

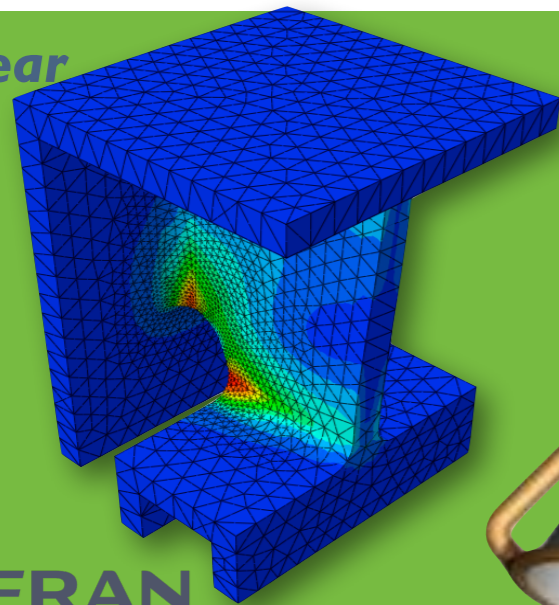
Réduction de modèles en mécanique non linéaire pour la construction d'abaques virtuels

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

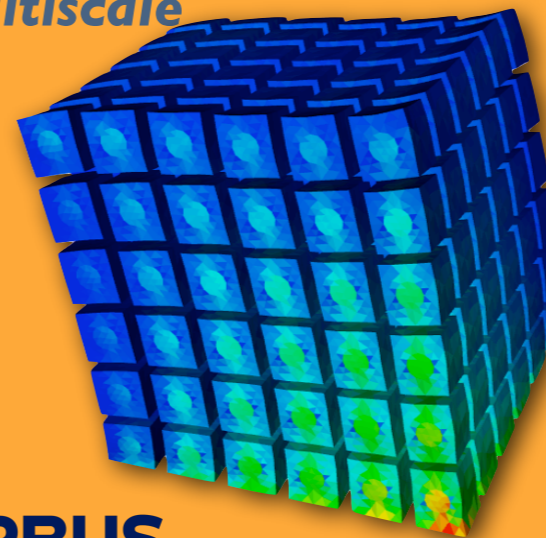
David Néron

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. Foulatier, P.-E. Malleval, V. Matray, N. Relun, F. Wurtzer...

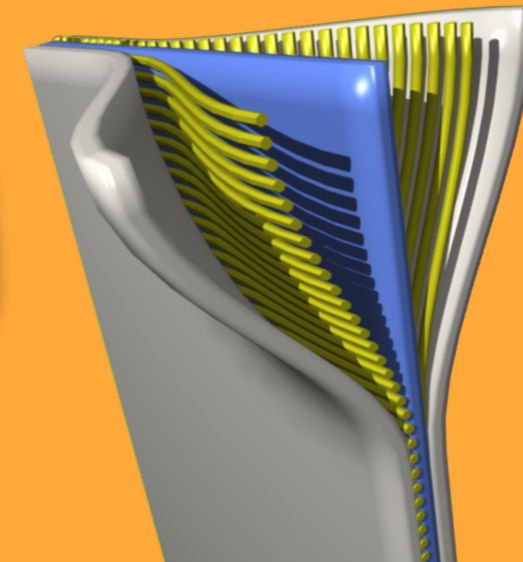
Nonlinear



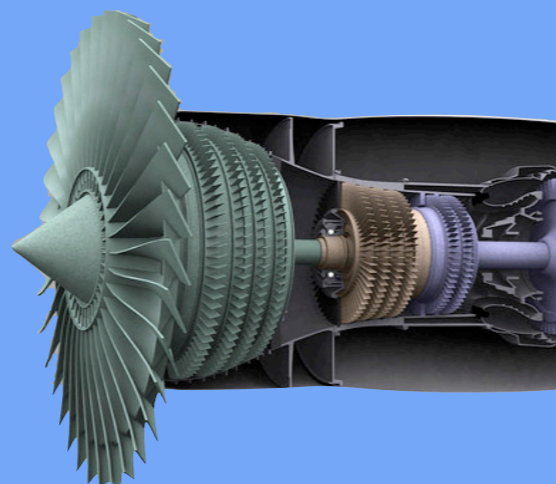
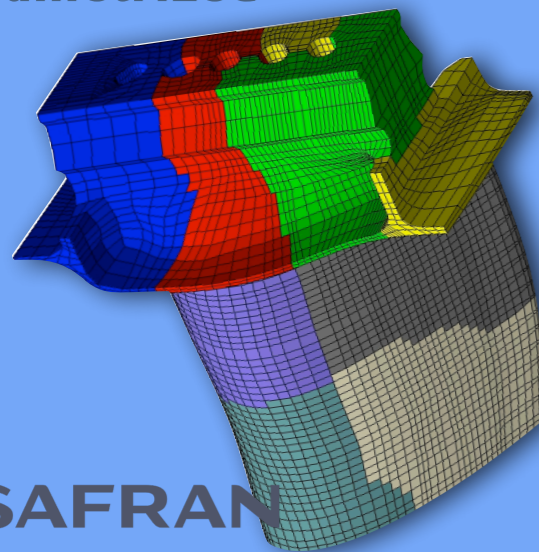
Multiscale



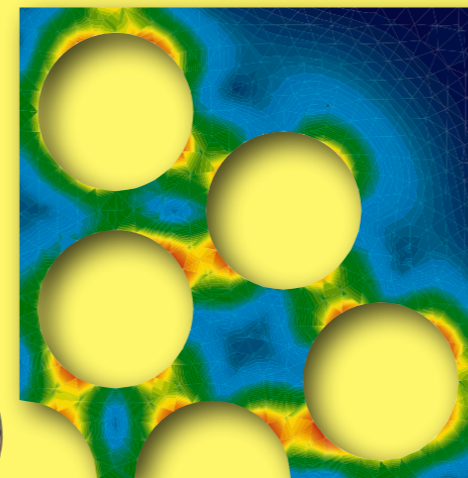
AIRBUS



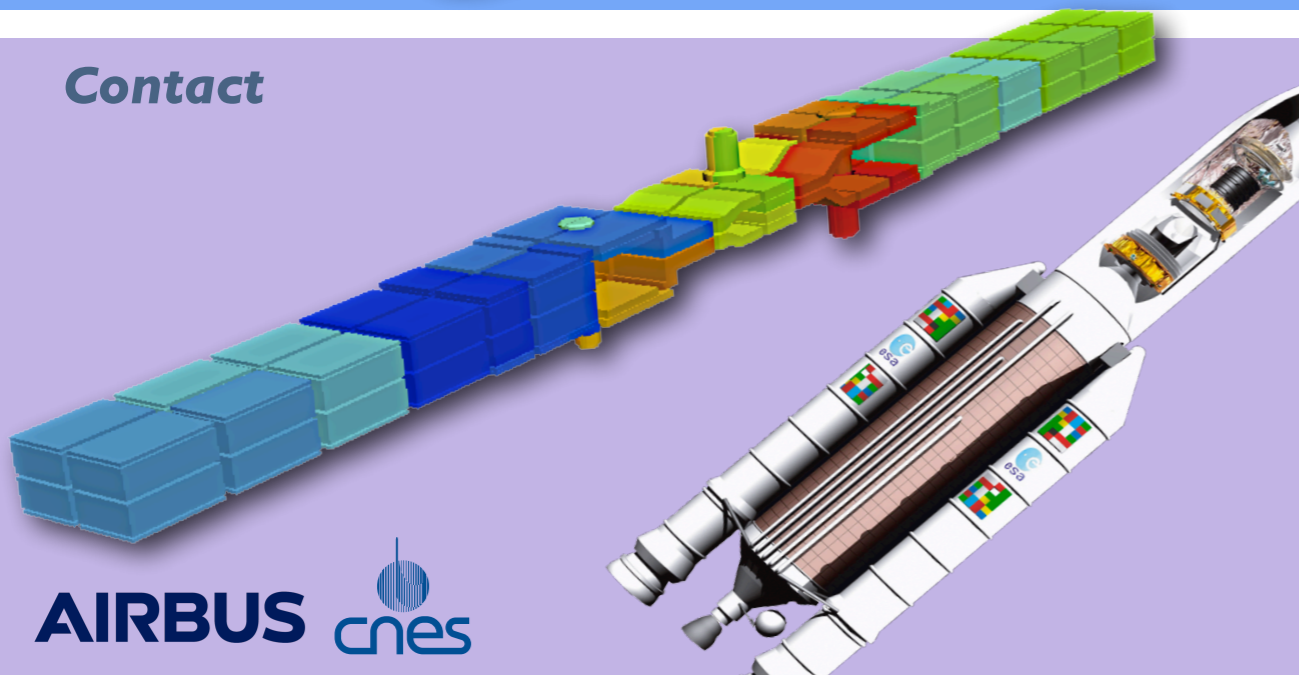
Parametrized



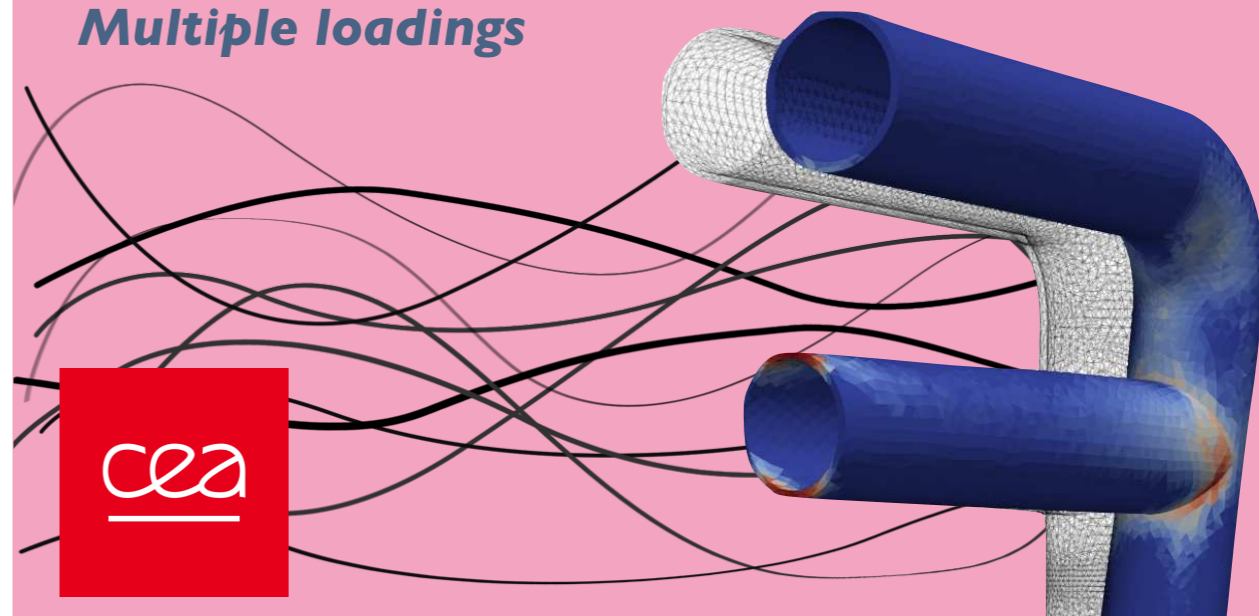
Coupled



Contact

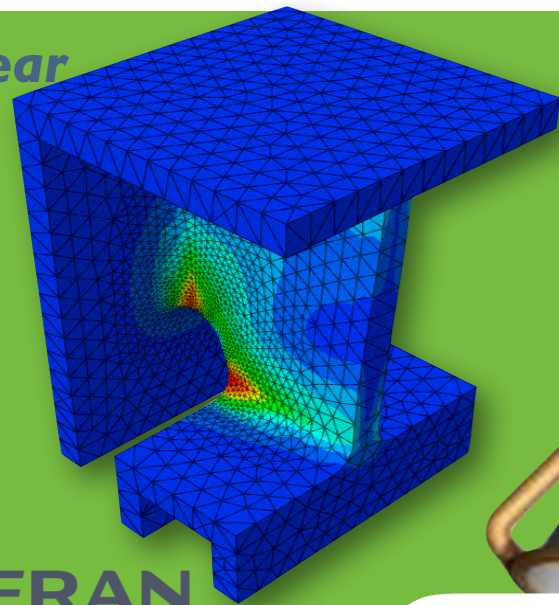


Multiple loadings

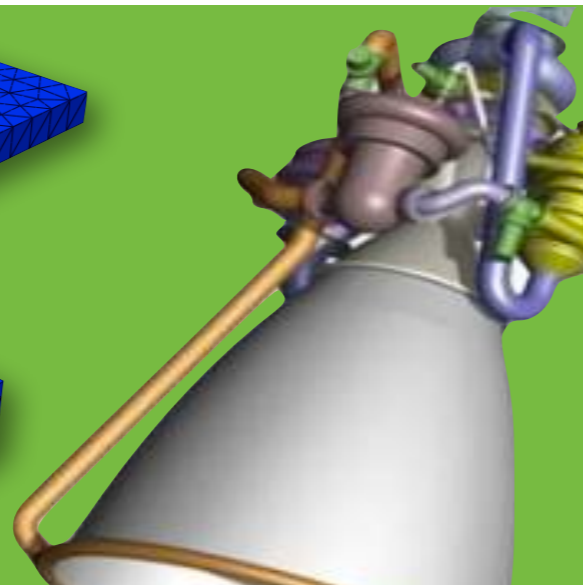


cea

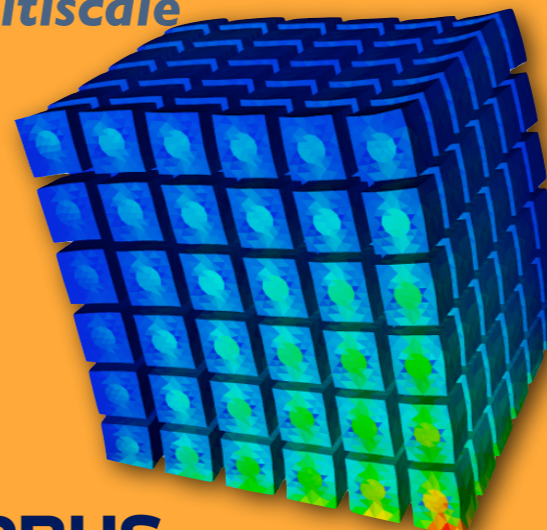
Nonlinear



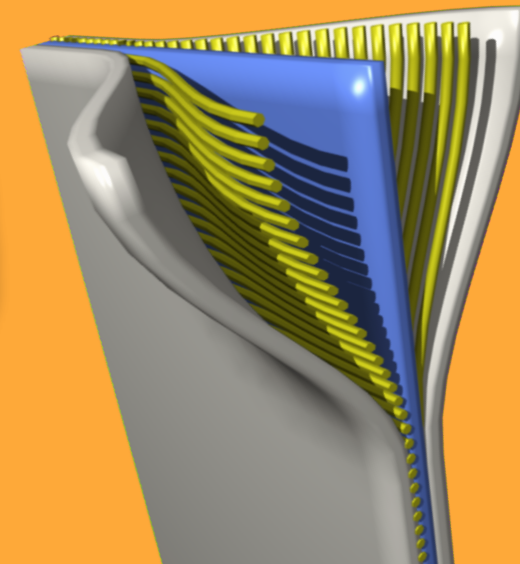
SAFRAN



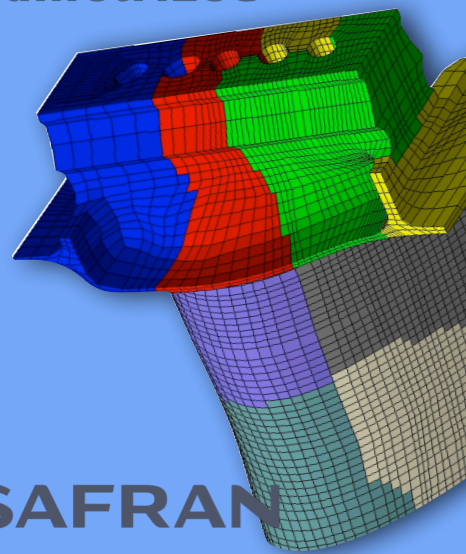
Multiscale



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SAFRAN

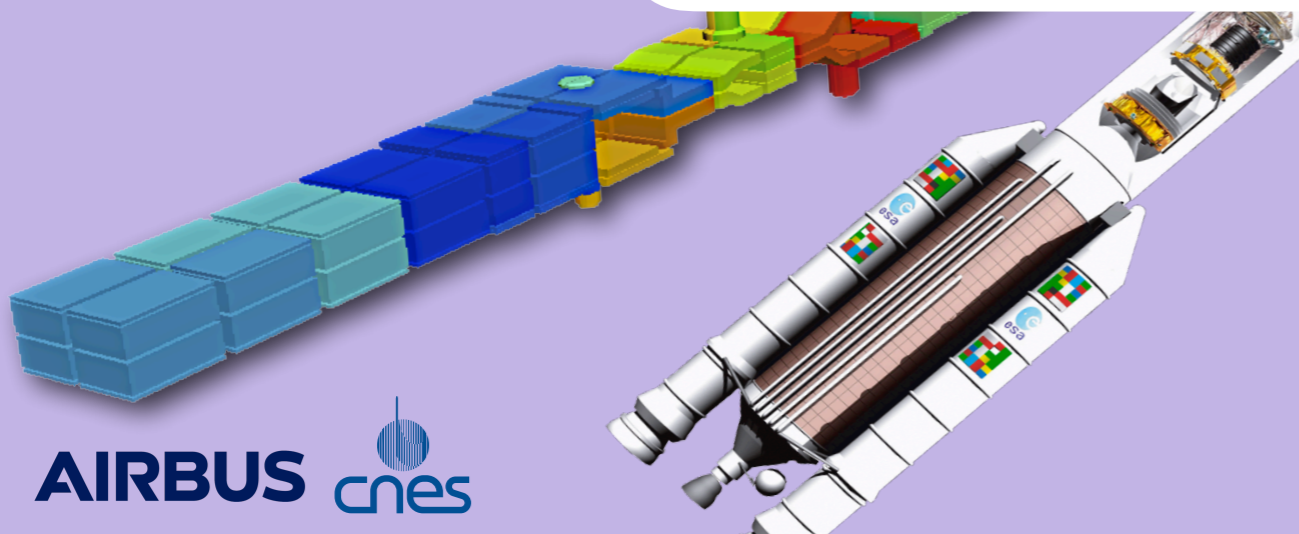
In our team, model reduction by;
LATIN
+
Proper Generalized Decomposition (PGD)

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

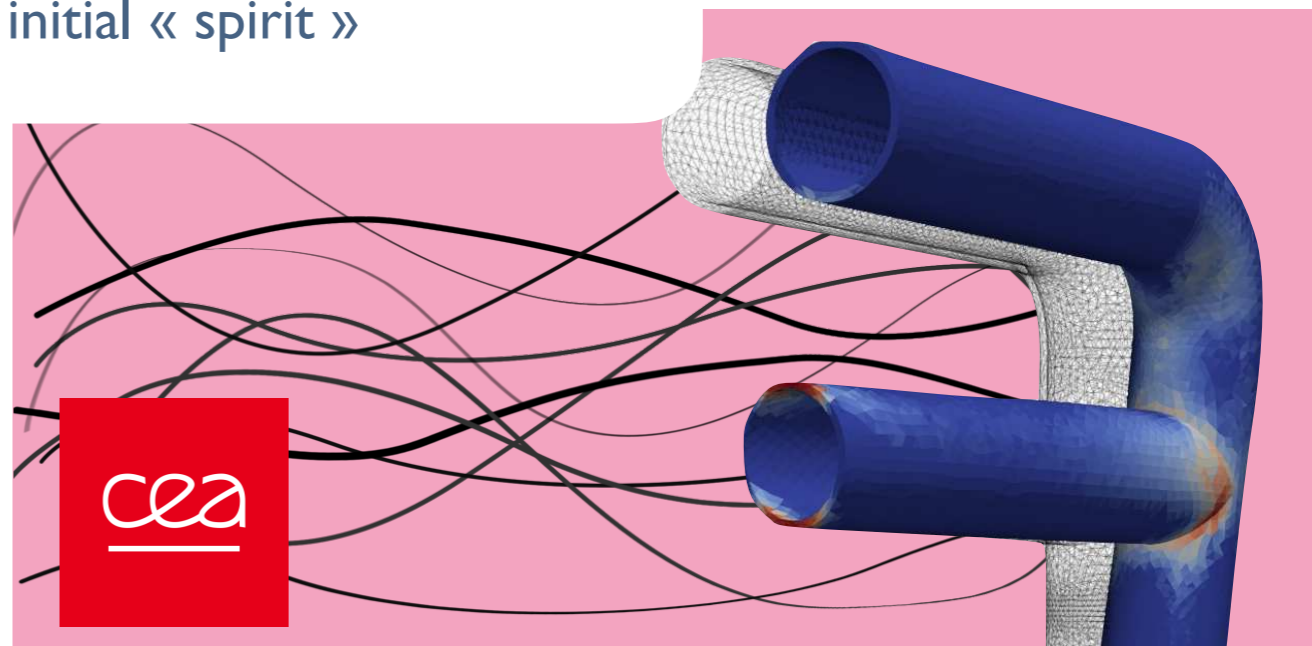
Since adapted to many other situations
using the same initial « spirit »



Contact



AIRBUS 



cea

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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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

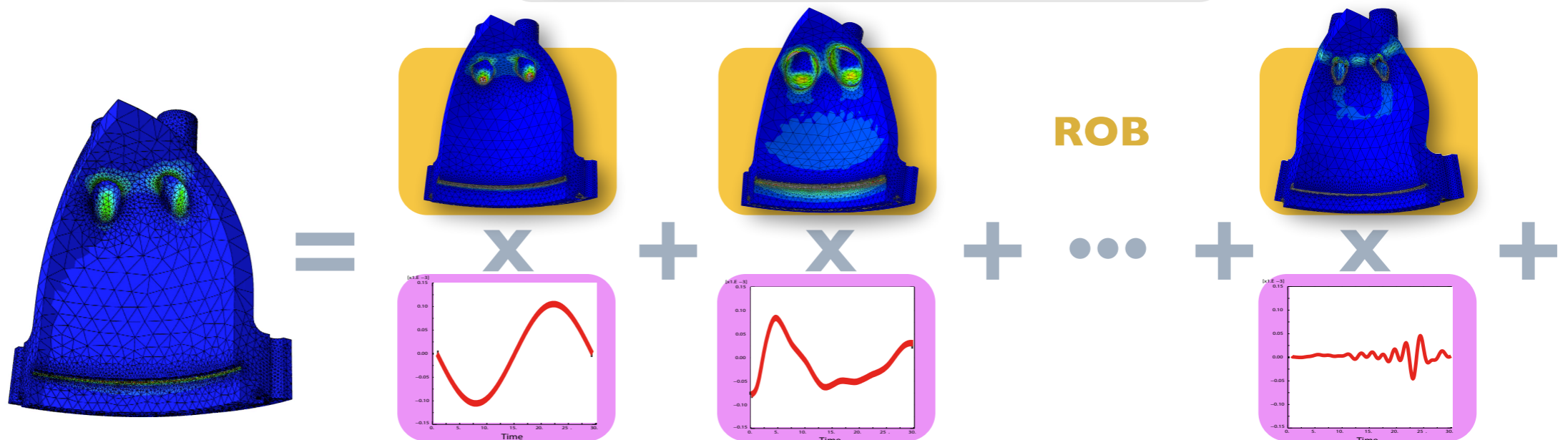
PDE: $\mathcal{L}(u(t, M)) = 0$

■ 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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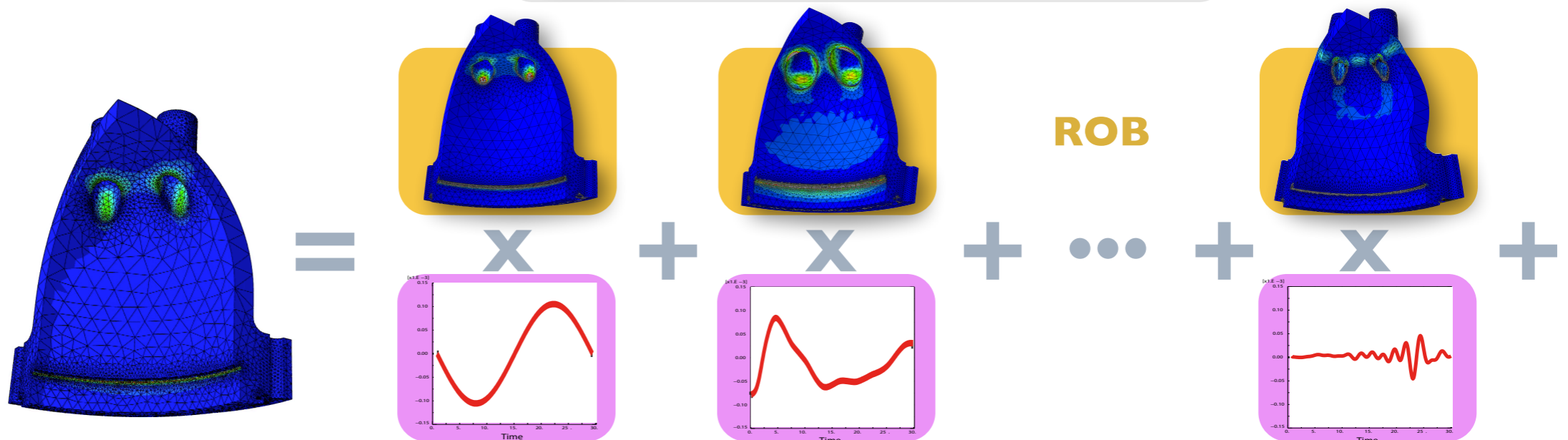
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POD and other stuff ...

