

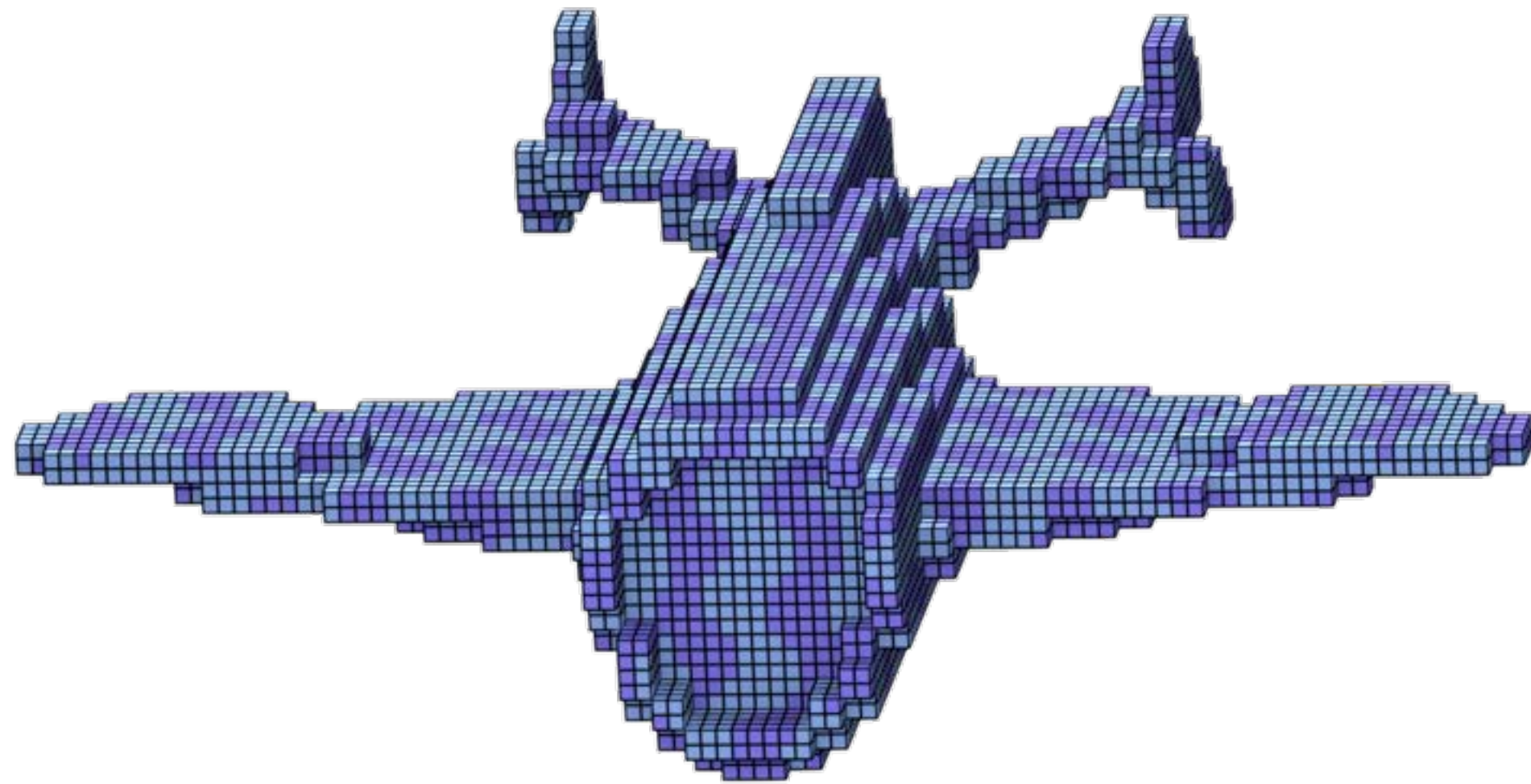
# Numerical Coarsening using Discontinuous Shape Functions

*Jiong Chen<sup>1</sup>, Hujun Bao<sup>1</sup>, Tianyu Wang<sup>1</sup>, Mathieu Desbrun<sup>2</sup>, Jin Huang<sup>1</sup>*

*<sup>1</sup> State Key Lab of CAD&CG, Zhejiang University <sup>2</sup> Caltech*

# Challenge

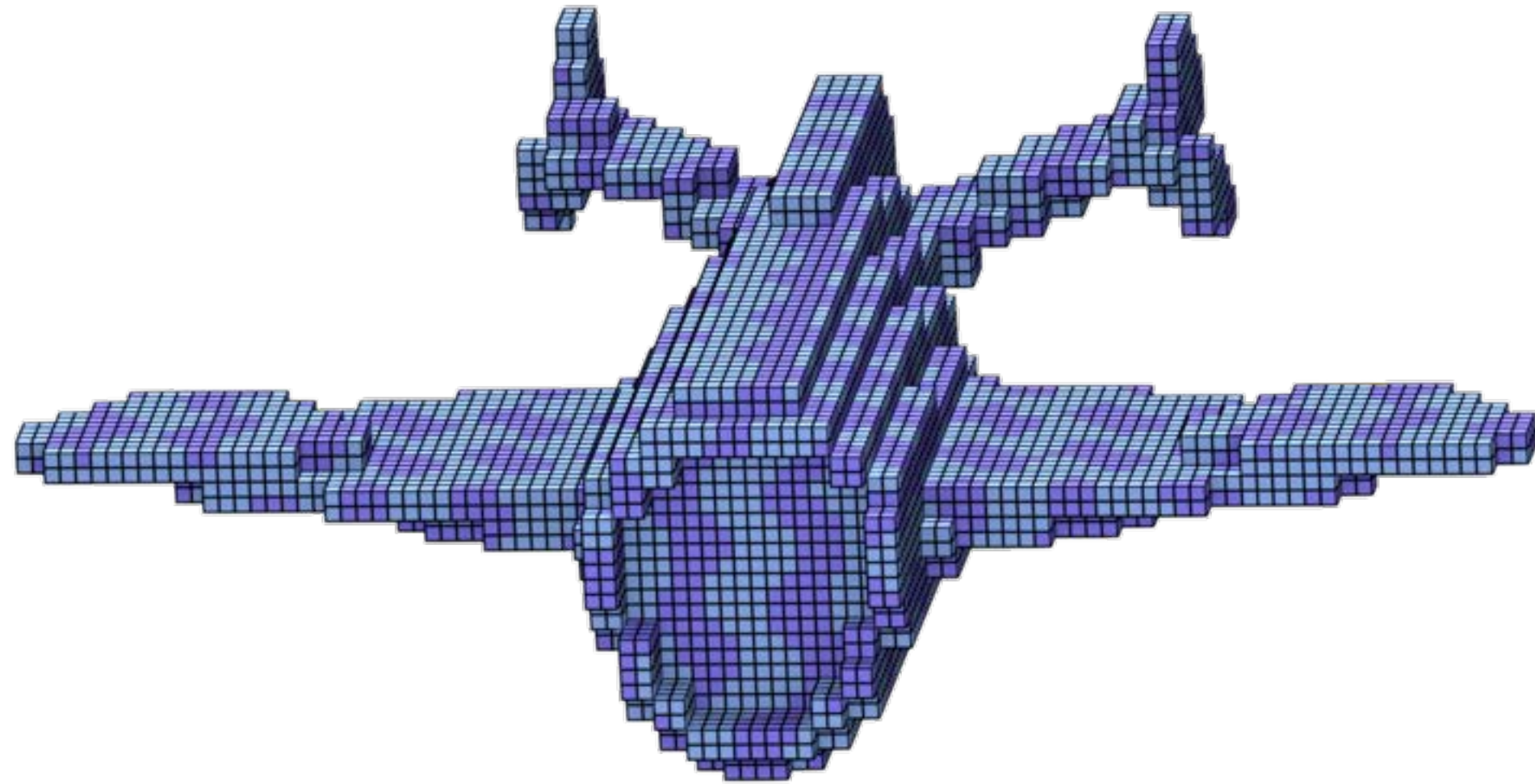
# Challenge



**Inhomogeneous**

**nonlinear**

# Challenge



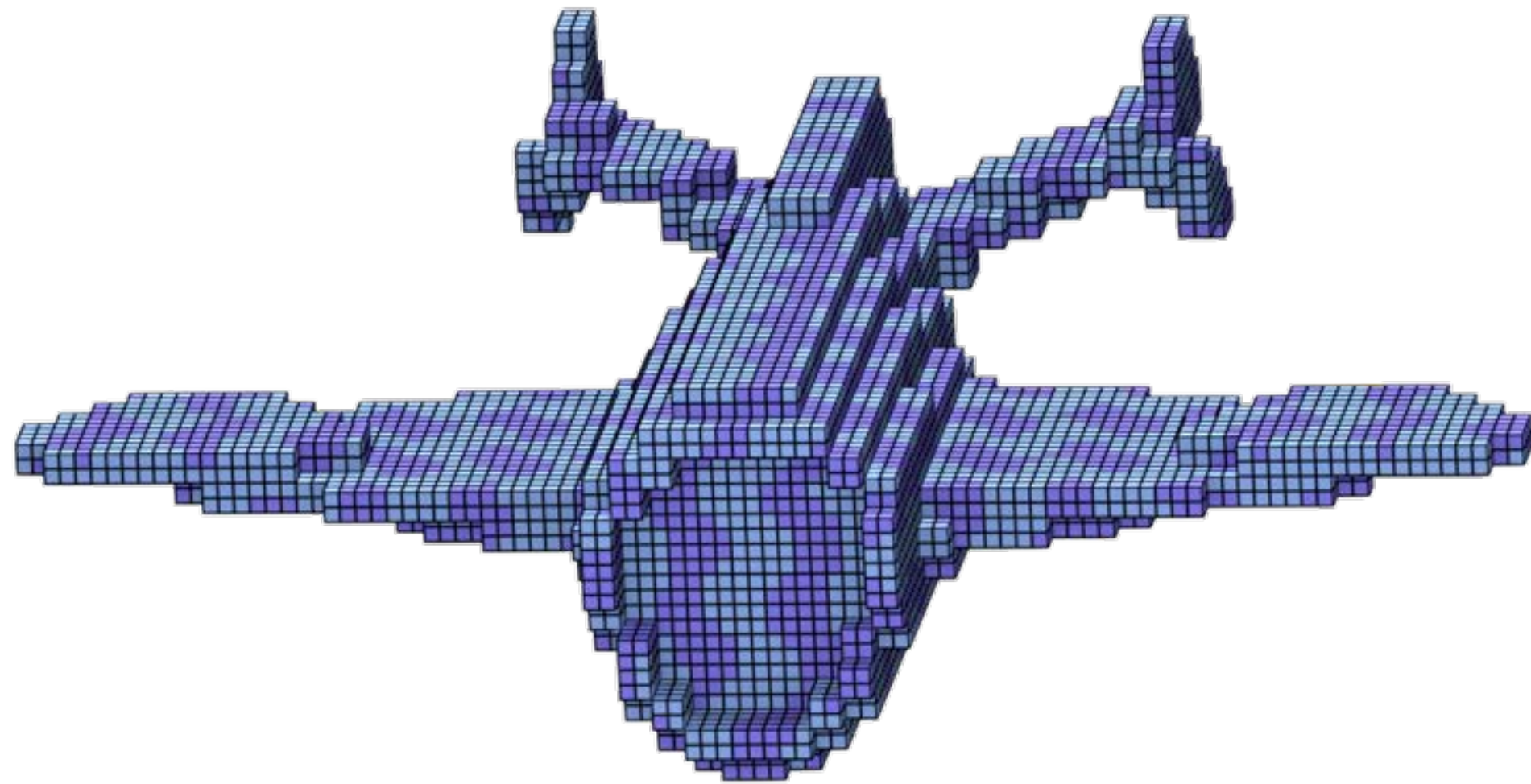
**Inhomogeneous**

**nonlinear**

**Require fine mesh**



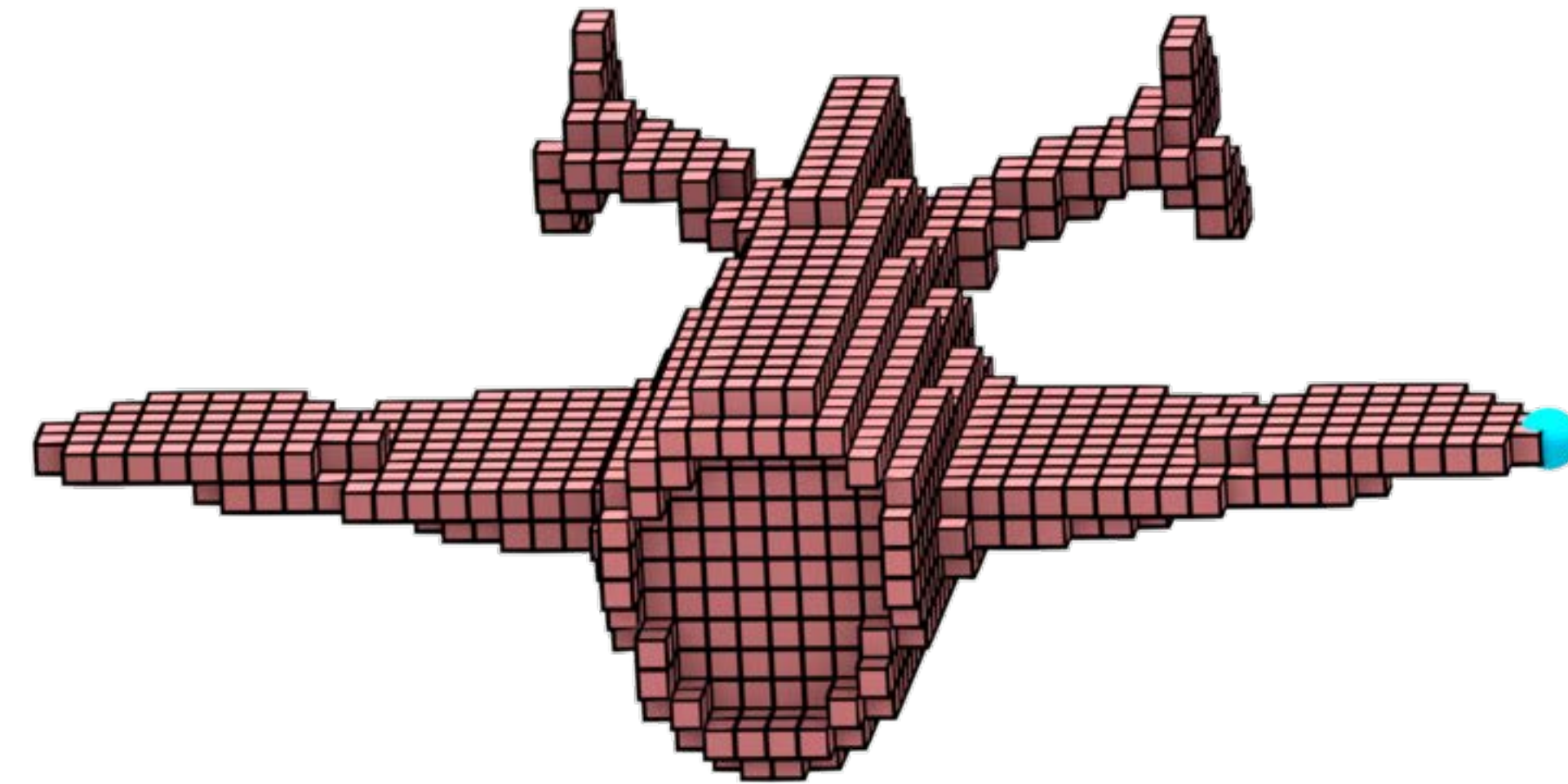
# Challenge



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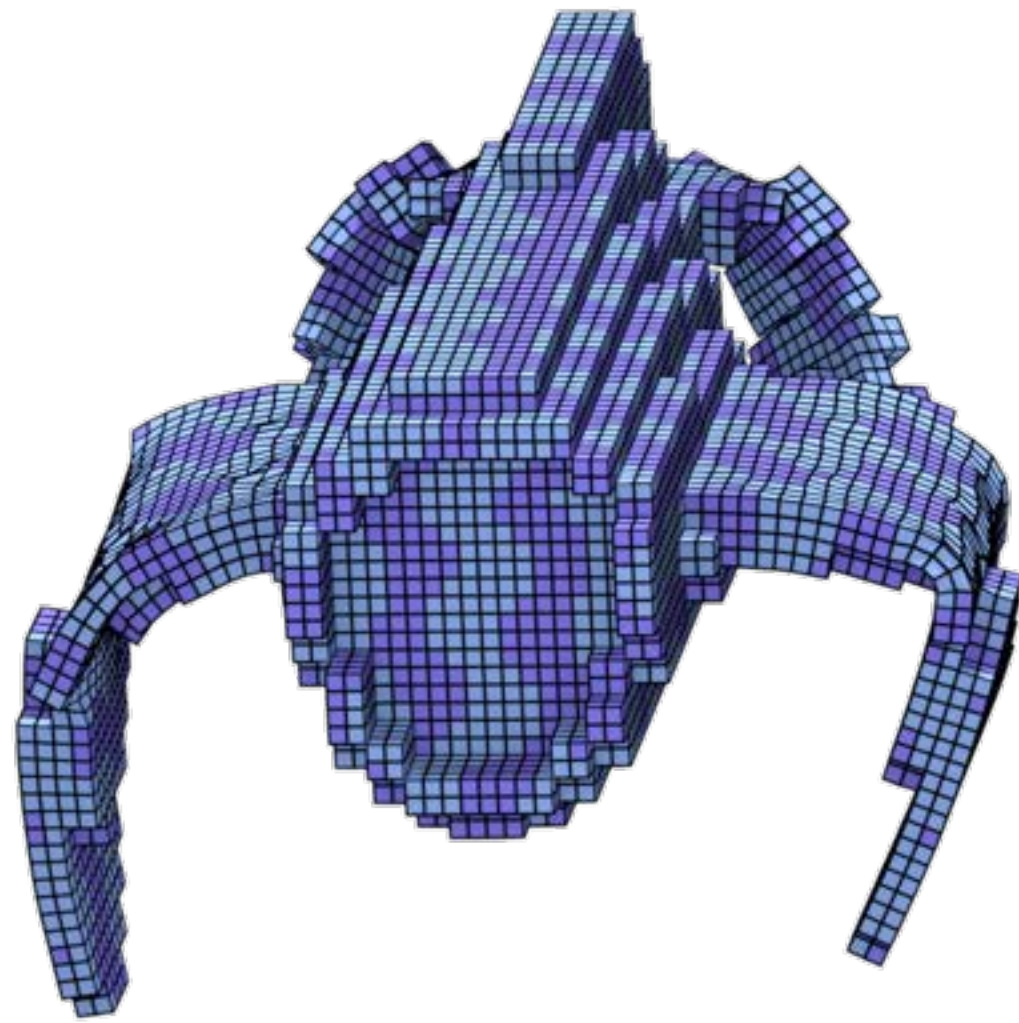
**Require fine mesh**



