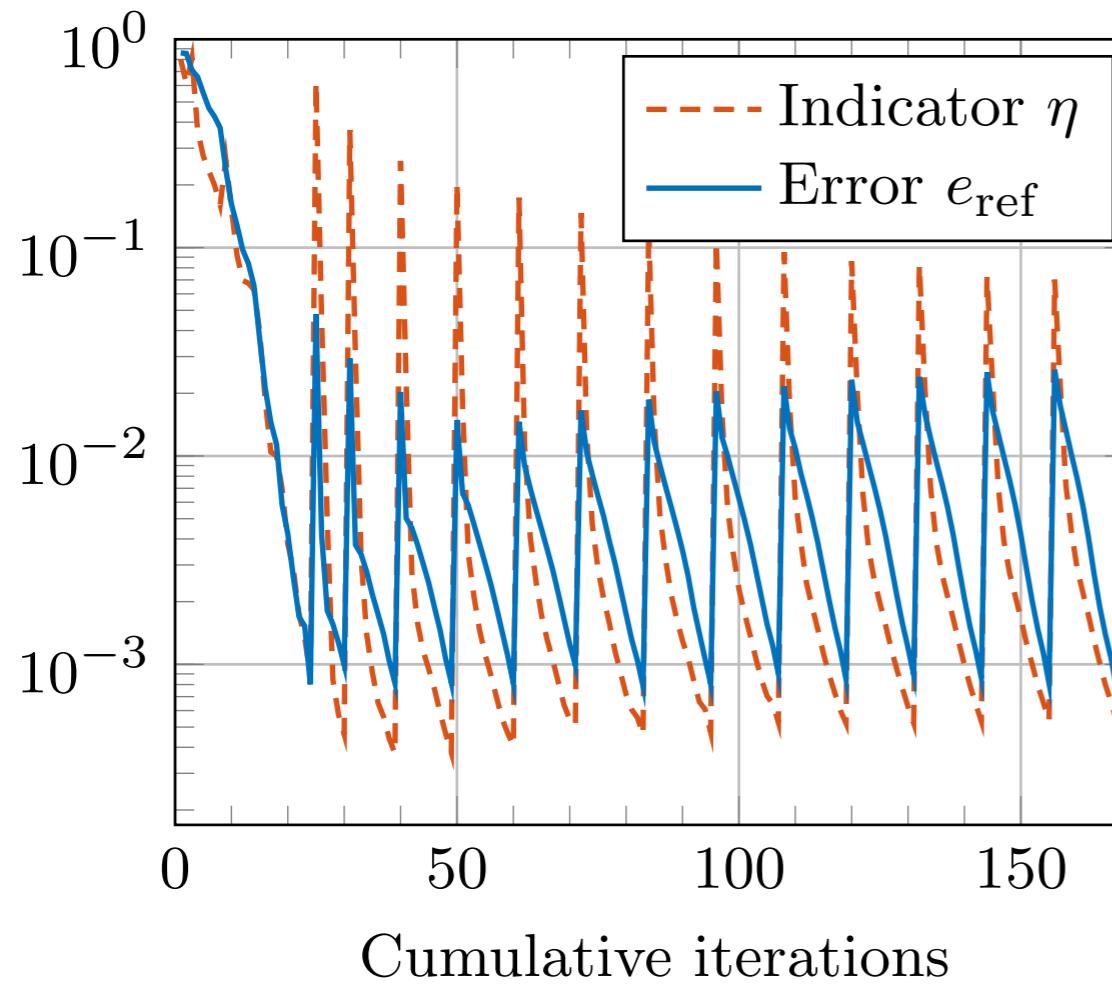
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# Turbine blade