■ Particular cases

- if one imposes to one of the families λ_i or Λ_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)

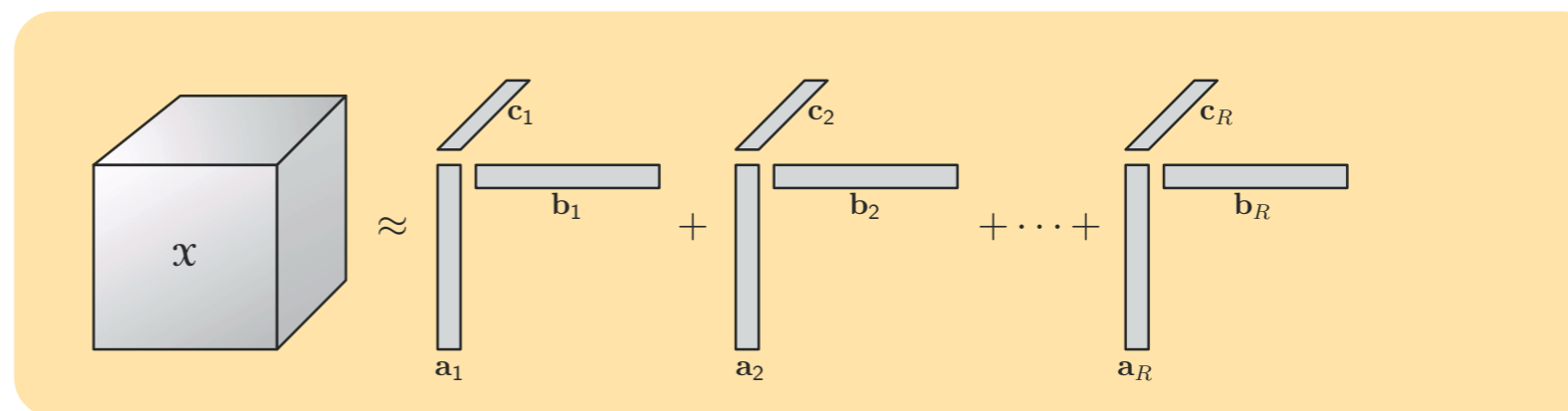
SVD [Ekardt & Young 39]

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

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] ...

PGD in a nutshell

Idea

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

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

ex: linear elasticity

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

Reformulation in the separated-variable framework

$$\begin{array}{c} \text{green box} \end{array}^T \left[\begin{array}{c} \text{orange box} \end{array} \begin{array}{c} \text{blue box} \end{array} - \begin{array}{c} \text{orange box} \end{array} \right] = 0$$

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$$\int_0^T \left[\begin{array}{c} \text{green rectangle} \\ \text{orange rectangle} \end{array} \right]^T \left[\begin{array}{c} \text{orange rectangle} \\ \text{orange rectangle} \end{array} - \begin{array}{c} \text{purple rectangle} \\ \text{orange rectangle} \end{array} \right] = 0$$

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$$\int_0^T \left[\begin{array}{c} \text{orange bar} \\ \text{green box } \nabla \\ \text{green bar} \end{array} + \begin{array}{c} \text{green bar} \\ \text{green box } \nabla \\ \text{purple box} \end{array} \right]^T \left[\begin{array}{c} \text{orange box} \\ \text{orange bar} \\ \text{purple box} \end{array} - \begin{array}{c} \text{orange box} \end{array} \right] = 0$$

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$$\text{purple} = f(\text{orange}) \quad \text{orange} = g(\text{purple})$$

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Reformulation in the separated-variable framework

$$\int_0^T \left[\begin{array}{c} \text{yellow bar} \\ \text{green bar with } \nabla \\ \text{green bar with } \nabla \\ \text{pink bar} \end{array} + \begin{array}{c} \text{green bar with } \nabla \\ \text{pink bar} \end{array} \right]^T \left[\begin{array}{c} \text{orange square} \\ \text{orange bar} \\ \text{pink bar} \\ \text{orange square} \end{array} - \begin{array}{c} \text{orange square} \end{array} \right] = 0$$

$$\text{pink bar} = f(\text{yellow bar}) \quad \text{yellow bar} = g(\text{pink bar})$$

Fixed-point method

PGD in a nutshell

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$$\text{pink box} = f(\text{orange bar}) \quad \text{orange bar} = g(\text{pink box}) \quad \text{pink box} = f \circ g(\text{pink box})$$

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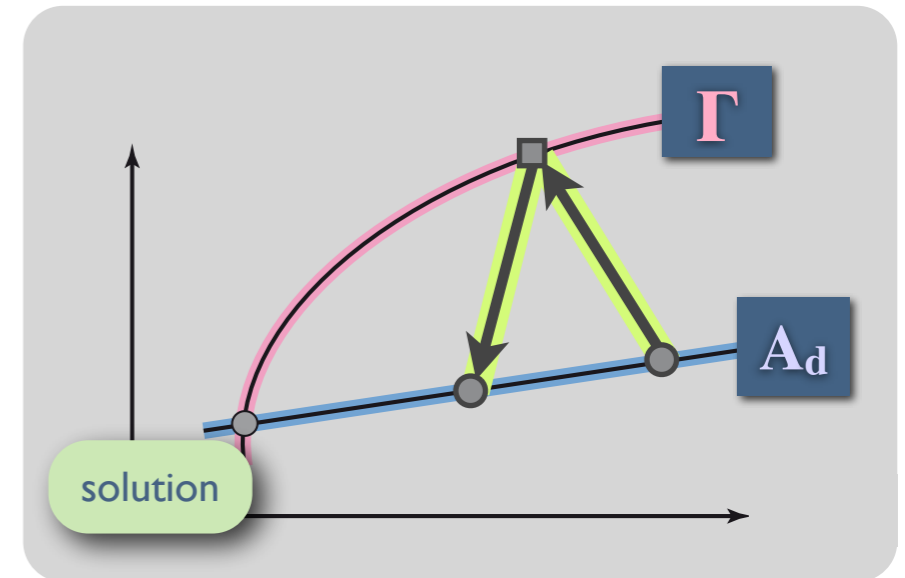
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Eigenvalue problem

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

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

Mechanical problem

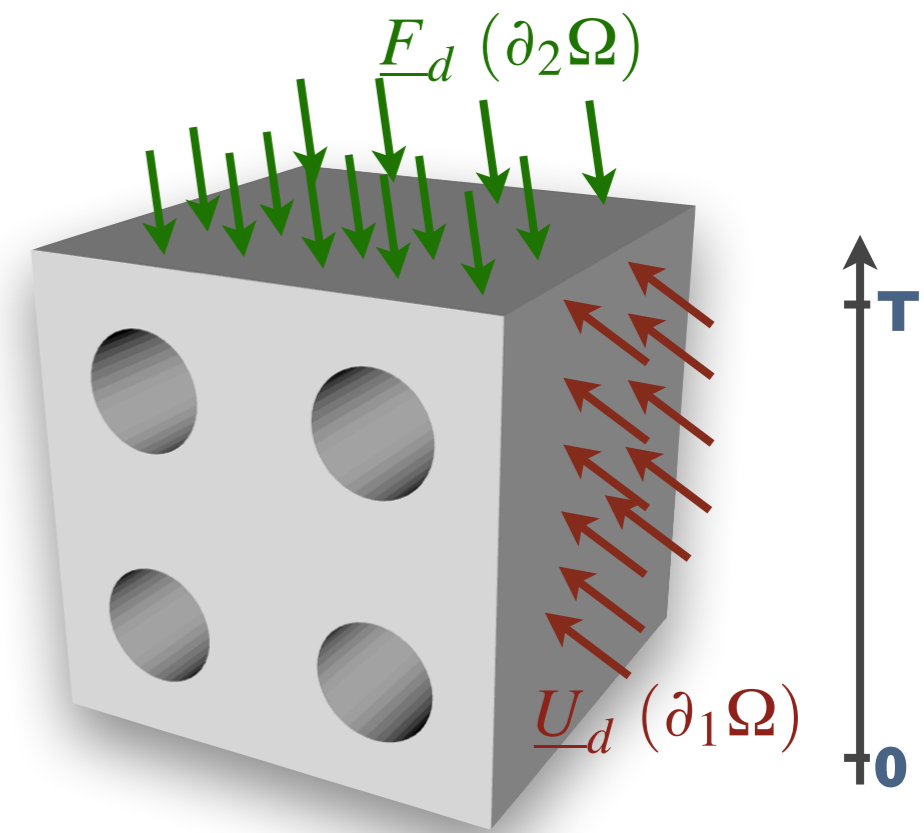
■ Framework

- small perturbation, quasi-static evolution, isothermal

■ State of the structure

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

- ▶ ε_p inelastic part of strain field
- ▶ X remaining internal variables
- ▶ σ stress field
- ▶ Y variables conjugate of X



Mechanical problem

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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)

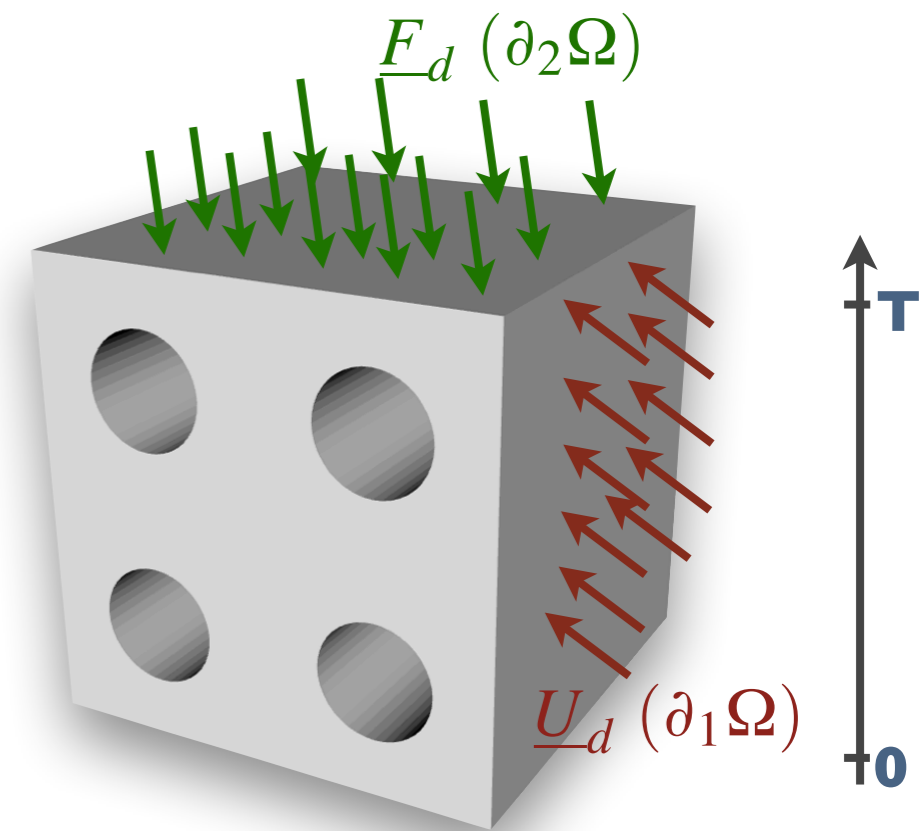
state equations

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

evolution laws

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

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



Mechanical problem

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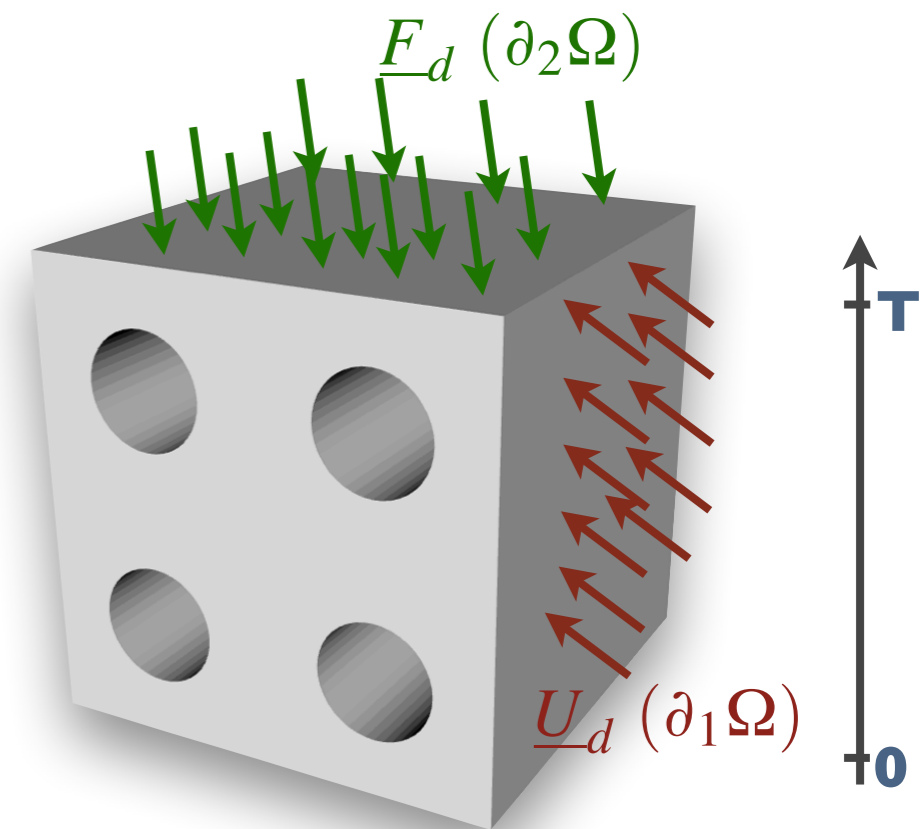
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\mathbf{A}_d