**Coarse mesh**



# Challenge

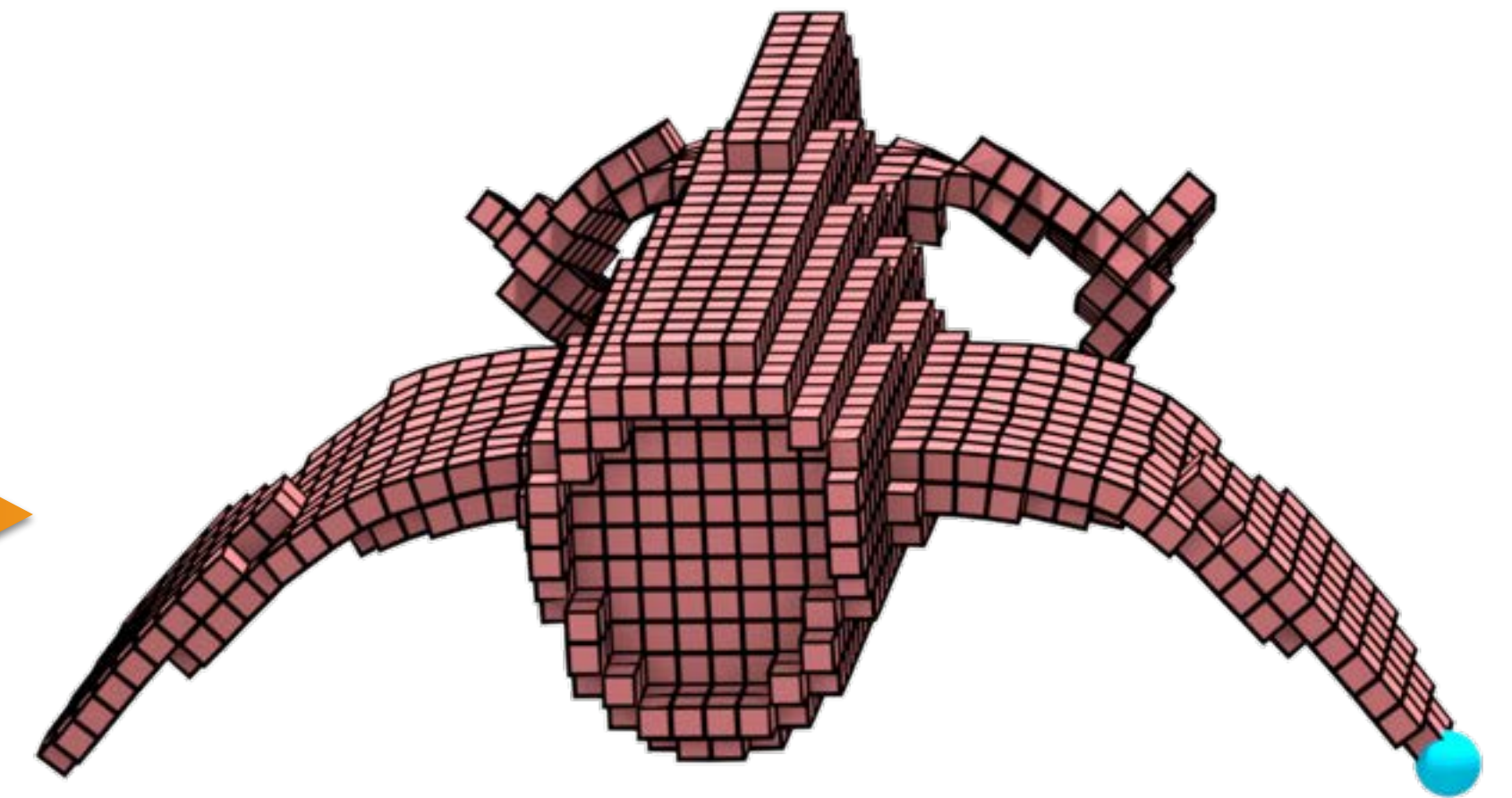


**Inhomogeneous**

**nonlinear**

**Require fine mesh**

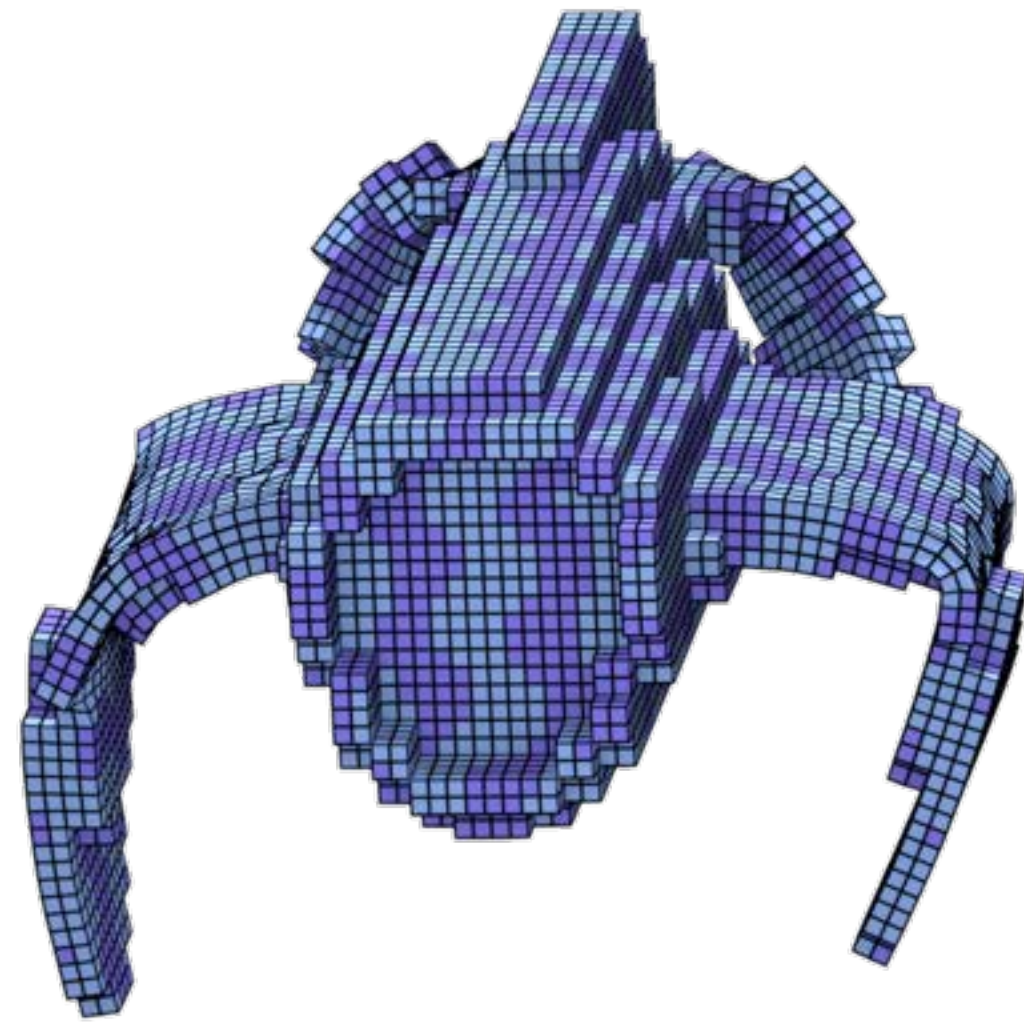
**linear bases**



**Coarse mesh**



# Challenge

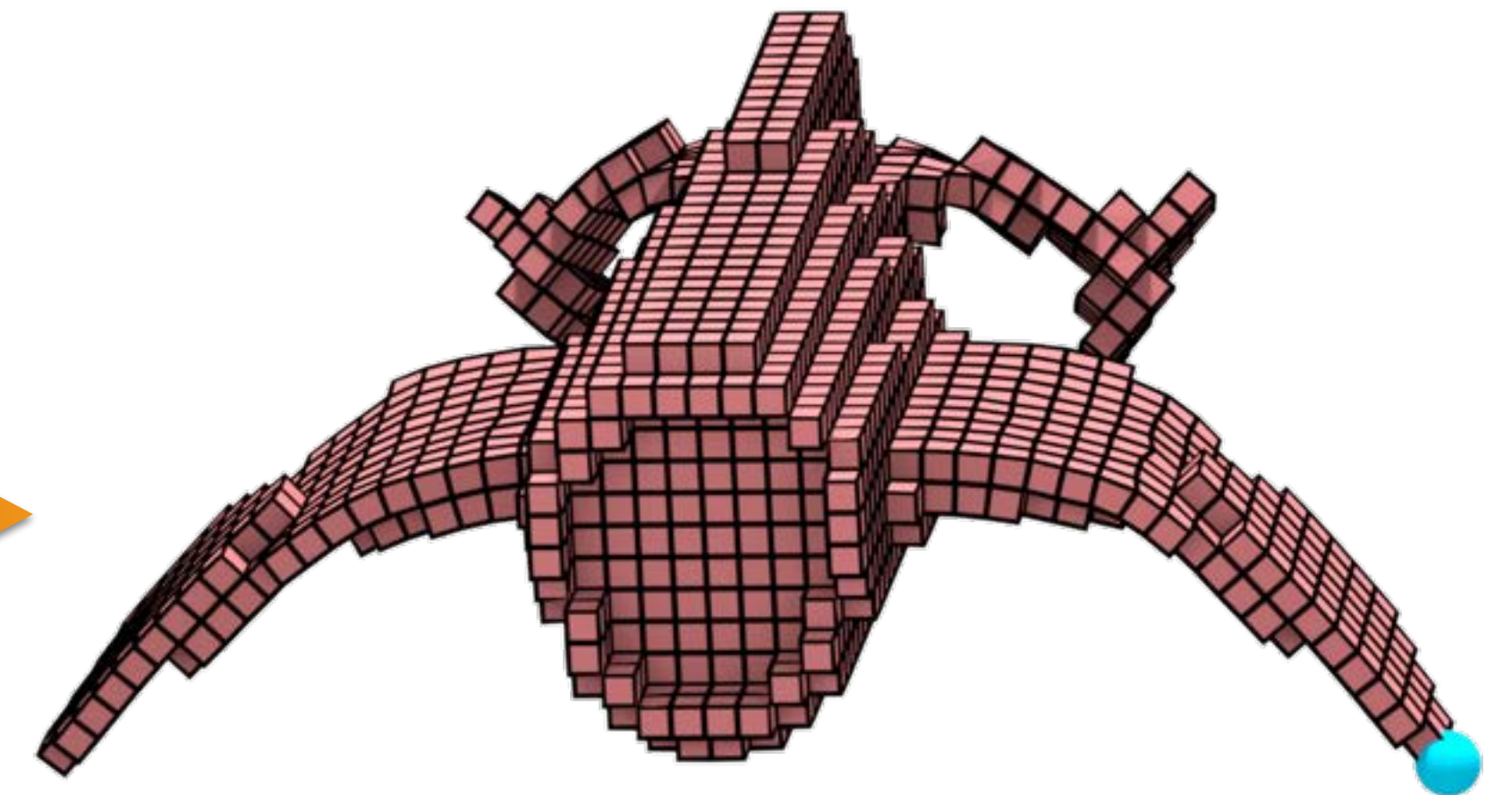


**Inhomogeneous**

**nonlinear**

**Require fine mesh**

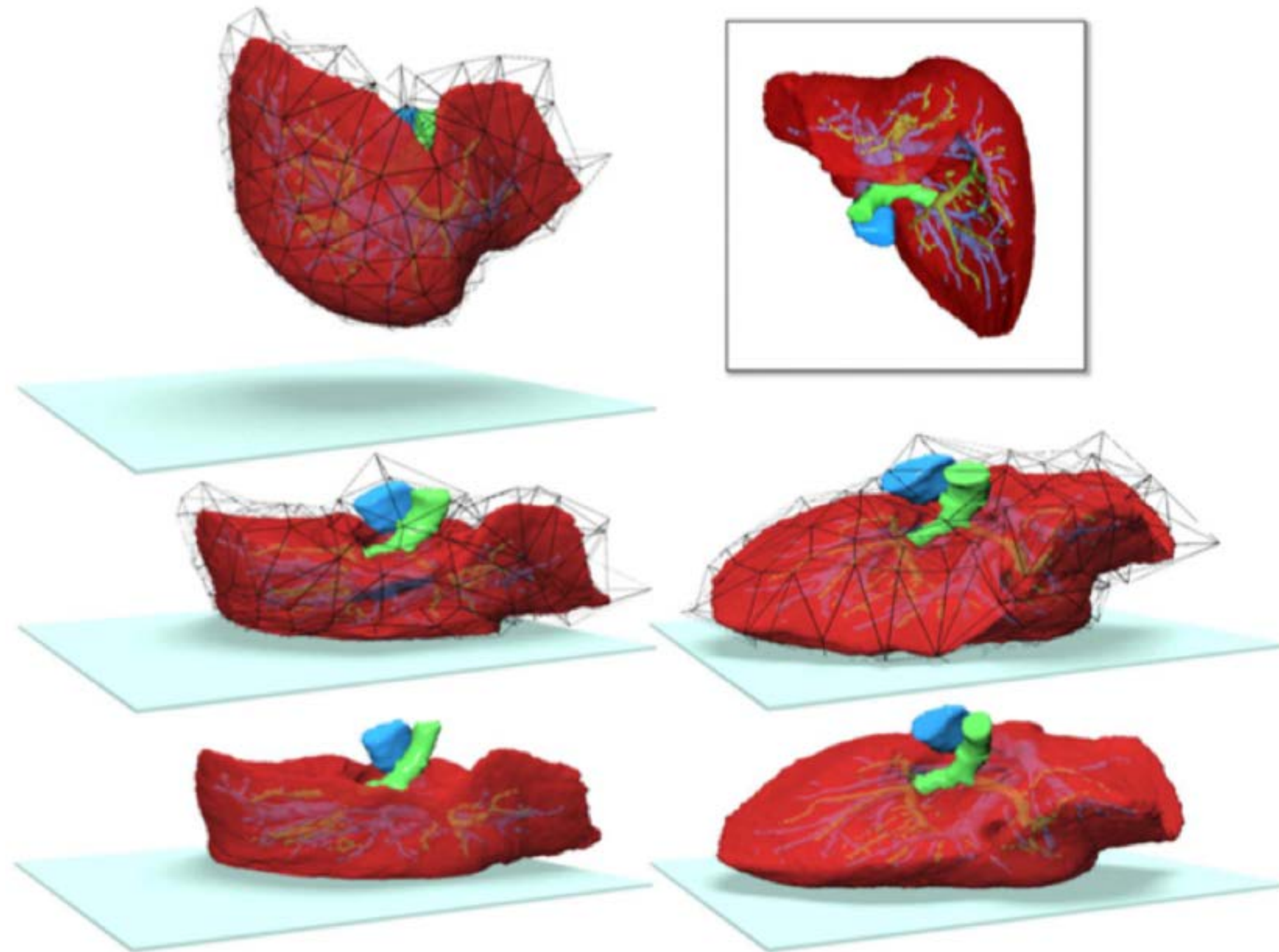
**linear bases**



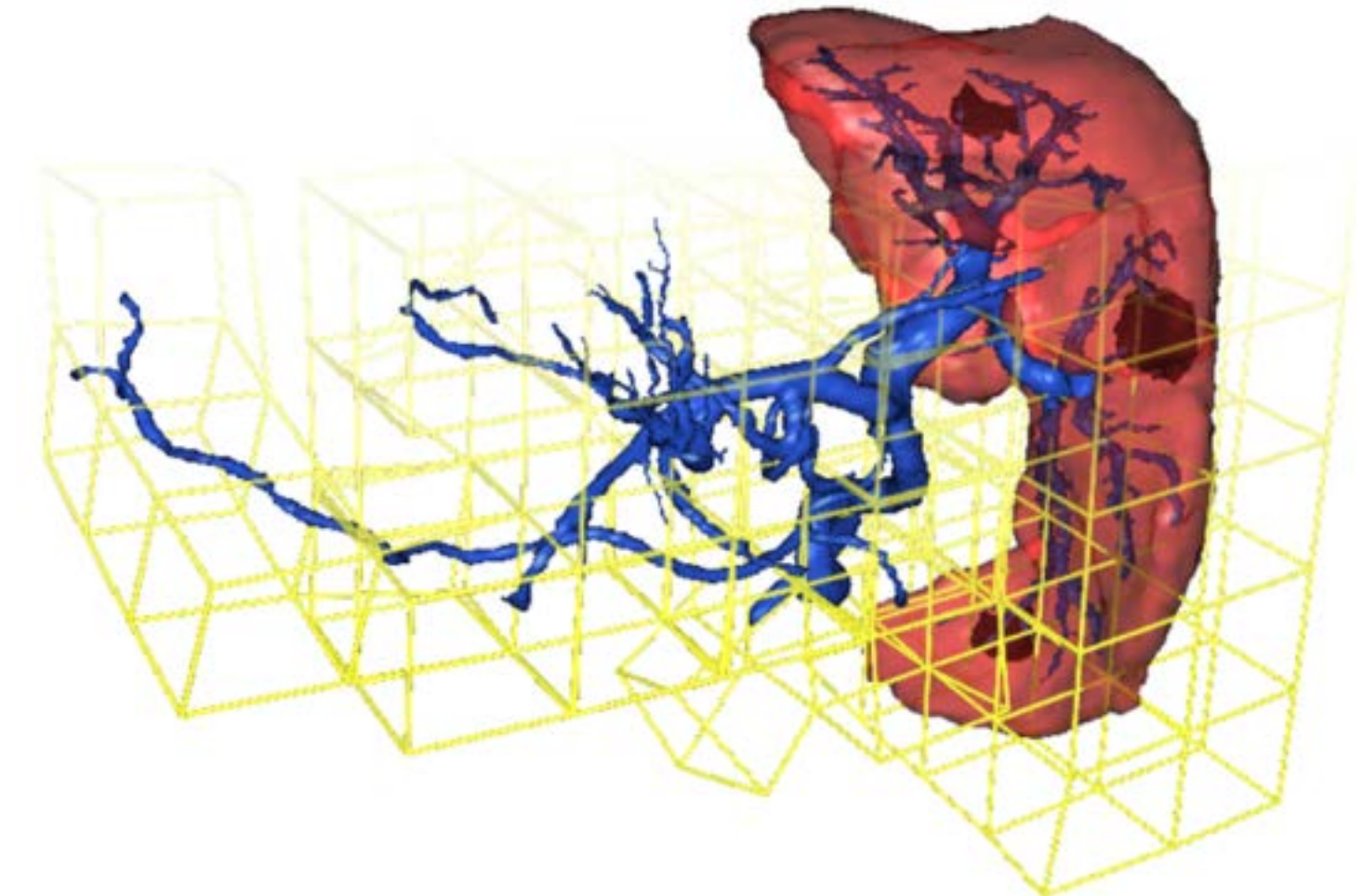
**Coarse mesh**



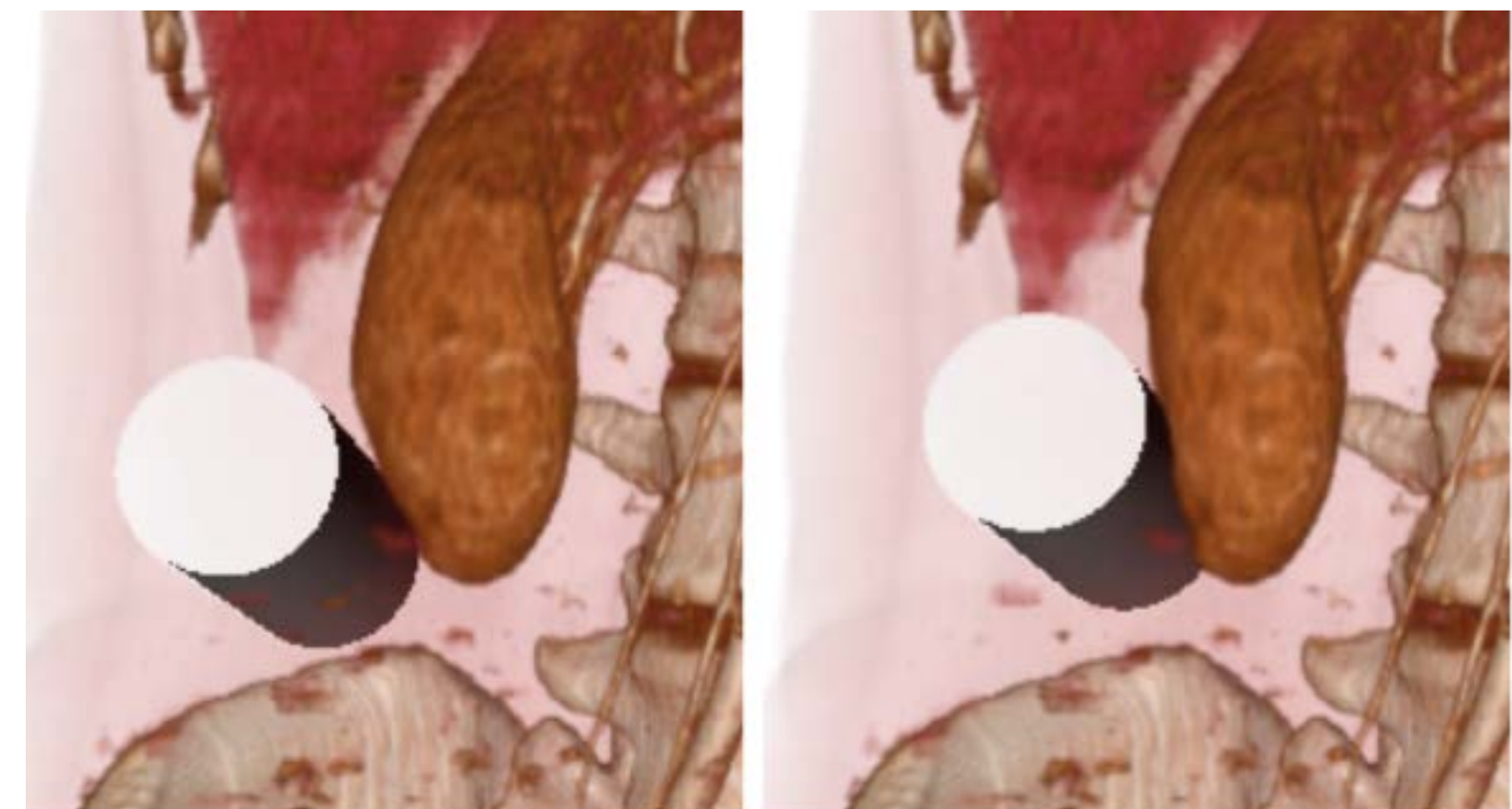
# Previous works



[Kharevych 2009]



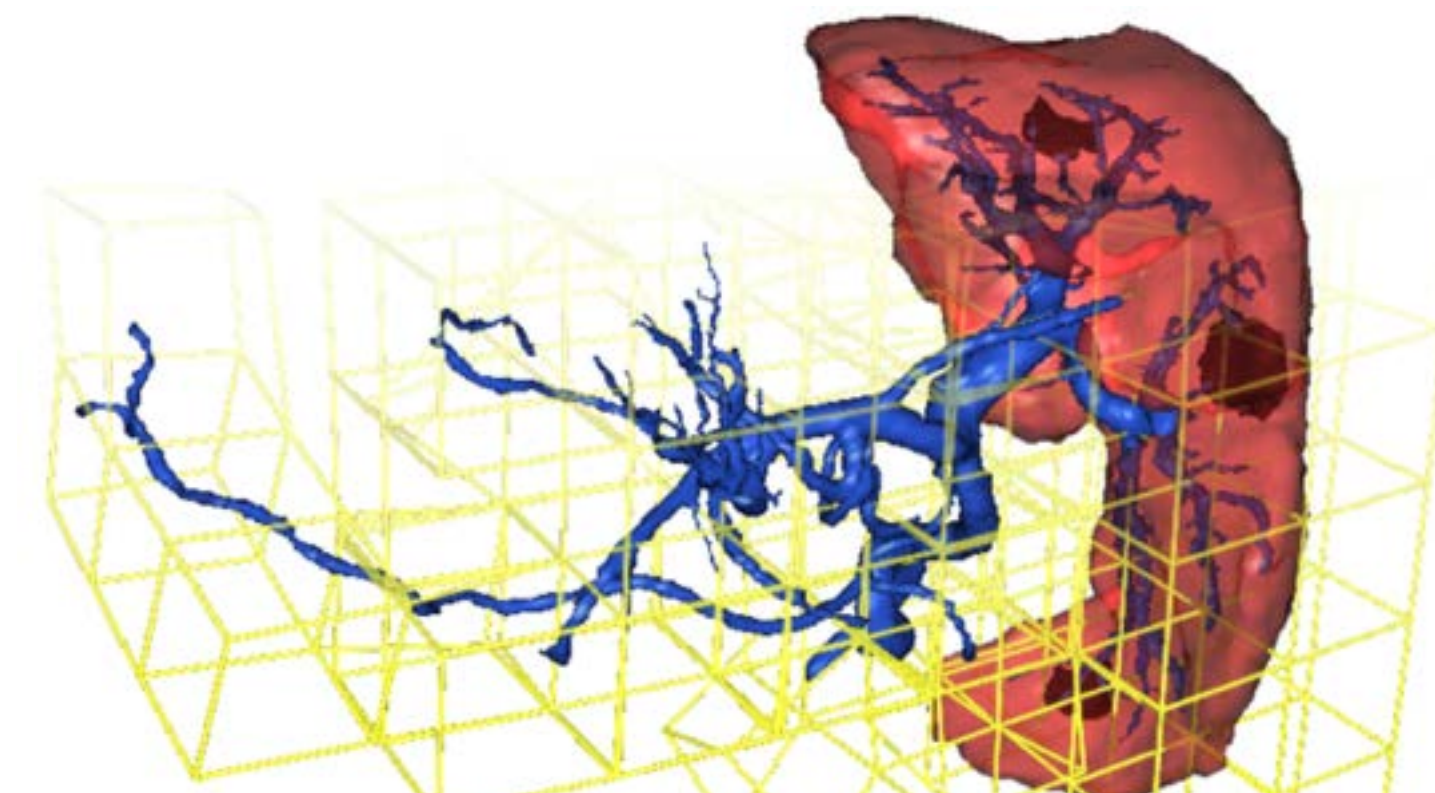
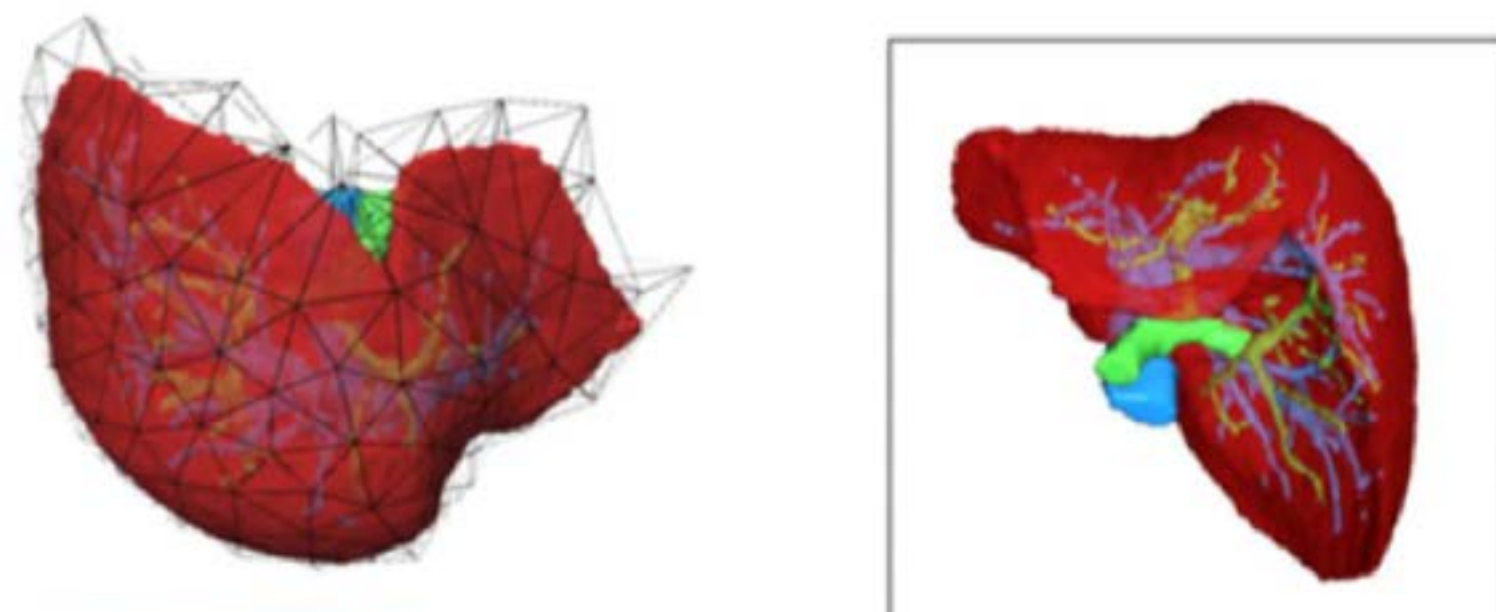
[Nesme 2009]



[Torres 2016]

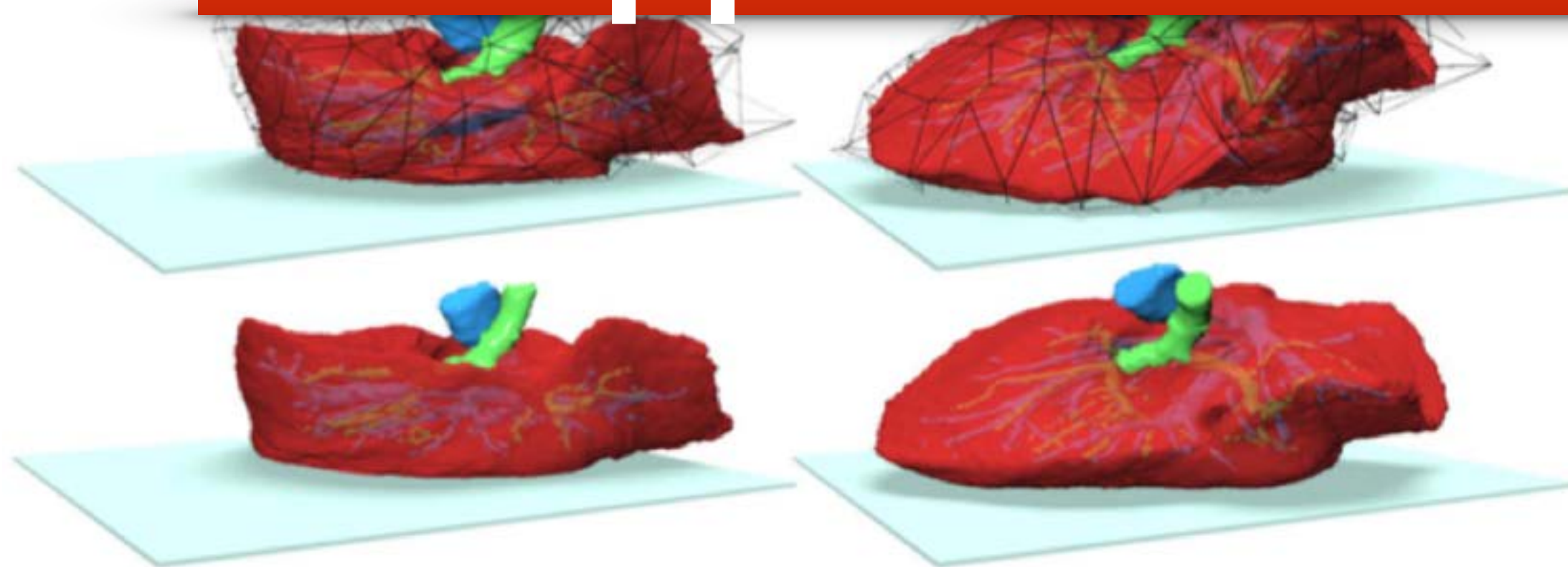


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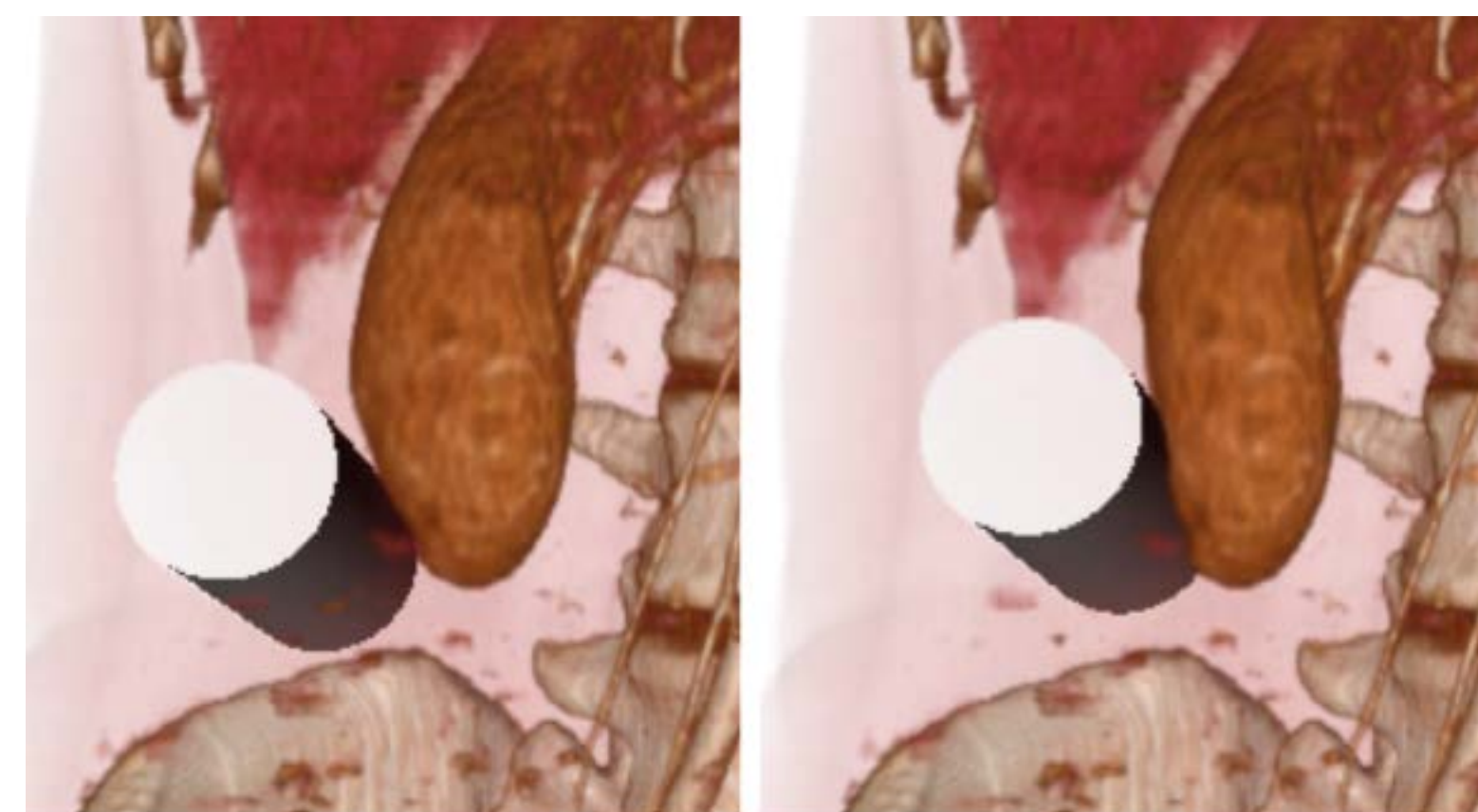


**Not applicable for nonlinear elasticity**

[Nestle 2009]



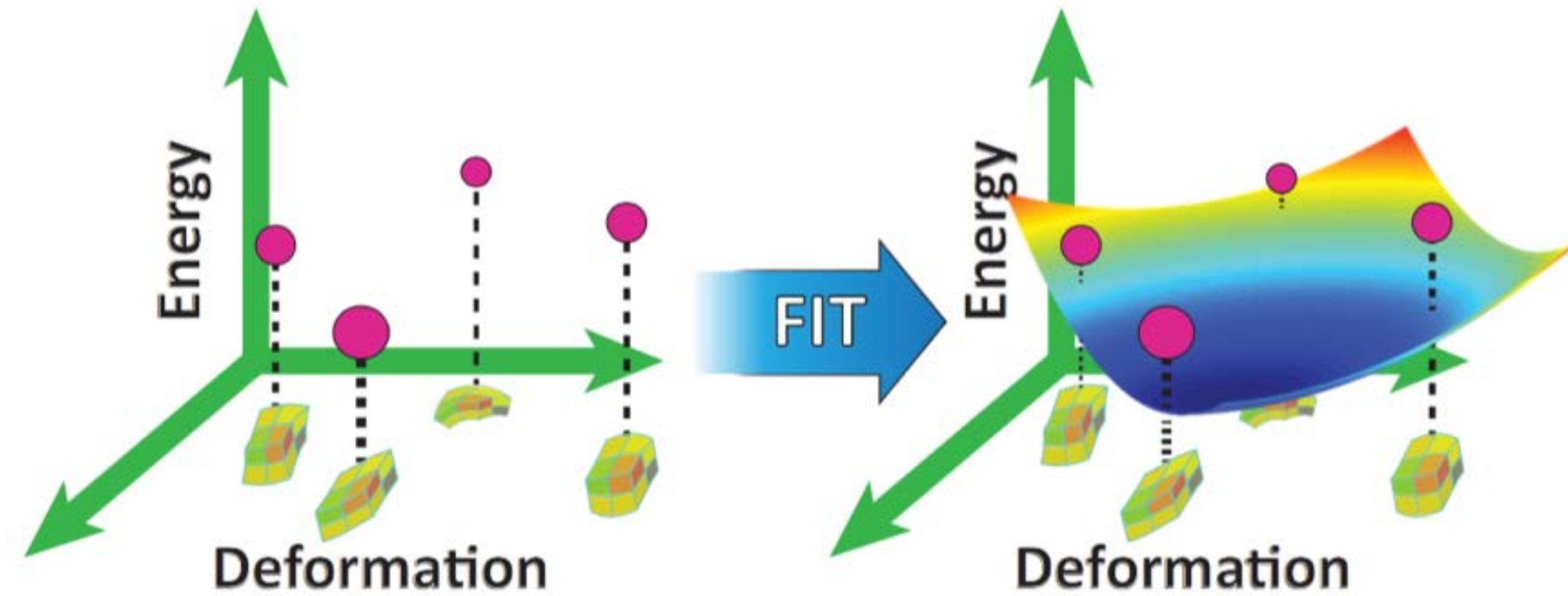
[Kharevych 2009]



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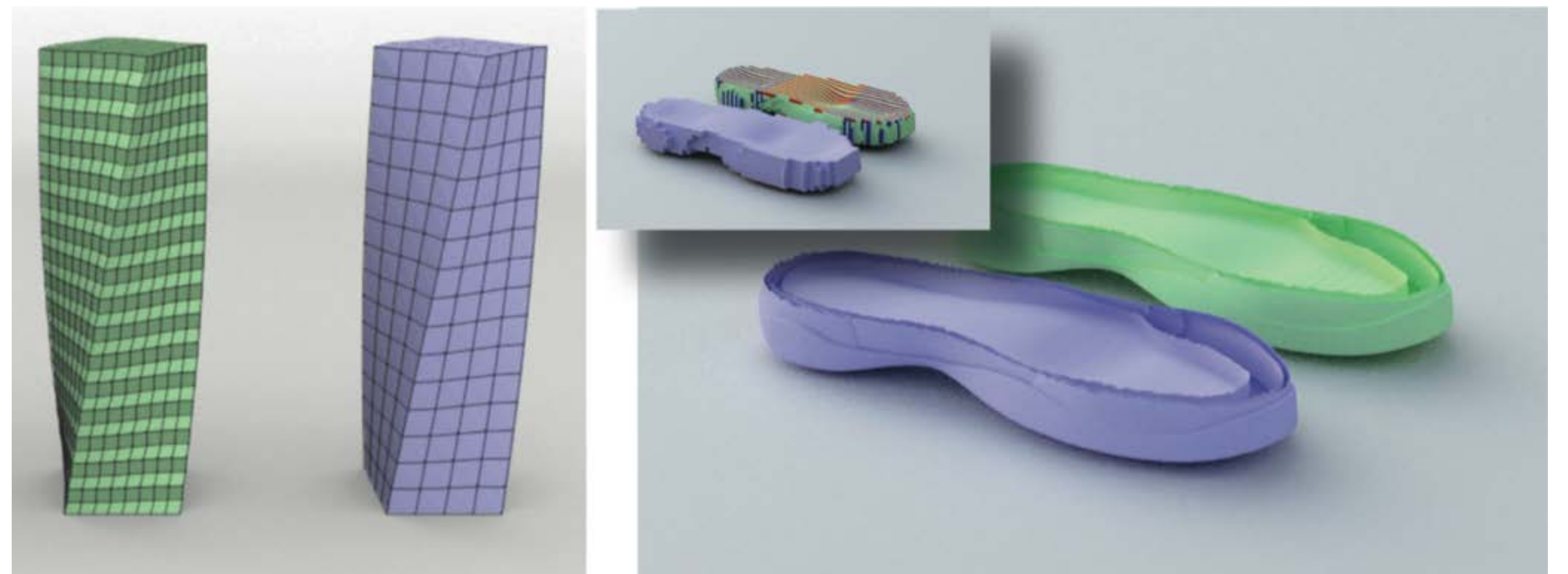