## ■ Parametric study

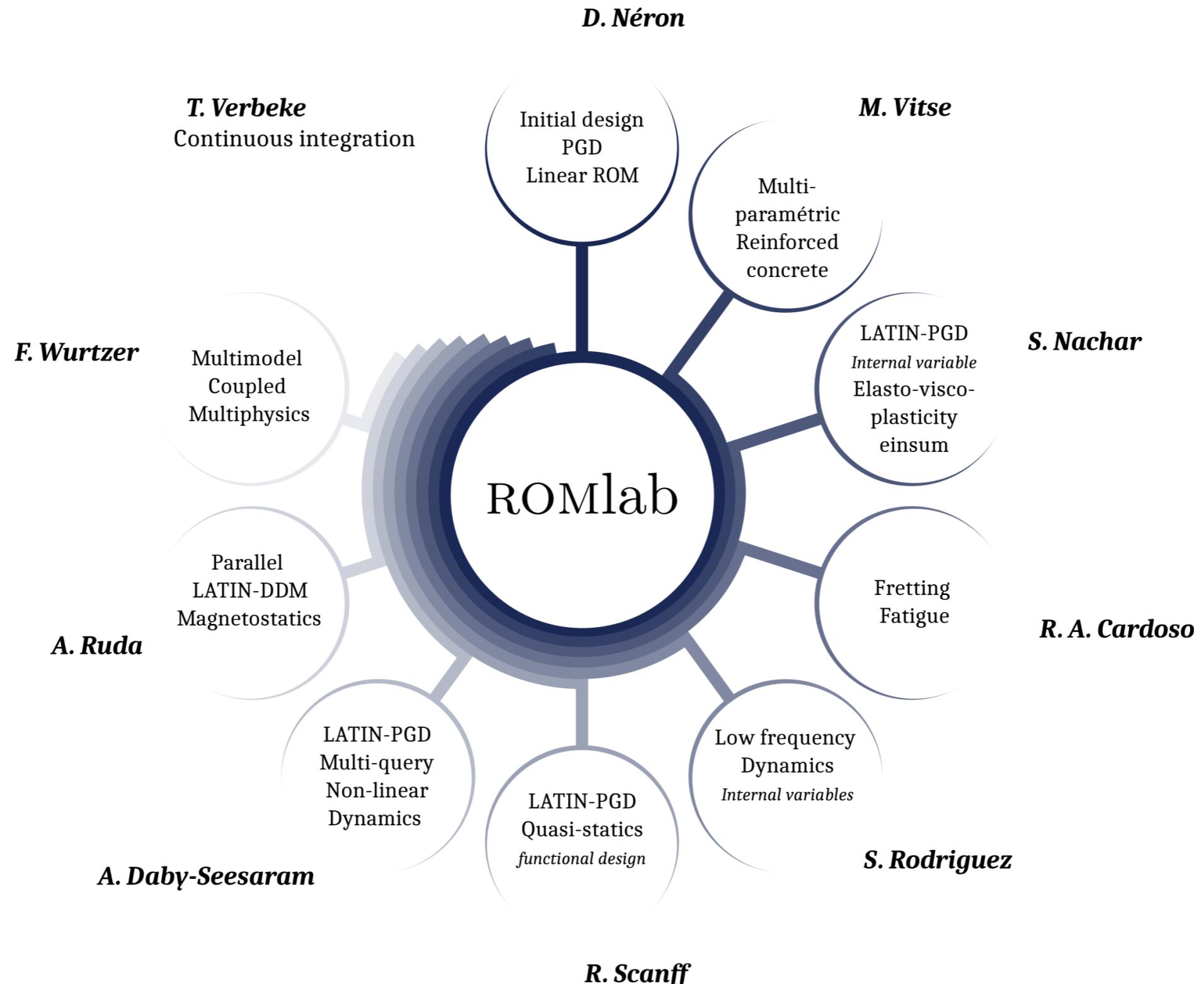
- parameter thermal expansion parameter  $\beta$  (influence the coupling between the 2 physics)
- 14 values of the parameter in the range of variation



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# Implementation



# Implementation



# Conclusion and prospects

## ■ **LATIN-PGD**

- to solve a variety of nonlinear problems

## ■ **Reduced-Order Modeling**

- allows to build new methods for high performance computing
- concept of virtual charts (overall fields, not only metamodels) opens new perspectives in terms of engineering design

## ■ **Numerical certification using high-fidelity models**

- available in engineering sciences now reproduce accurately complex physics
- but direct handling is completely impossible due to CPU time and big data issues
- implementation or coupling with existing softwares must not be overlooked!

## ■ **Recent works in the nonlinear context**

- computation of fragility curves (coll CEA)
- simulation of frictional contact in wire ropes (coll IFP Energies Nouvelles)
- native implementation in industrial optimisation software (coll SIEMENS)
- coupling ROM with AI for non parametrisable geometries (coll SAFRAN)
- coupling ROM with AI for multiphysics problems
- ...



# Merci