Γ

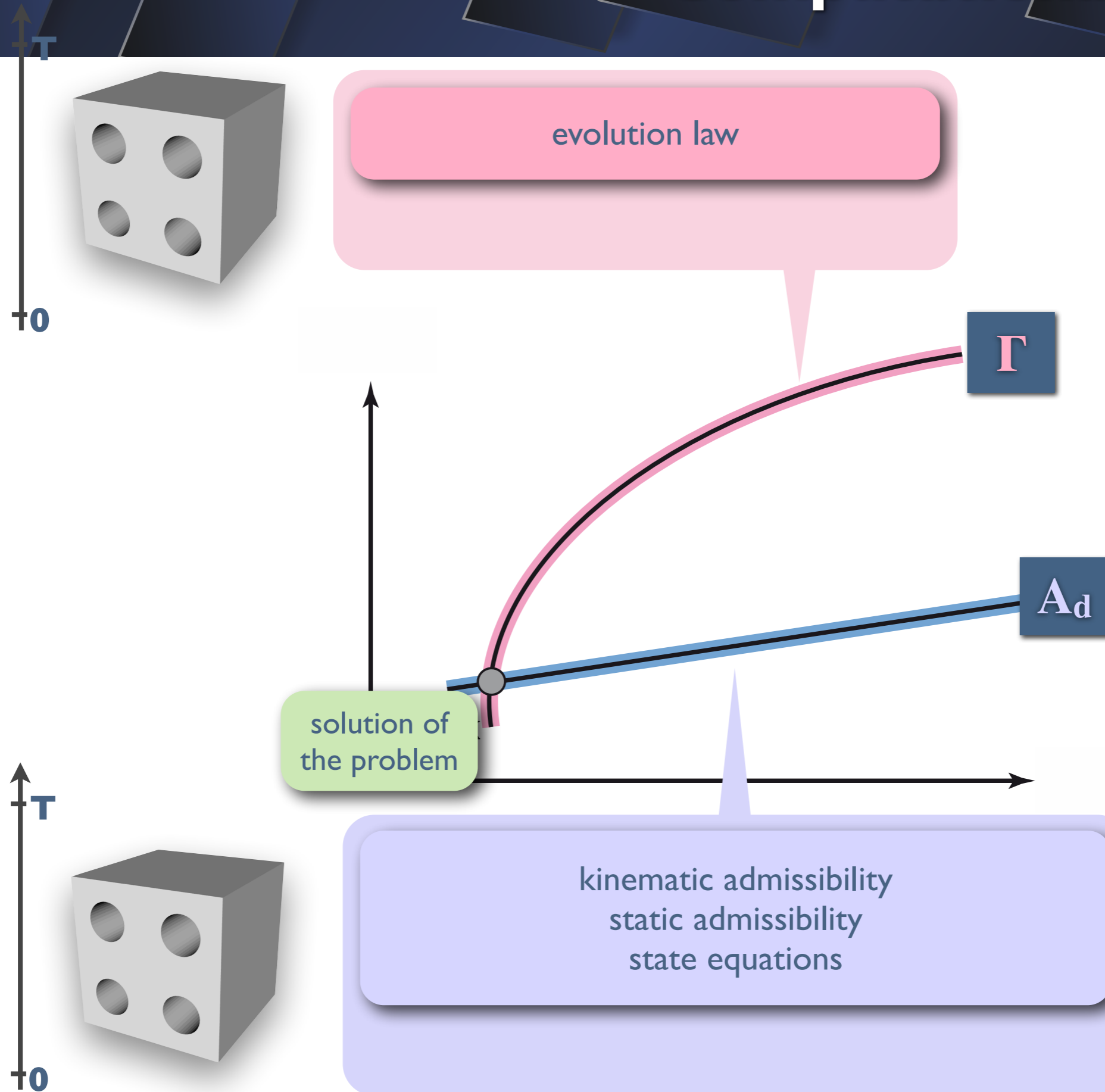


linear

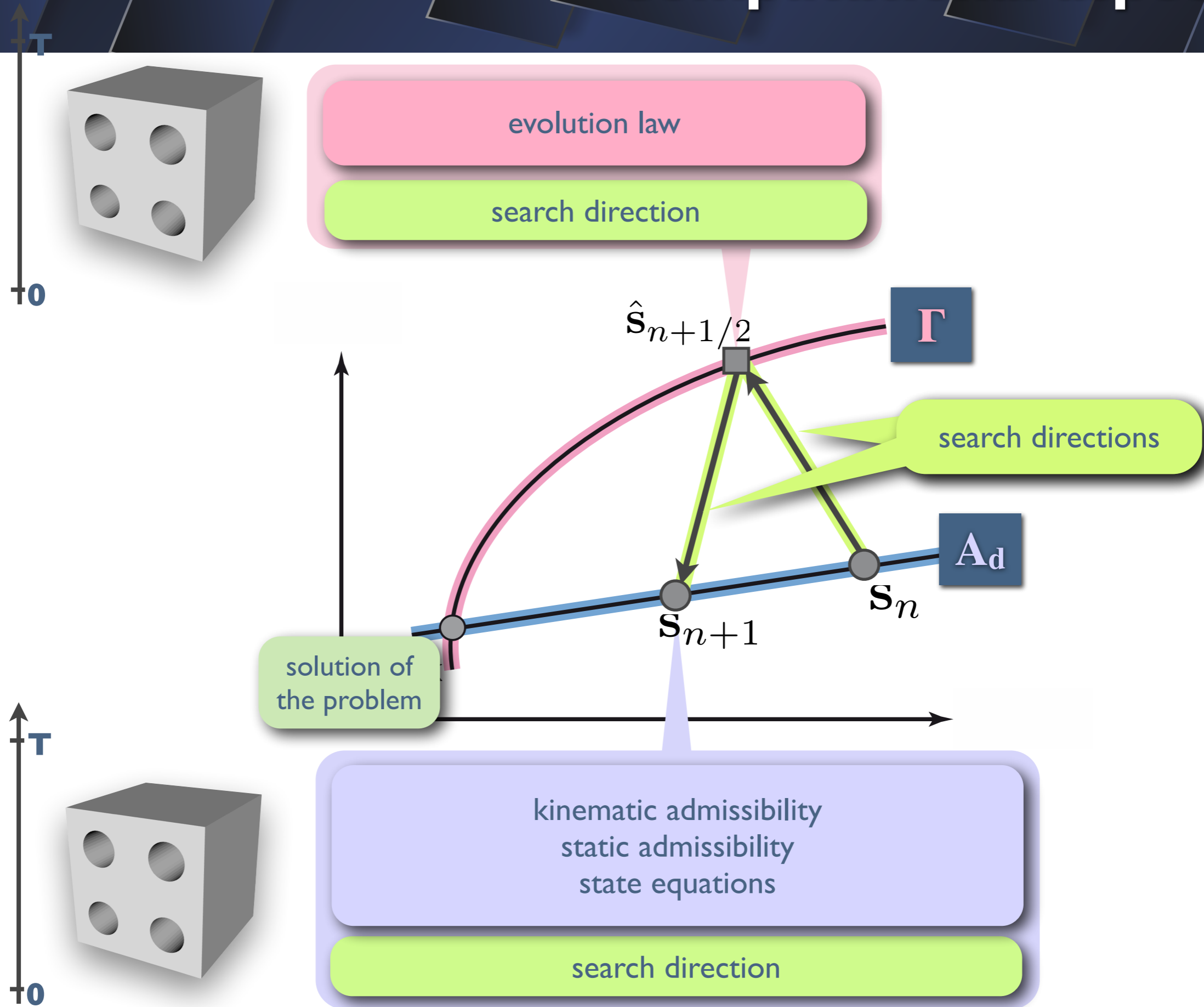


nonlinear

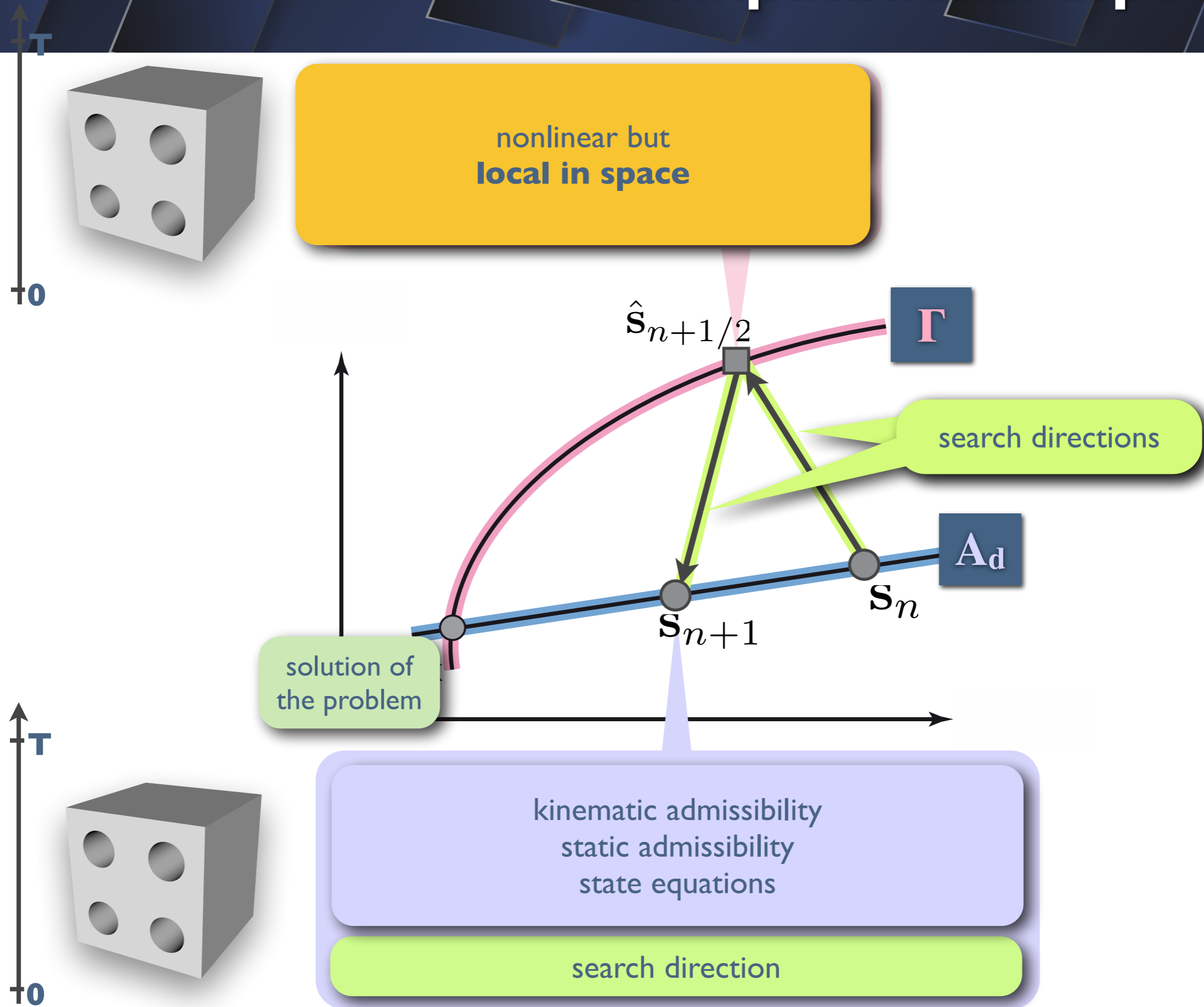
Computational aspects



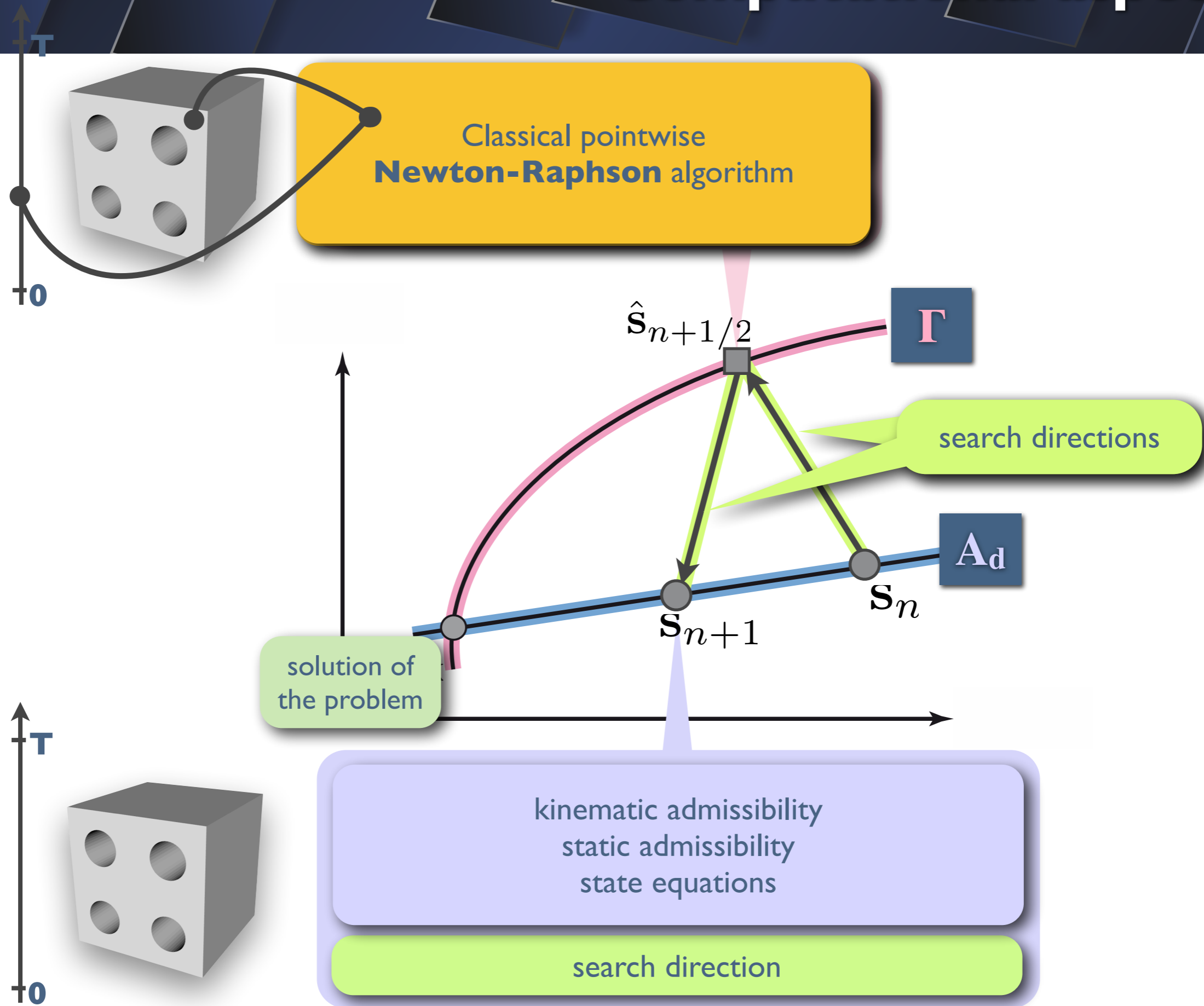
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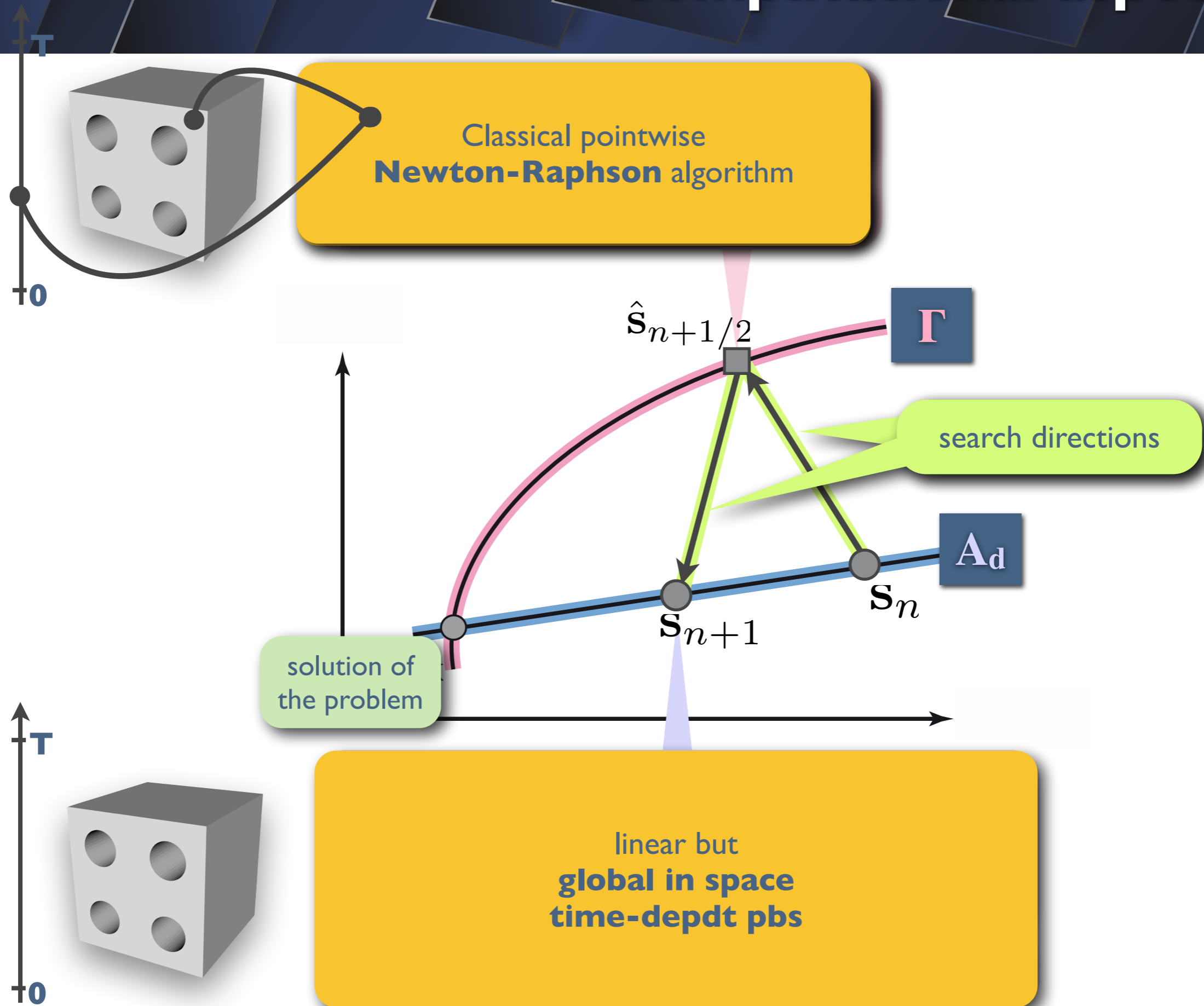
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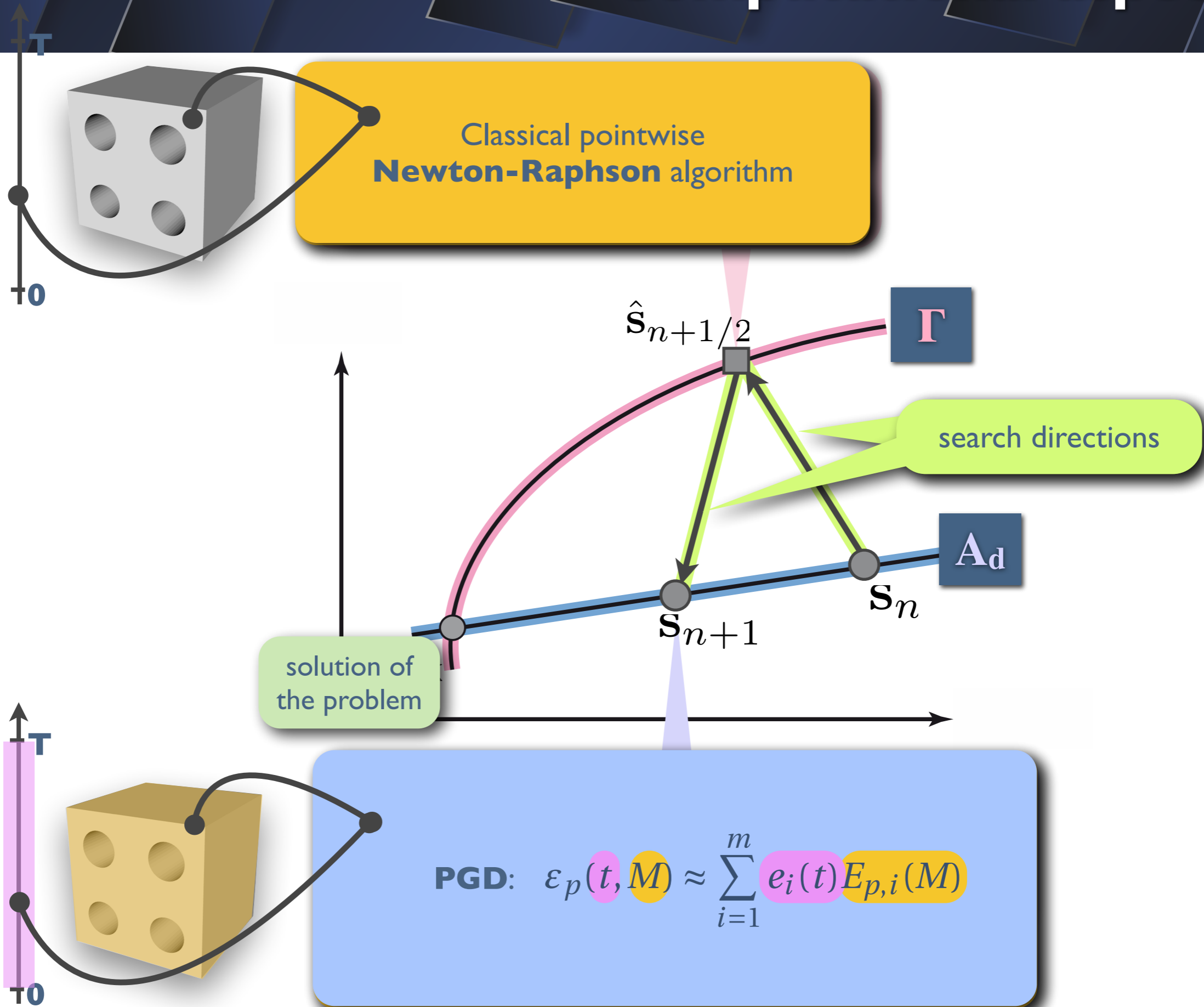
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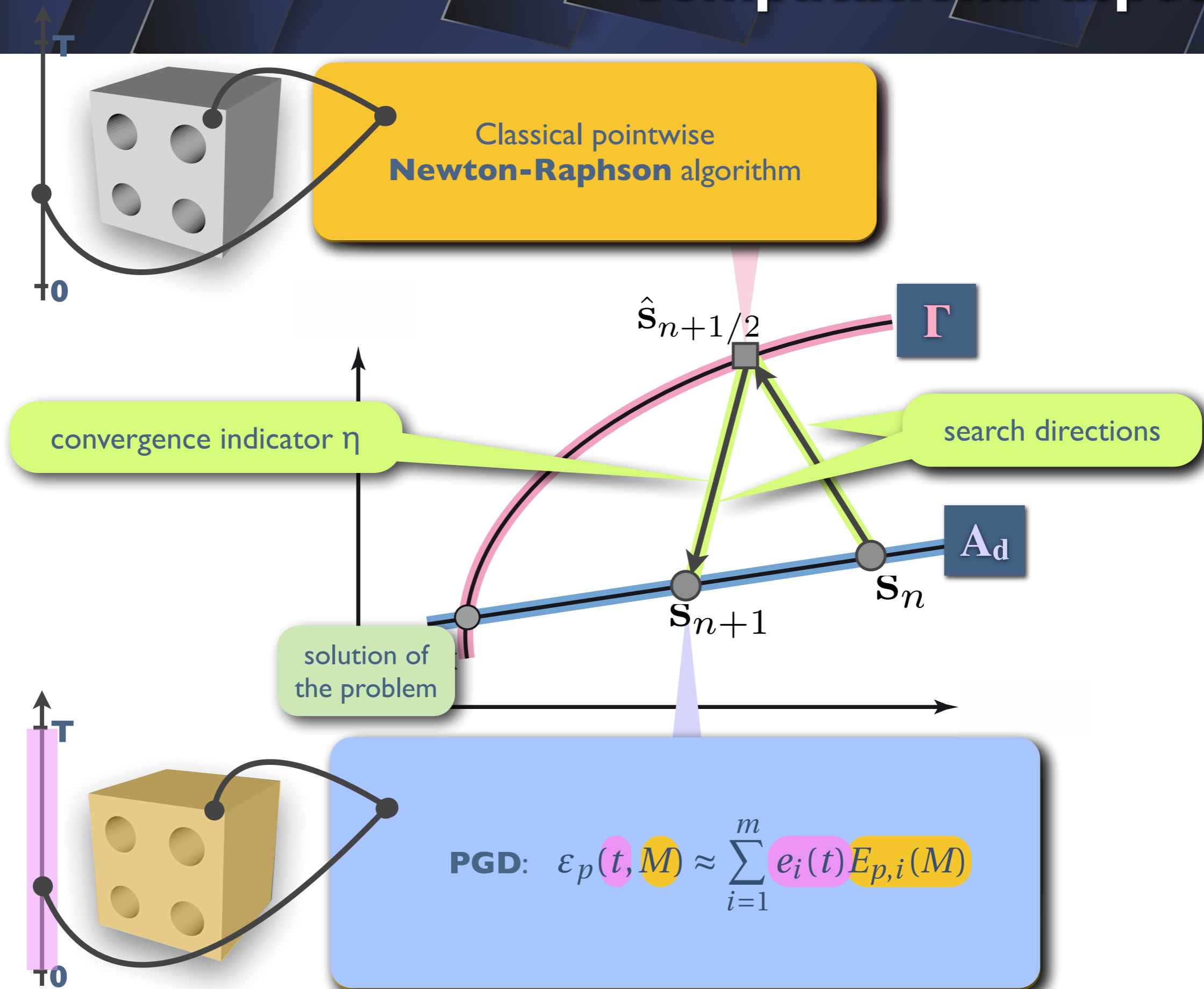
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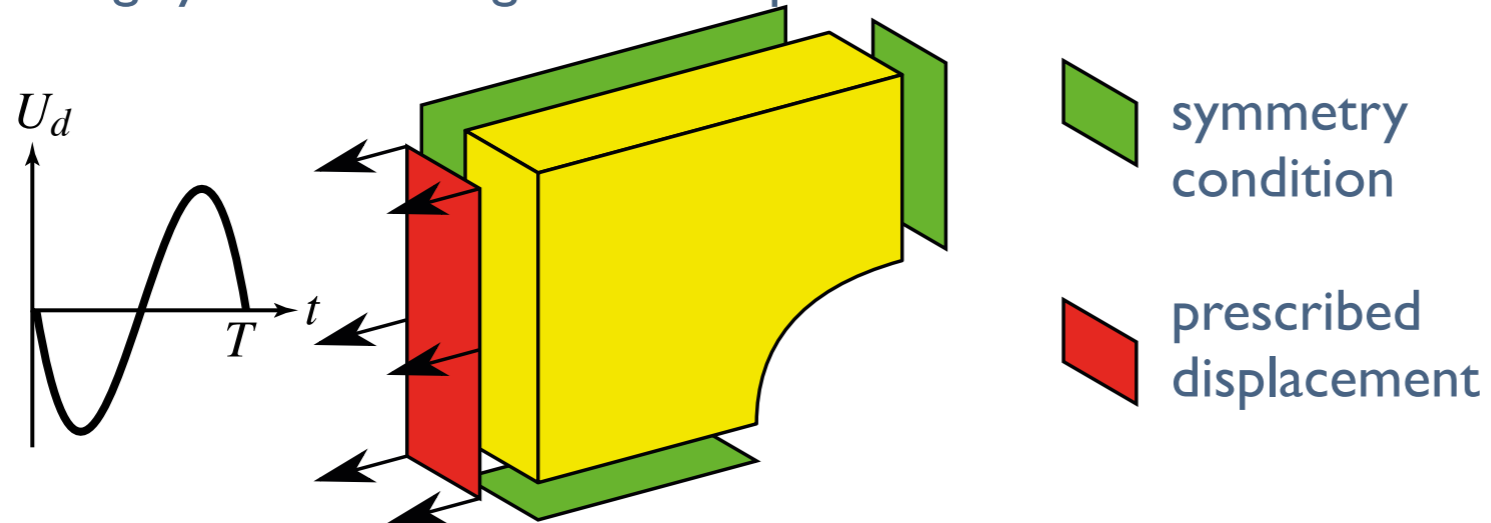
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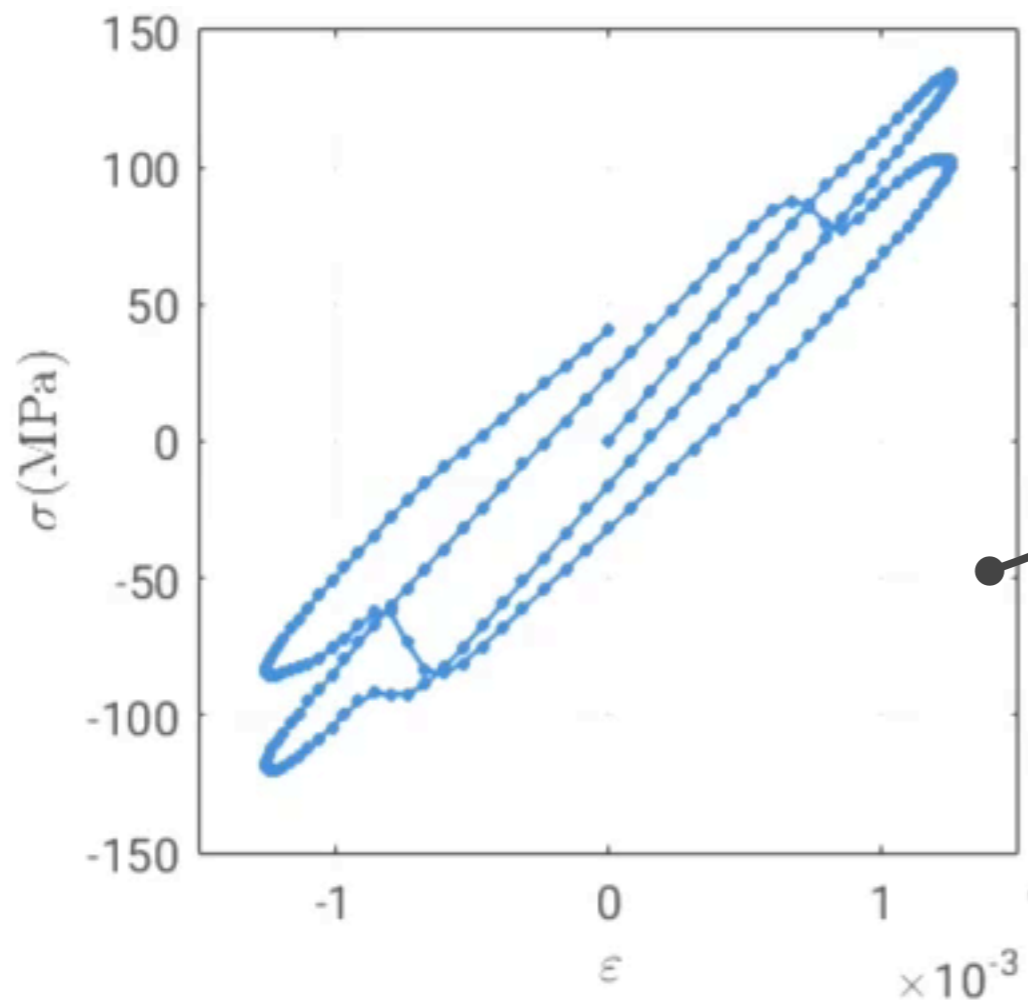
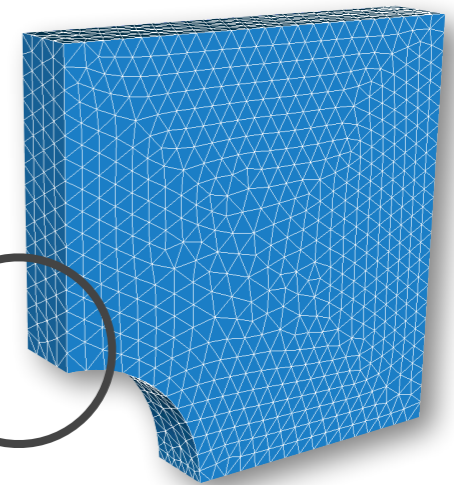
Mini example