# Previous work



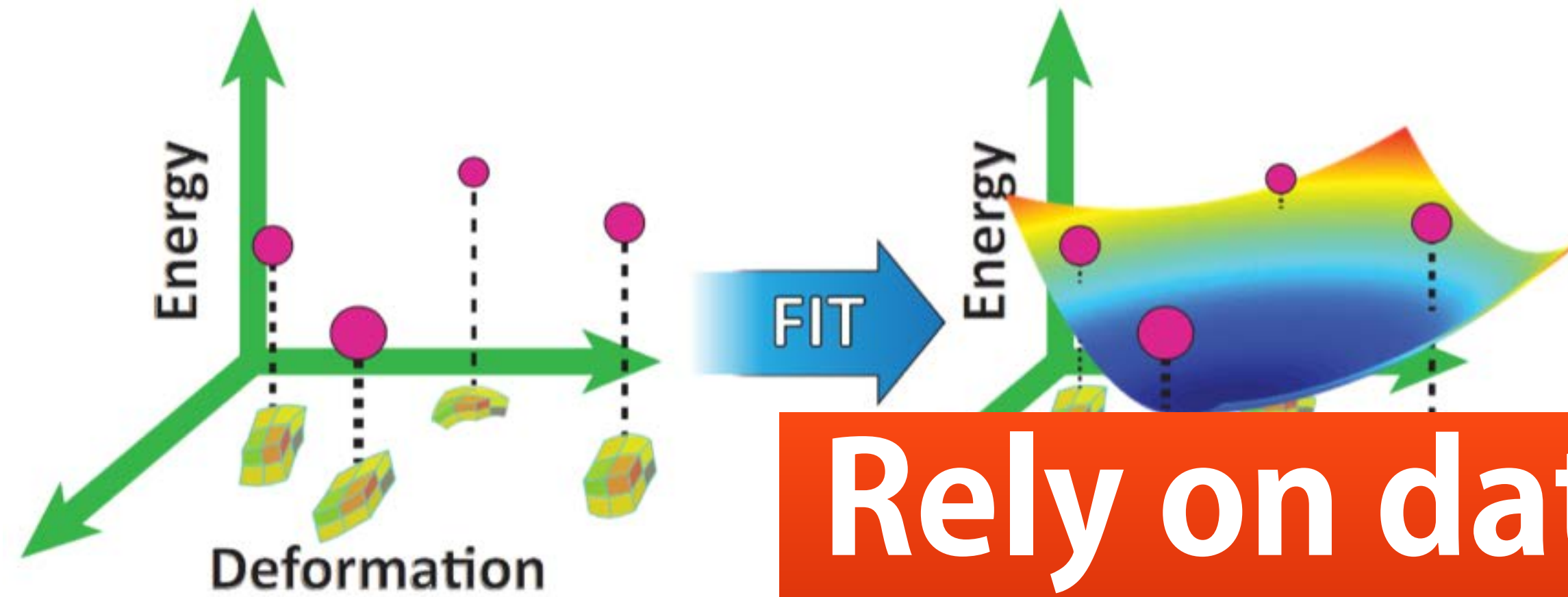
Data-driven approach to regress the coarse elastic model

[Chen 2015]





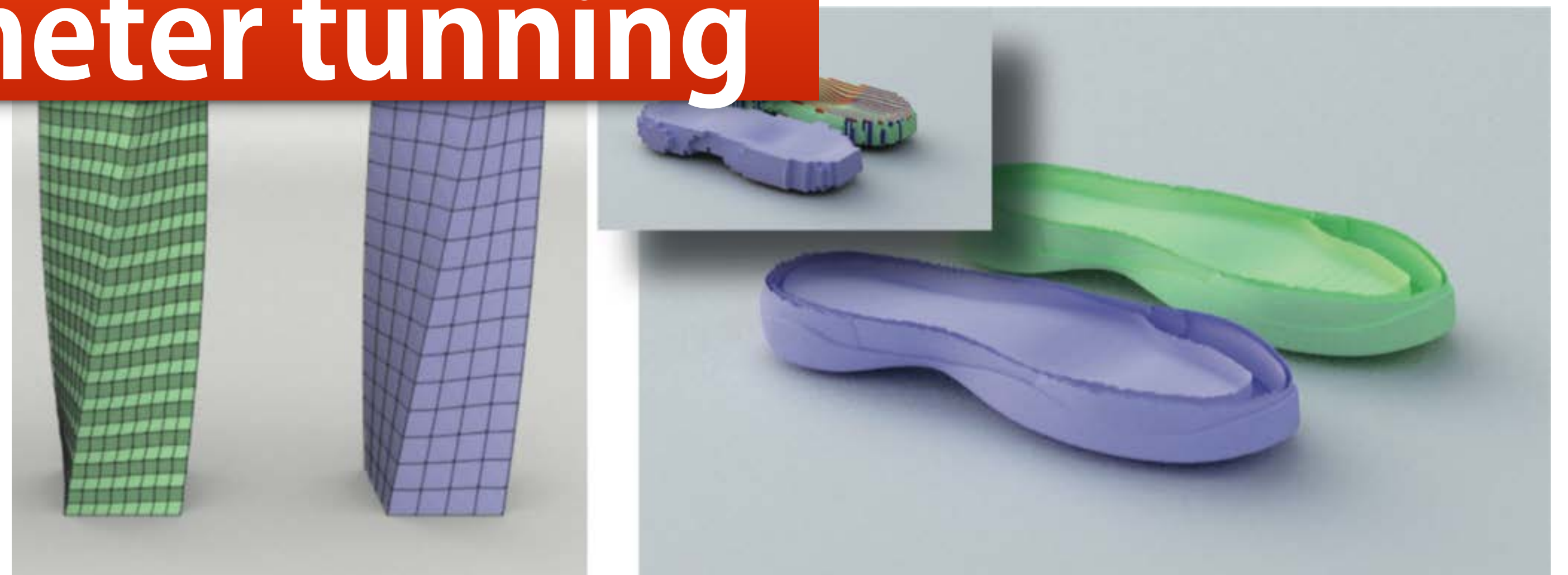
# Previous work



Data-driven approach to regress the coarse elastic model

**Rely on data set and parameter tuning**

[Chen



# Our solution

$$E[u] = \int_{\Omega} \Psi(\nabla u) dX$$



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$$K_{ij}(u) = \int \nabla N_i^T : \frac{\partial^2 \Psi}{\partial \nabla u^2} : \nabla N_j$$



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$$E[u] = \int_{\Omega} \Psi(\nabla u) dX$$

$$\nabla u = \sum_i \nabla N_i(X) u_i$$

# Our solution

$$\int_{\Omega} \sigma(\nabla u) \cdot \nabla v \, dx = \int_{\Omega} f v \, dx$$

$$\nabla u = \sum_i \nabla N_i(X) u_i$$



**Homogenize the constitutive model**

# Our solution

$$\int_{\Omega} \mathbf{D}(\mathbf{u}) : \mathbf{D}(\mathbf{u}) \, dx$$

$$\nabla u = \sum_i \nabla N_i(X) u_i$$



**Homogenize the constitutive model**



**Approximate the solution space better**



# Our solution

- **Matrix-valued** shape functions

scalar basis

$\mathbf{N}(x)$

$\approx$

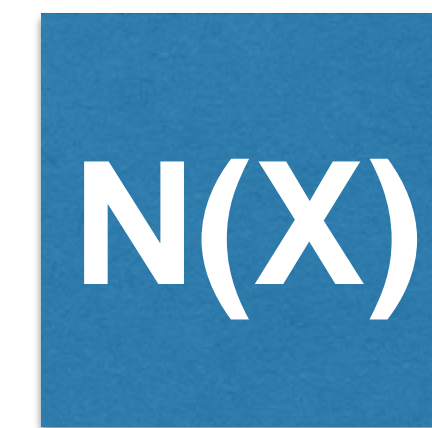
$$\begin{bmatrix} \blacksquare & 0 & 0 \\ 0 & \blacksquare & 0 \\ 0 & 0 & \blacksquare \end{bmatrix}$$

# Our solution

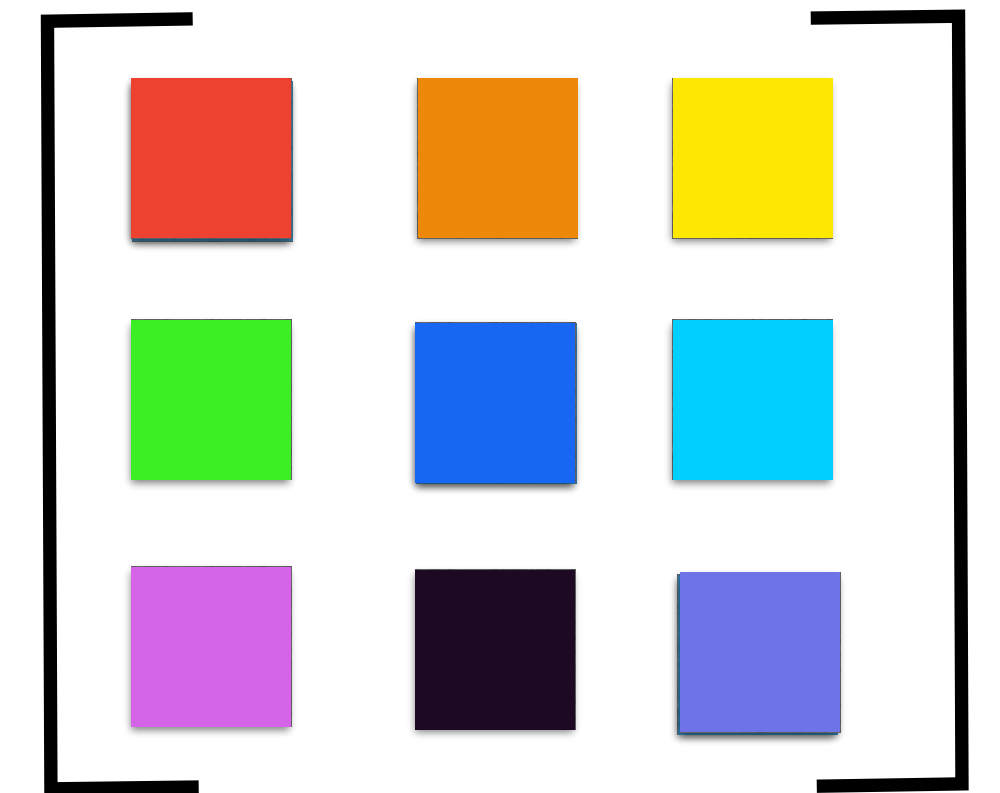
- **Matrix-valued** shape functions

$$N_i^H : \Omega \rightarrow \mathbb{R}^{d \times d}$$

generalize



$\approx$





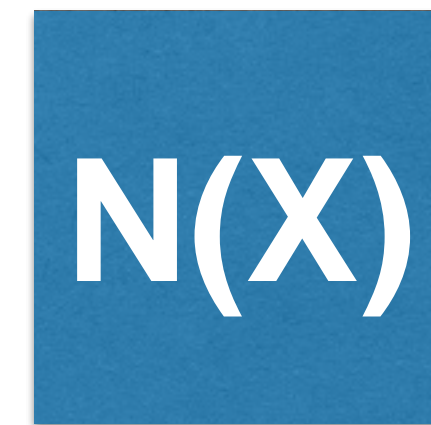
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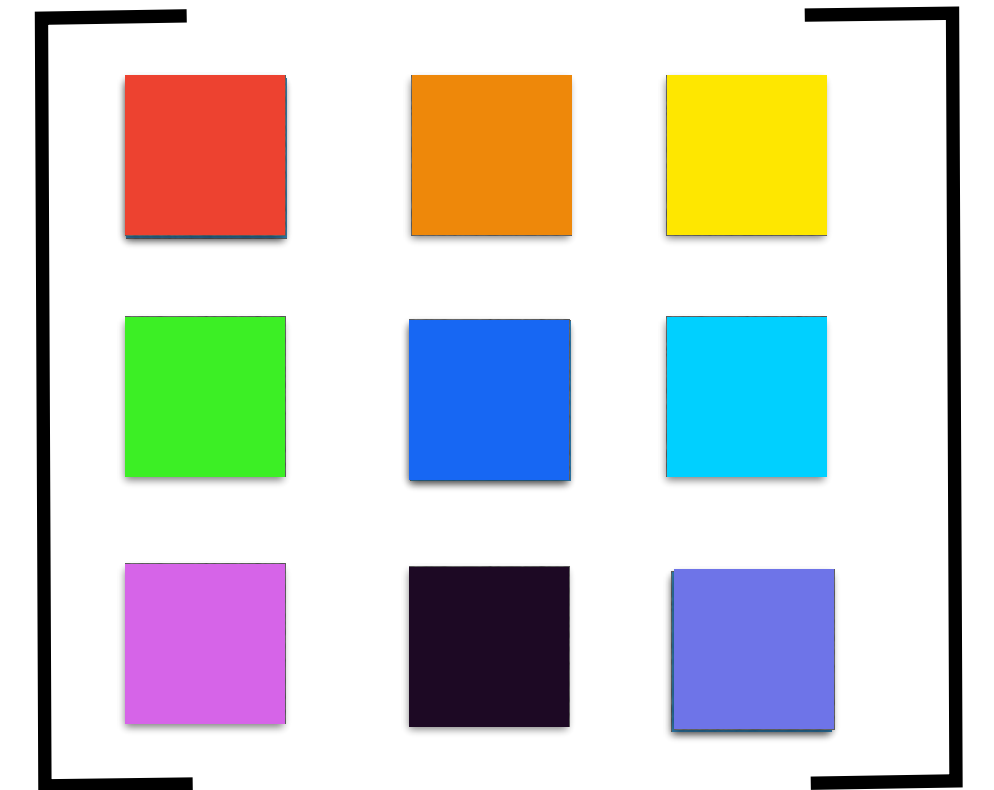
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- Geometric & physical conditions

generalize



$\approx$



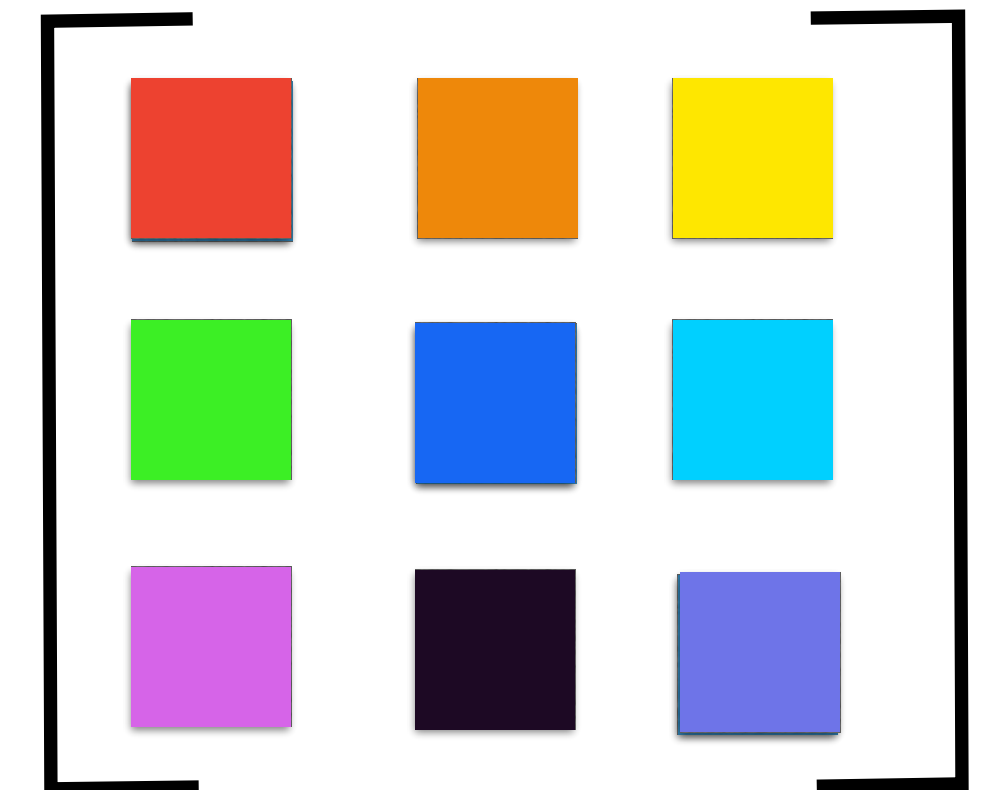
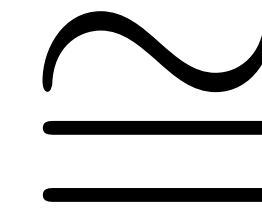
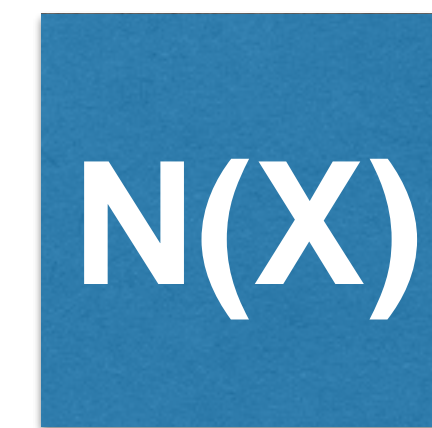
# Our solution

- **Matrix-valued** shape functions

$$N_i^H : \Omega \rightarrow \mathbb{R}^{d \times d}$$

- Geometric & physical conditions

generalize



Inter-element  
continuity

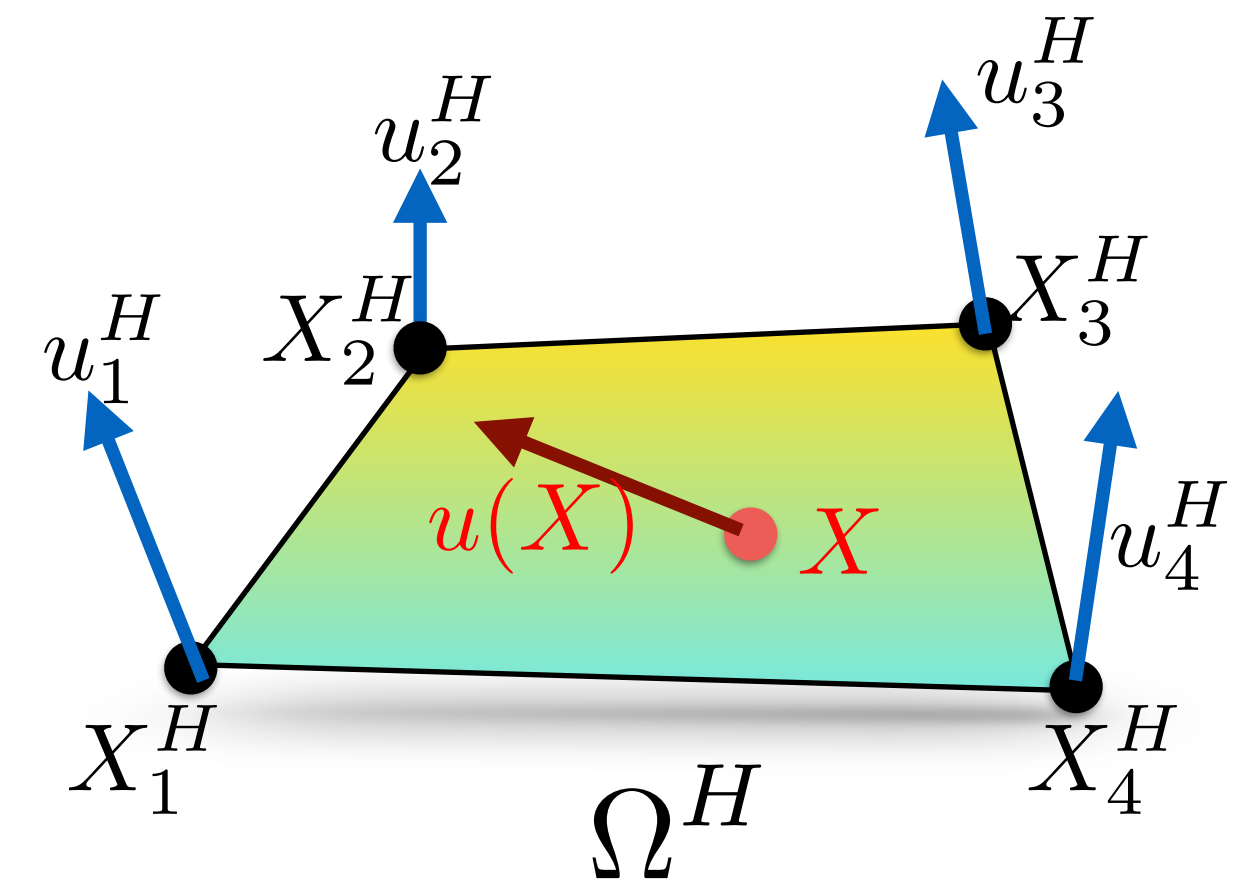
Inner-element  
stiffness



# Matrix-valued shape function

- Element-wise interpolation

$$\forall X \in \Omega^H, u(X) = \sum_{X_i \in \Omega^H} N_i^H(X) u_i^X$$





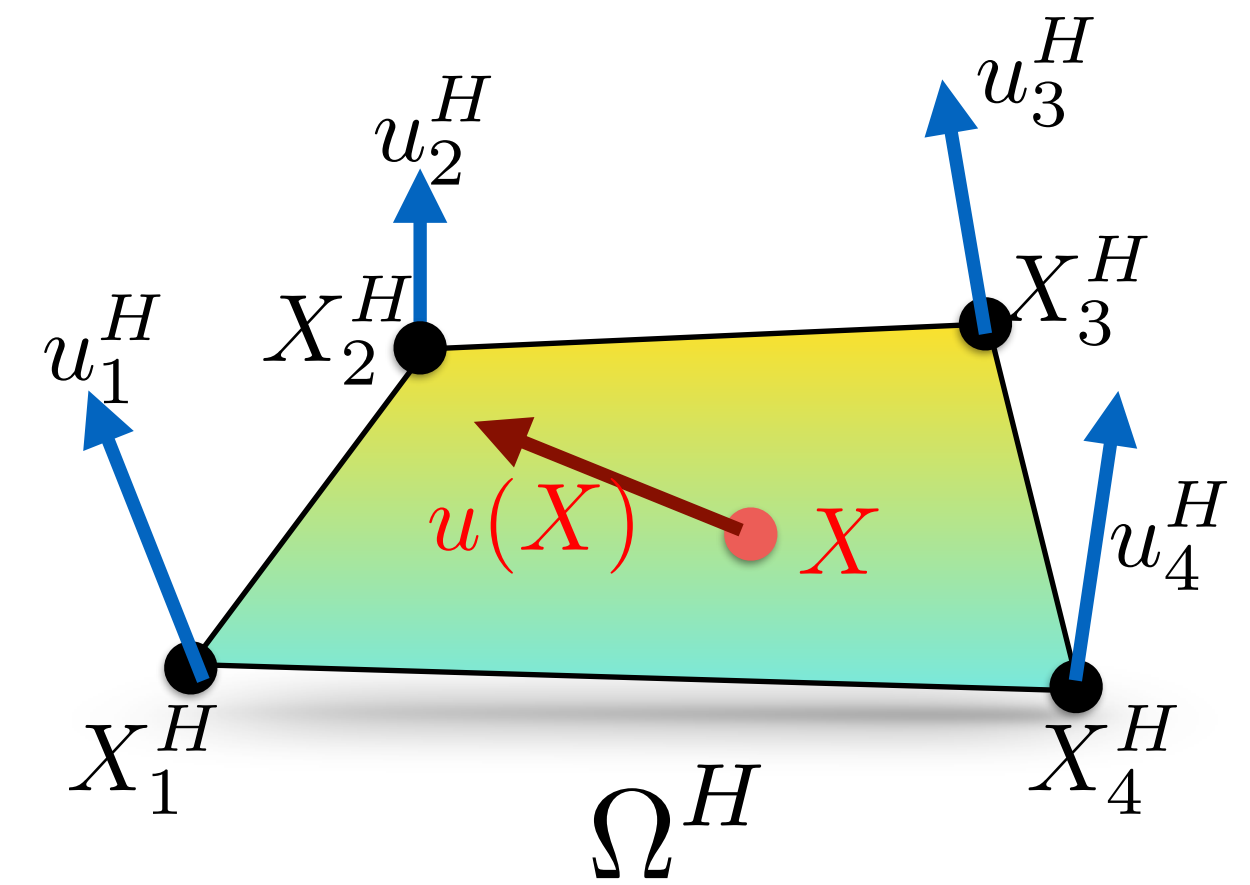
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- Corotational formulation