■ Open hole plate

- using symmetries: eighth of the plate



36,954 DOFs
120 time steps



Evolution equations

Kinematic admissibility
Static admissibility

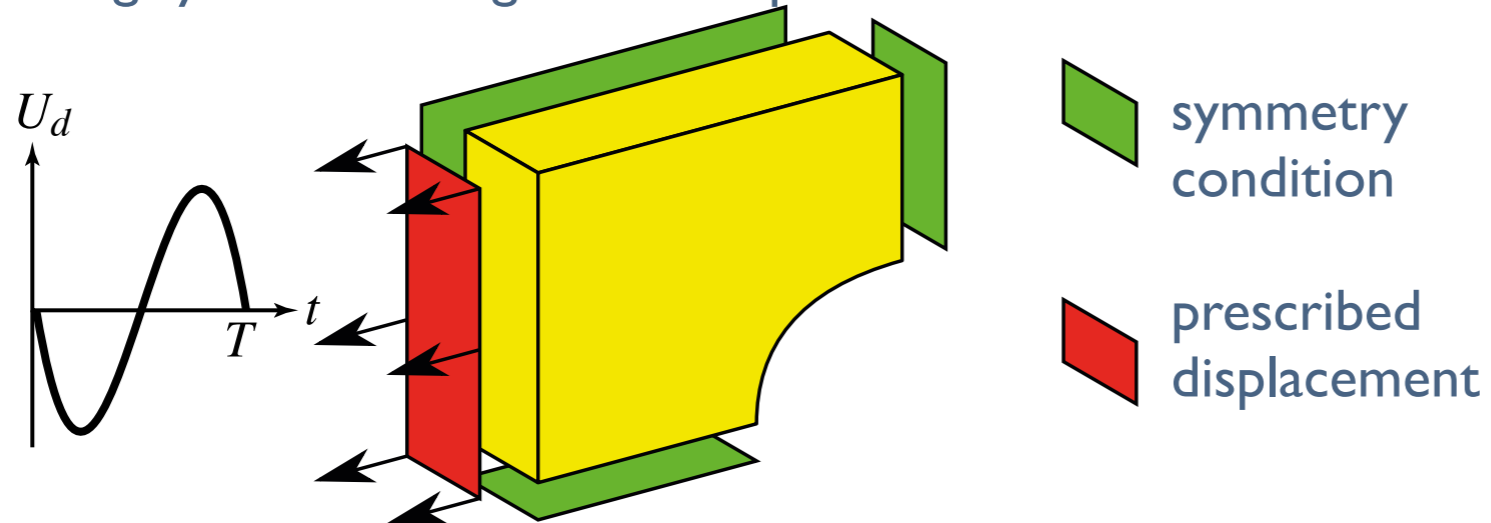
Γ

A_d

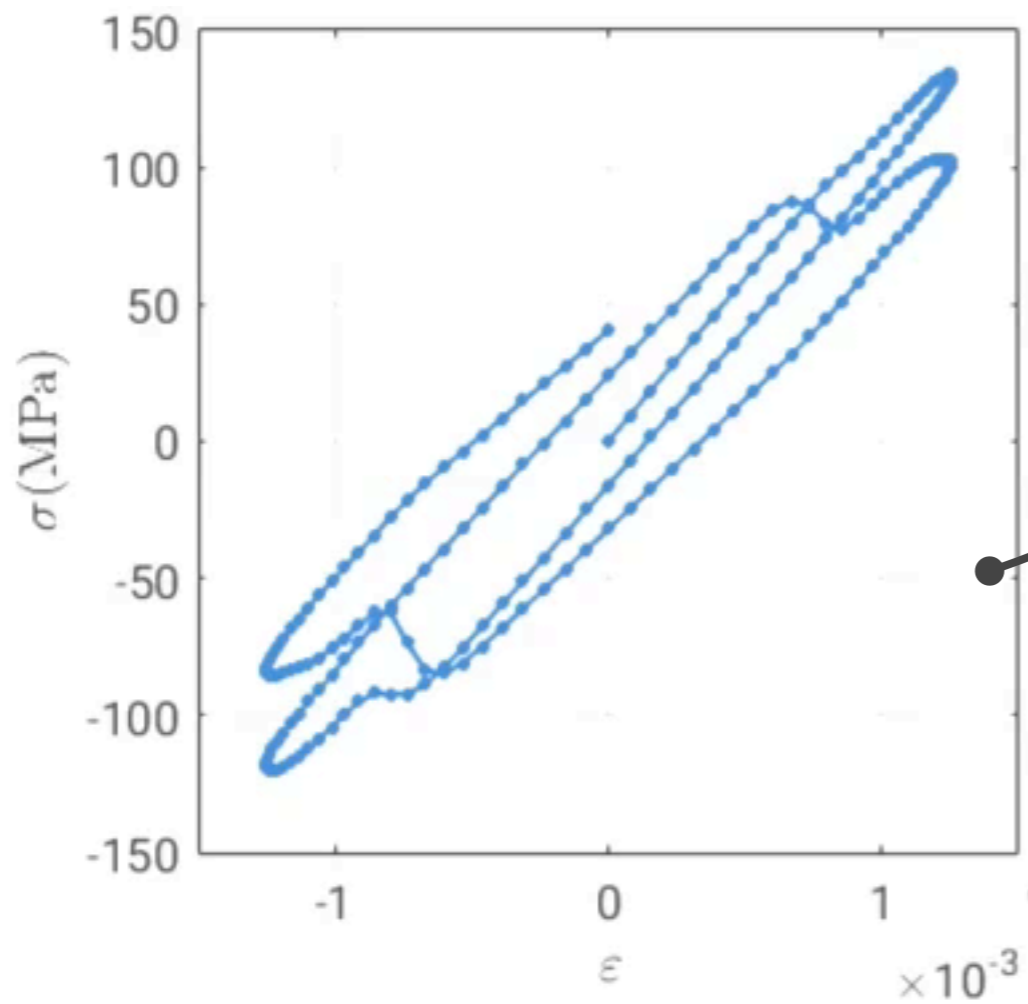
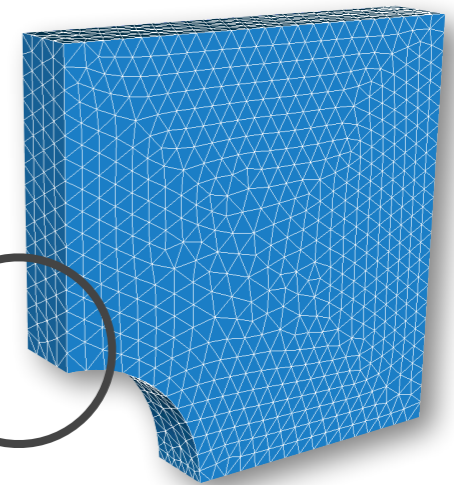
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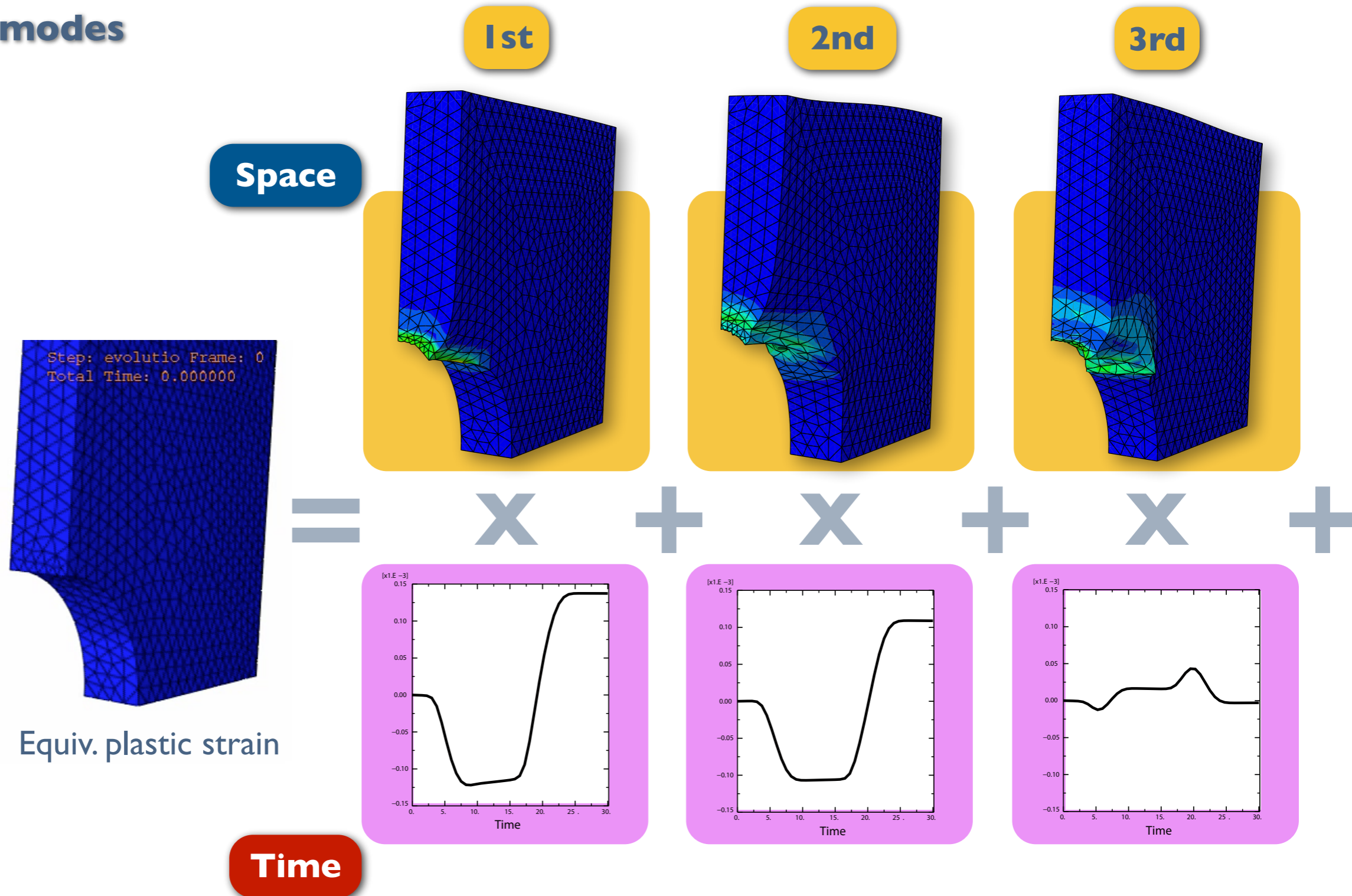
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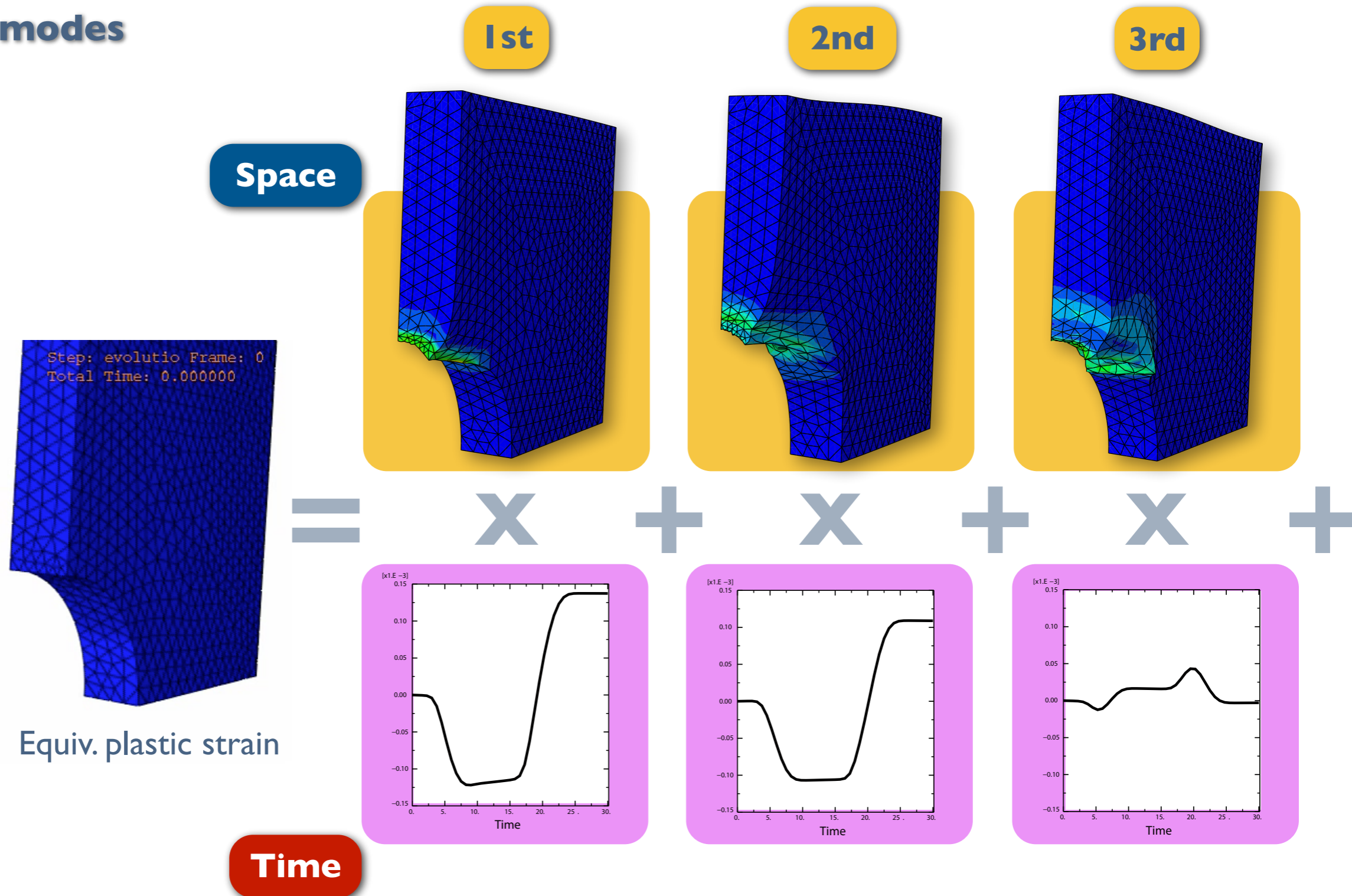
Mini example

PGD modes



Mini example

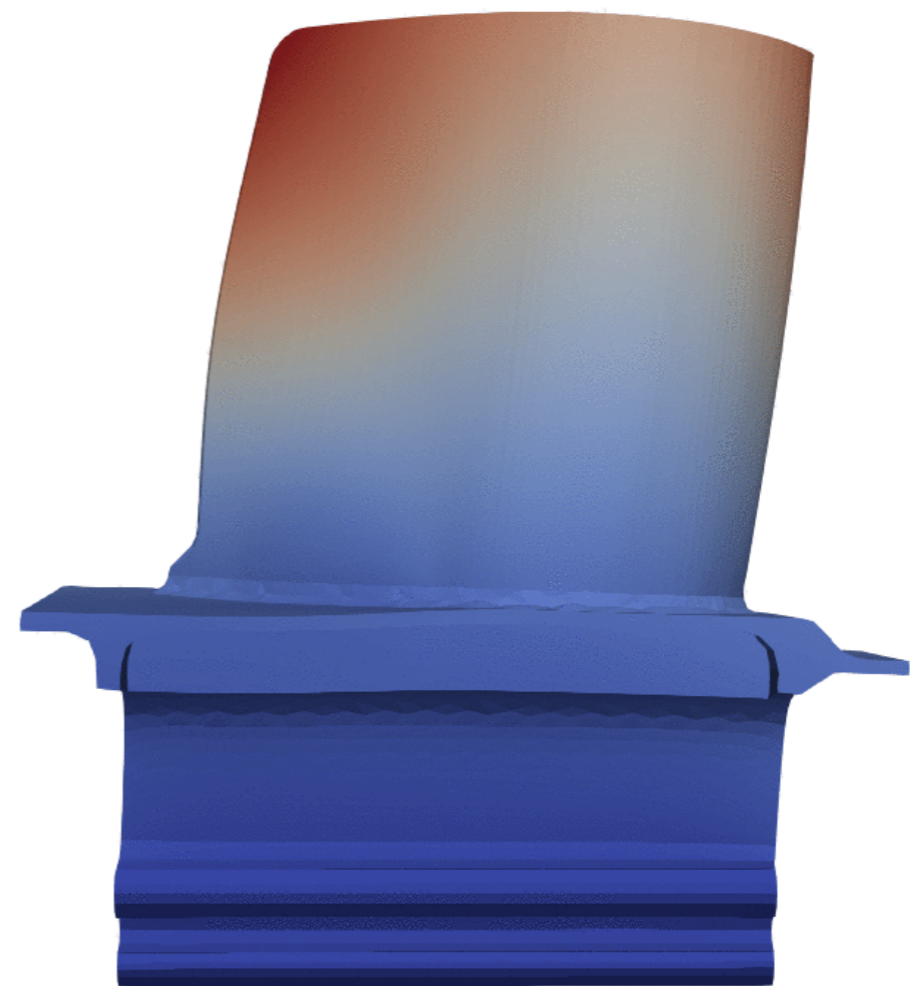
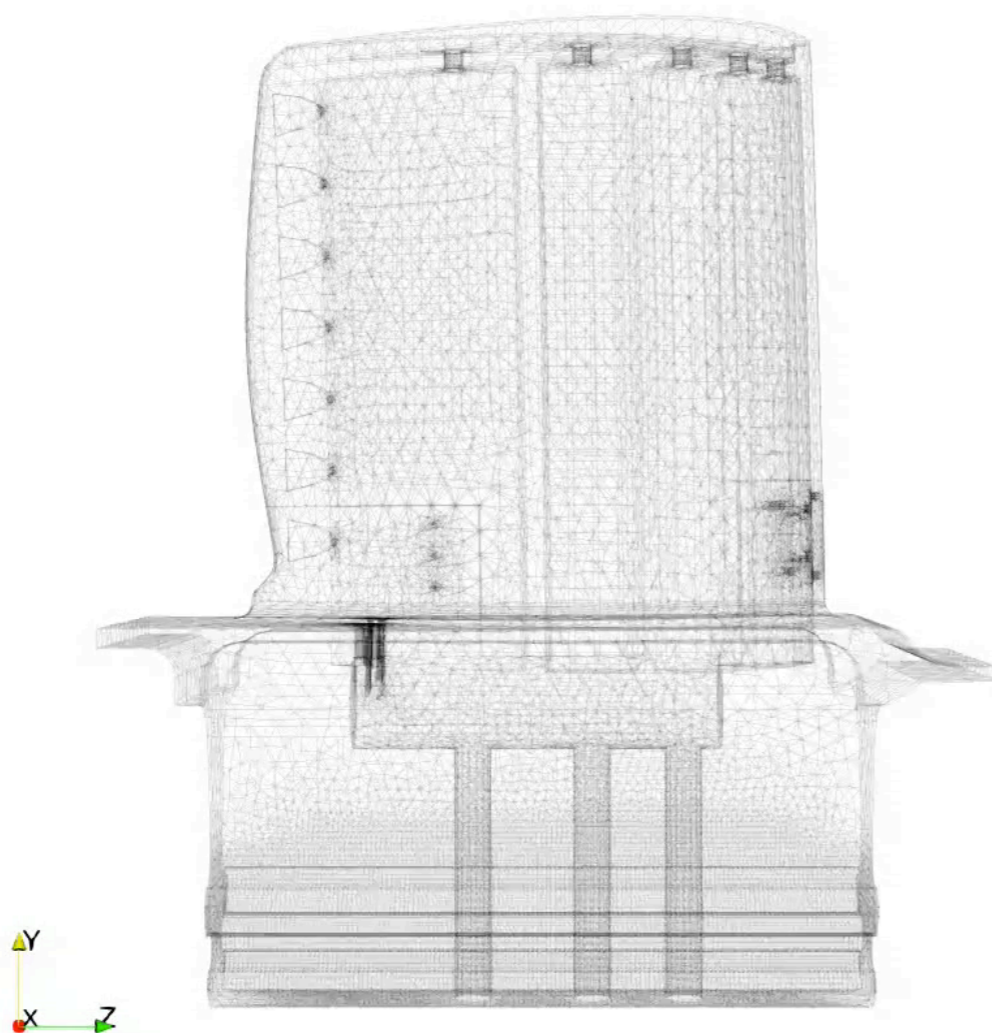
PGD modes



■ 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]

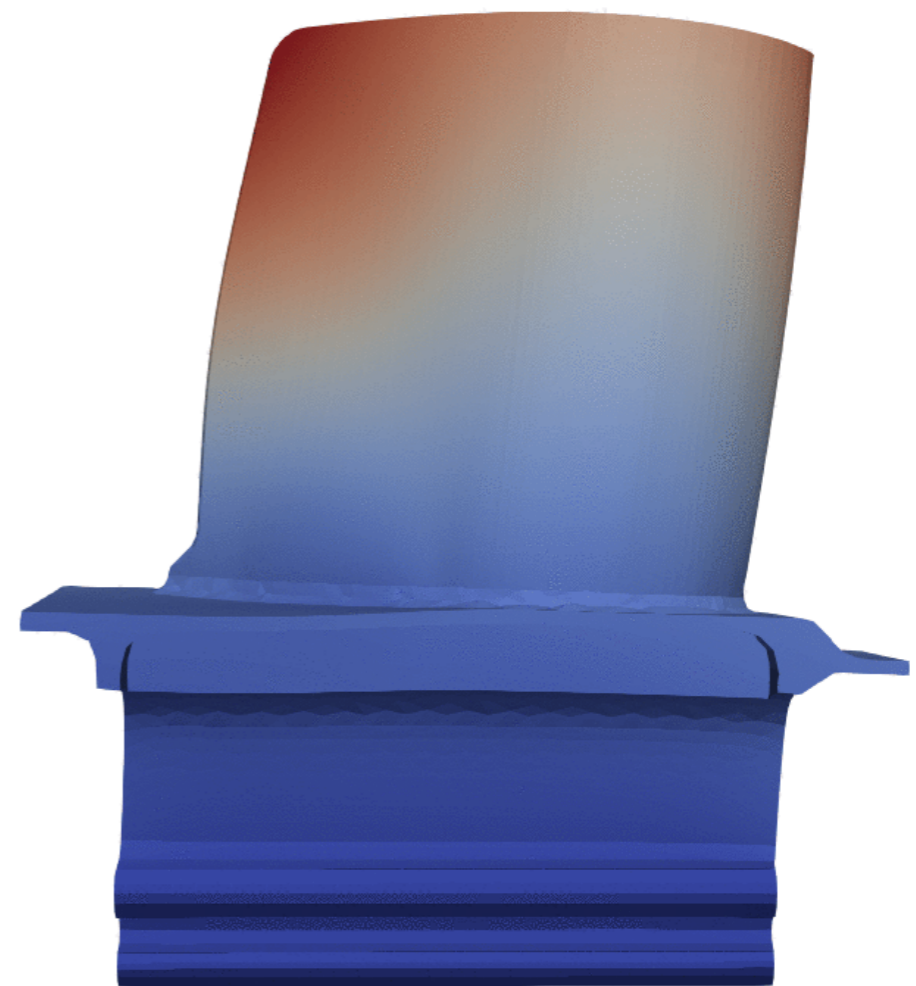
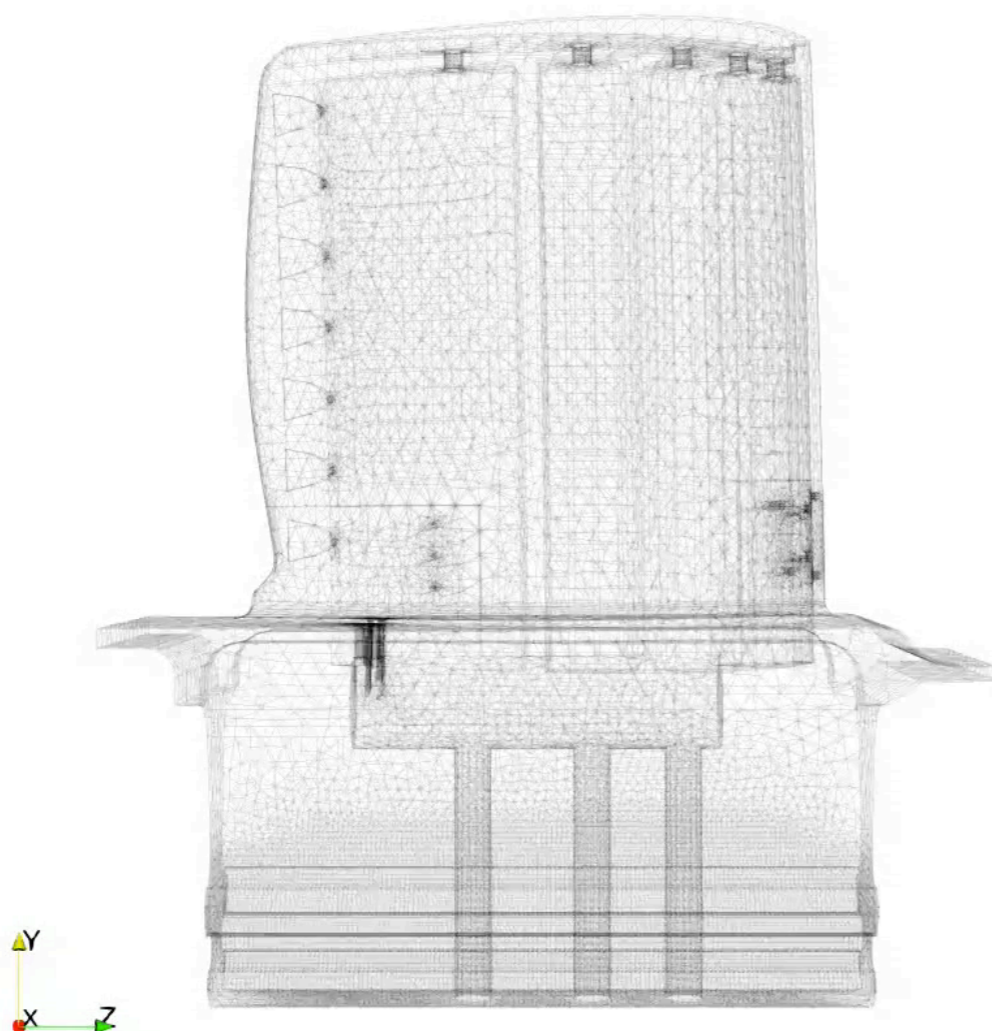
SIEMENS



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SIEMENS

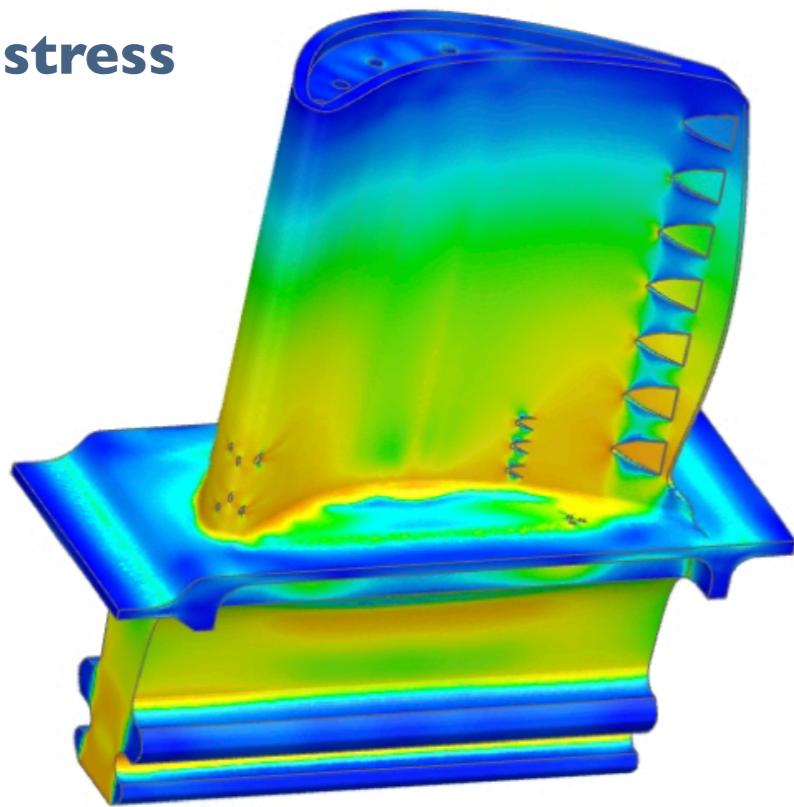
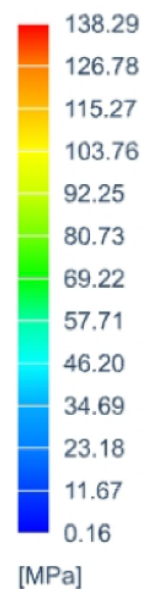


Bigger example

■ Blade of an aircraft engine

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Mises stress



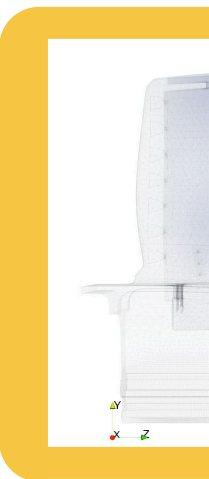
Space
ROB

Time
funct.

1st

2nd

3rd



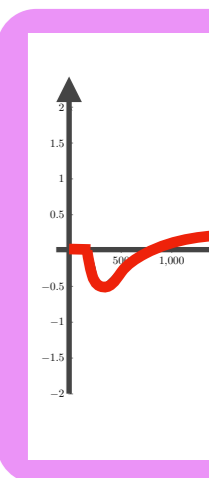
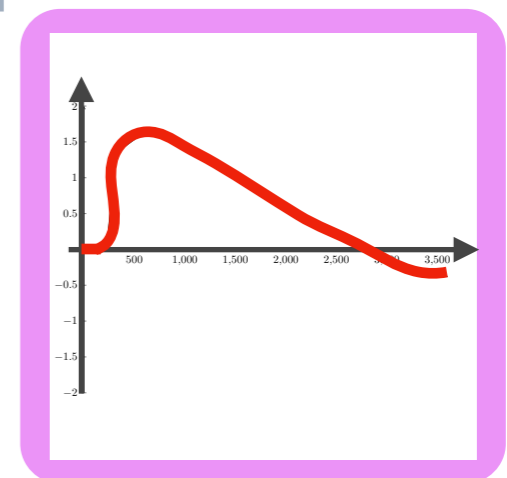
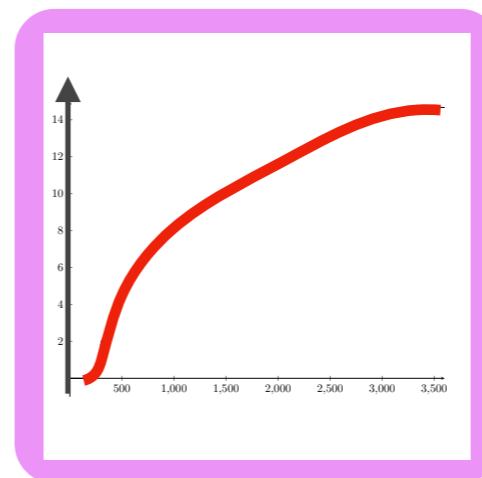
X

+

X

+

X

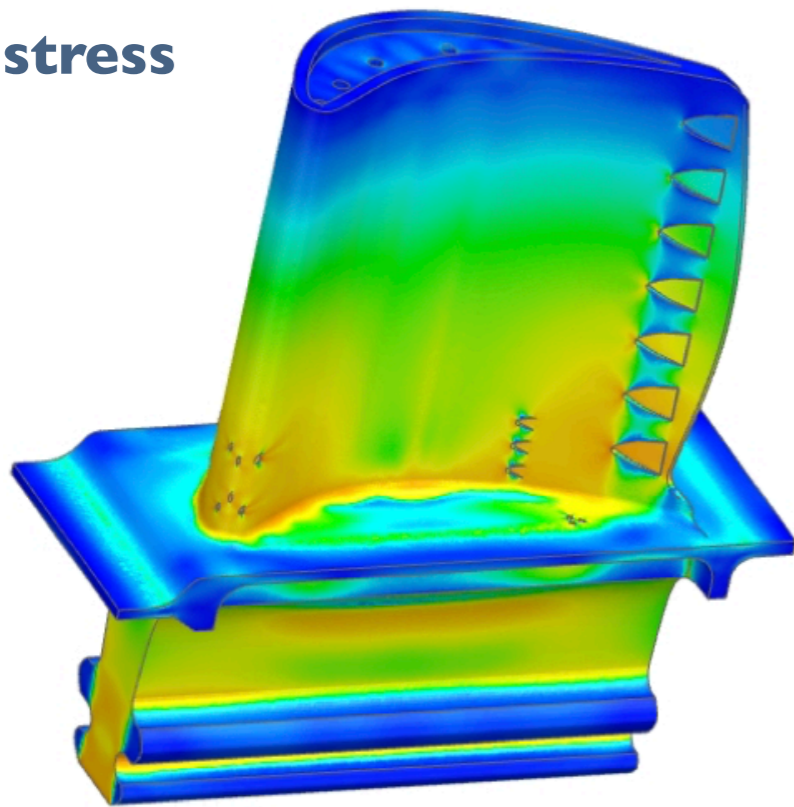
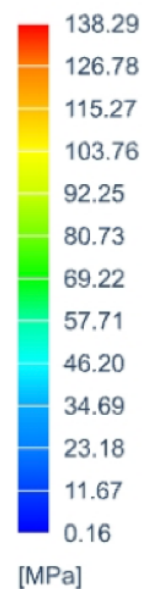


Bigger example

■ 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



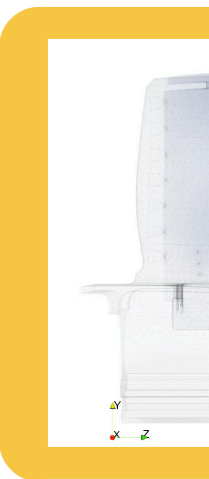
Space
ROB

Time
funct.