$$u(X) = R \left[ X + \sum_i N_i^H(X) (R^T x_i^H - X_i^H) \right] - X$$



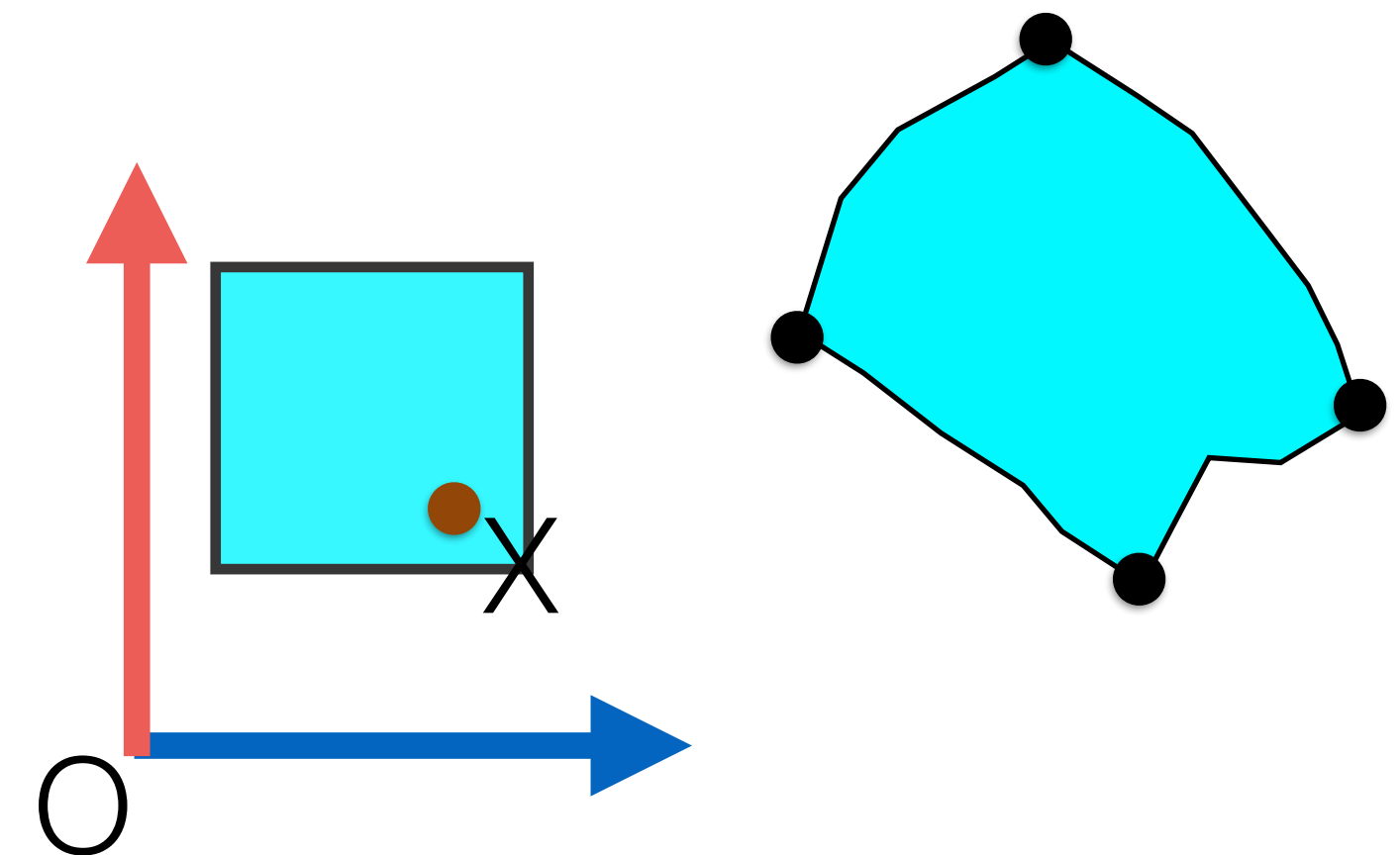
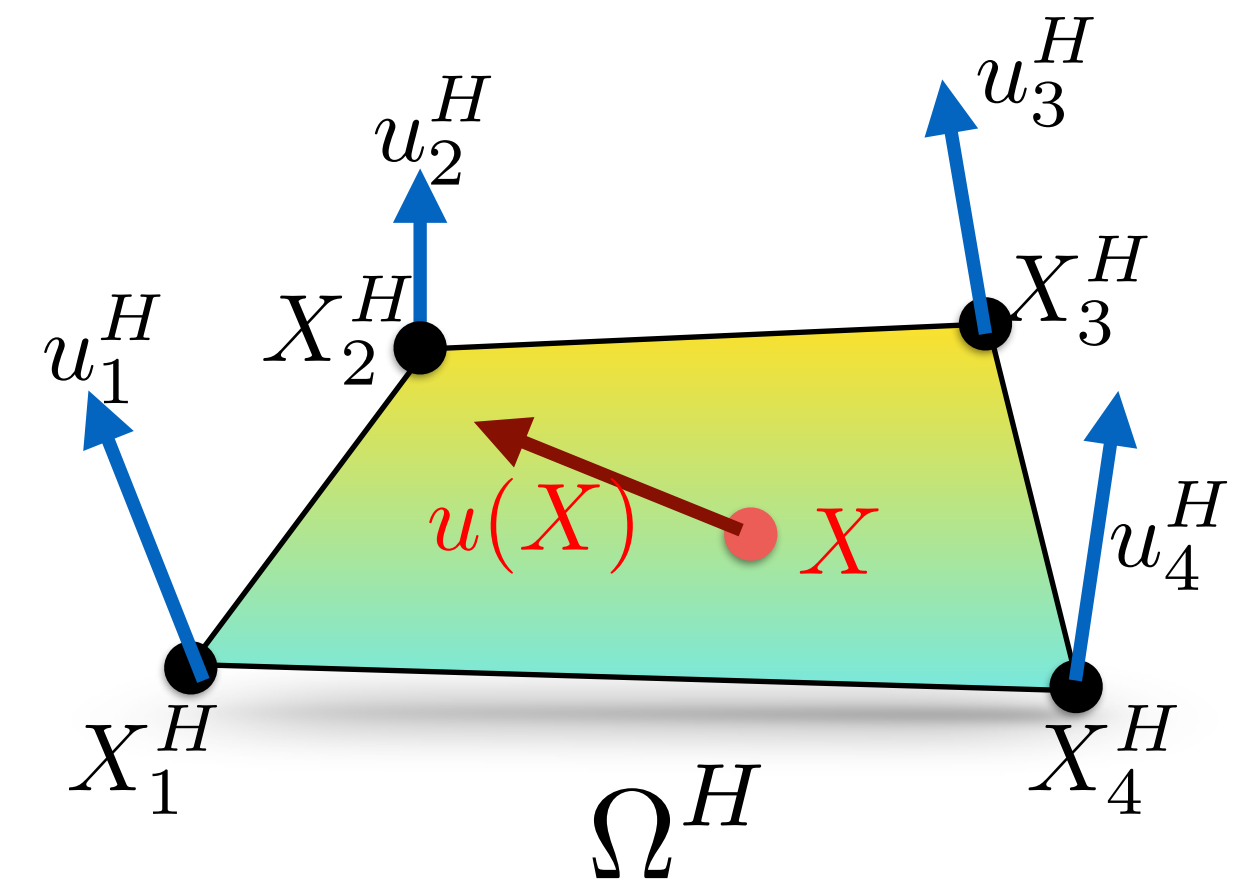
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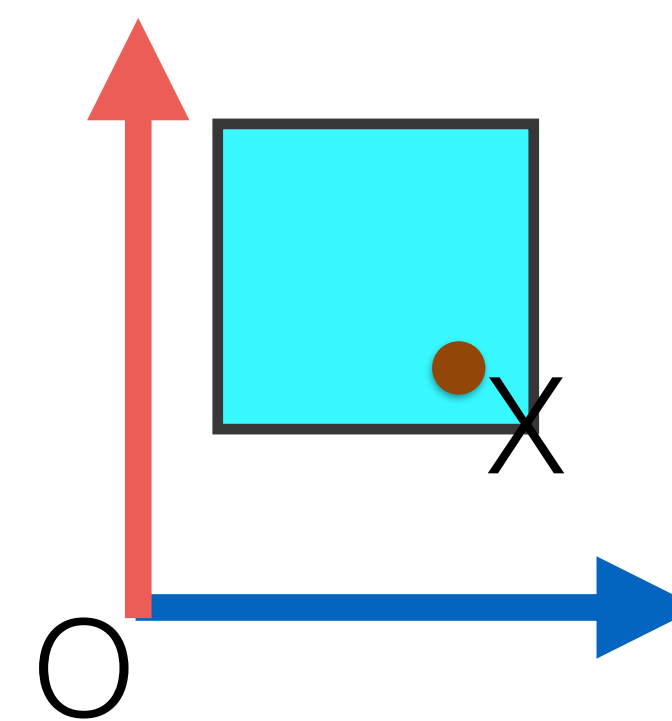
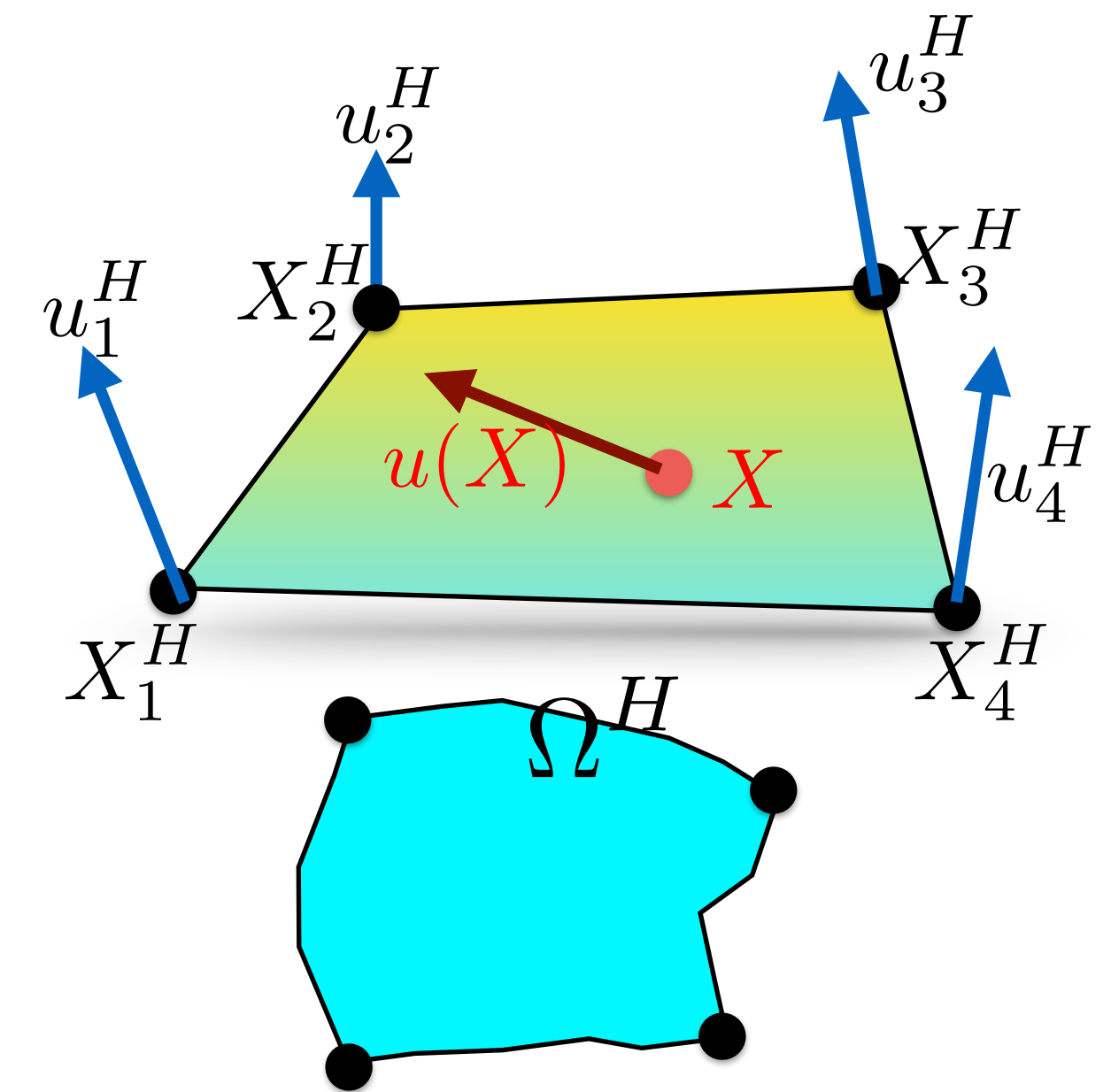
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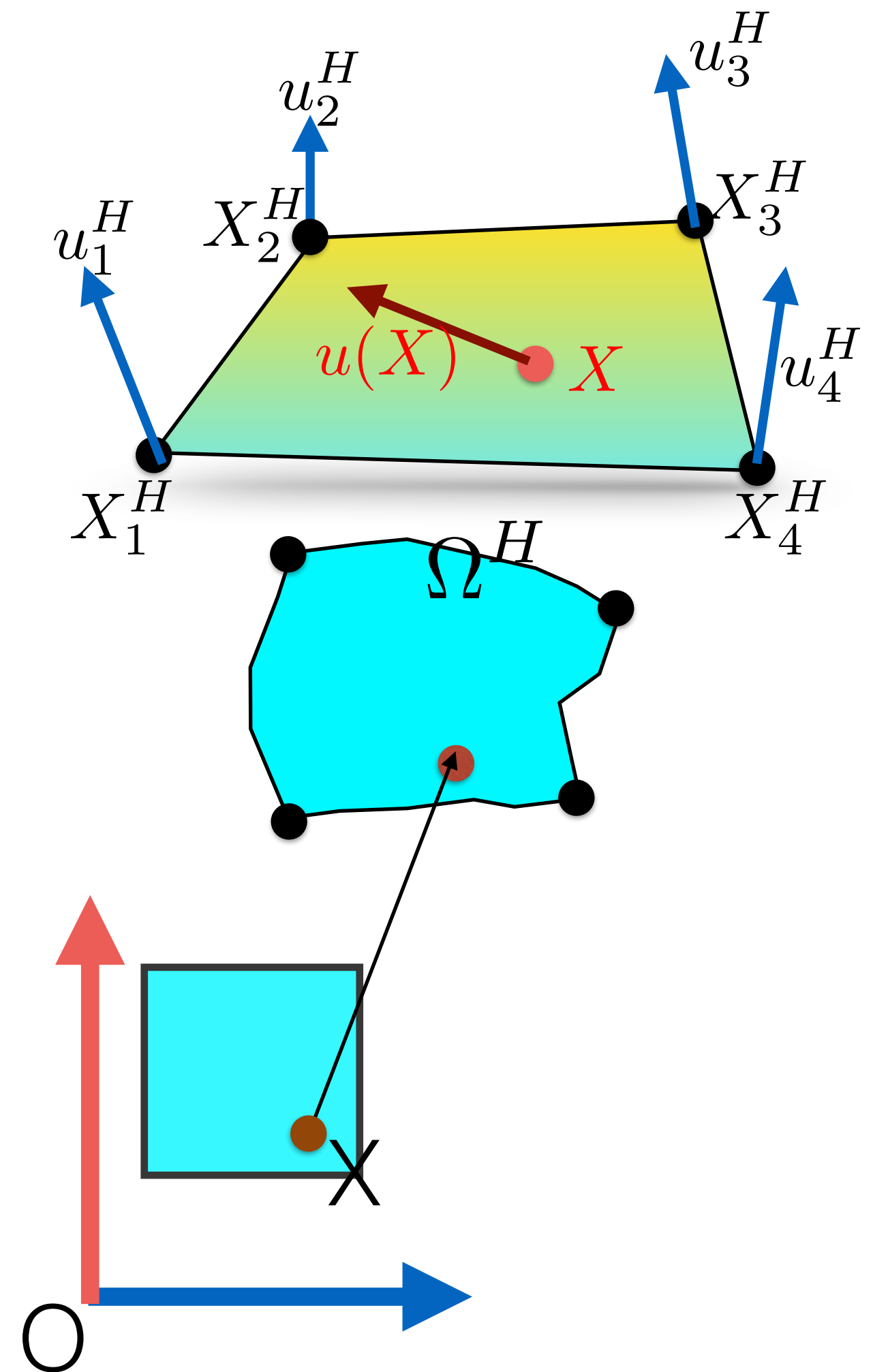
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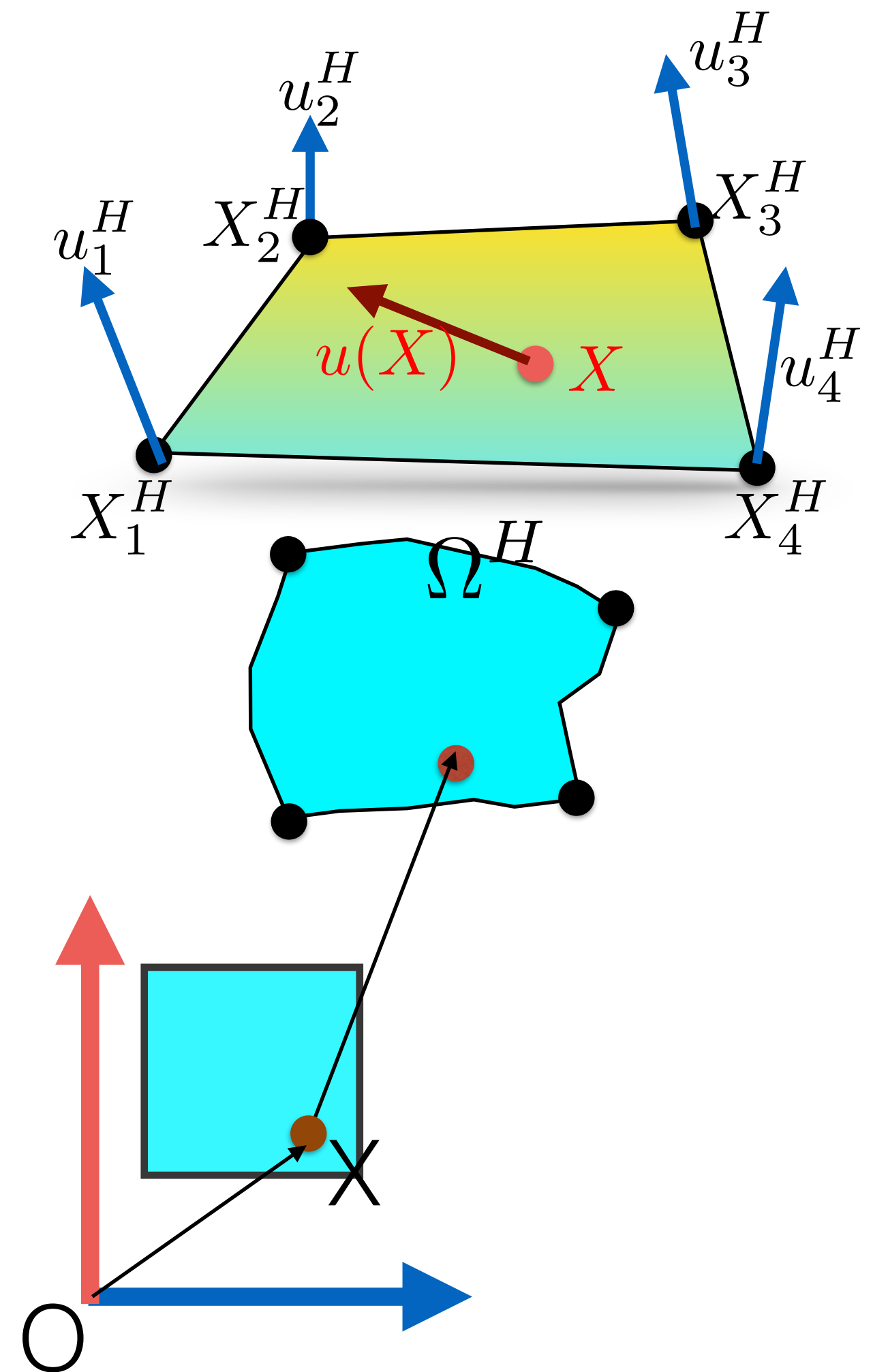
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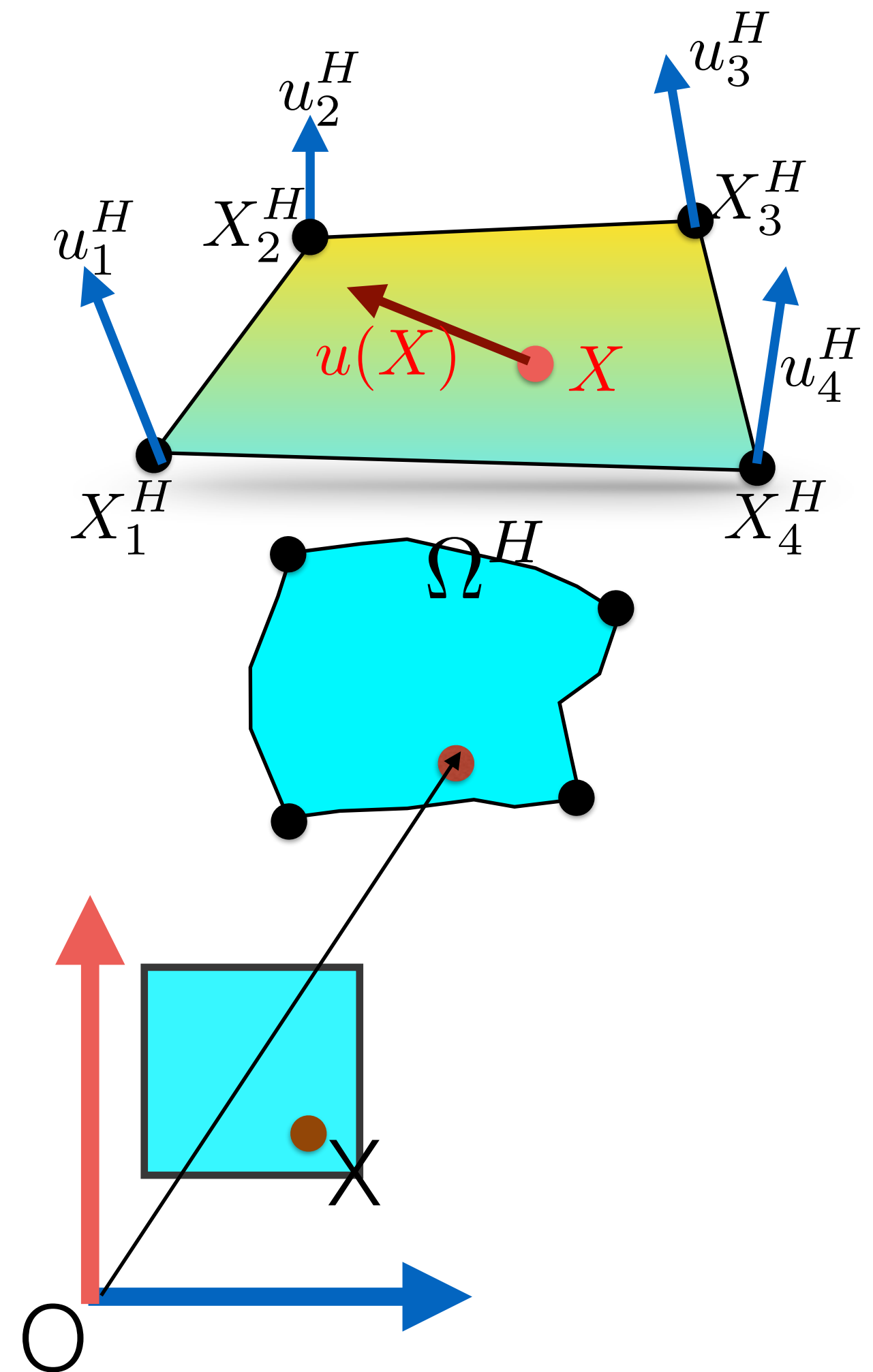
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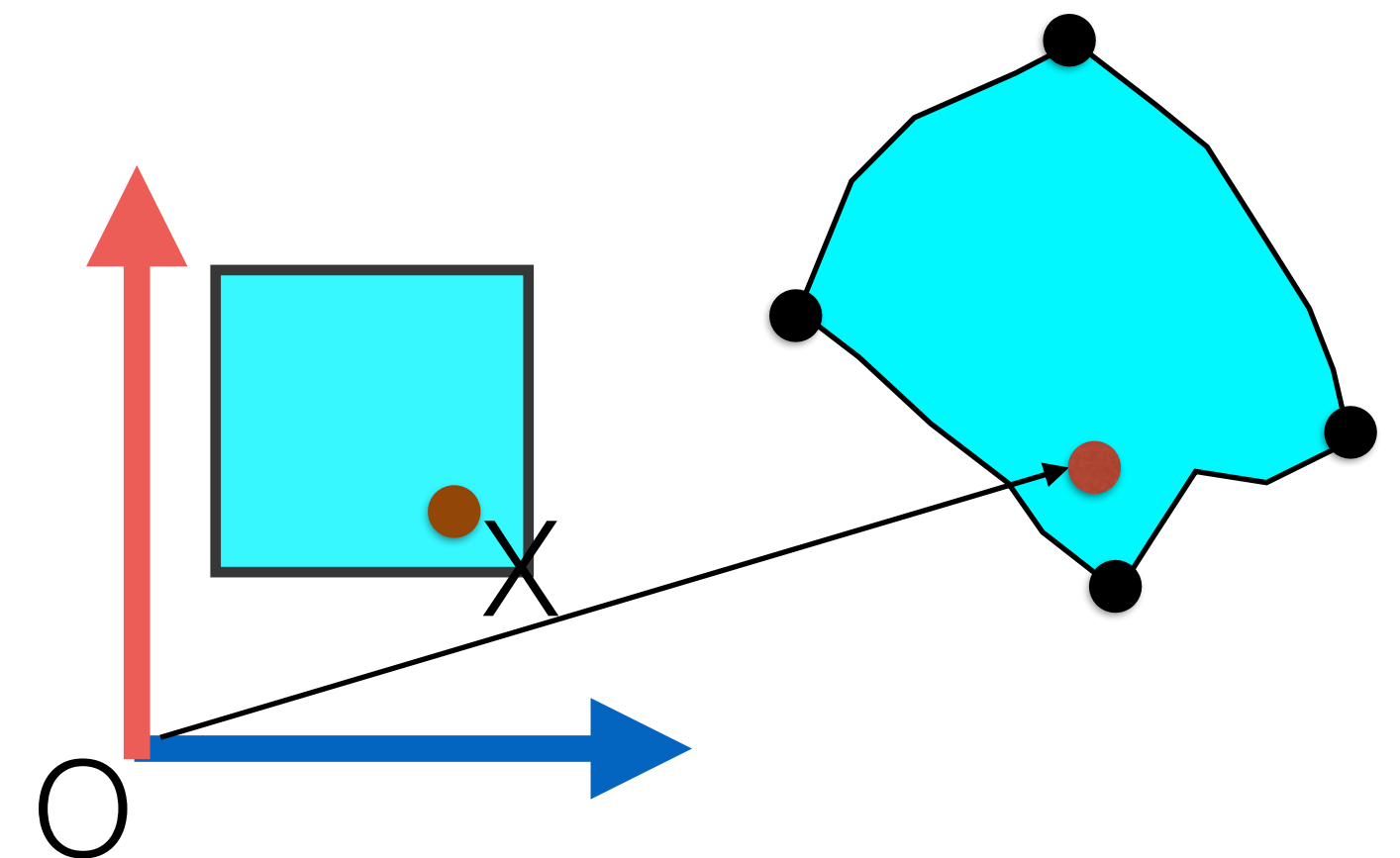
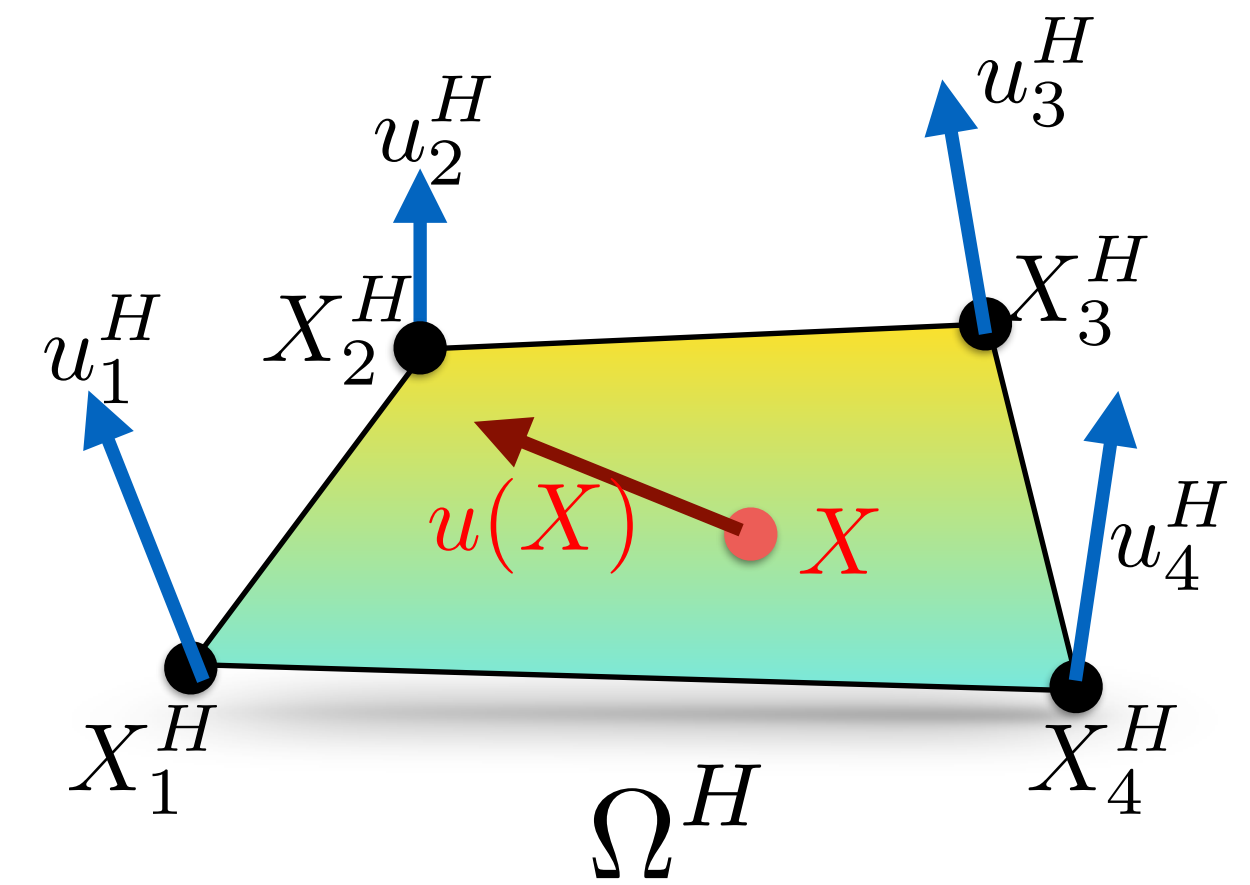
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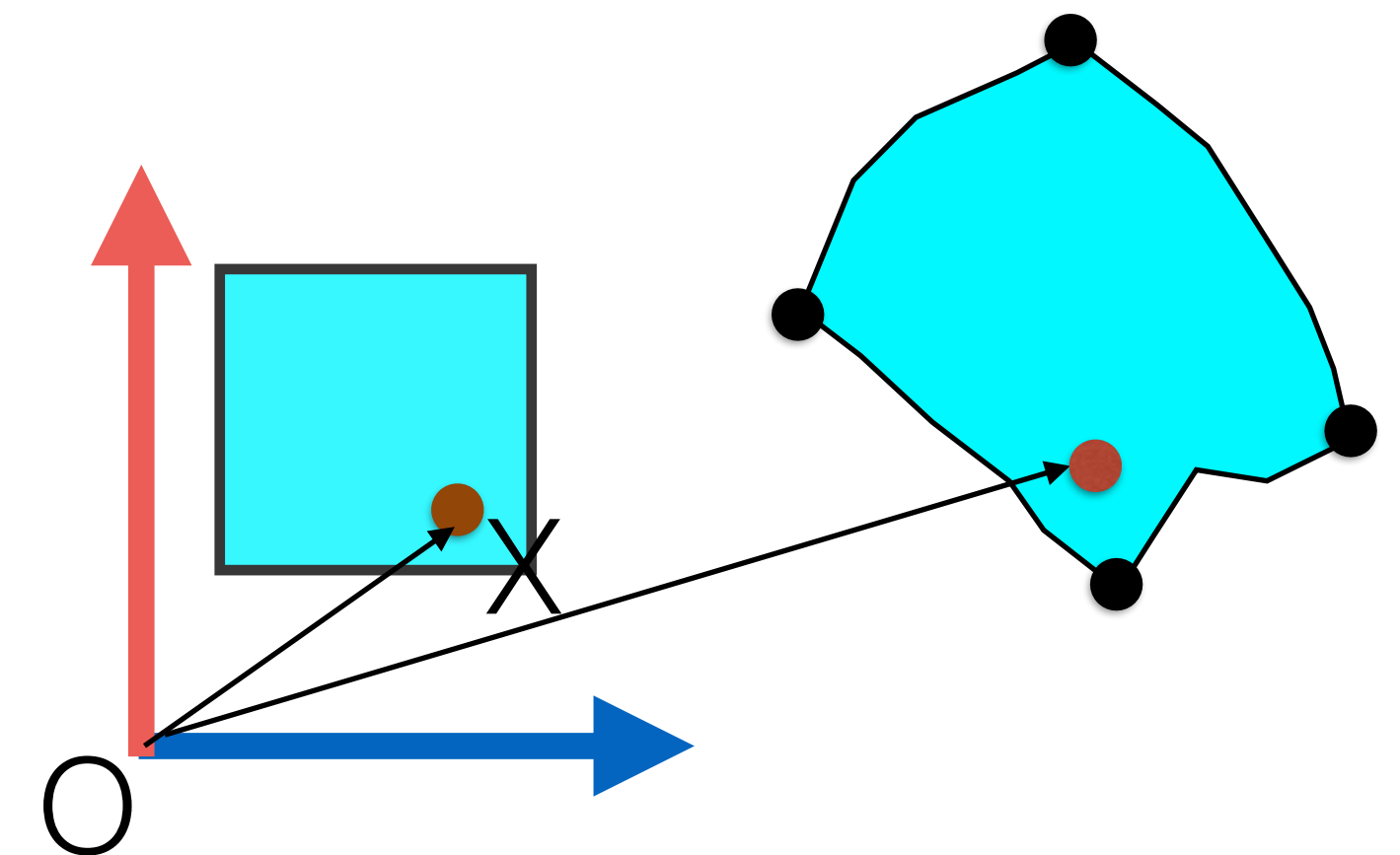
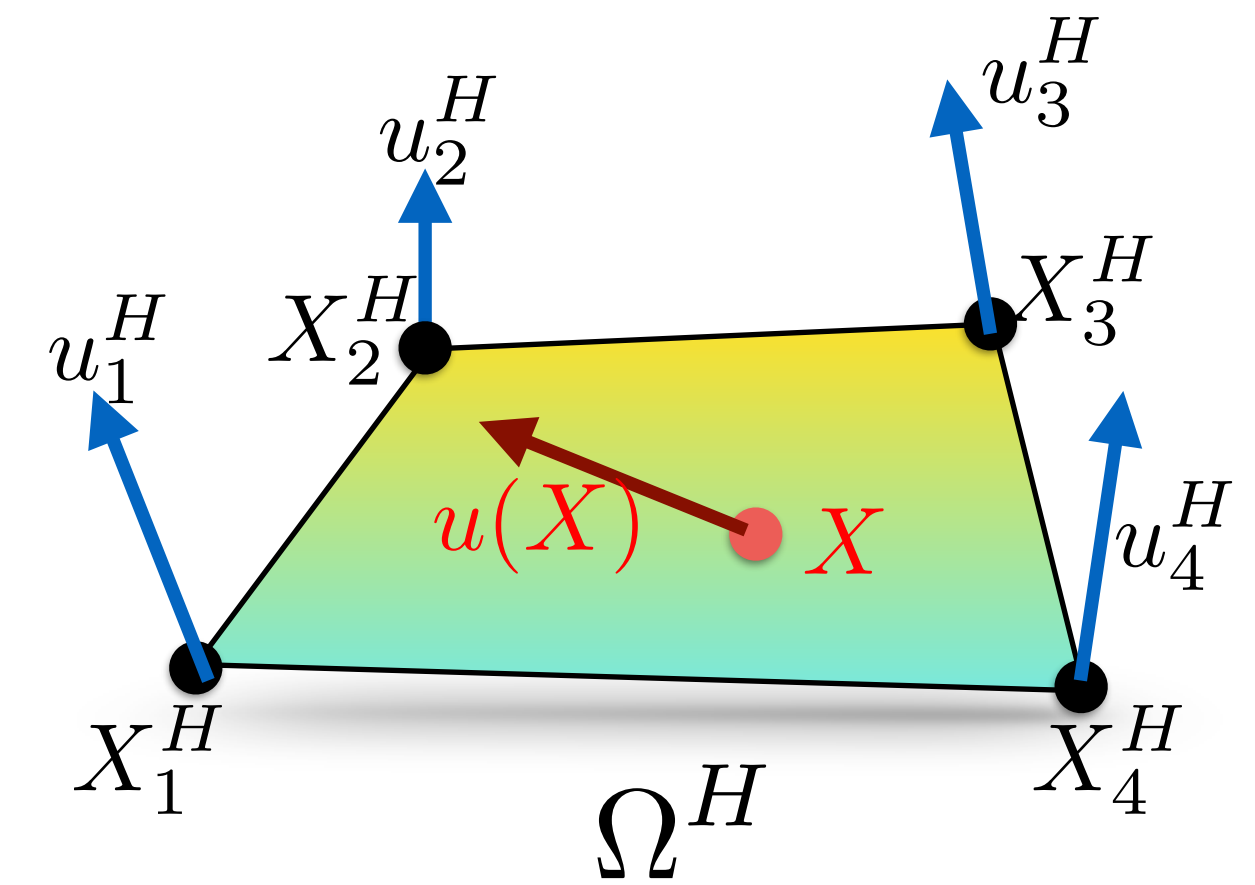
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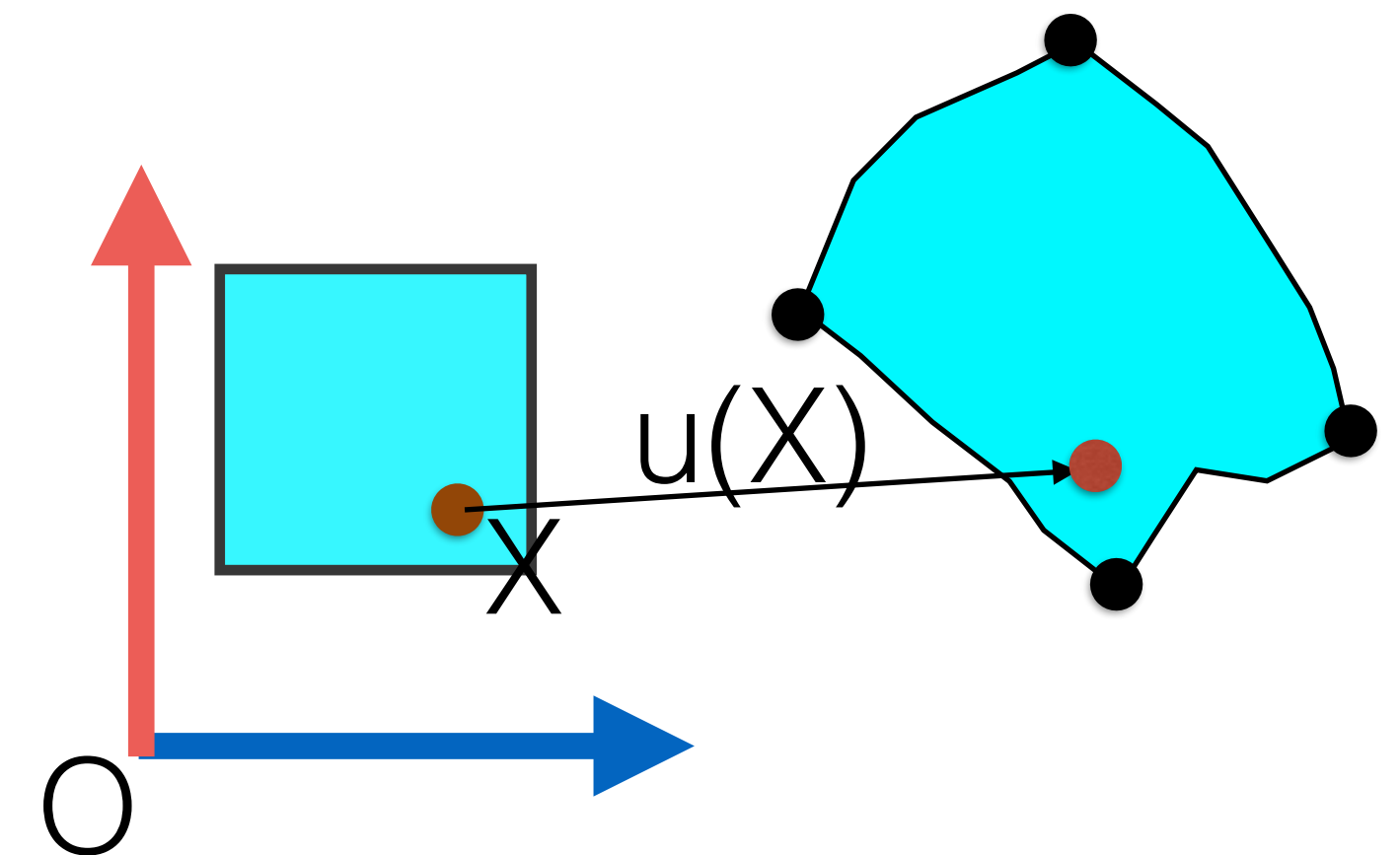
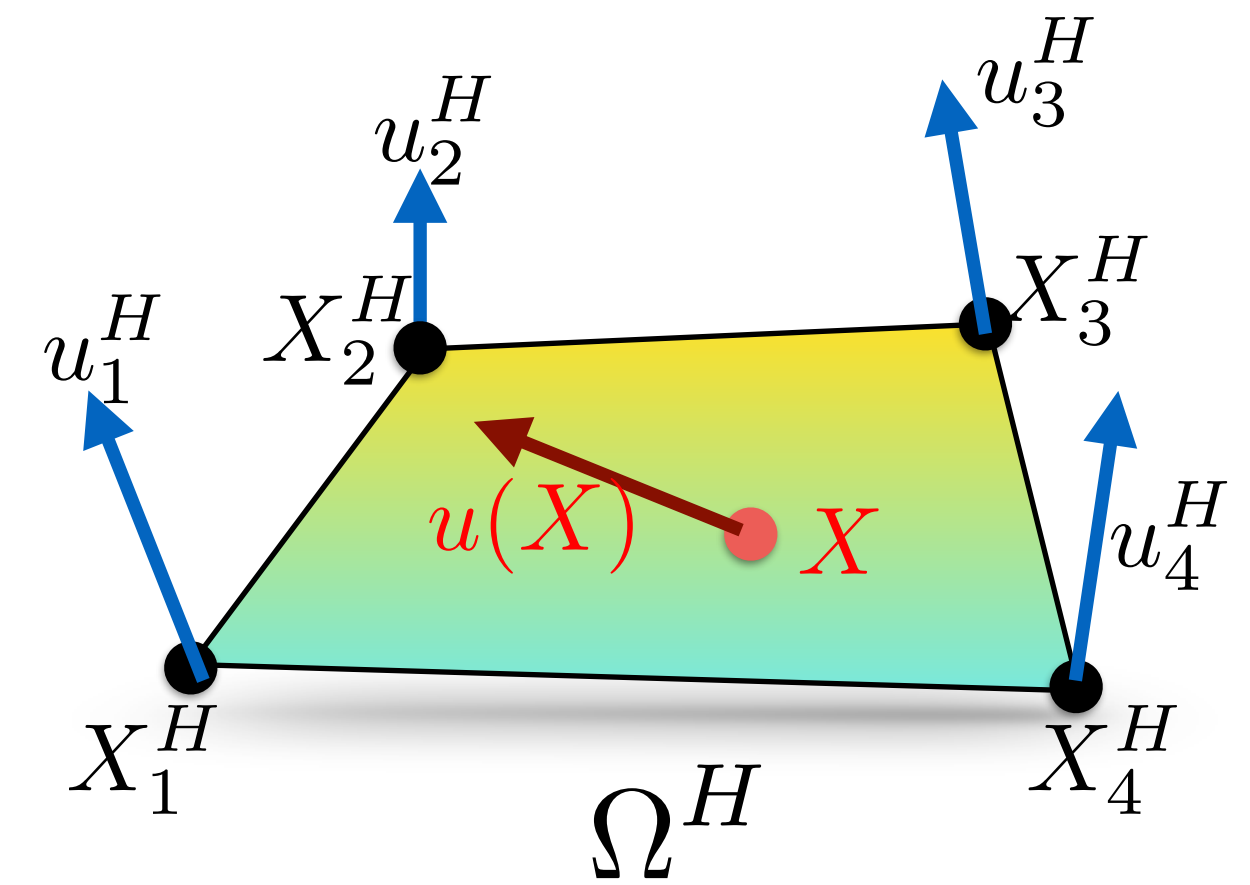
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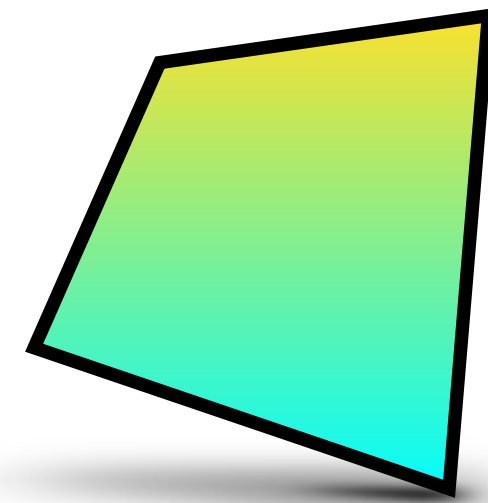
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# Conditions

**Geometric conditions**

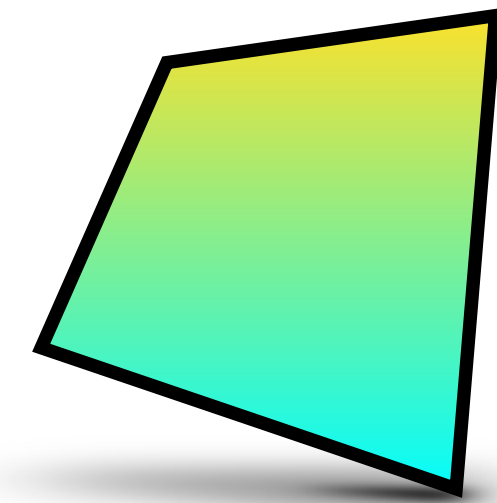


# Conditions

## Geometric conditions

- Translational invariance

$$\sum_i N_i^H(X) = \mathbb{I}$$



# Conditions

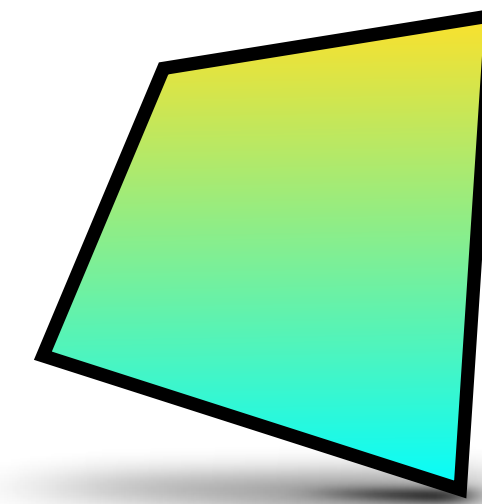
## Geometric conditions

- Translational invariance

$$\sum_i N_i^H(X) = \mathbb{I}$$

- Rotational invariance

$$\sum_i N_i^H(X) [X_i^H]_{\times} = [X]_{\times}$$



# Conditions

## Geometric conditions

- Translational invariance

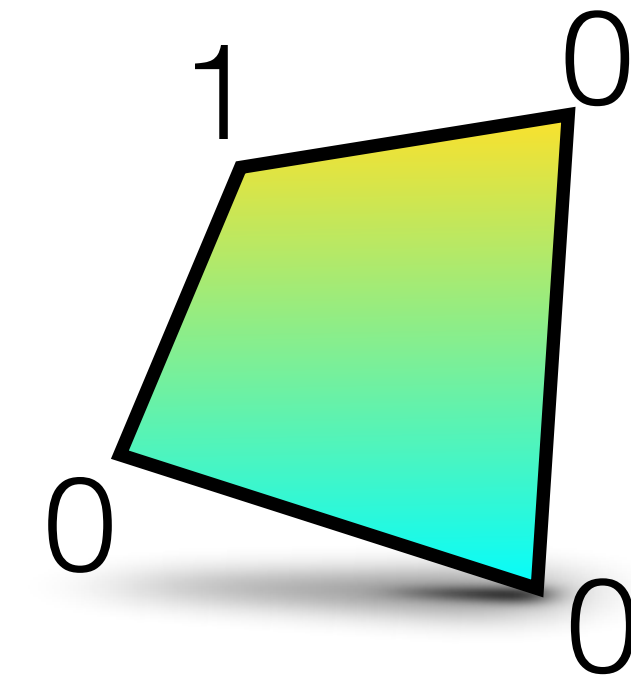
$$\sum_i N_i^H(X) = \mathbb{I}$$

- Rotational invariance

$$\sum_i N_i^H(X) [X_i^H]_{\times} = [X]_{\times}$$

- Node interpolation

$$N_i^H(X_j^H) = \delta_{ij} \mathbb{I}$$





# Conditions

**Physical condition**

# Conditions

## Physical condition

- *Reconstruct global “representative” deformation*

$$h_{ab}(X) = \sum_i N_i^H(X) h_{ab}(X_i^H)$$

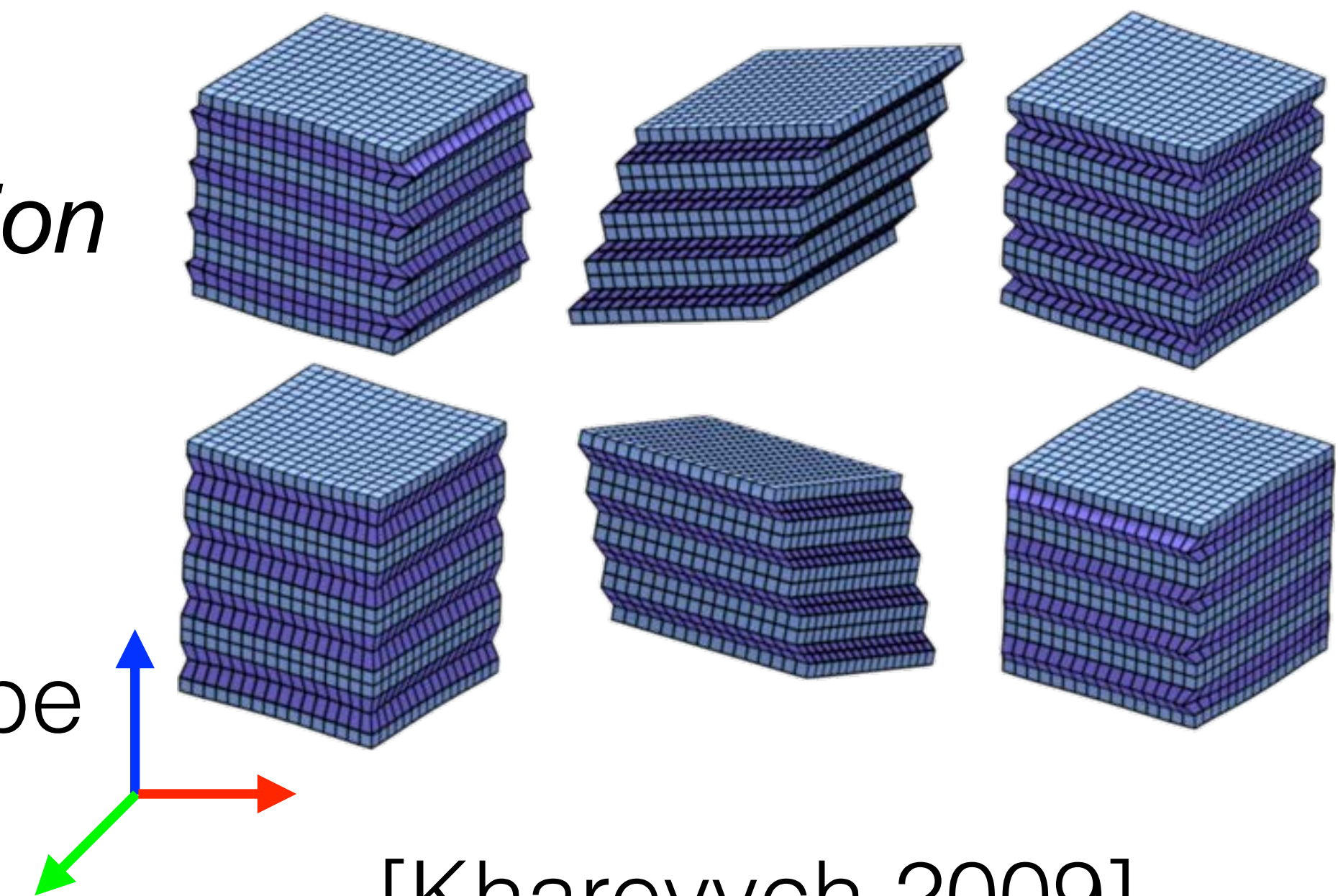
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- *Reconstruct global “representative” deformation*

$$h_{ab}(X) = \sum_i N_i^H(X) h_{ab}(X_i^H)$$

- Global harmonic displacement at rest shape





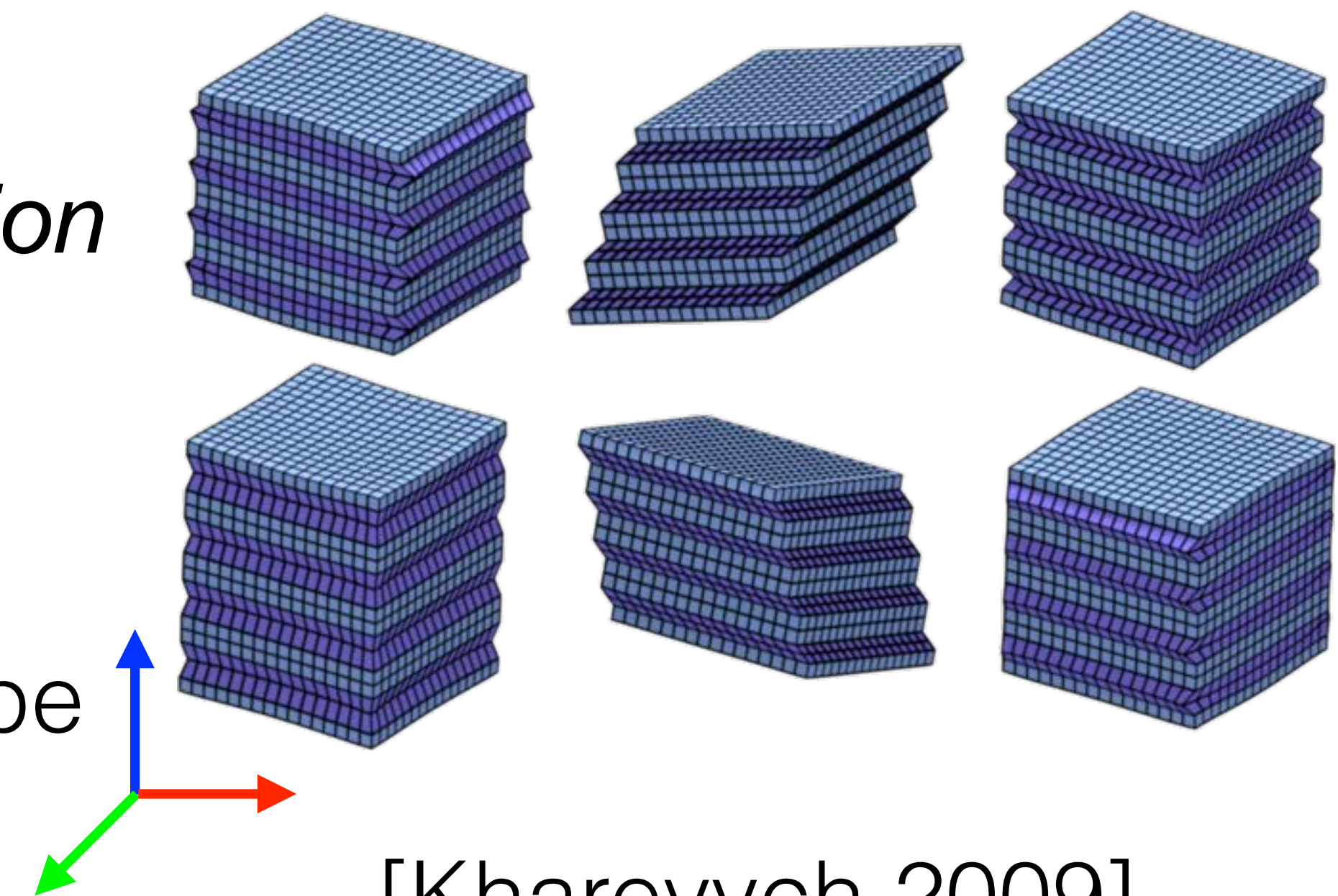
# Conditions

## Physical condition

- *Reconstruct global “representative” deformation*

$$h_{ab}(X) = \sum_i N_i^H(X) h_{ab}(X_i^H)$$

- Global harmonic displacement at rest shape
- Contribute 6 more constraints in 3D for each element



[Kharevych 2009]



# Numerical conditioning

## Smooth regularization

$$\int_{\Omega} \text{tr} \left( (\nabla N_i^H)^T : M : \nabla N_i^H \right) dX$$

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$$\int_{\Omega} \text{tr} \left( (\nabla N_i^H)^T : \boxed{M} : \nabla N_i^H \right) dX$$

**rank-4 tensor**

# Numerical conditioning

## Smooth regularization

$$\int_{\Omega} \text{tr} \left( (\nabla N_i^H)^T : \boxed{M} : \nabla N_i^H \right) dX$$

**rank-4 tensor**

- Two Options of metric
  - Harmonic:  $M = \mathbb{I}$
  - $\Psi$ -harmonic:  $M = \partial^2 \Psi / \partial F^2$   
( $\Psi$ -constitutive model,  $F$ -deformation gradient)

# Summary

- Finding basis ->



# Summary

- Finding basis ->

***Solve a constrained quadratic programming per element***

$$\int_{\Omega} \text{tr} \left( (\nabla N_i^H)^T : M : \nabla N_i^H \right) dX$$