1st

2nd

3rd



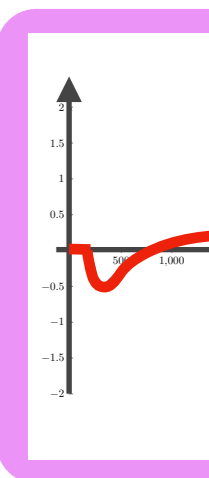
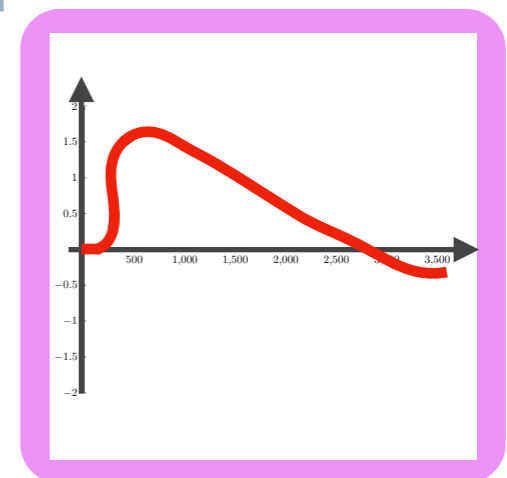
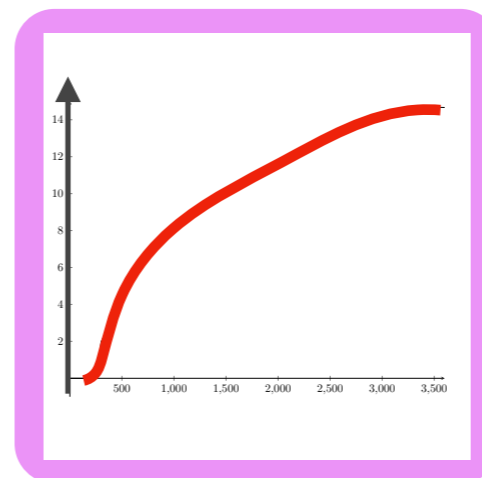
X

+

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

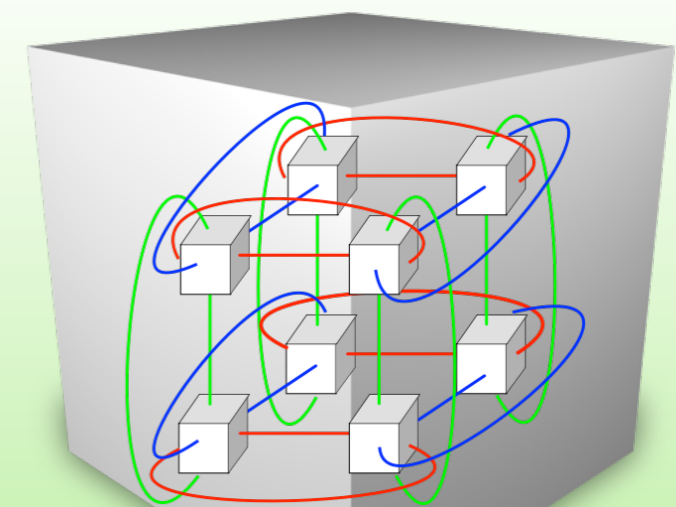
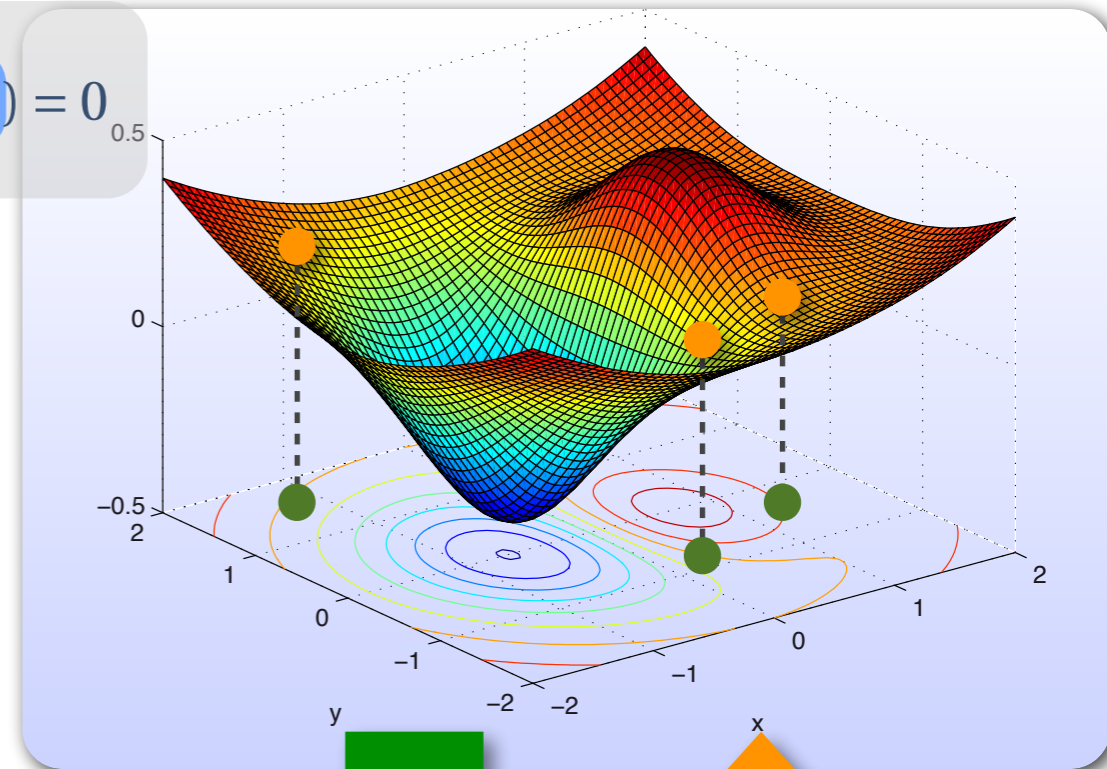
μPDE: $\mathcal{L}(u(t, M), \mu_1, \mu_2) = 0$

■ 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: $\mathcal{L}(u(t, M)) = 0$



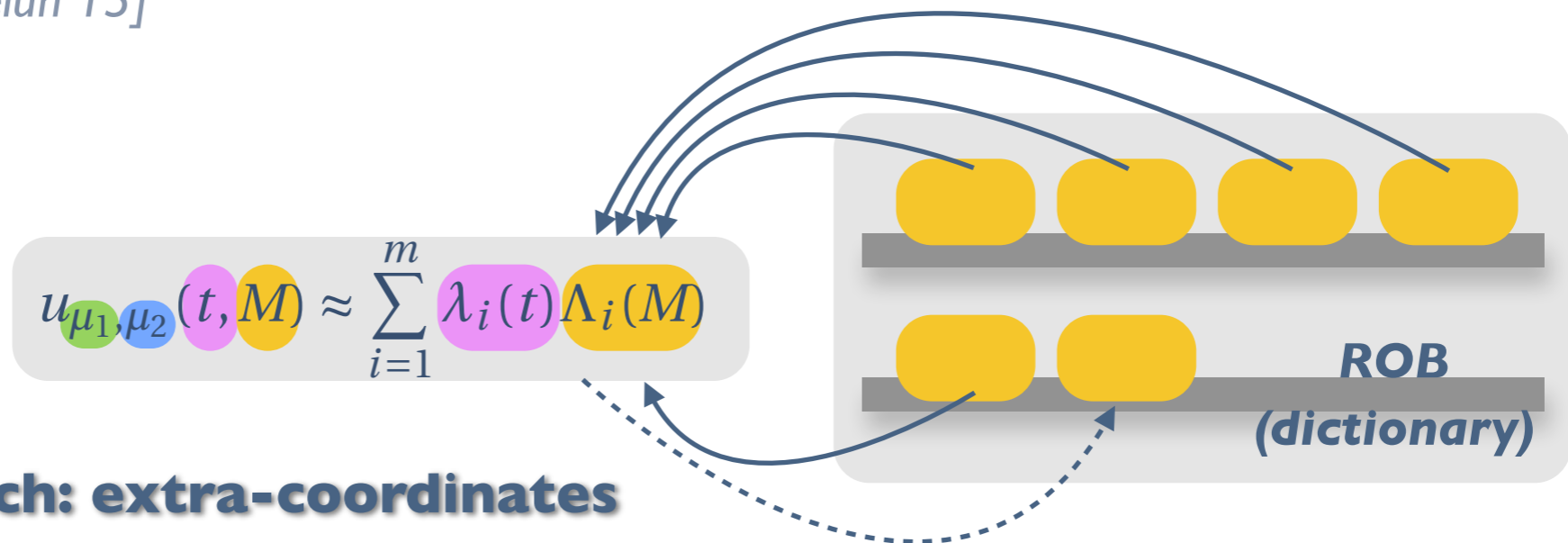
μPDE: $\mathcal{L}(u(t, M), \mu_1, \mu_2) = 0$

■ 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

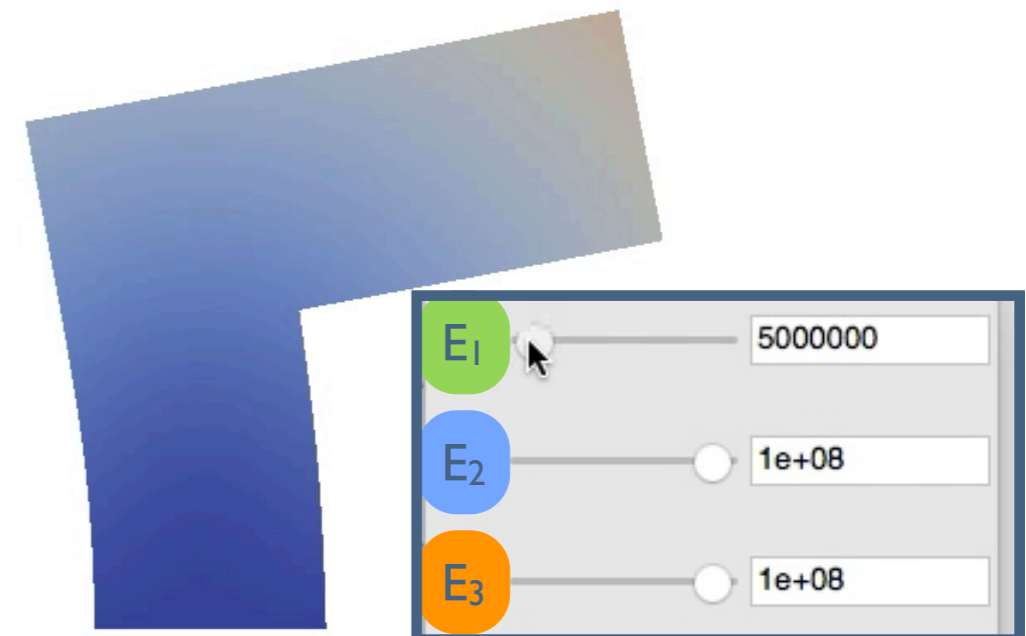
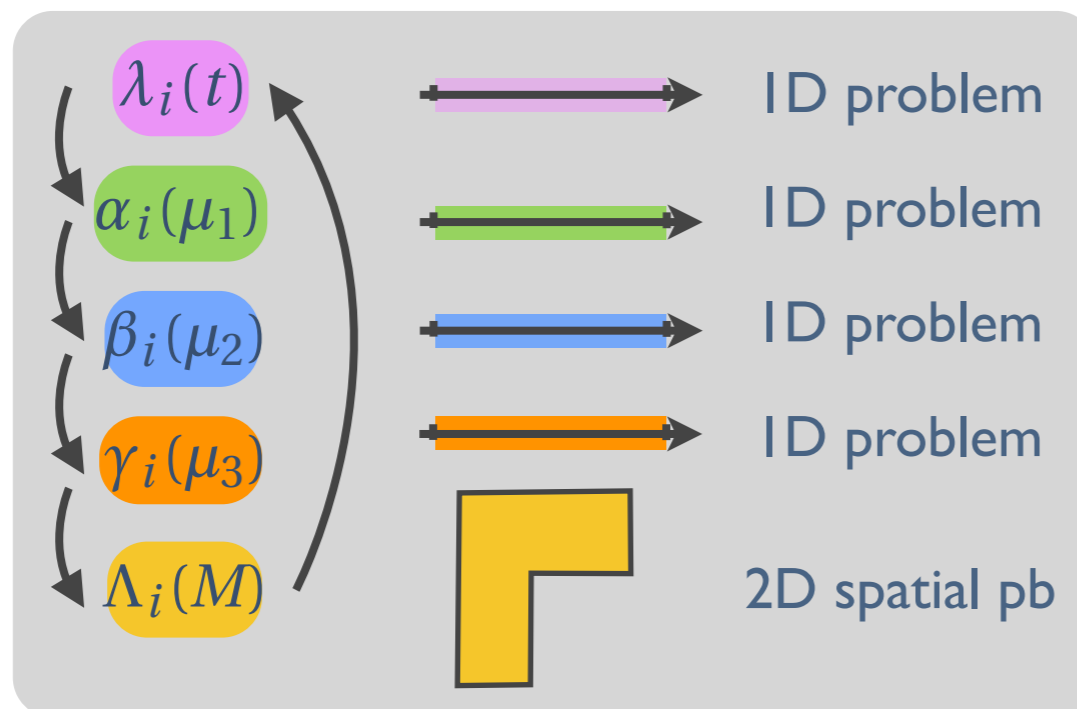
- with 3 Young moduli as parameters



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

■ Separation of variables

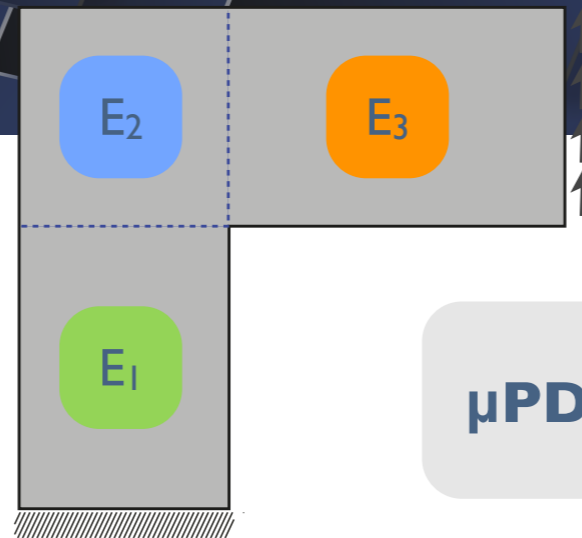
i $u(t, M, \mu_1, \mu_2, \mu_3) \approx \sum_{i=1}^{m'} \lambda_i(t) \Lambda_i(M) \alpha_i(\mu_1) \beta_i(\mu_2) \gamma_i(\mu_3)$



Second approach

■ Parametrized PDE

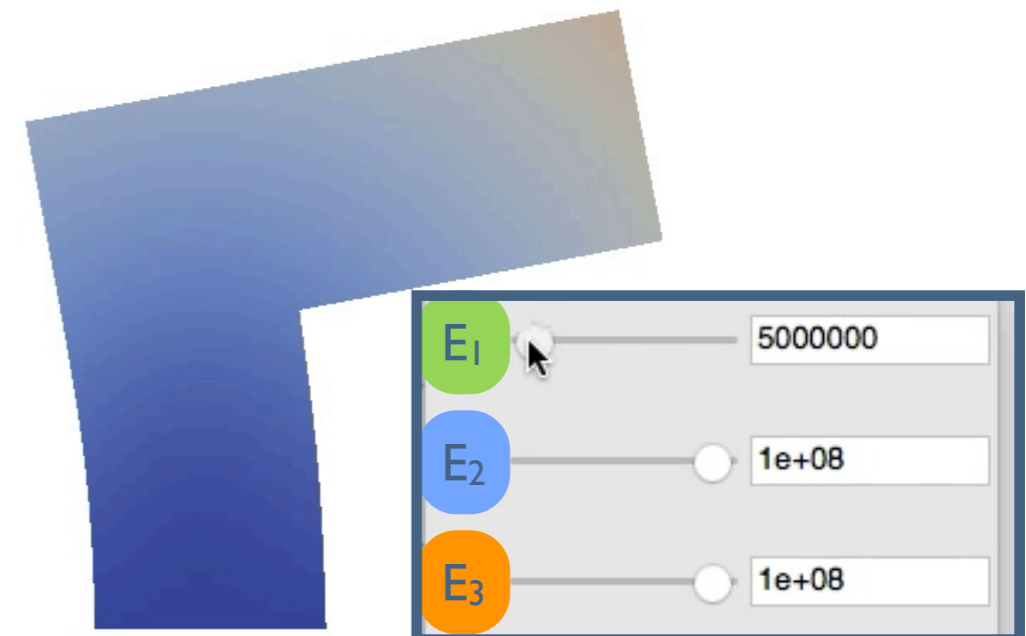
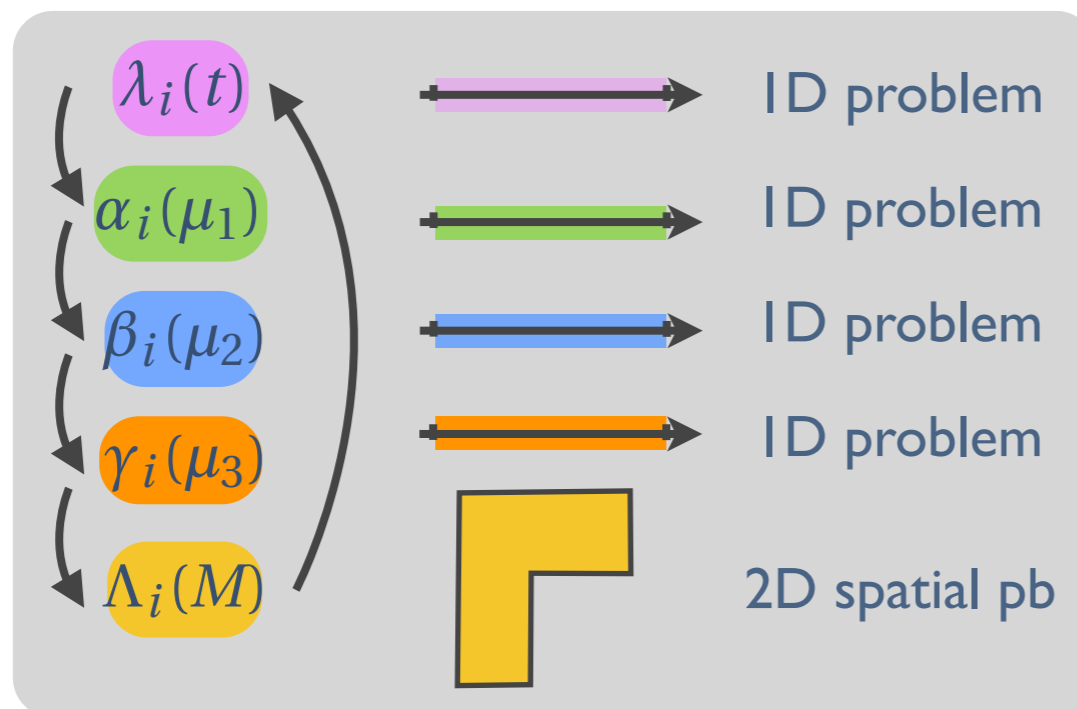
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μPDE: $\mathcal{L}(u(t, M), \mu_1, \mu_2, \mu_3) = 0$

■ Separation of variables

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

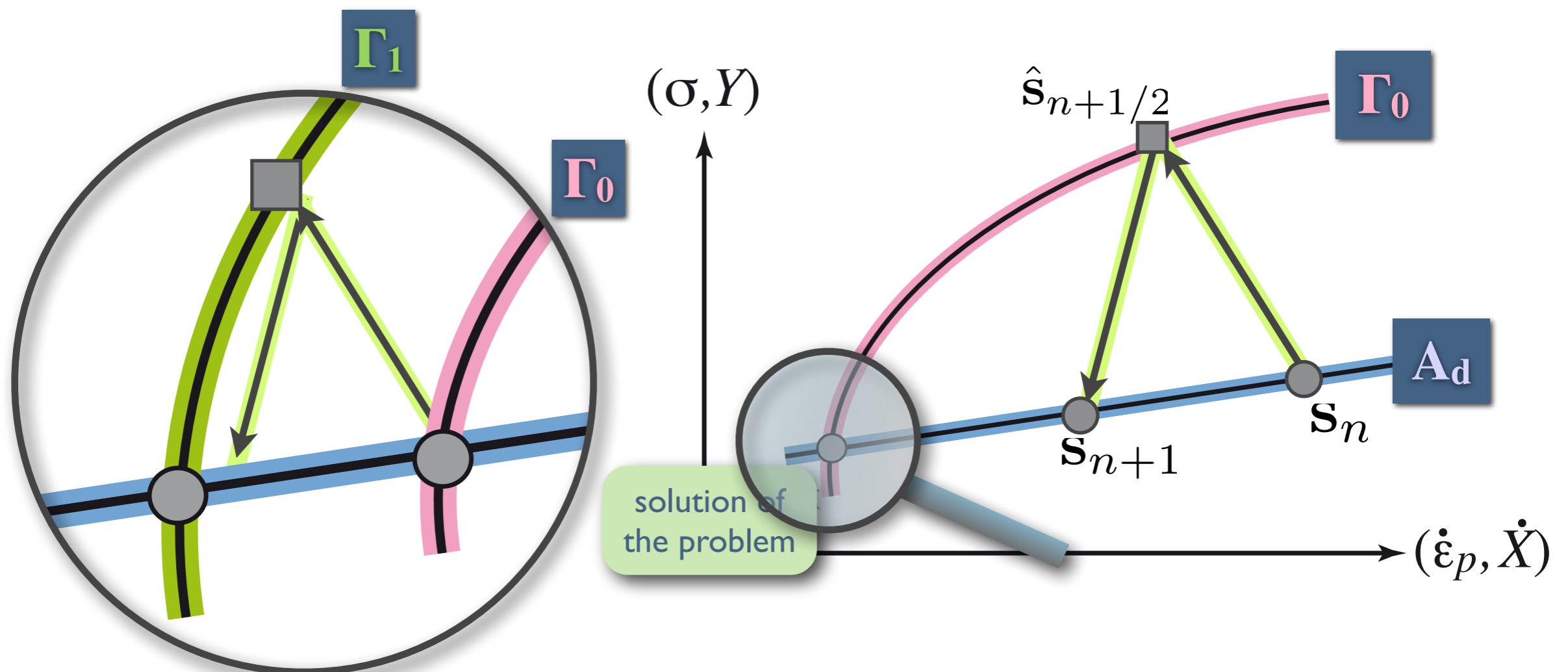


■ Taken into account variability of parameters

- for example: variation of a material parameter of the nonlinear law
- first computation for value k_1 : space Γ_0
- new computation for value k_2 : space Γ_1