$$\text{s.t. } \sum_i N_i^H(X) = \mathbb{I}$$

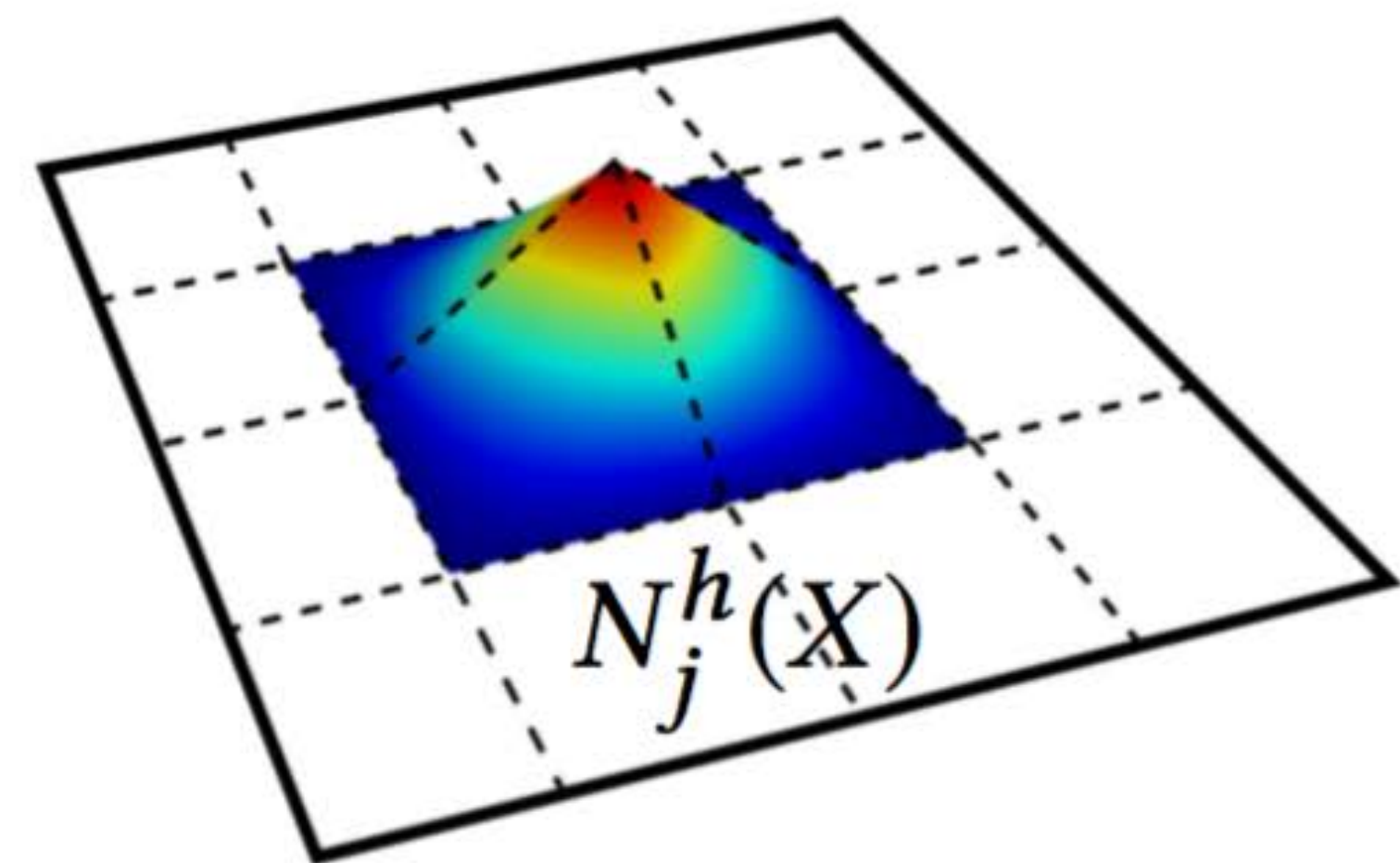
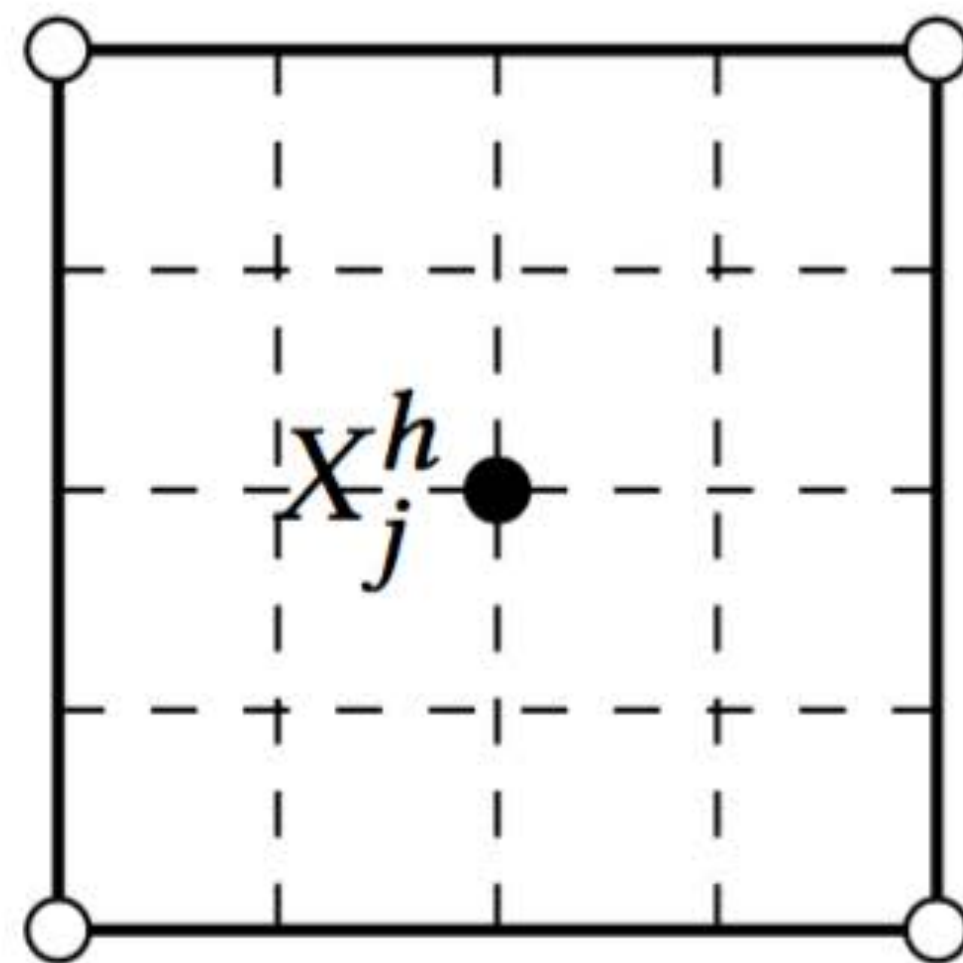
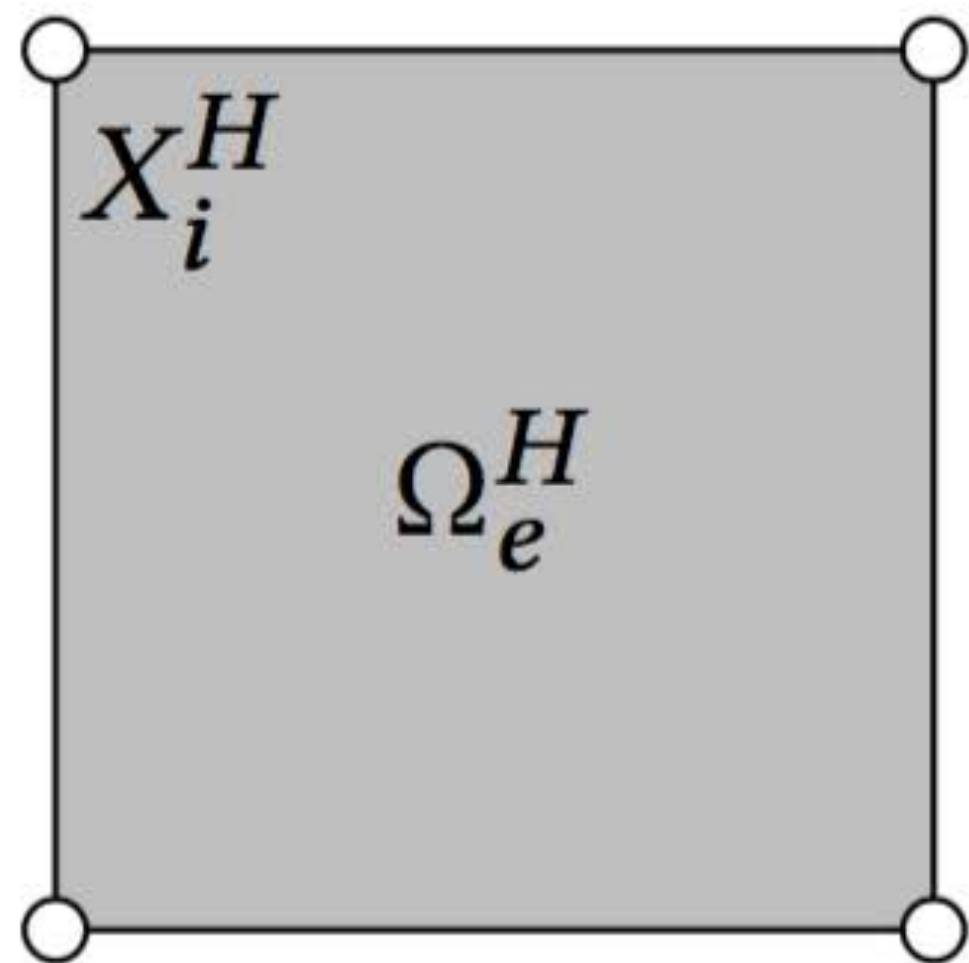
$$\sum_i N_i^H(X) [X_i^H]_{\times} = [X]_{\times}$$

$$\sum_i N_i^H(X) h_{ab}(X_i^H) = h_{ab}(X)$$

$$N_i^H(X_j^H) = \delta_{ij} \mathbb{I}$$

# Basis discretization

- Our basis functions are discretely represented



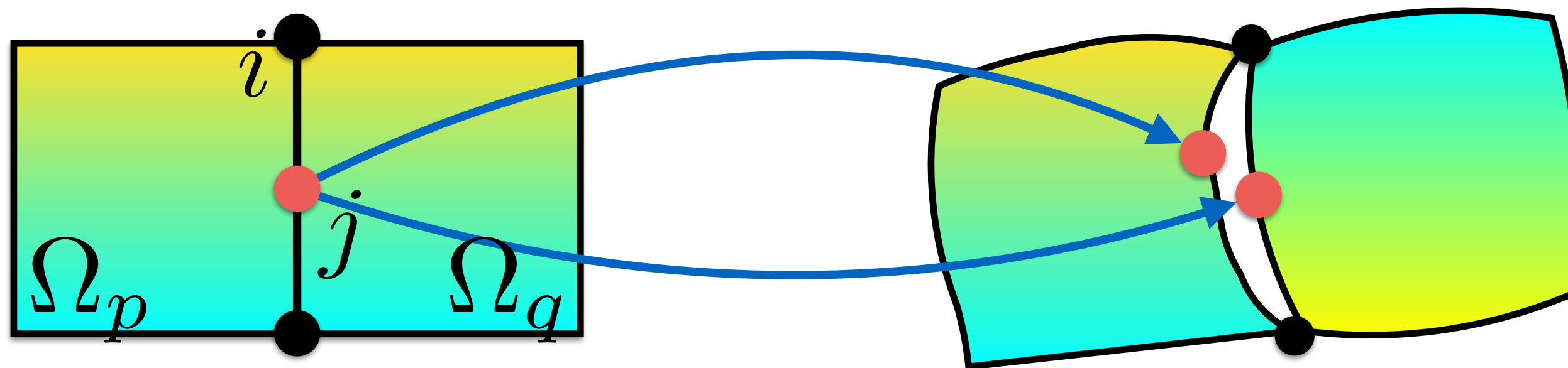
piecewise bilinear function

$$N_i^H(X) = \sum_j n_{ij} N_j^h(X)$$

# Balance

- Our optimized basis function does not guarantee  $C^0$ -continuity

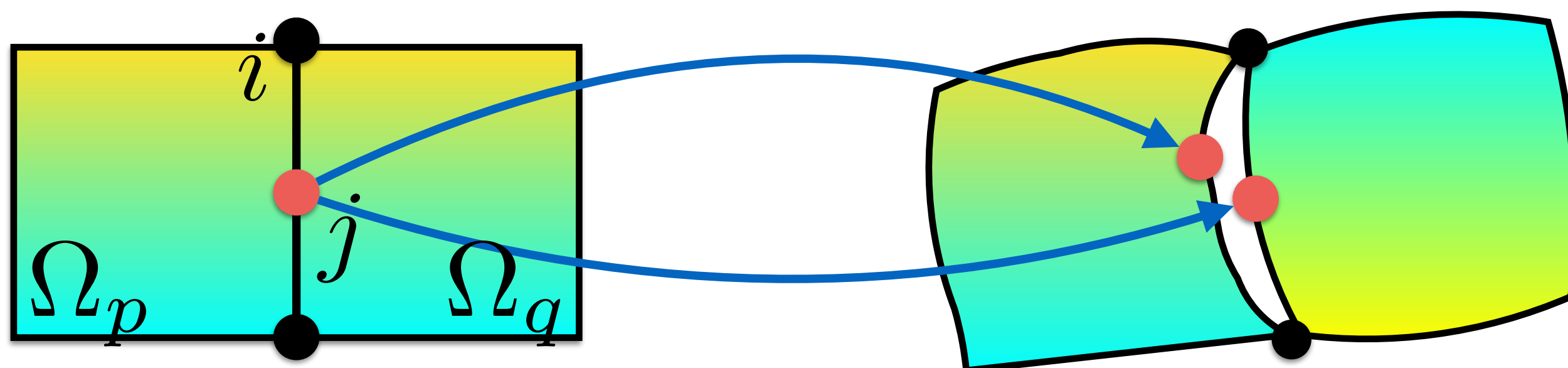
$$N_{p,i}(X_j^h) \neq N_{q,i}(X_j^h) \longrightarrow u_p(X_j^h) \neq u_q(X_j^h)$$



# Balance

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$$N_{p,i}(X_j^h) \neq N_{q,i}(X_j^h) \longrightarrow u_p(X_j^h) \neq u_q(X_j^h)$$

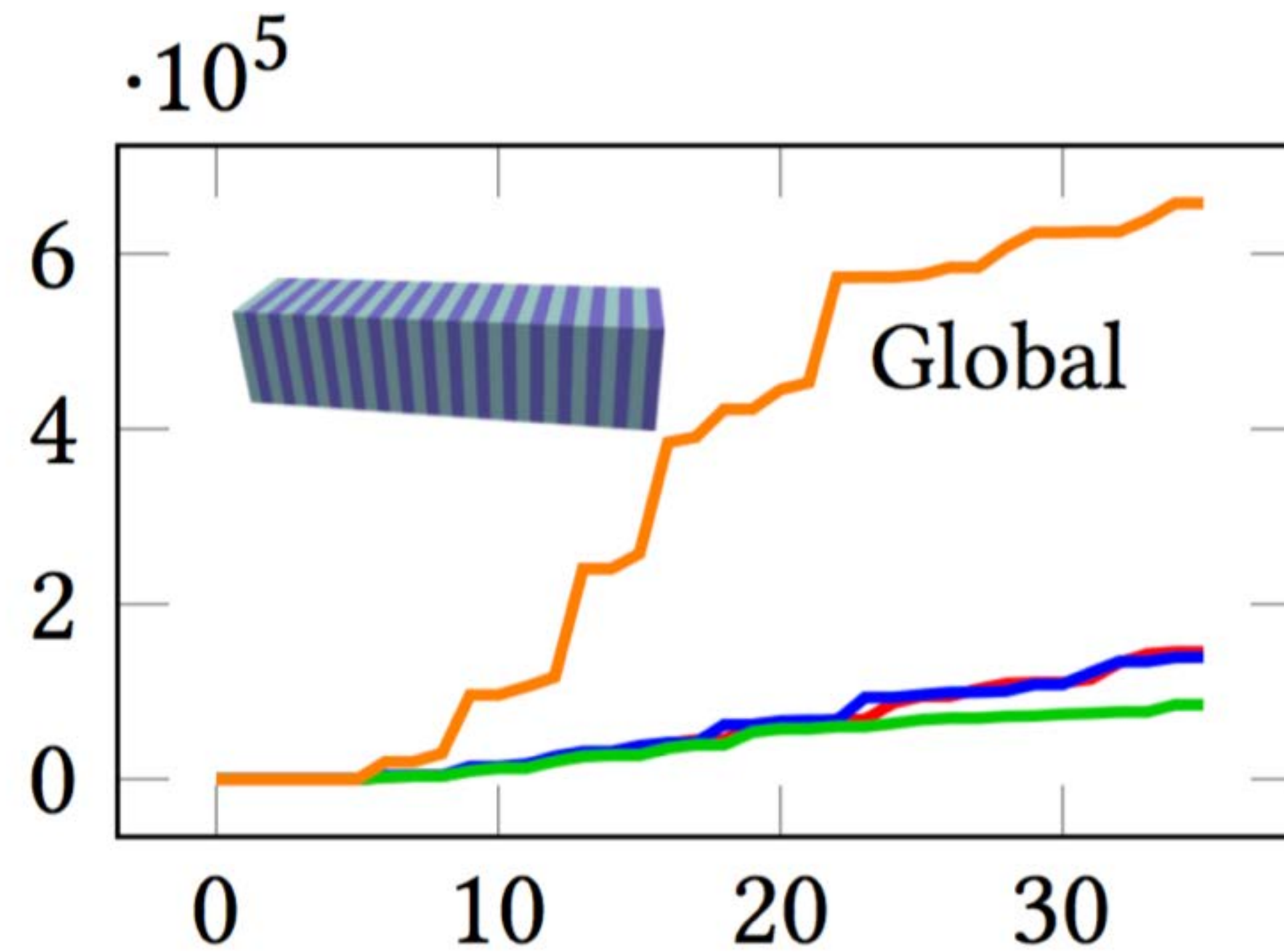
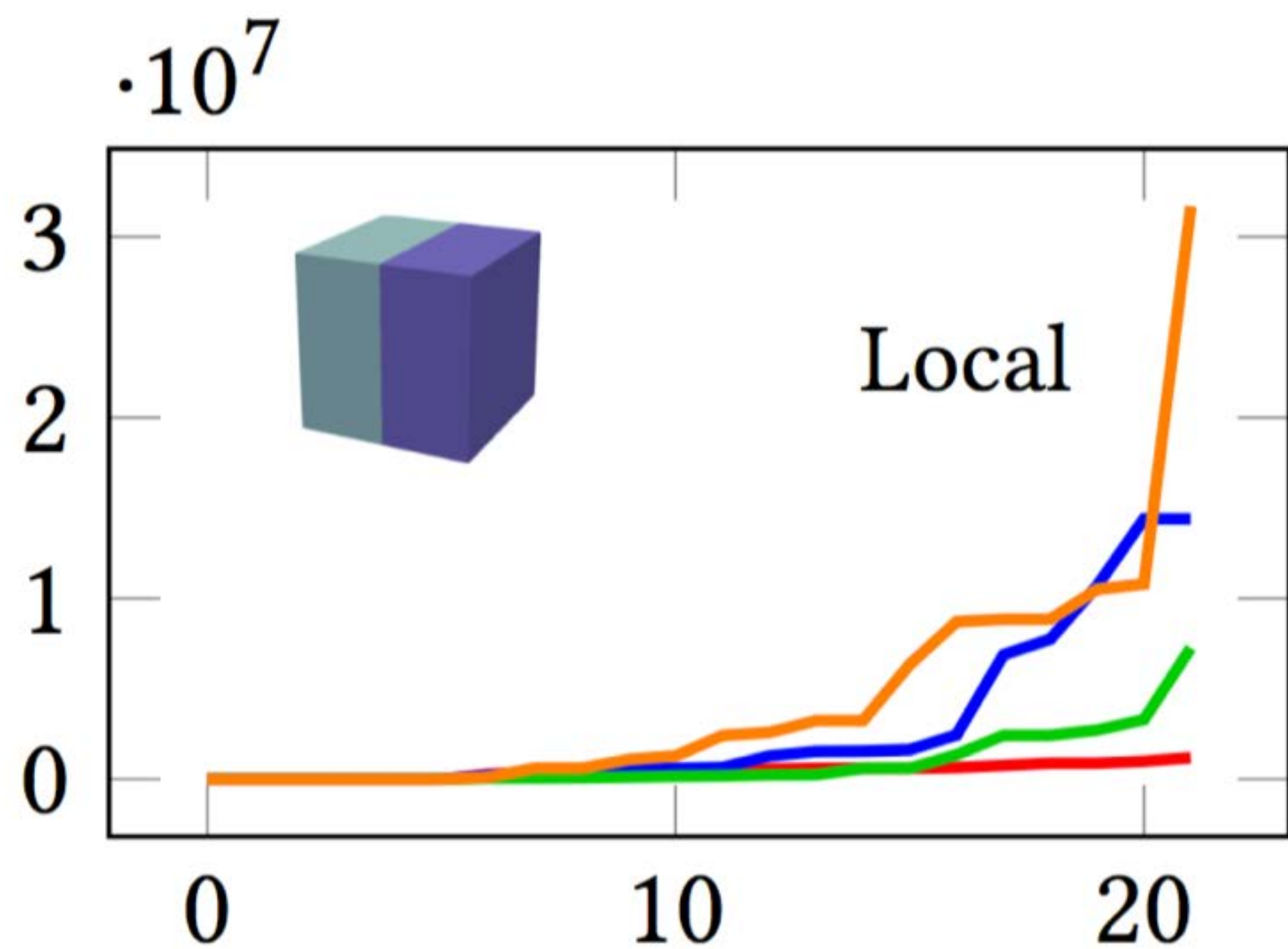


- **Coarse element** generally appears to be “**stiffer**”.
- **Discontinuous** basis functions make system “**softer**”.





# Make balance

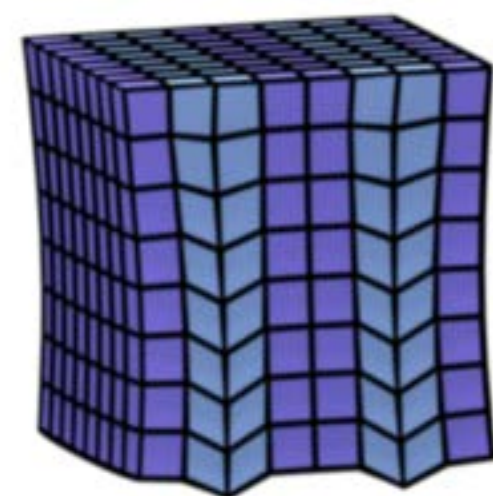
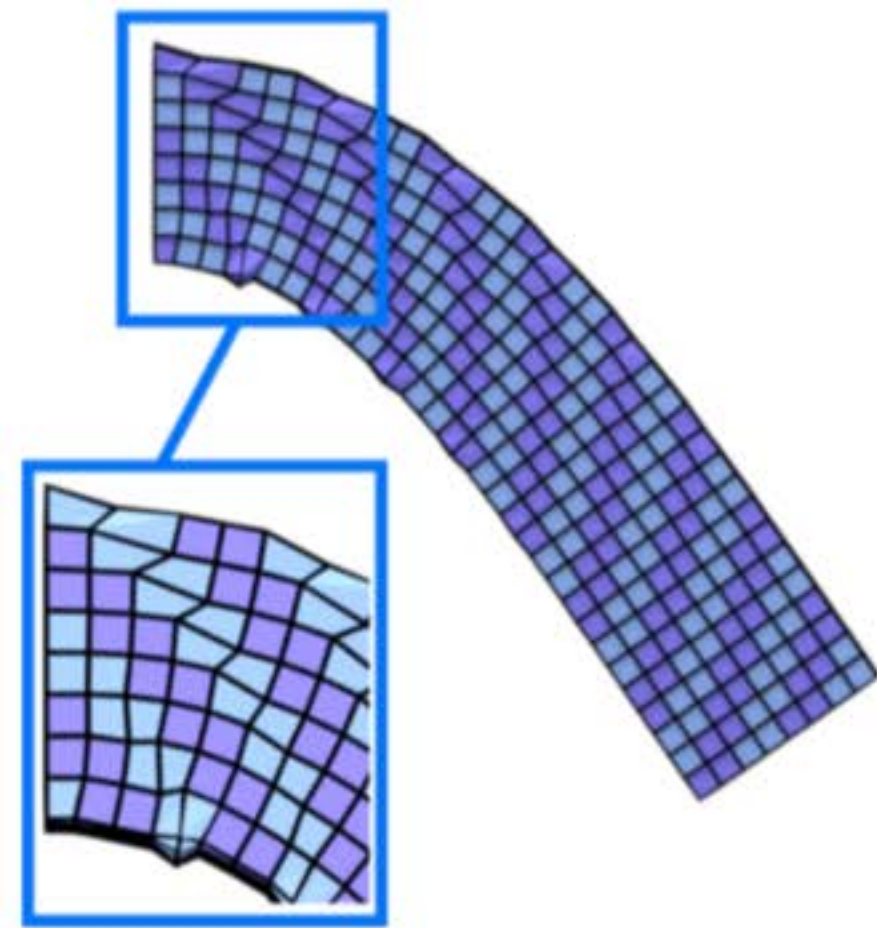


- trilinear on  $\Omega^h$
- harmonic on  $\Omega^H$
- trilinear on  $\Omega^H$
- $\Psi$ -harmonic on  $\Omega^H$

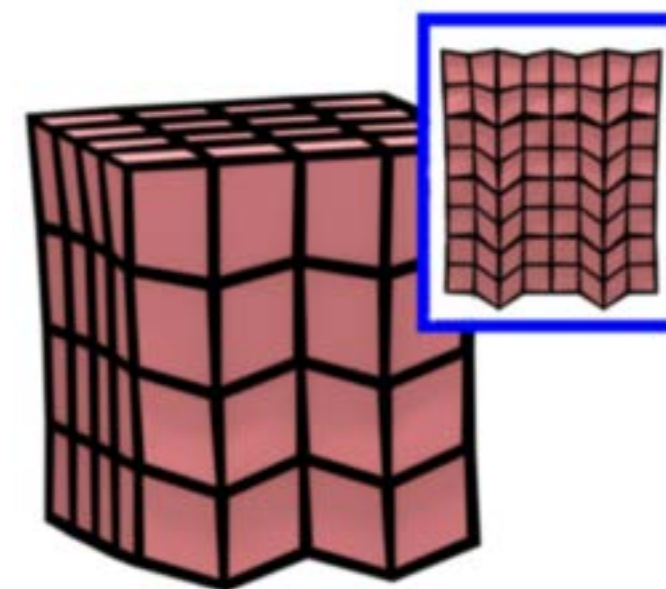
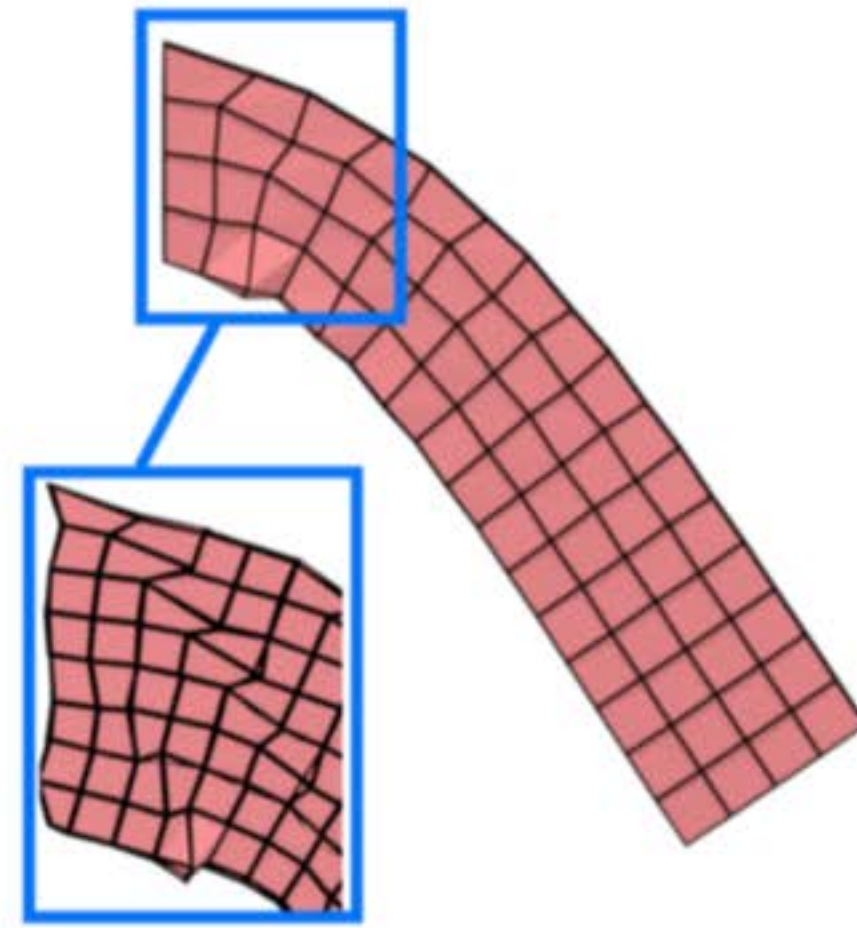


# Make balance

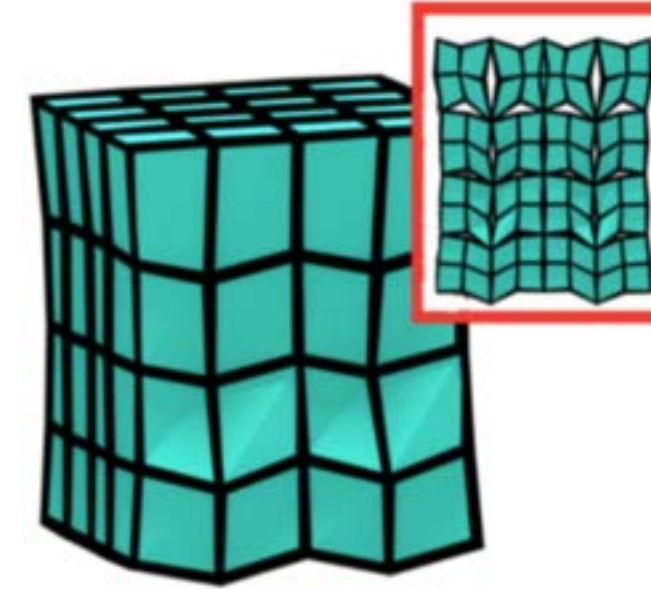
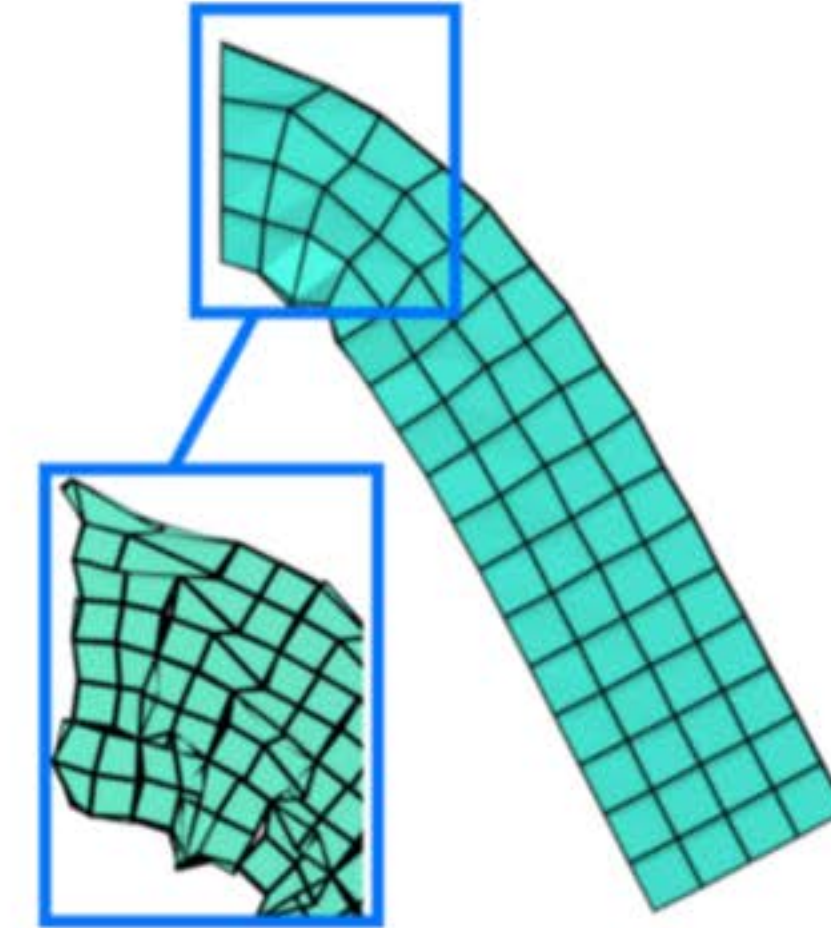
Fine



harmonic



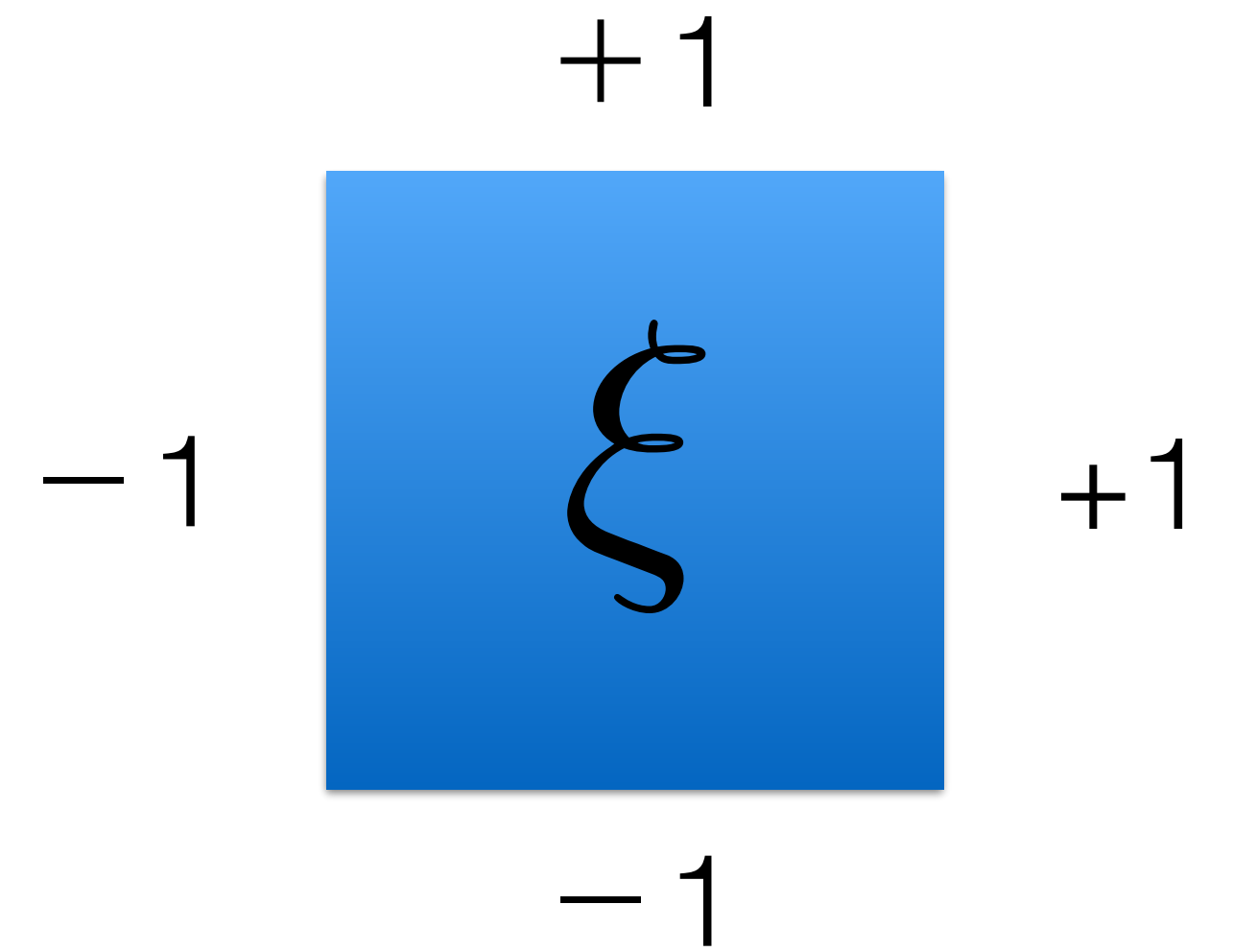
$\Psi$ -harmonic



# Simulation

- Calculation of deformation gradient

$$\begin{aligned} \nabla_X x &= \nabla_X u + \mathbf{I} = (R_e - \mathbf{I}) + \sum_i R_e \otimes (R_e^T x_i - X_i) : \frac{\partial N_i^H}{\partial X} + \mathbf{I} \\ &= R_e + \left( \sum_i R_e \otimes (R_e^T x_i - X_i) : \frac{\partial N_i^H}{\partial \xi} \right) \left( \sum_j \frac{\partial \bar{N}_j^H}{\partial \xi} \right)^{-1} \end{aligned}$$

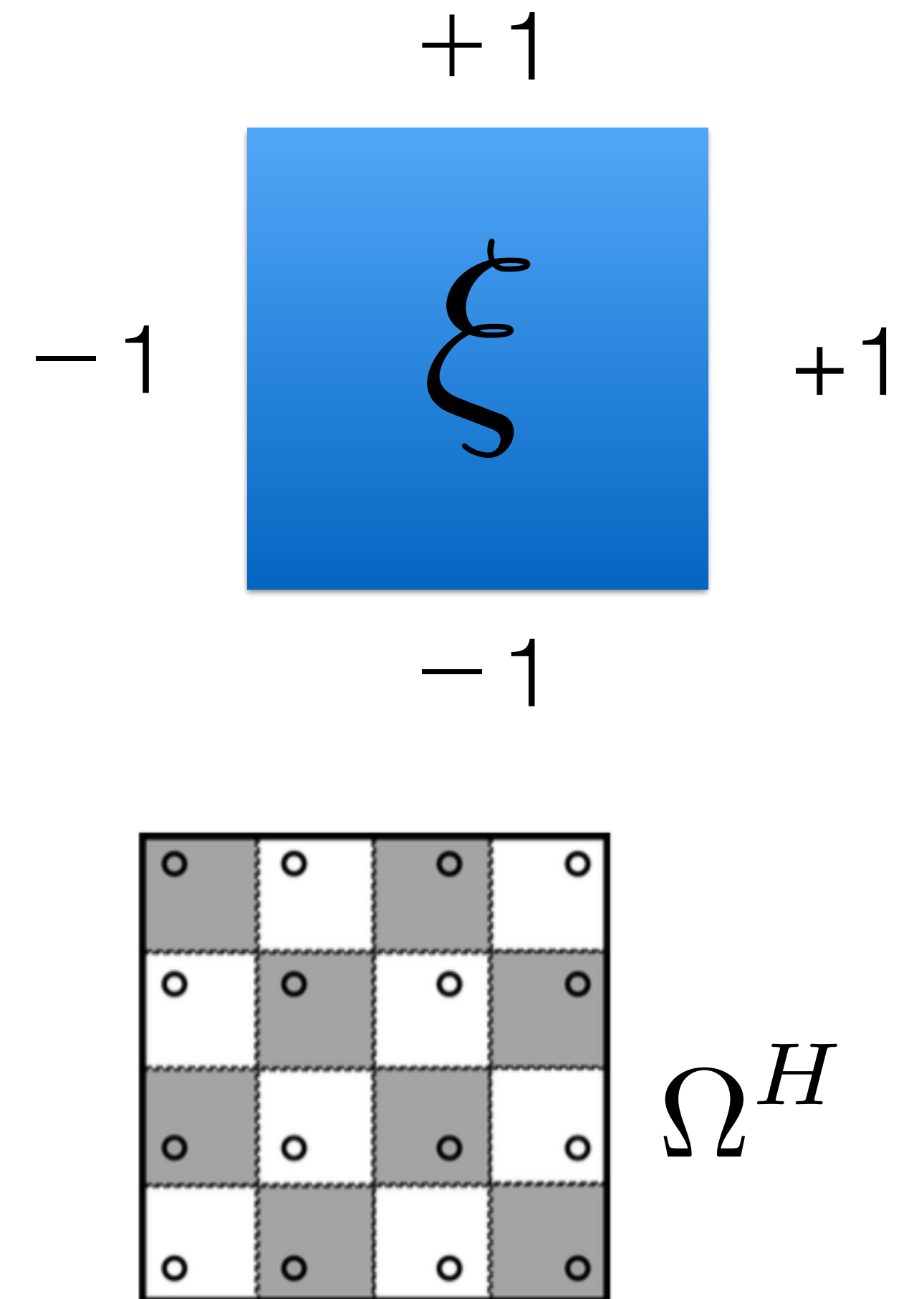


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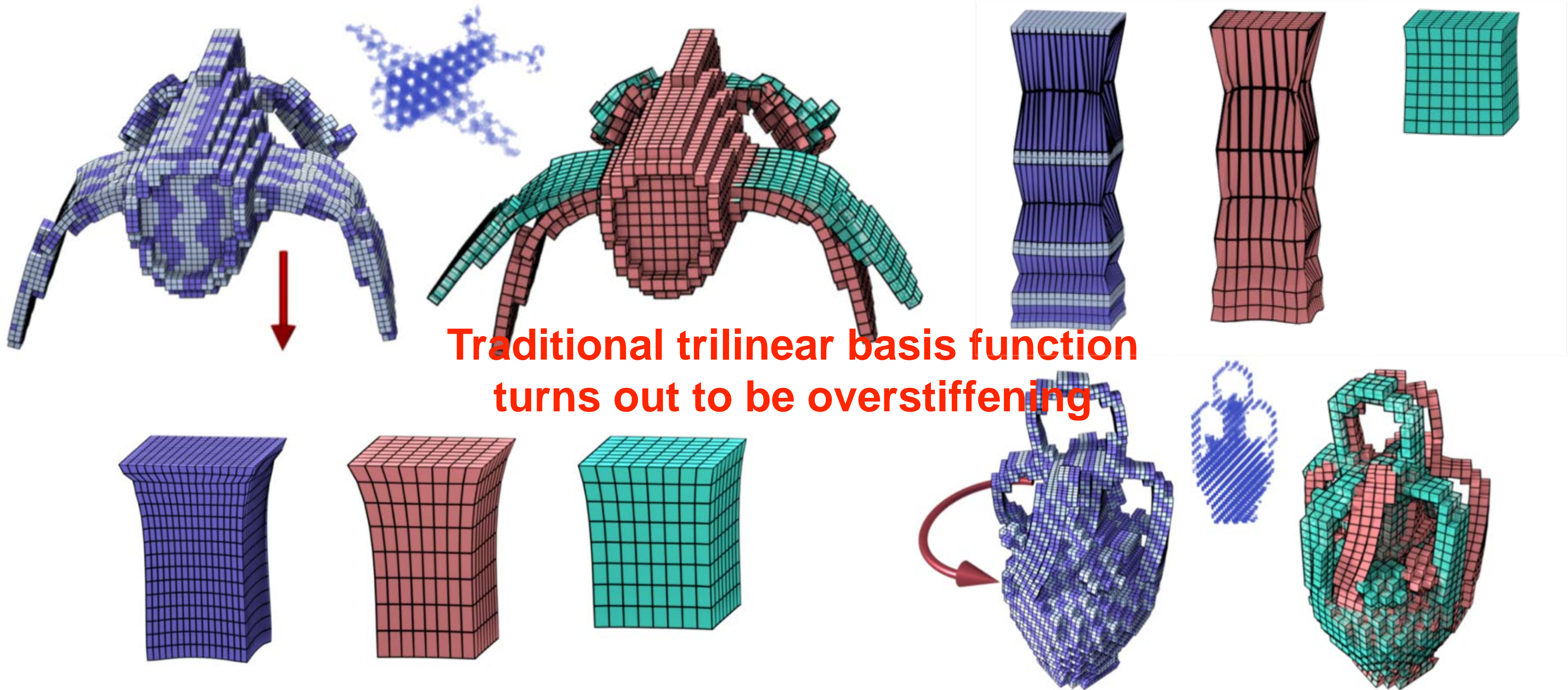
- Quadrature: standard Gaussian quadrature



# Results

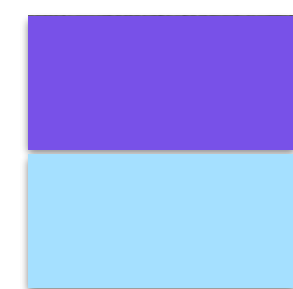
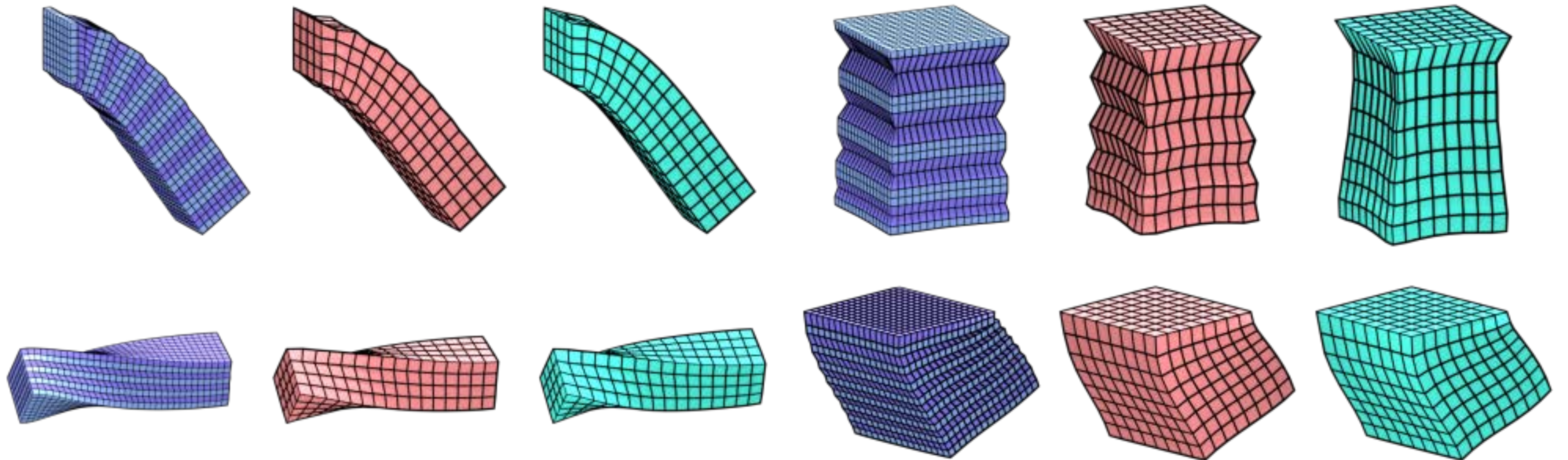


# Comparison with trilinear basis

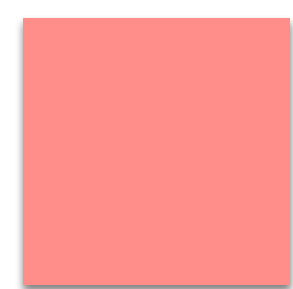




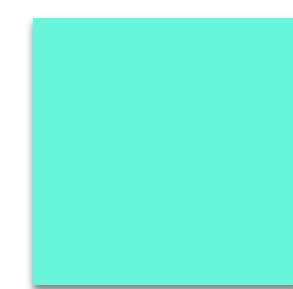
# Relation to [Kharevych 2009]



Fine



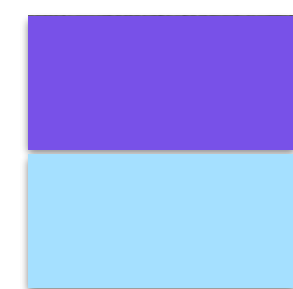
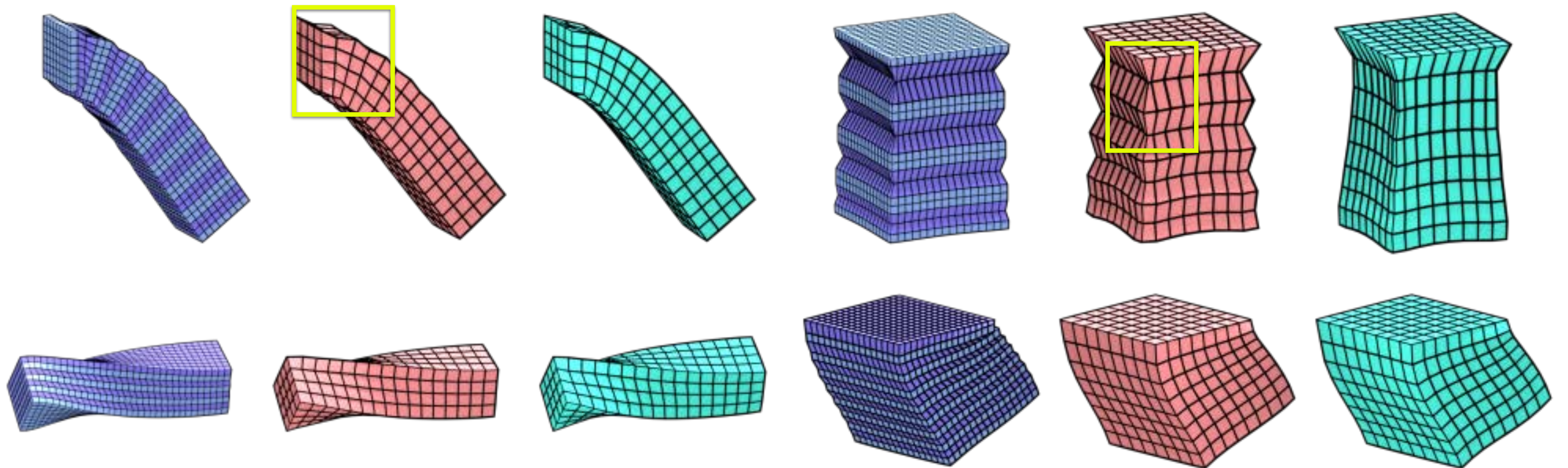
Our method



[Kharevych 2009]



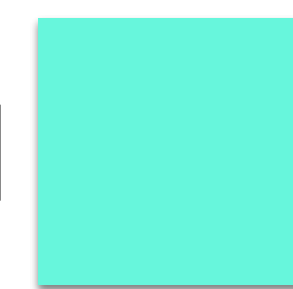
# Relation to [Kharevych 2009]



Fine



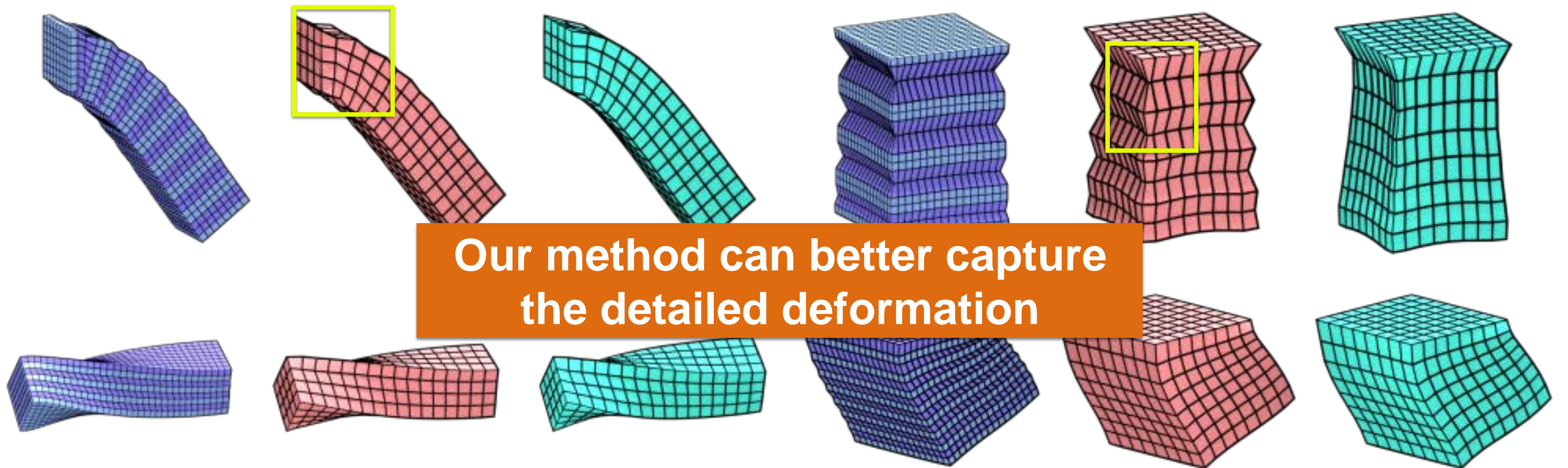
Our method



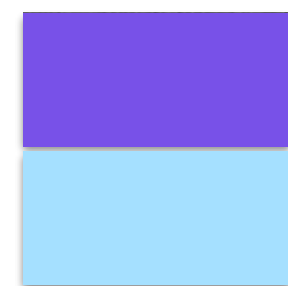
[Kharevych 2009]



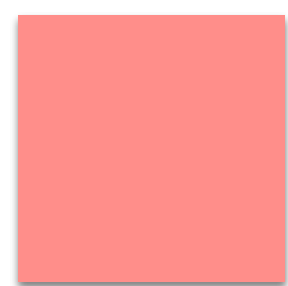
# Relation to [Kharevych 2009]



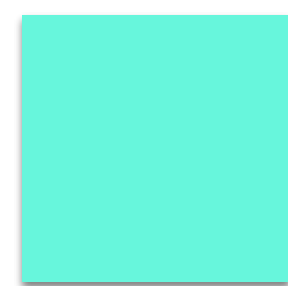
**Our method can better capture the detailed deformation**



Fine



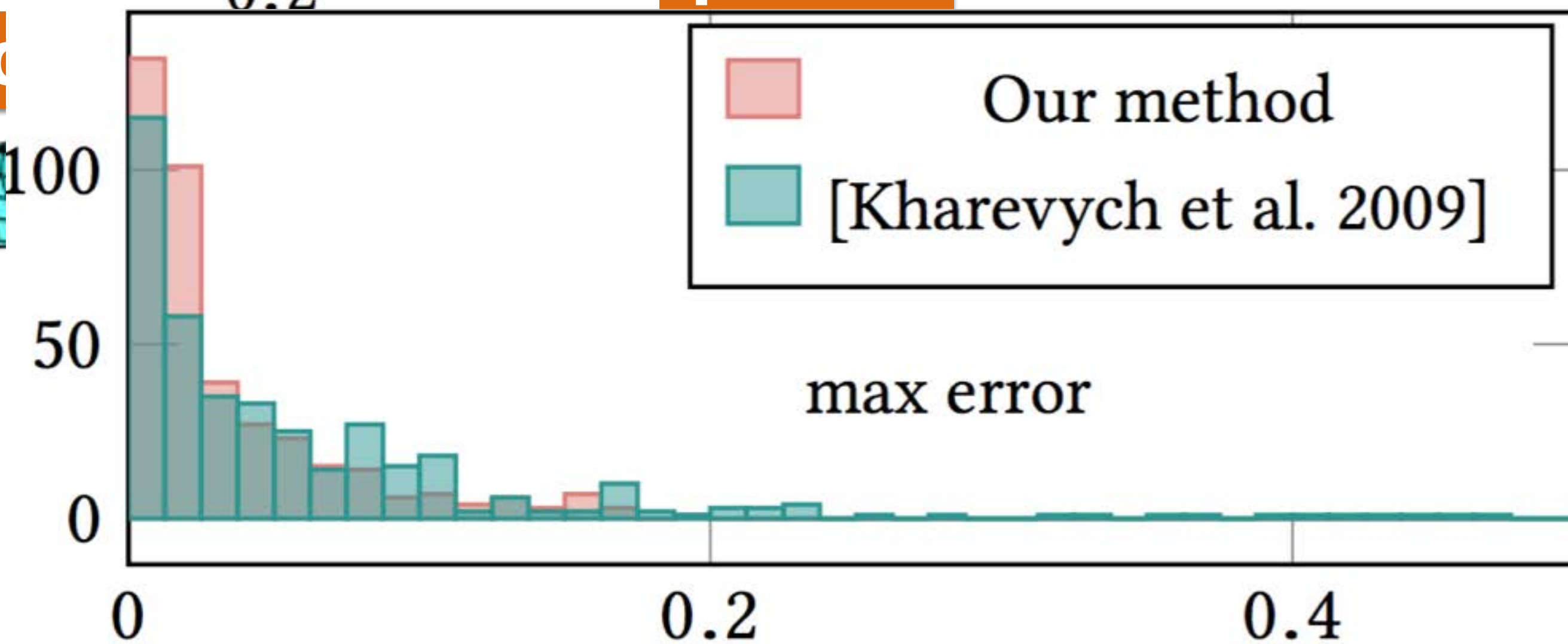
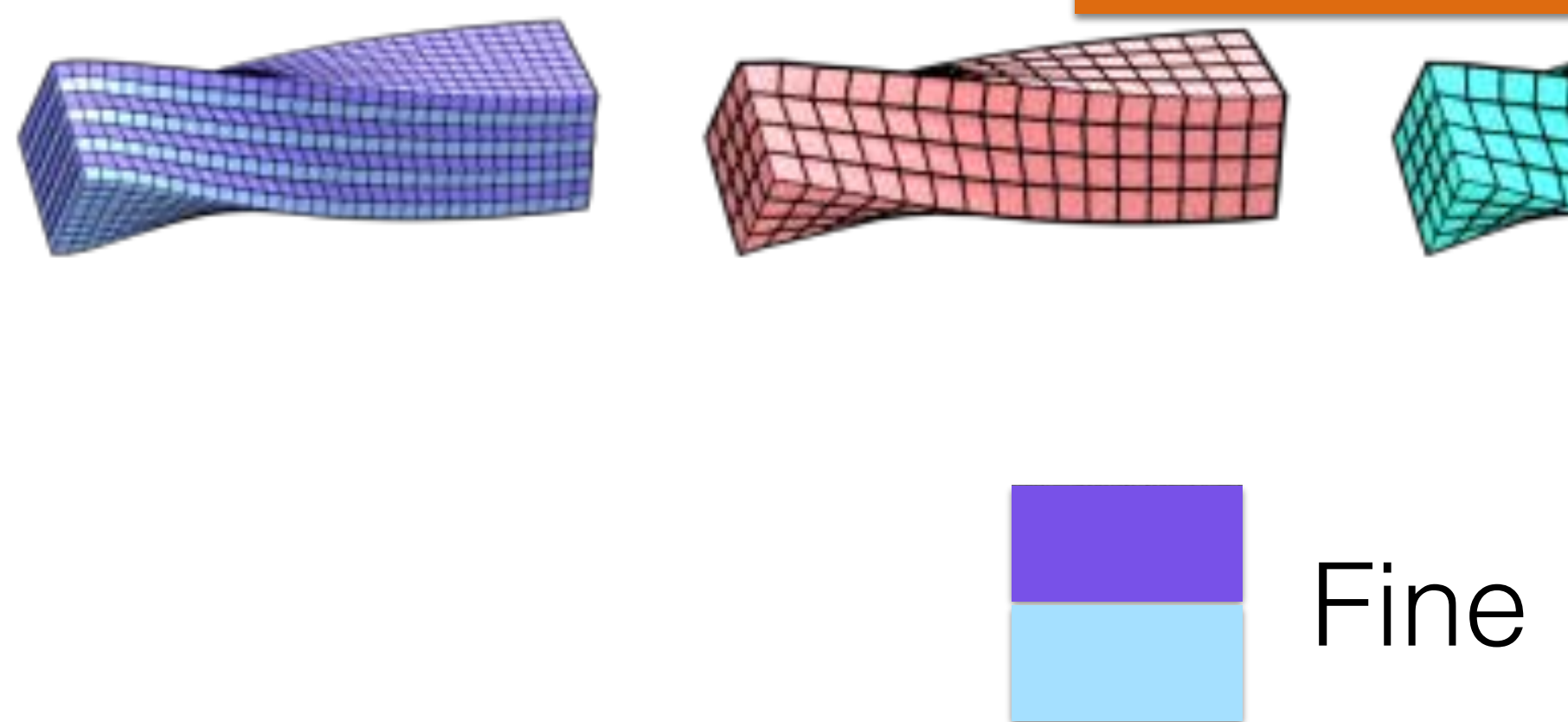
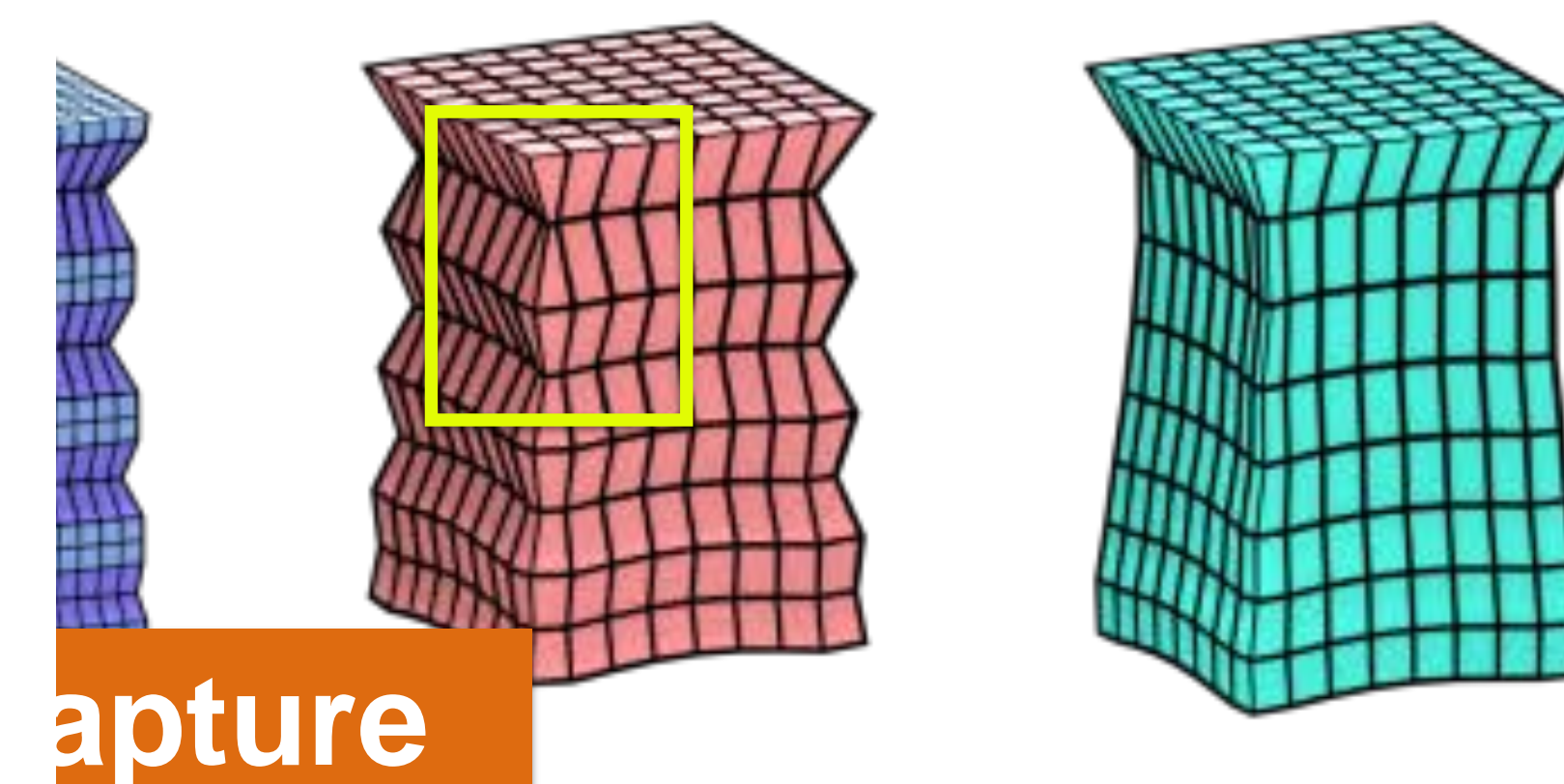
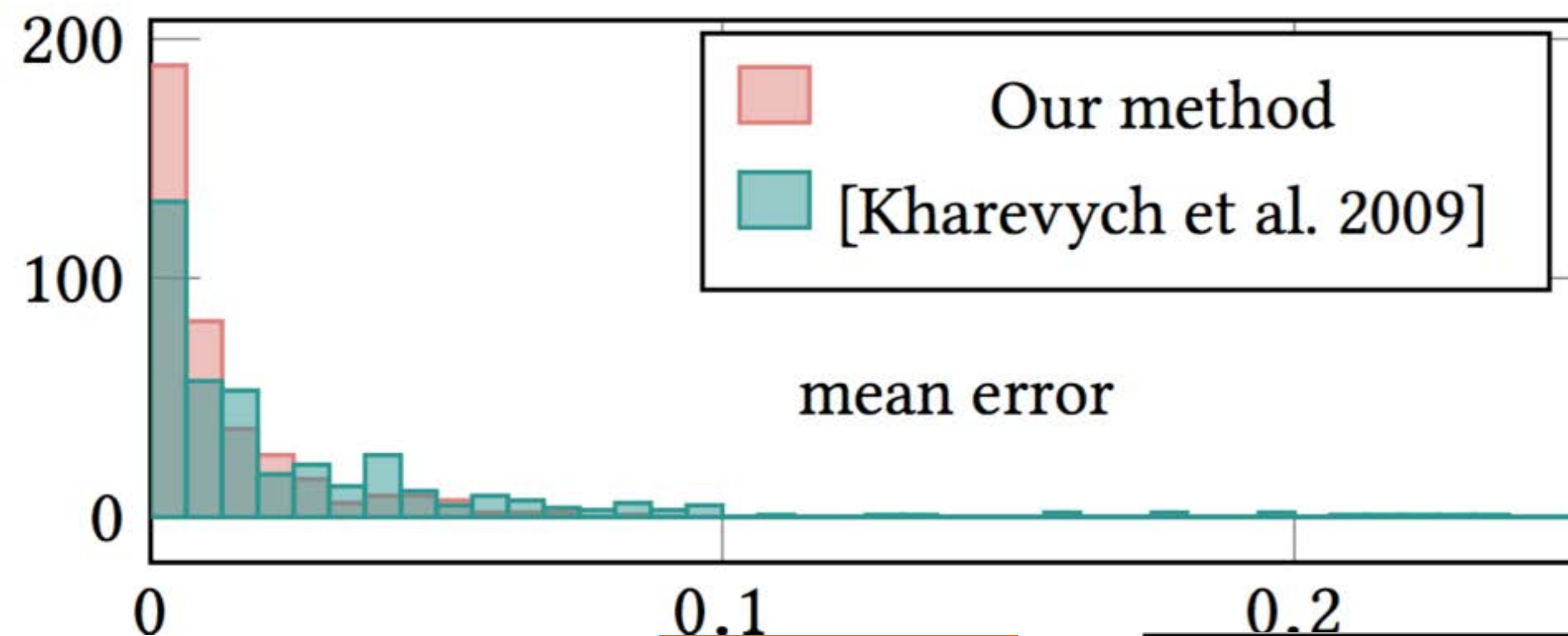
Our method