➔ reuse of the reduced model obtained from the PGD

➔ addition of new pairs only if needed



Vessel head of nuclear reactor

■ Parametric study

740,000 DOFs
60 time steps

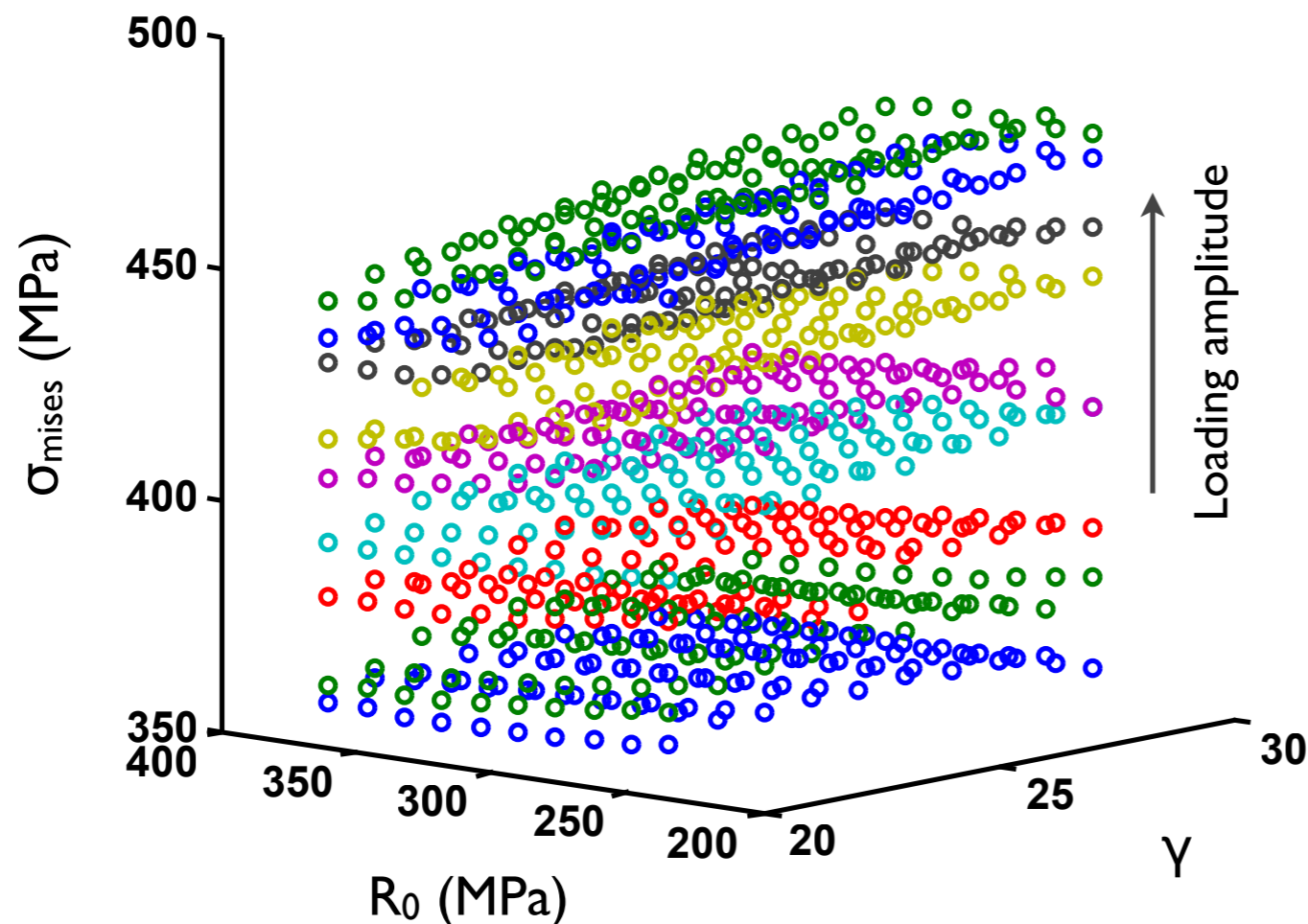
● parameters: loading amplitude and material characteristics (R_0, γ)

● 1,000 sets of parameters (**range of variation $\pm 30\%$**)

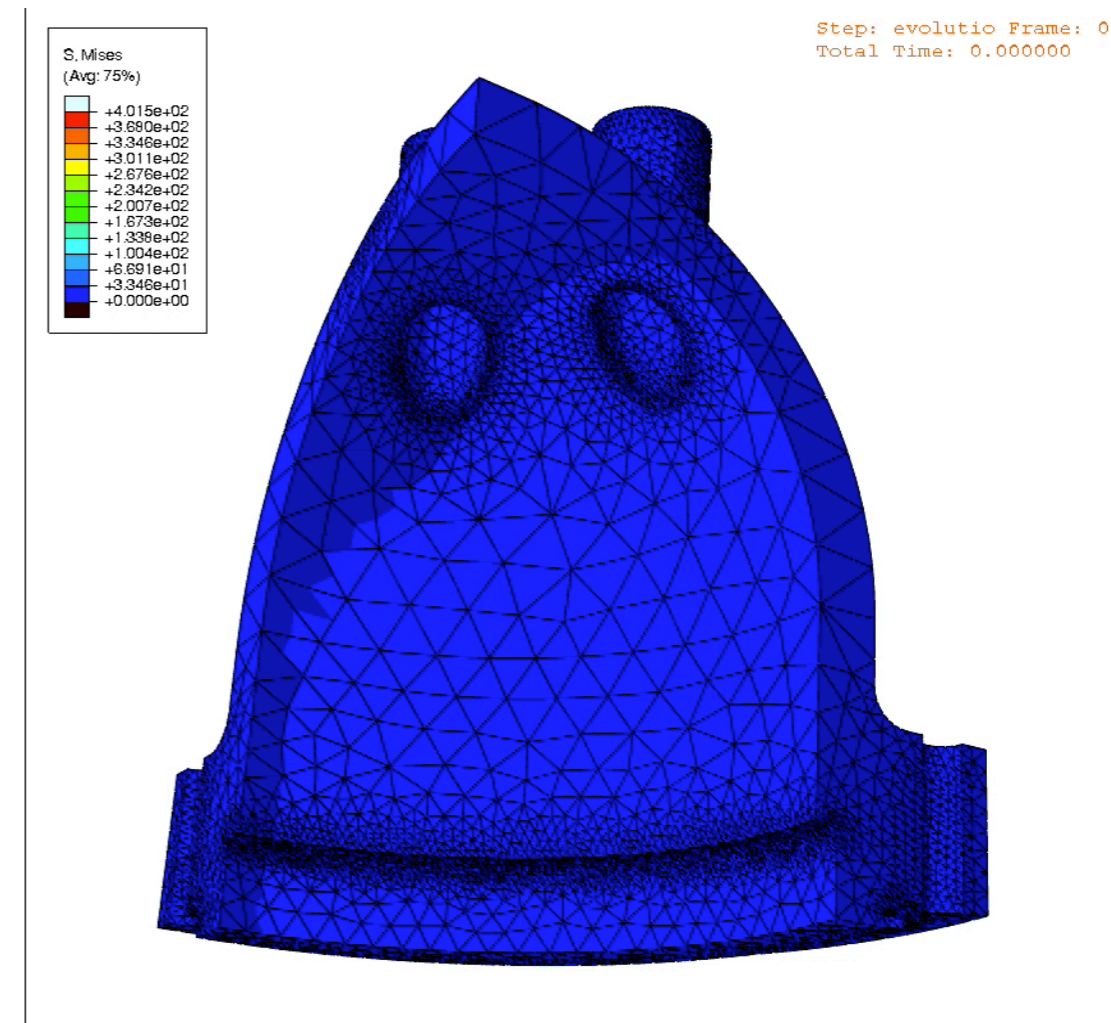
● wallclock time for 1 run: **LATIN (2.5 hours)**

ABAQUS (3.5 hours)

● influence on the maximum value of the σ_{mises}



>35% of variation



Mises stress

Vessel head of nuclear reactor

■ Parametric study

740,000 DOFs
60 time steps

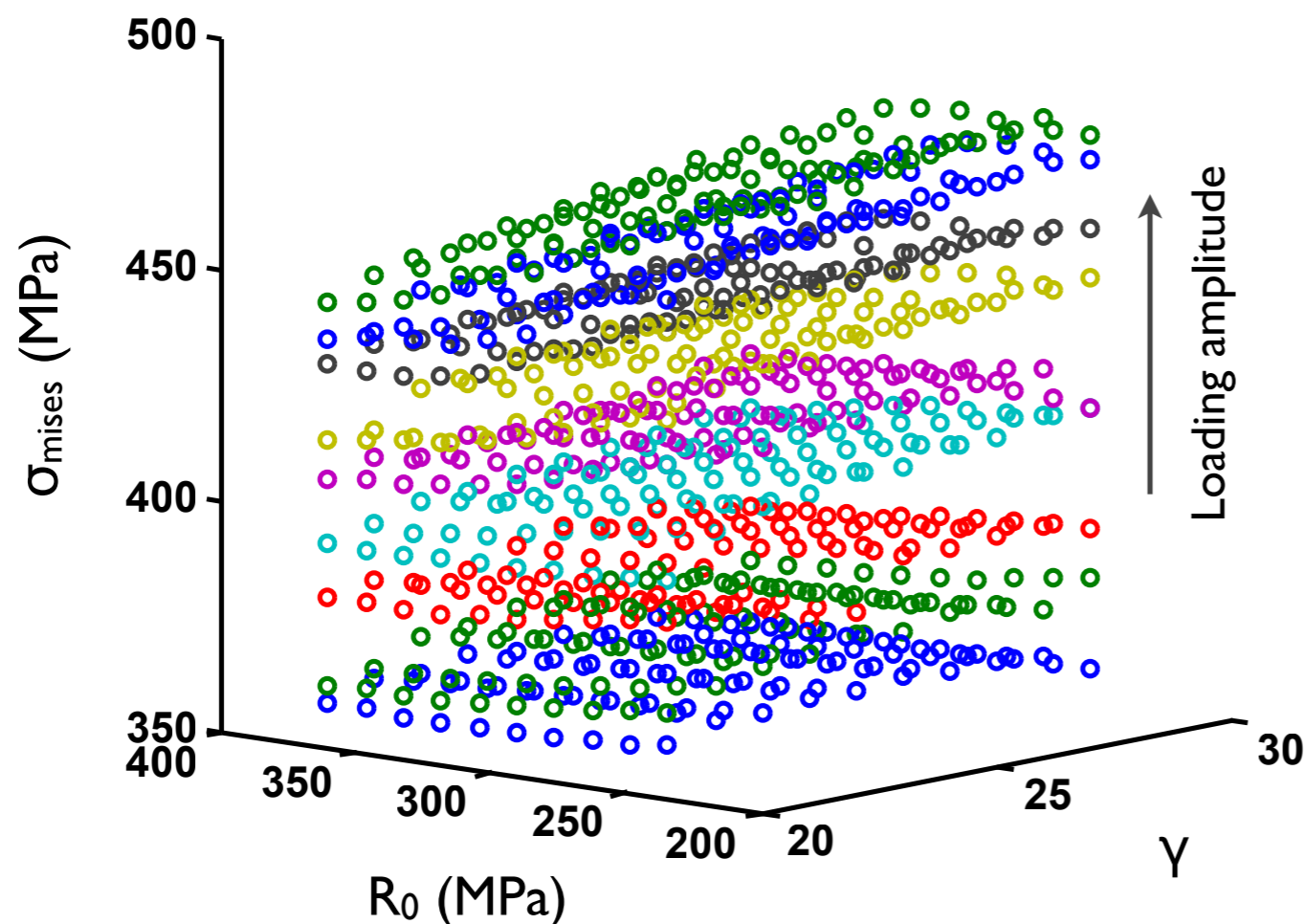
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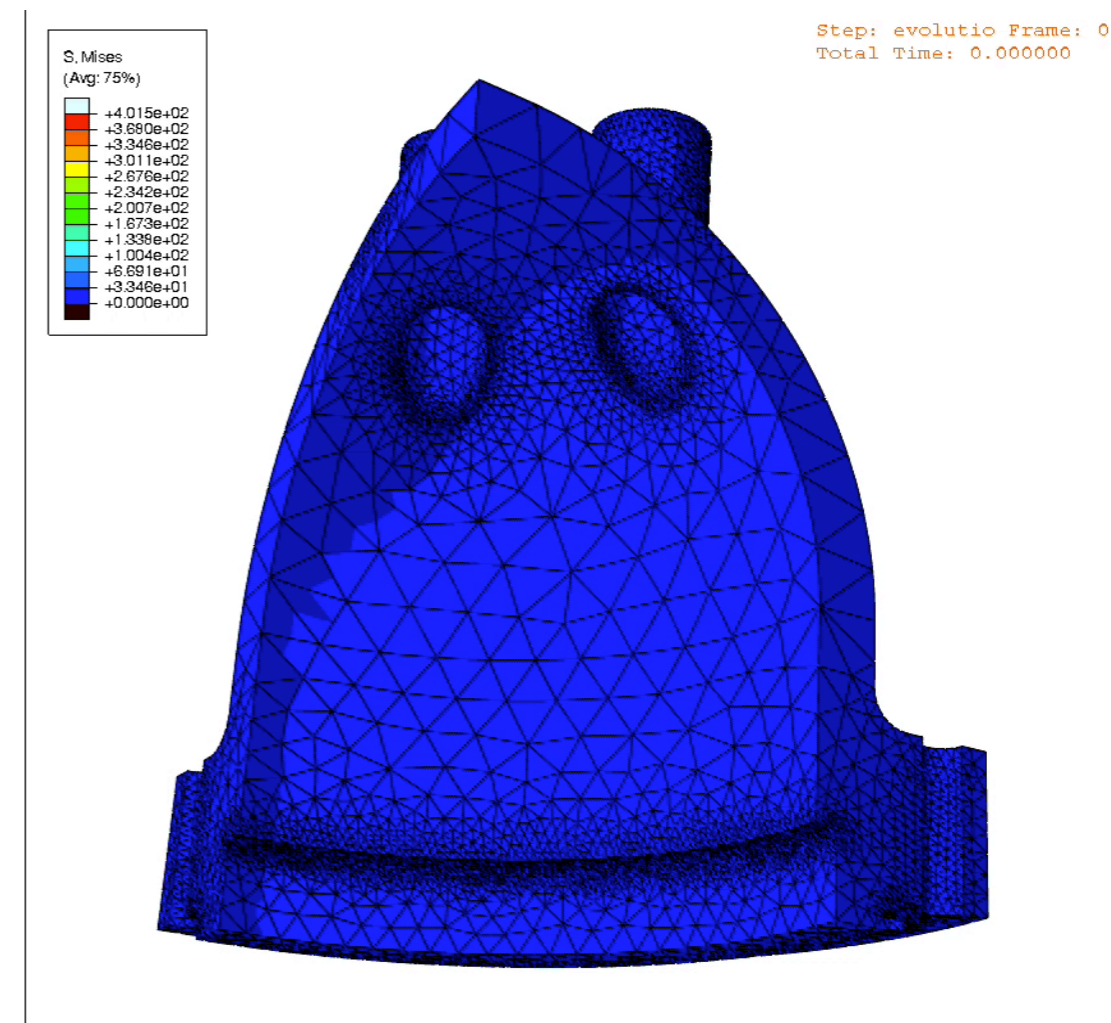
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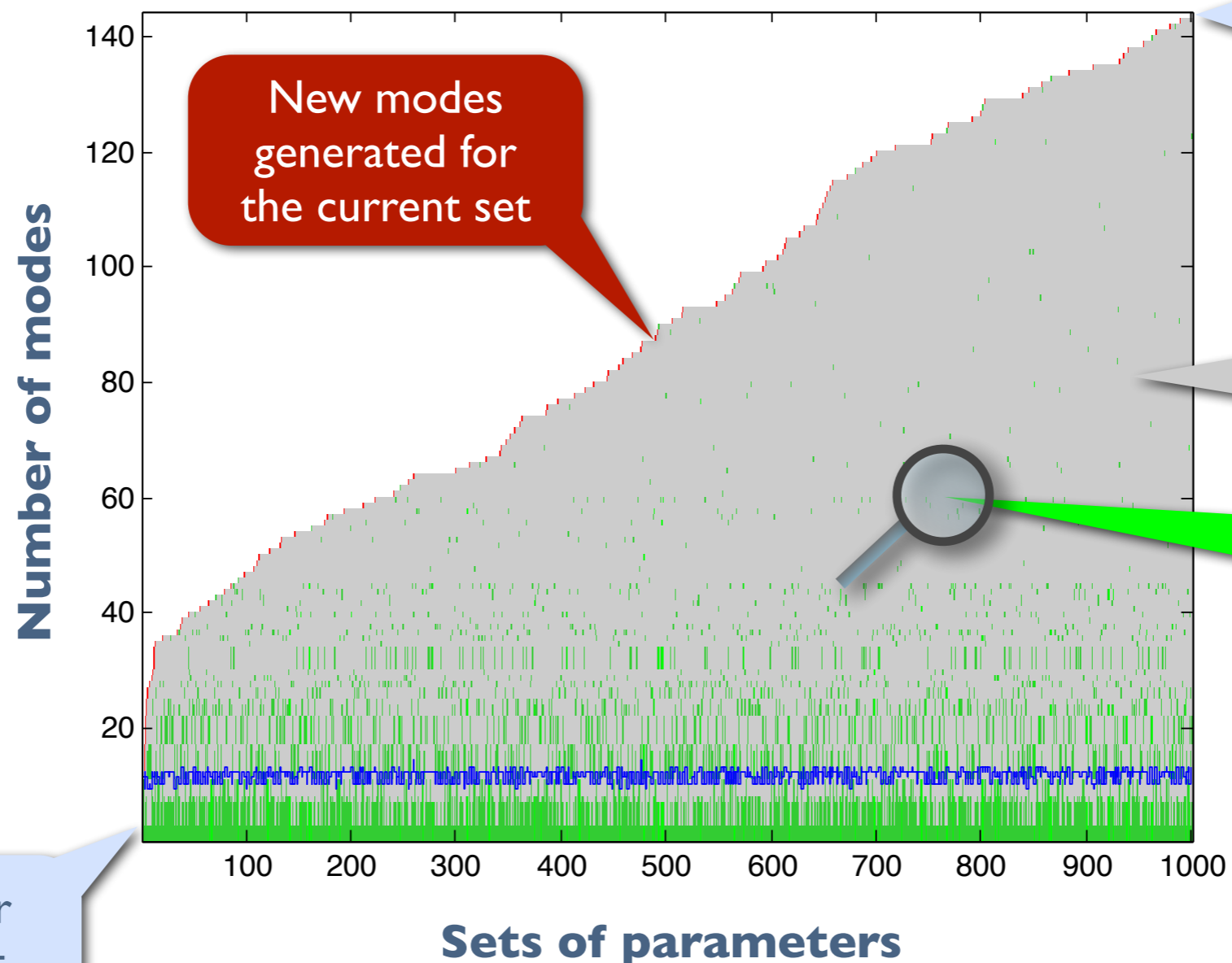


Mises stress

Vessel head of nuclear reactor

■ Parametric study

- parameters: loading amplitude and material characteristics (R_0, γ)
- influence on the maximum value of the σ_{mises}
- 1,000 sets of parameters (**range of variation $\pm 30\%$**)



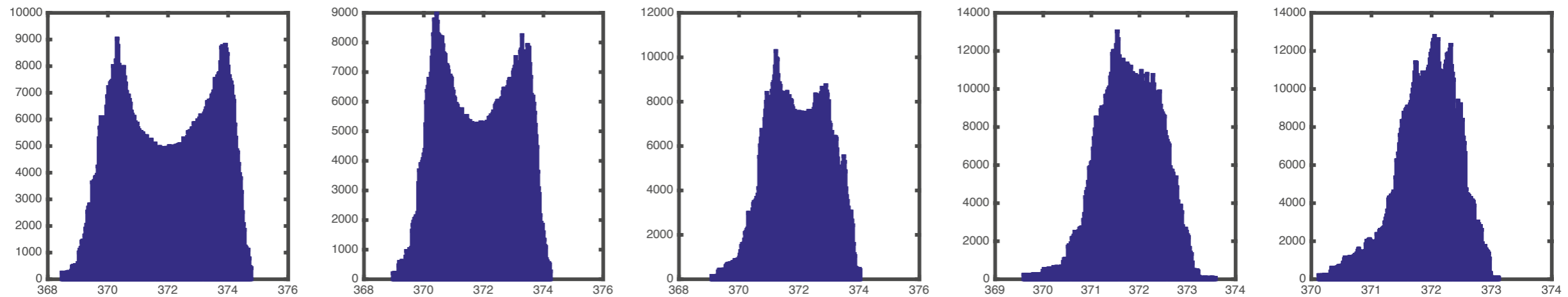
4 months
with ABAQUS

LATIN+PGD
1 week (gain: 12)

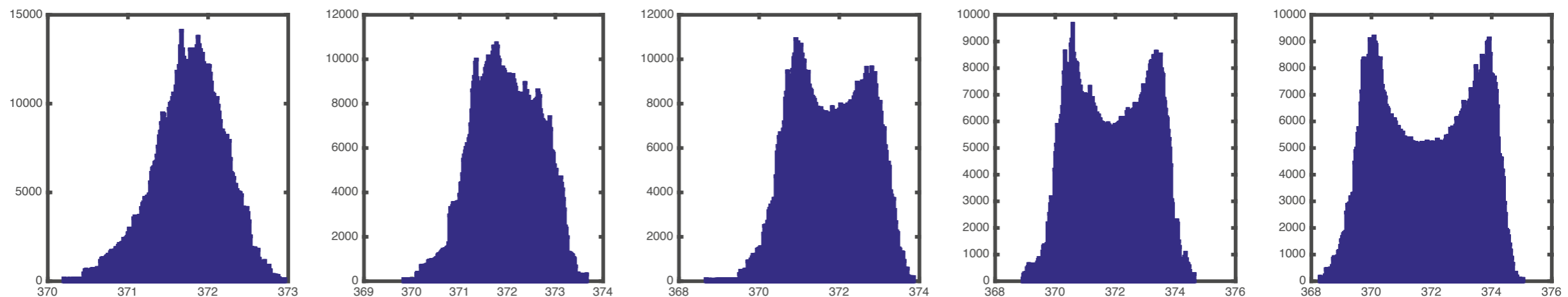
Post-treatment of virtual charts

■ Uncertainties

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



PDFs of the maximum of sigma Mises max

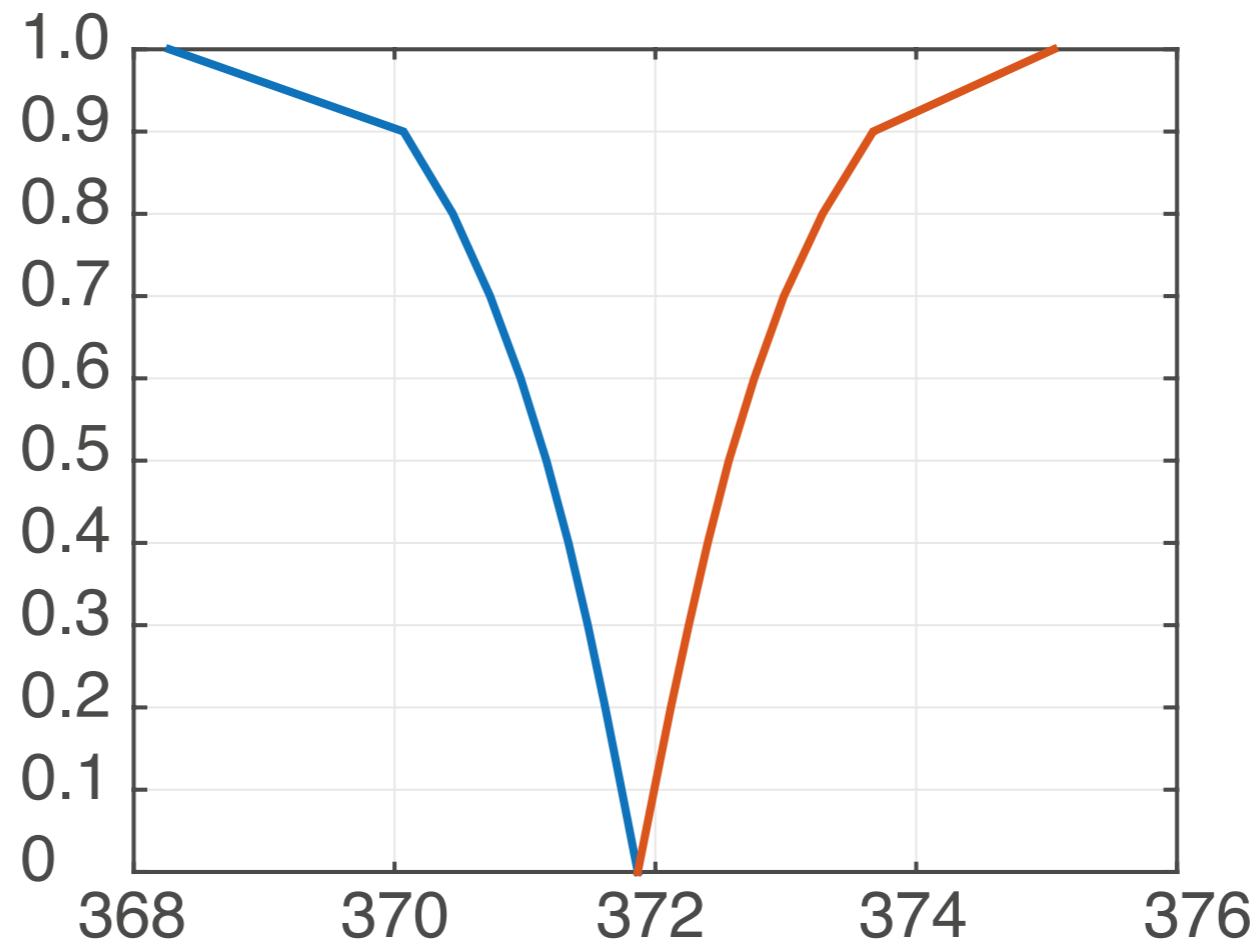


~ 5 s for 10 millions of Monte-Carlo calls

Post-treatment of virtual charts

■ Uncertainties

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

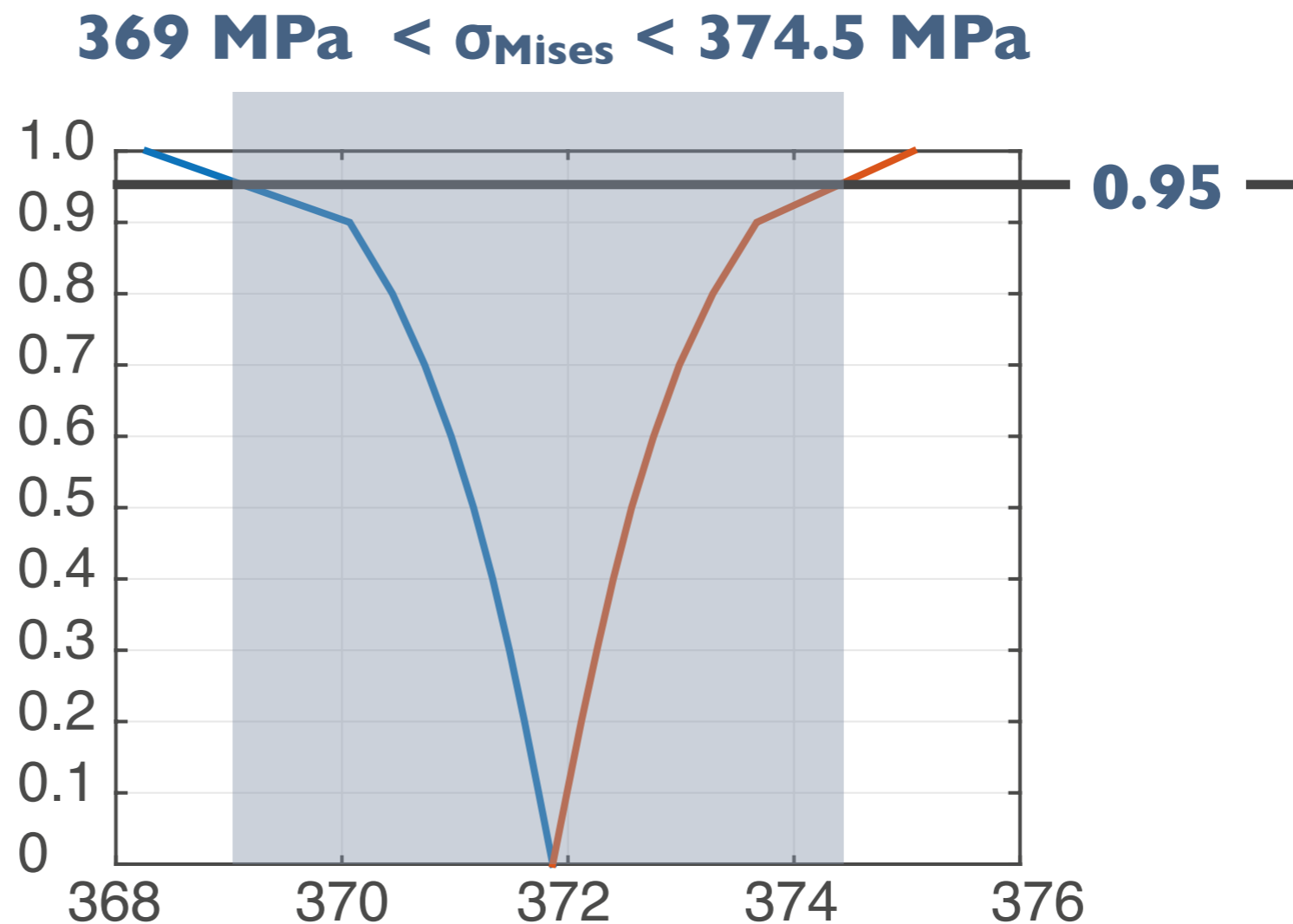


*Interval with stochastic bounds
for the maximum of sigma Mises max*

Post-treatment of virtual charts

■ Uncertainties

- material characteristics (R_0, γ) are **stochastic**
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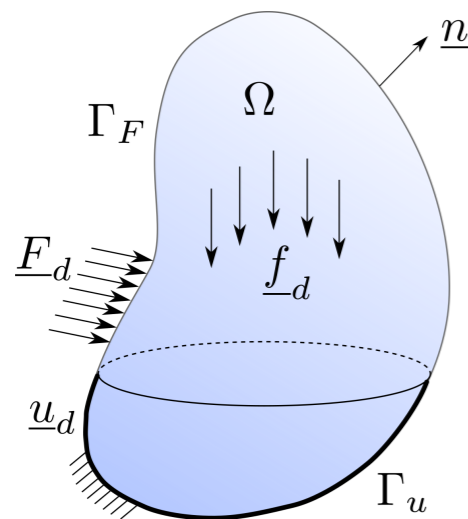


*Interval with stochastic bounds
for the maximum of sigma Mises max*

Outline

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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

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

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

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

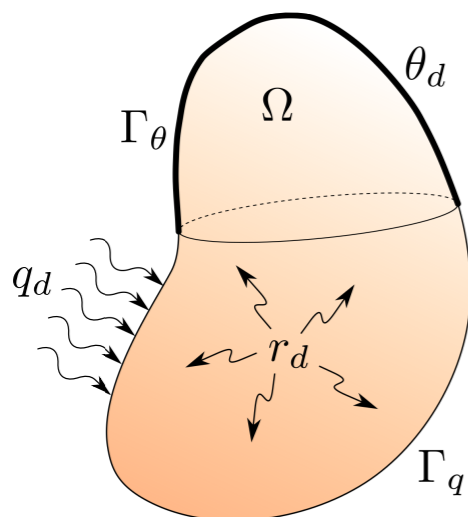
Strongly coupled constitutive equations

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

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

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

$$r_m = T_0 \beta \text{Tr } \dot{\underline{\varepsilon}}$$



Thermal equilibrium

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

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

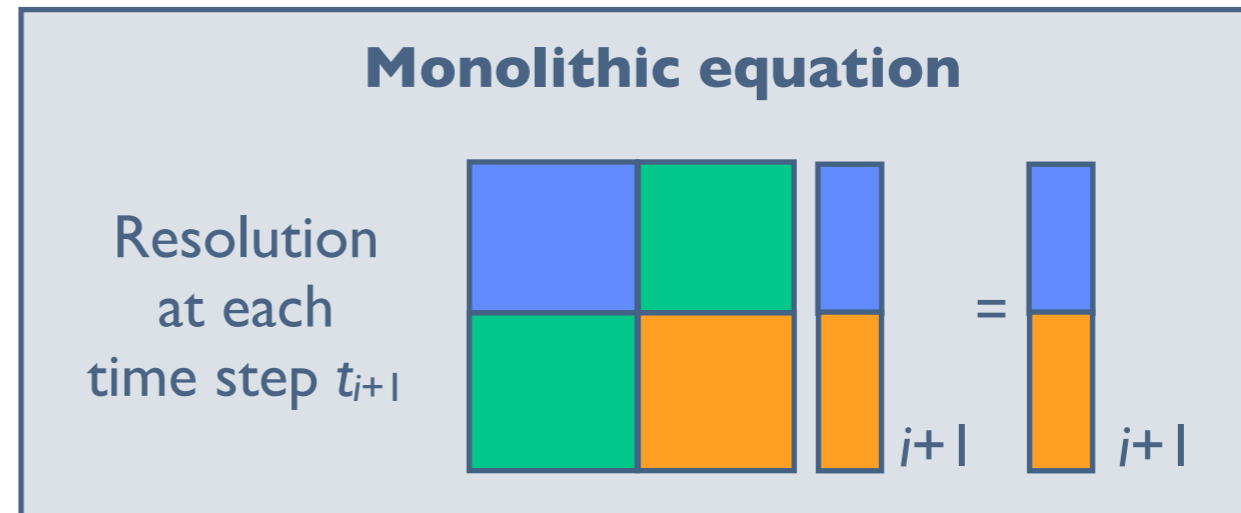
$$\underline{x} = \nabla \theta \quad \text{in } \Omega$$

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

■ Monolithic coupled resolution

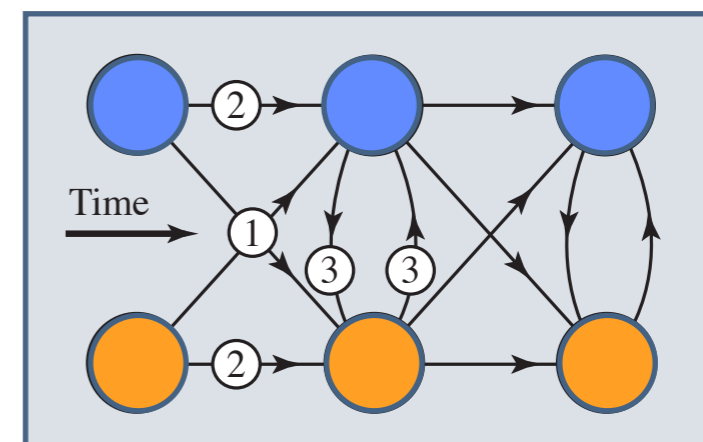
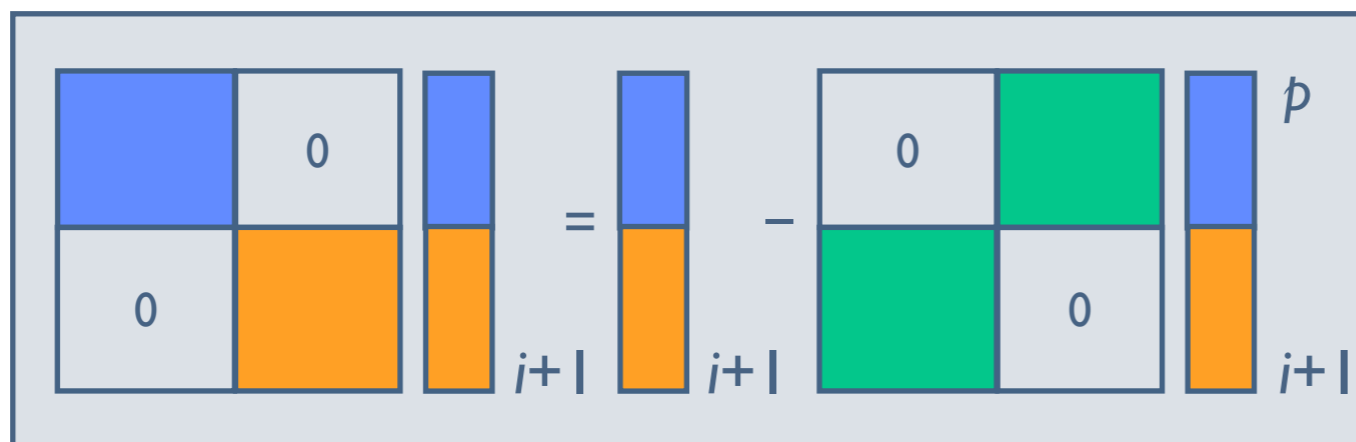
- direct resolution of the system: a priori CPU expensive

Mechanical equilibrium	
• Stress equilibrium	$\nabla \cdot \underline{\sigma} + \underline{f}_d = \underline{0}$ in Ω
• Strain compatibility	$\underline{\varepsilon} = \frac{1}{2}(\nabla \underline{u} + {}^T \nabla \underline{u})$ in Ω
• Boundary conditions	$\underline{u} = \underline{u}_d$ on Γ_u and $\underline{\sigma} \underline{n} = \underline{F}_d$ on Γ_F
Strongly coupled constitutive equations	
• Hooke's law	$\underline{\sigma} = \underline{\mathcal{K}} : \underline{\varepsilon} - \beta \theta \underline{I}$
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• Mechanical heat source	$r_m = T_0 \beta \text{Tr} \dot{\underline{\varepsilon}}$
Thermal equilibrium	
• Heat equation	$\rho c \dot{\theta} + r_m = -\nabla \cdot \underline{q} + r_d$ in Ω
• Temp. grad. compatibility	$\underline{x} = \nabla \theta$ in Ω
• Boundary conditions	$\theta = \theta_d$ on Γ_θ and $\underline{q} \cdot \underline{n} = q_d$ on Γ_q



■ Partitioned procedures

- decoupled resolution of the physics [Felippa and Park 80, Belytschko and Hughes 83, Shreffler *et al.* 87, Zienkiewicz *et al.* 88, Farhat *et al.* 95, Morand and Ohayon 95, Lewis and Schreffler 98, ...]



■ Natural separation of the equations

linear decoupled
but
global-in-space

Mechanical equilibrium

- Stress equilibrium $\nabla \cdot \underline{\sigma} + \underline{f}_d = \underline{0}$ in Ω
- Strain compatibility $\underline{\varepsilon} = \frac{1}{2}(\nabla \underline{u} + {}^T \nabla \underline{u})$ in Ω
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Thermal equilibrium

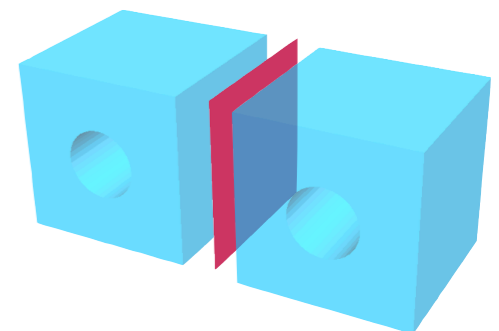
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linear decoupled
but
global-in-space

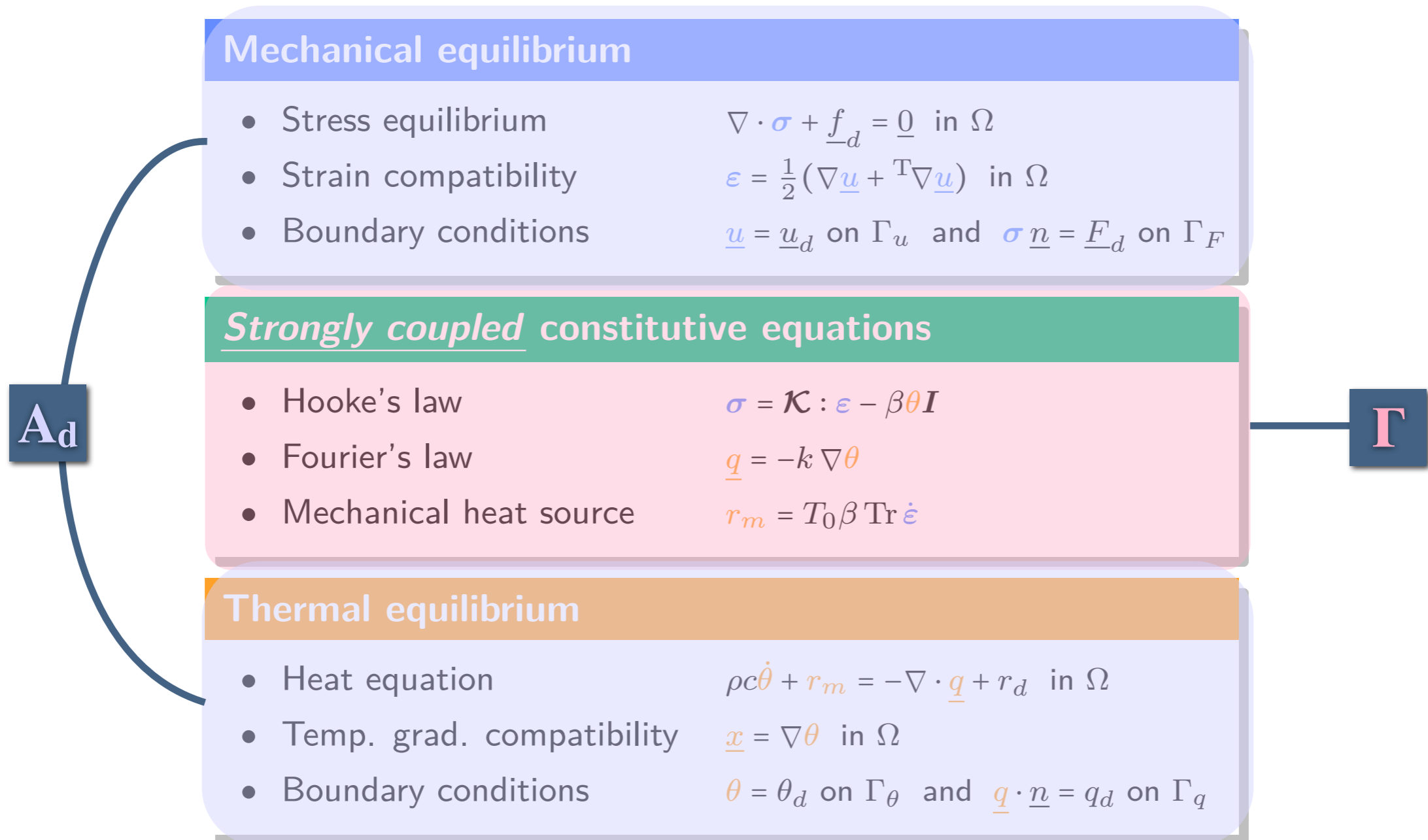
**Interface
between
physics**

local in space
but
coupled

similar to



■ Natural separation of the equations



LATIN framework

Mechanical equilibrium

- Stress equilibrium $\nabla \cdot \underline{\sigma} + \underline{f}_d = \underline{0}$ in Ω
- Strain compatibility $\underline{\epsilon} = \frac{1}{2}(\nabla \underline{u} + {}^T \nabla \underline{u})$ in Ω
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Strongly coupled constitutive equations

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Thermal equilibrium

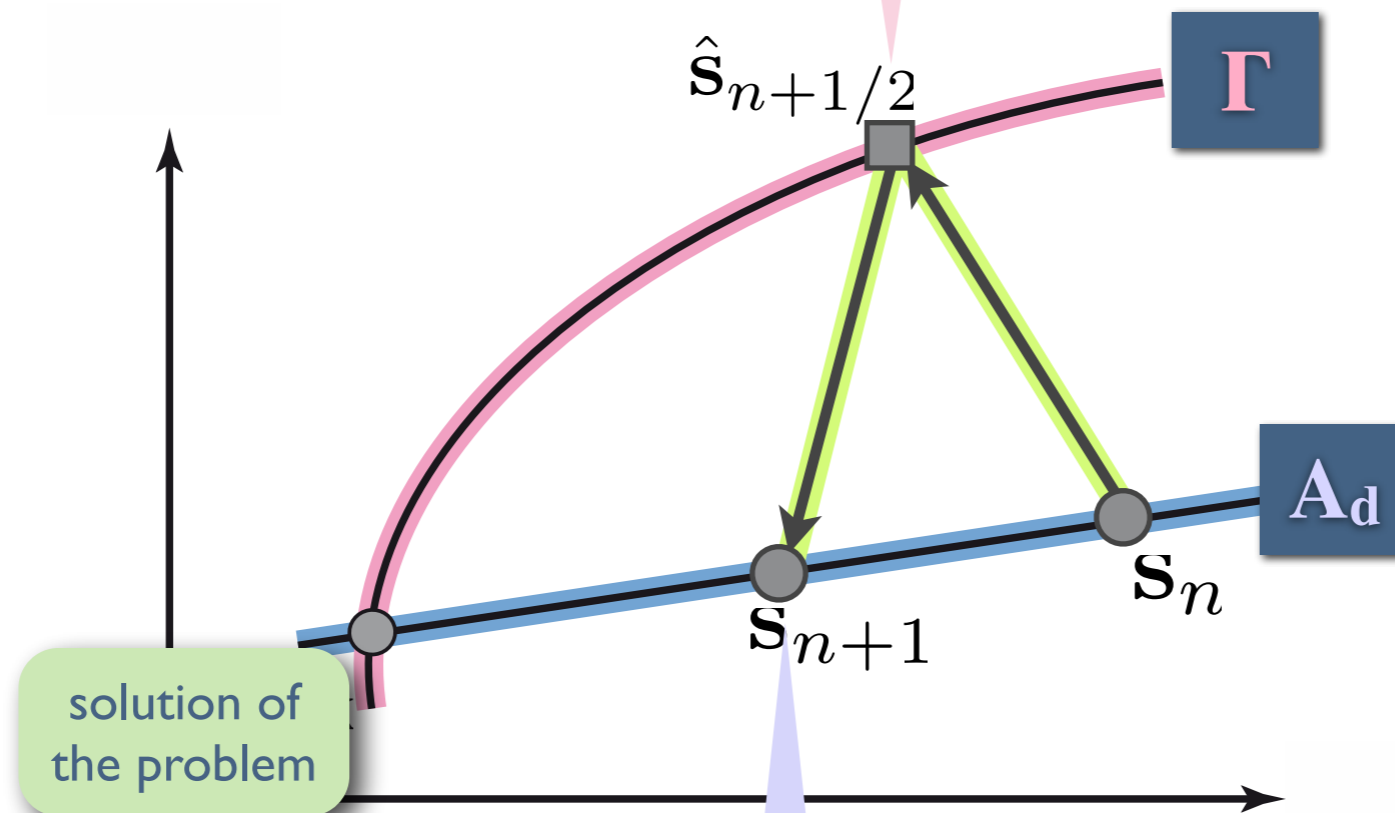
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A_d

Γ

Interface behavior

Search direction



Mechanical adm.

Thermal adm.

Search direction

Mechanical equilibrium

- Stress equilibrium $\nabla \cdot \underline{\sigma} + \underline{f}_d = \underline{0}$ in Ω
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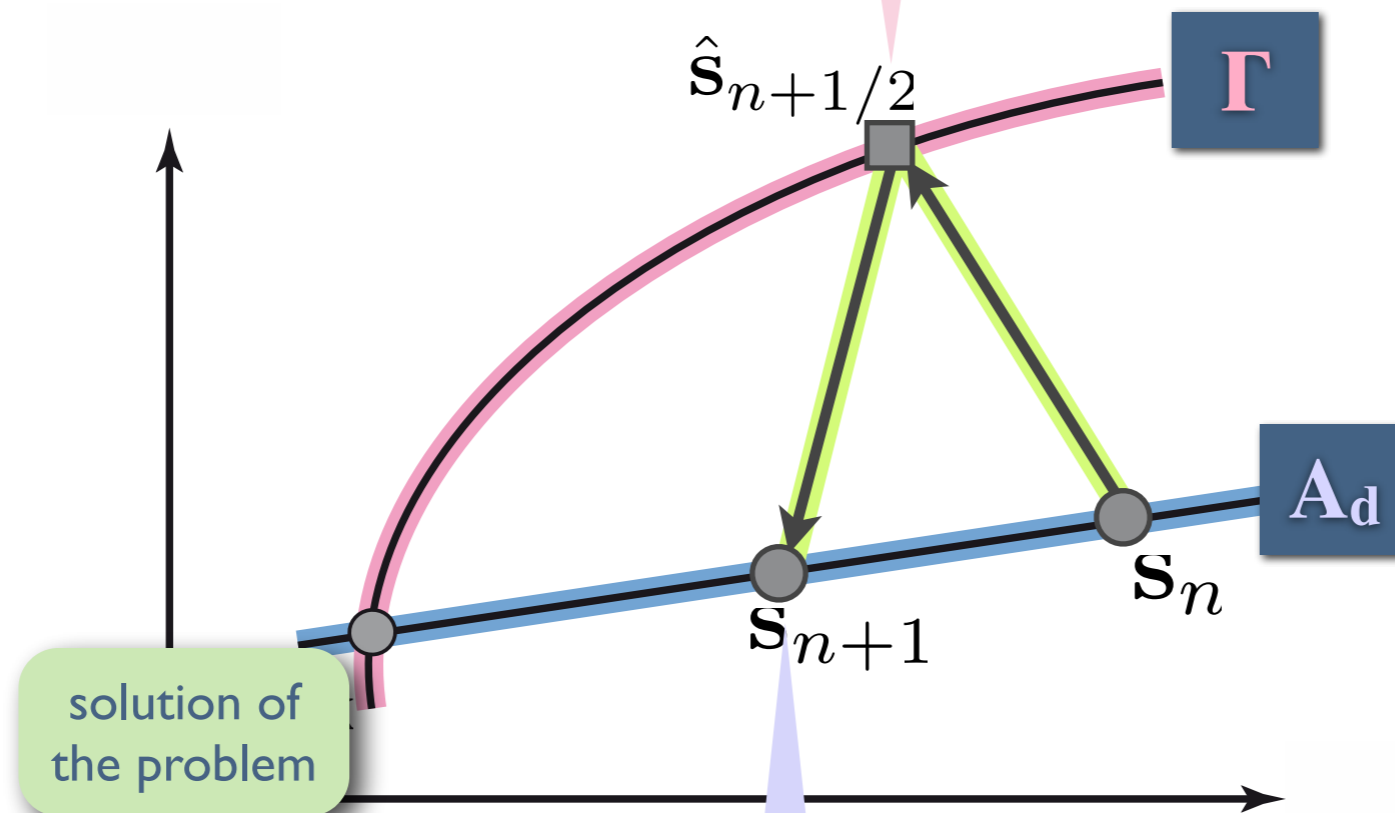
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Thermal equilibrium

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Coupled but local-in-space
« interface »



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

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

Turbine blade

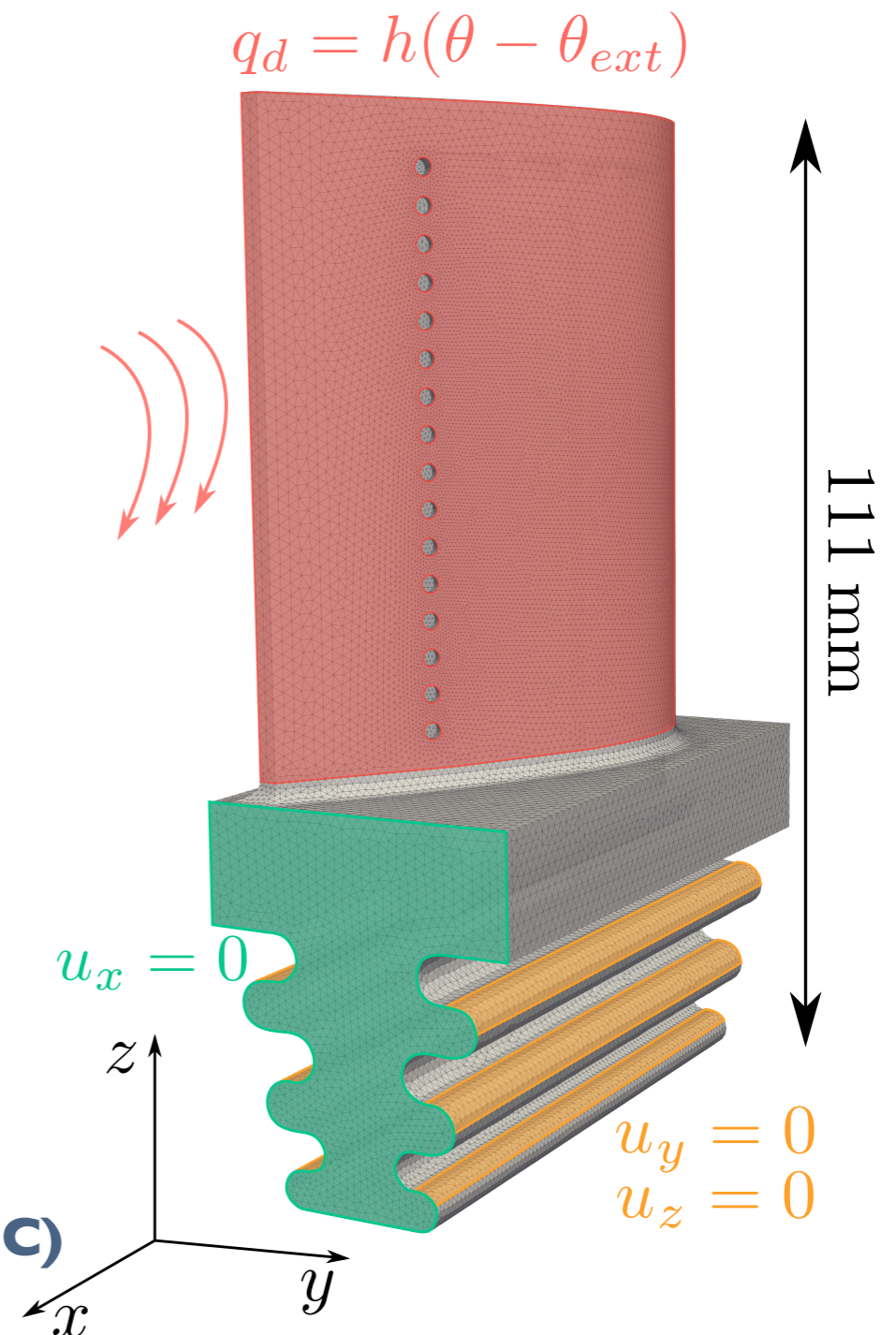


■ Number of DOFs

- 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)



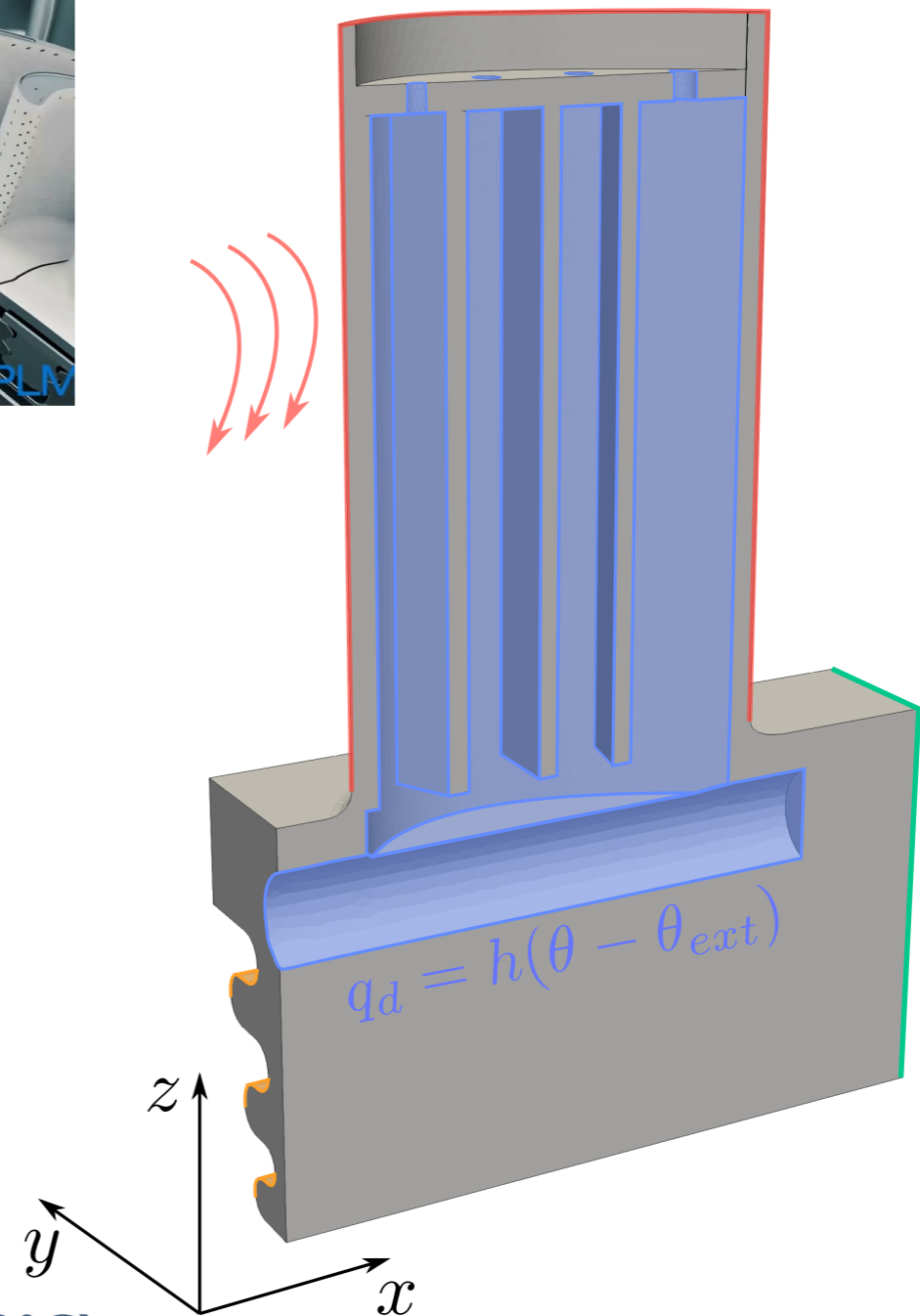


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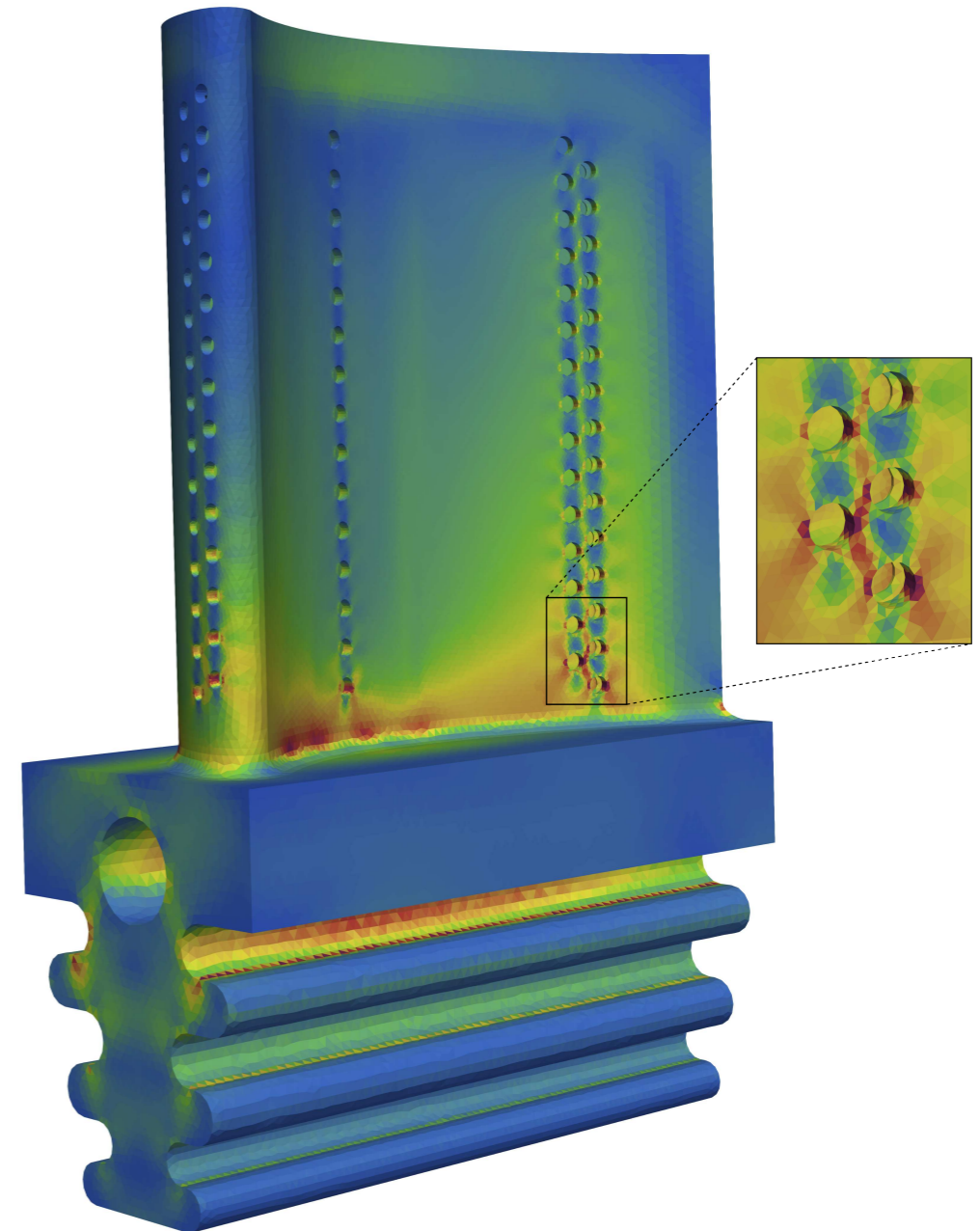
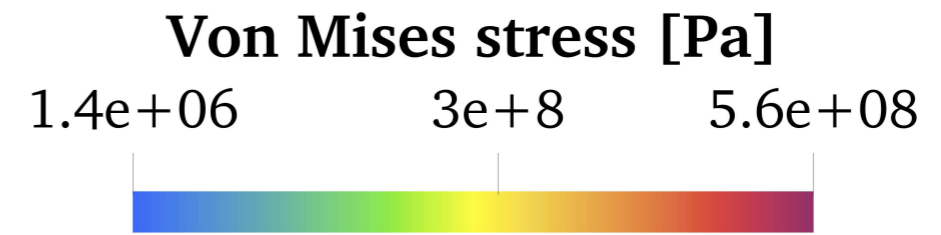
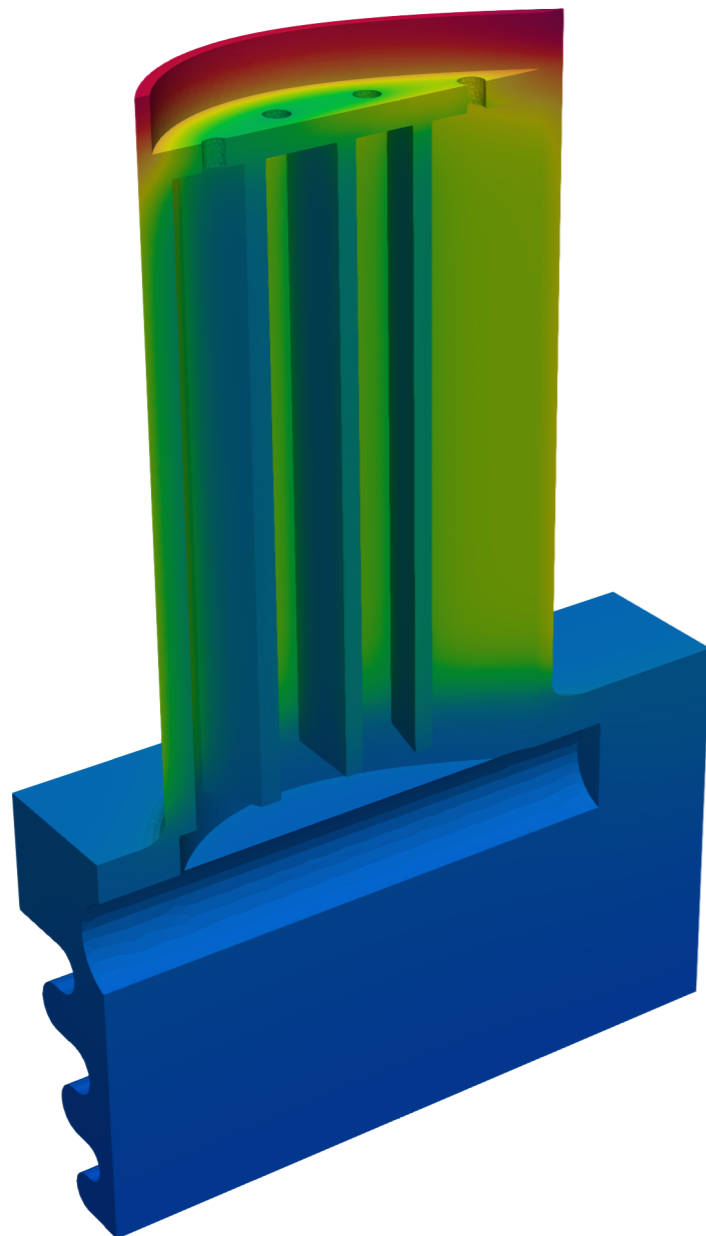
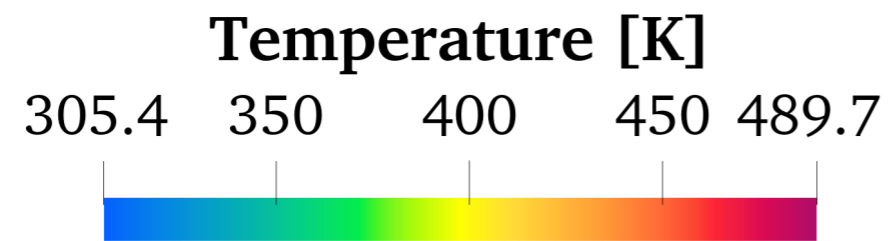
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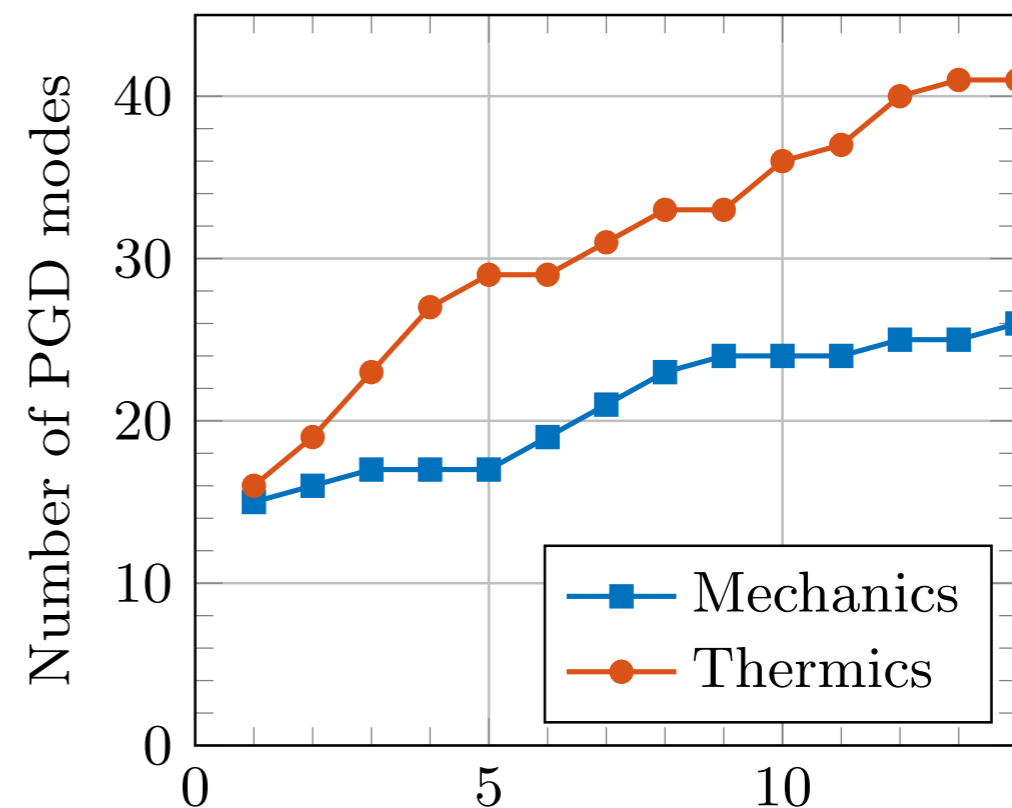
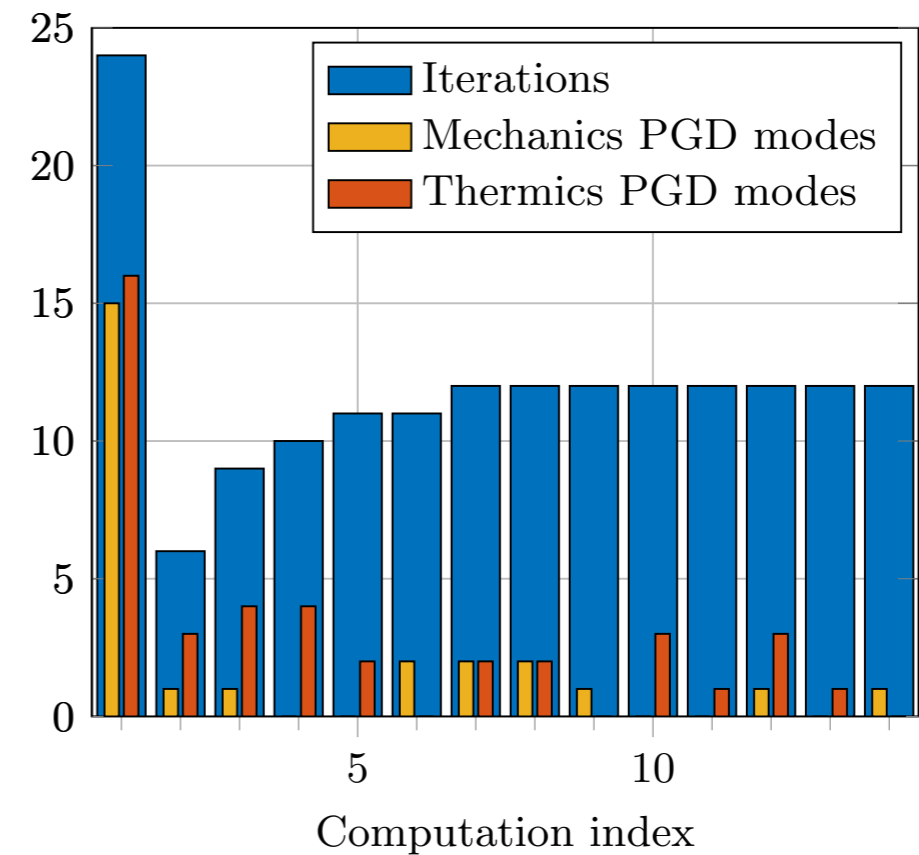
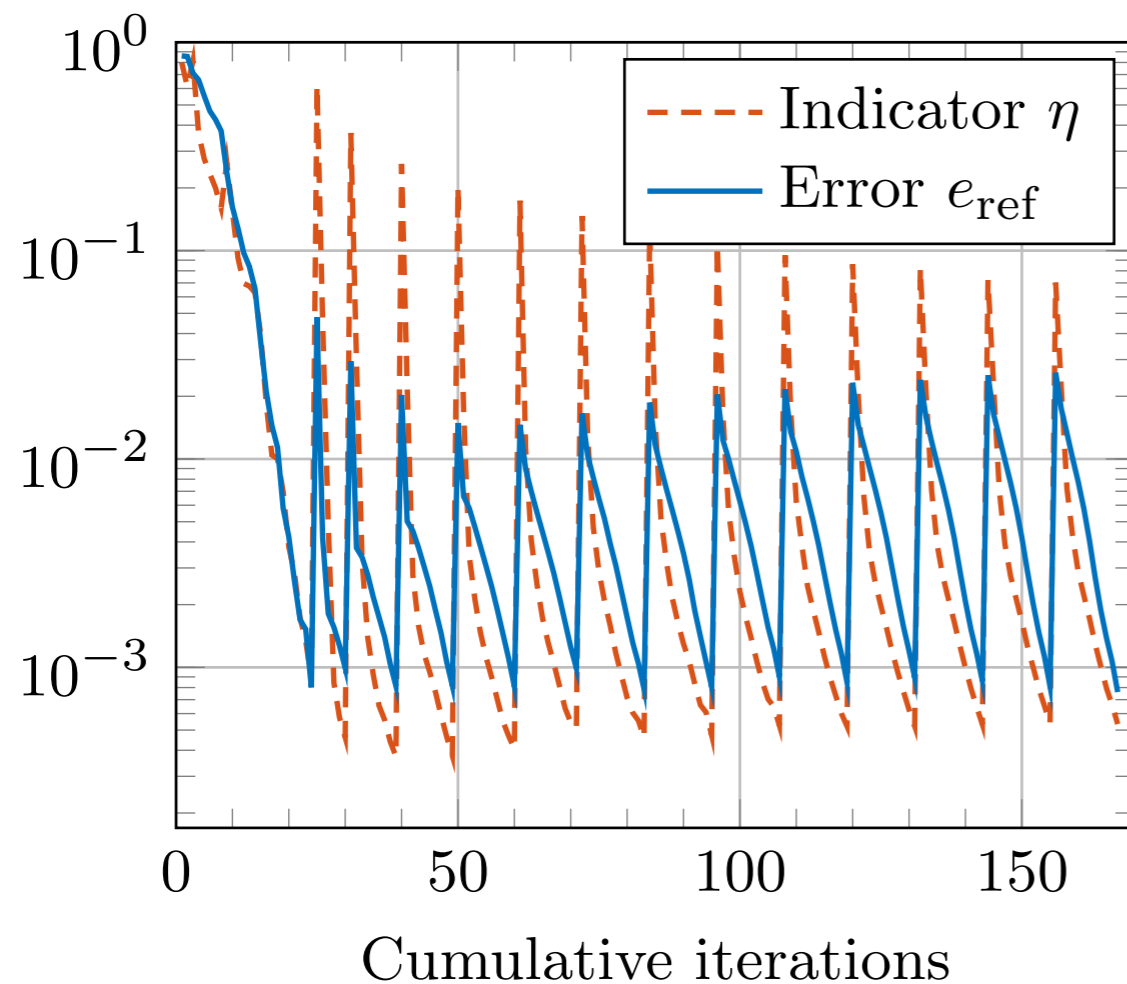


Turbine blade



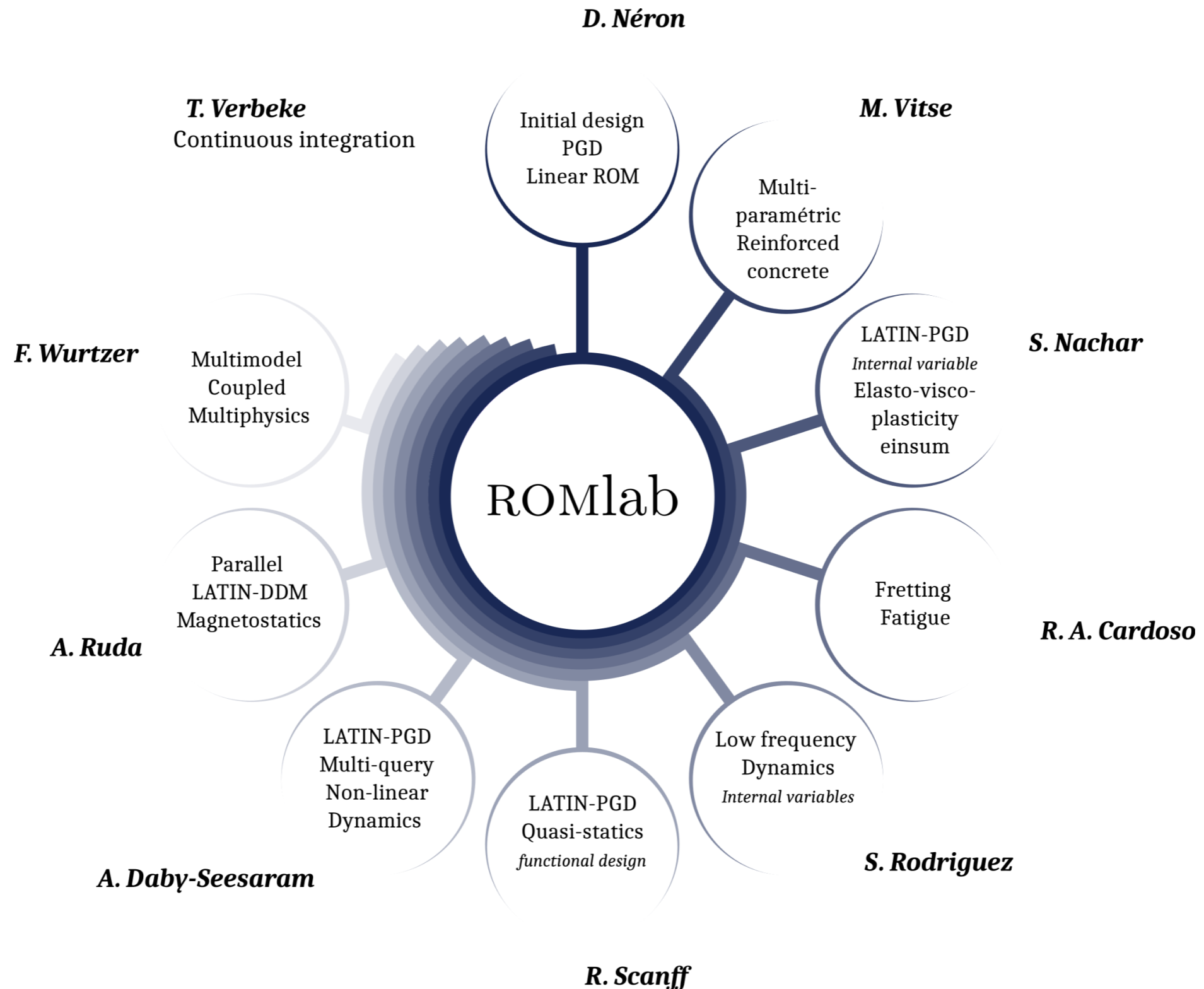
■ Parametric study

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



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Implementation



■ 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