[Kharevych 2009]

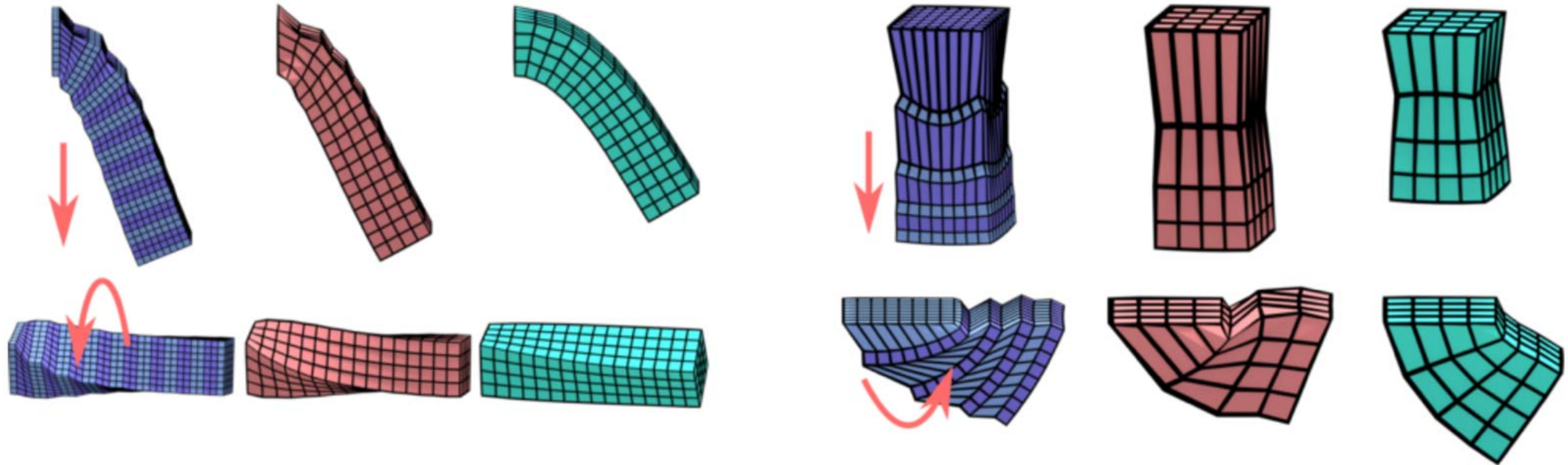


# Relation to [Kharevych 2009]



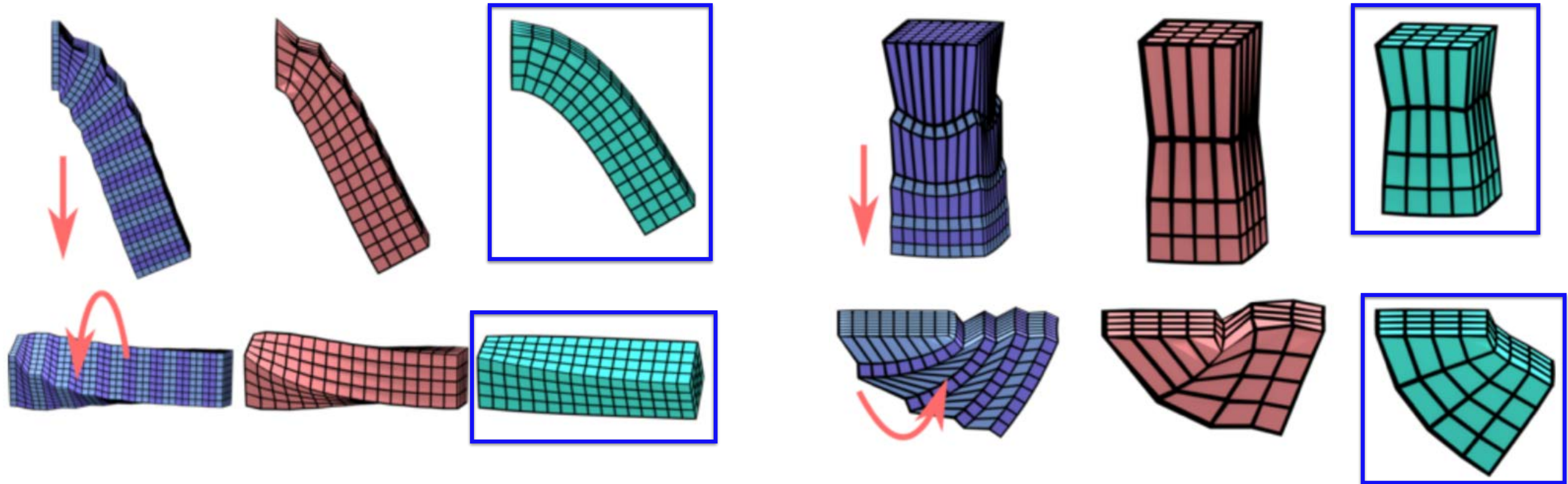


# Relation to [Nesme 2009]



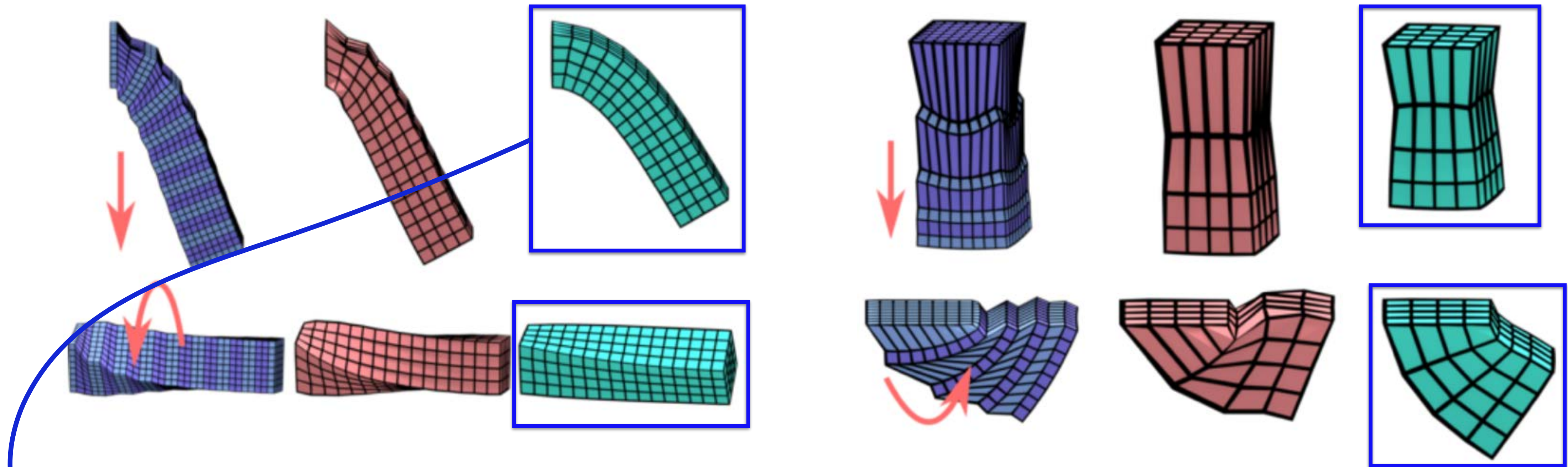


# Relation to [Nesme 2009]





# Relation to [Nesme 2009]

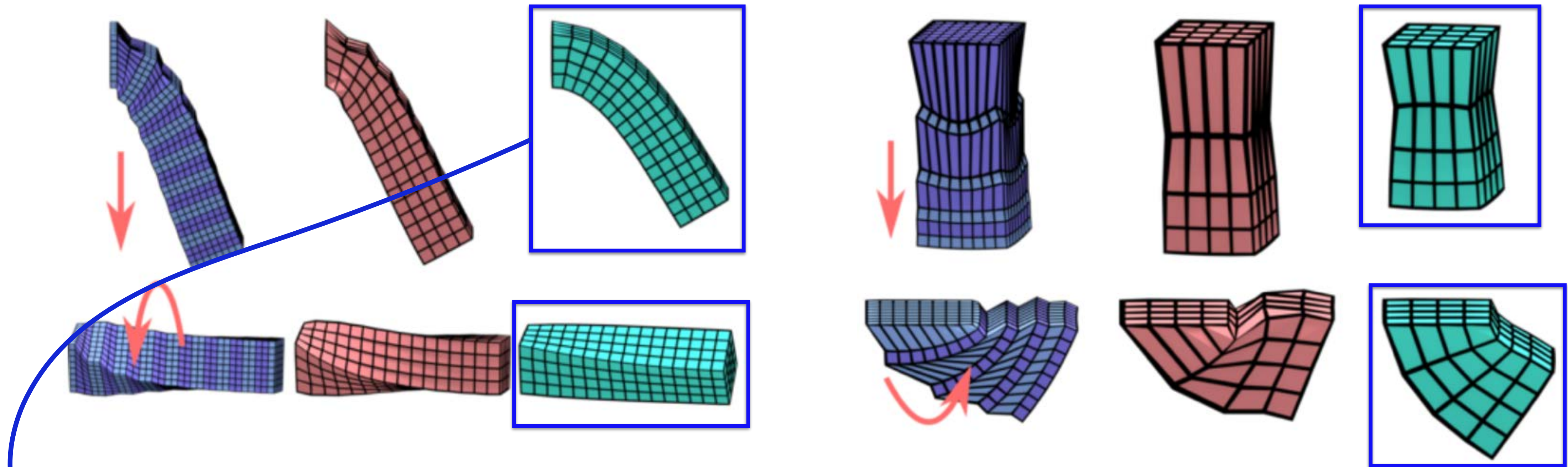


**Diagonal basis**  
**Translation invariance**  
**Rotation invariance**

**Far boundary vanishing**  
**Node interpolation**  
**Psi-harmonic**

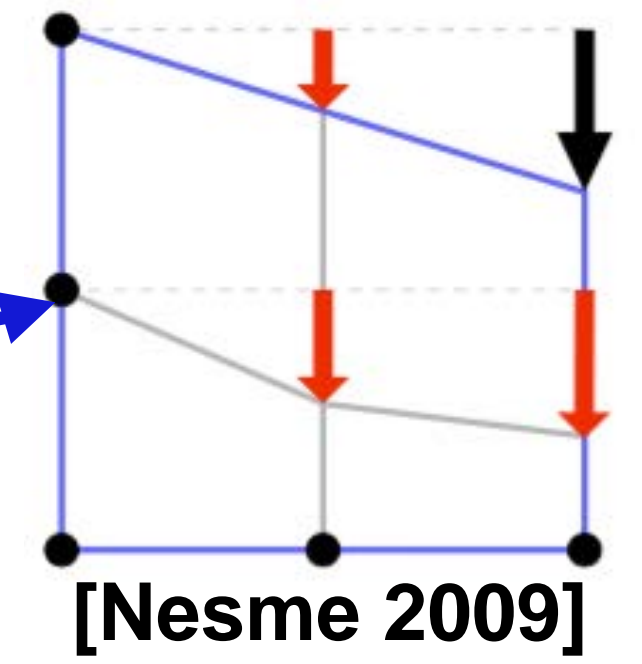


# Relation to [Nesme 2009]



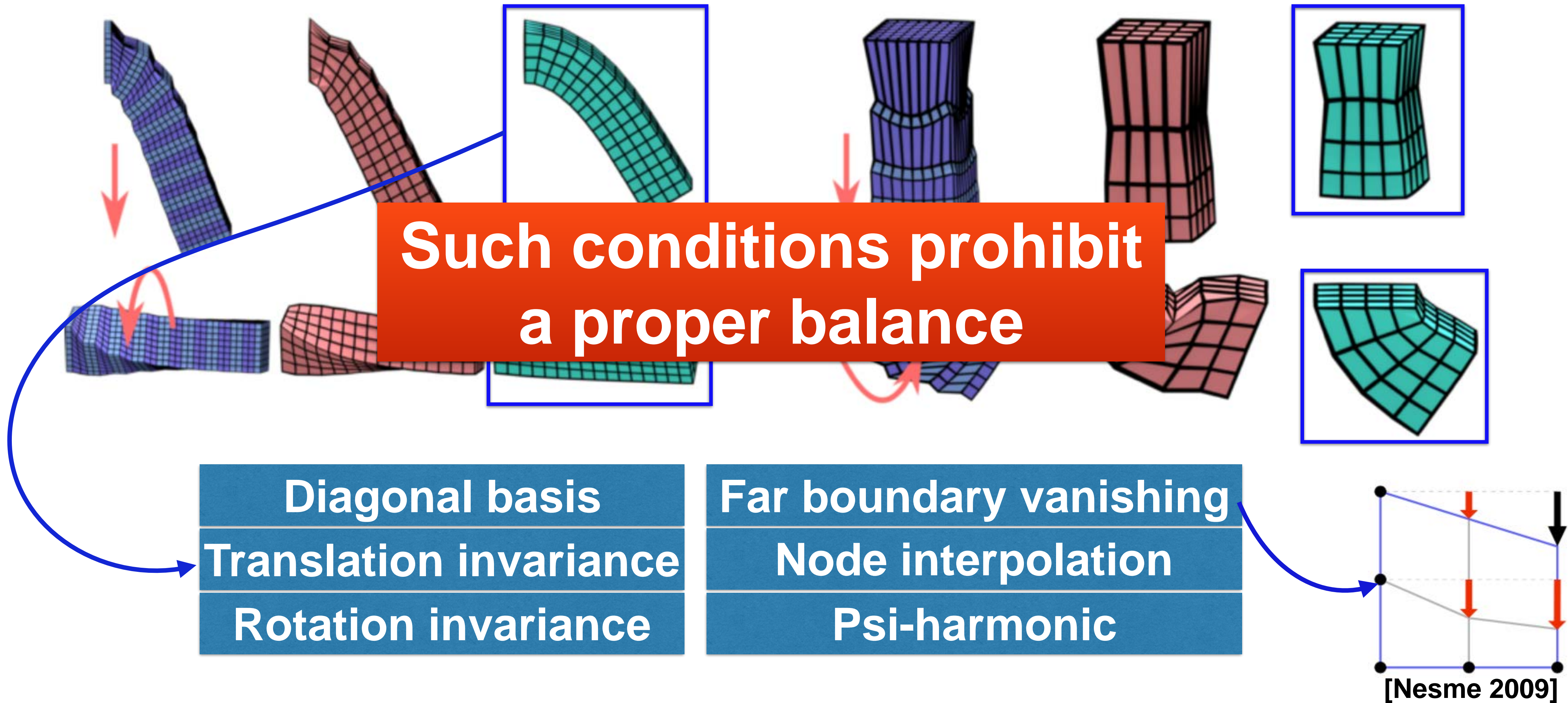
**Diagonal basis**  
**Translation invariance**  
**Rotation invariance**

**Far boundary vanishing**  
**Node interpolation**  
**Psi-harmonic**





# Relation to [Nesme 2009]



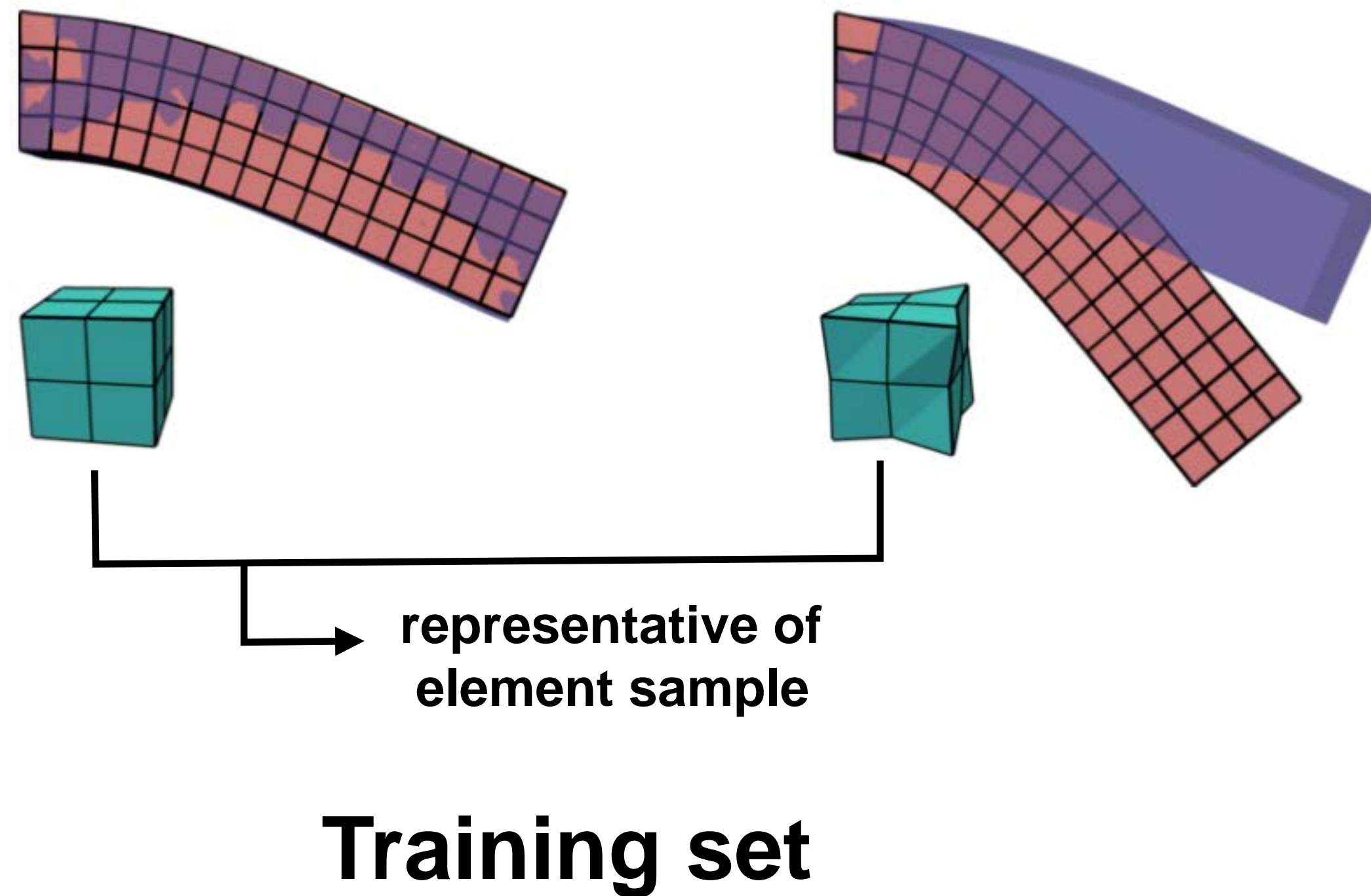


# Relation to DDFEM

Results of DDFEM will be likely impacted by ...

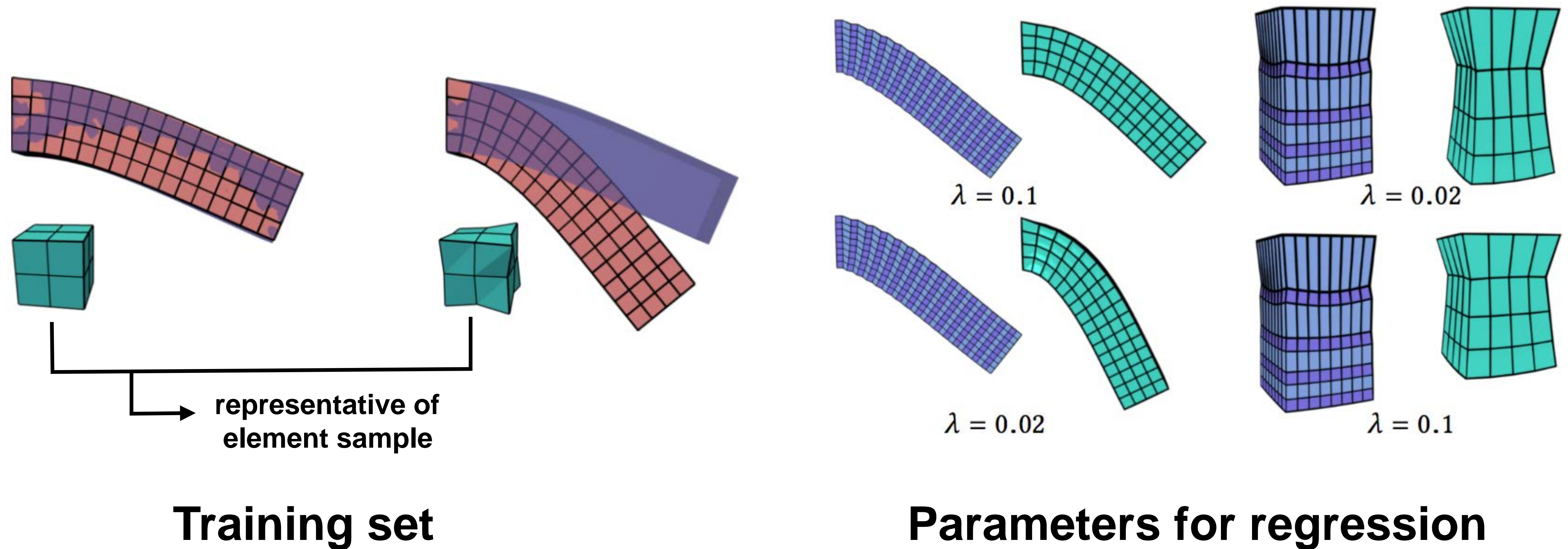
# Relation to DDFEM

Results of DDFEM will be likely impacted by ...



# Relation to DDFEM

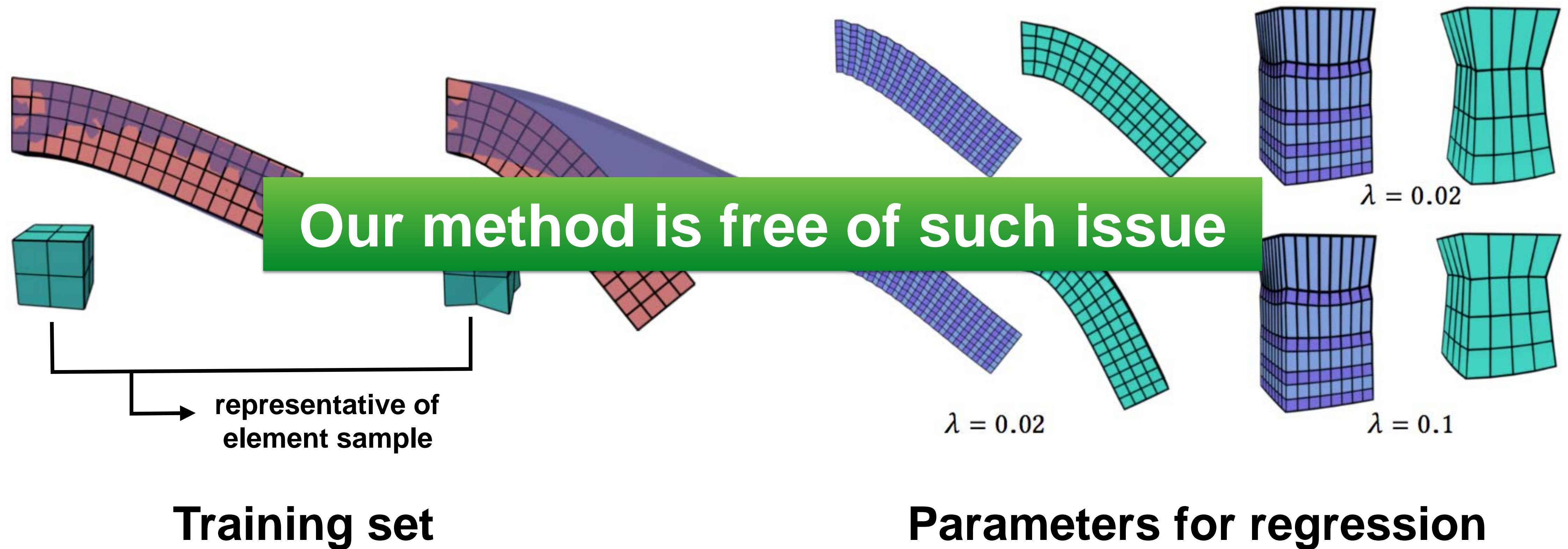
Results of DDFEM will be likely impacted by ...





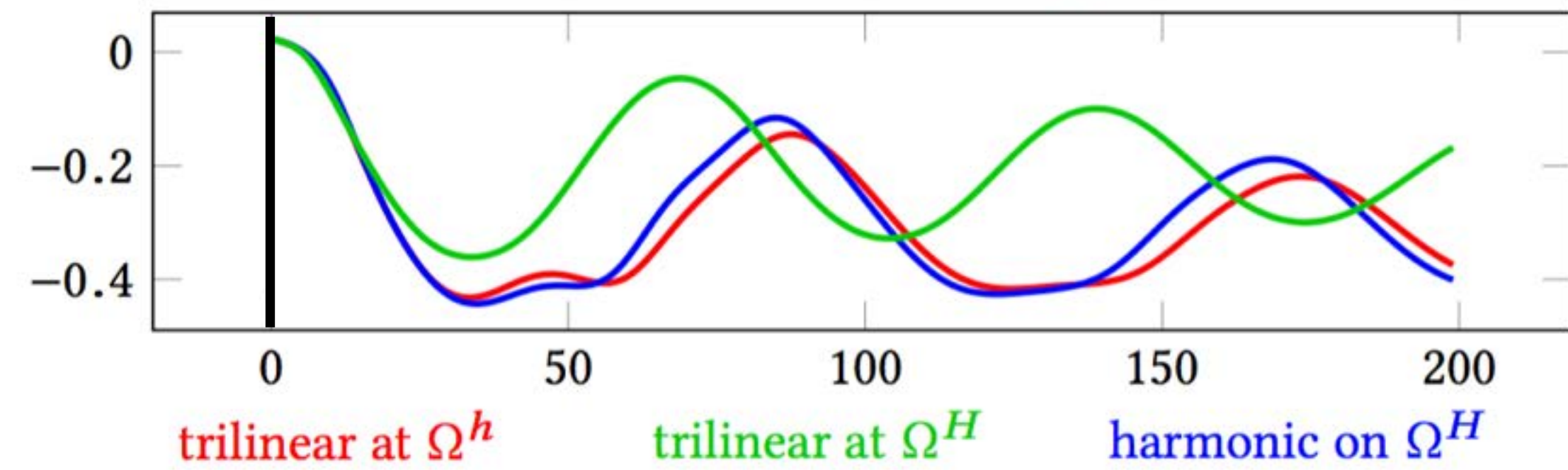
# Relation to DDFEM

Results of DDFEM will be likely impacted by ...

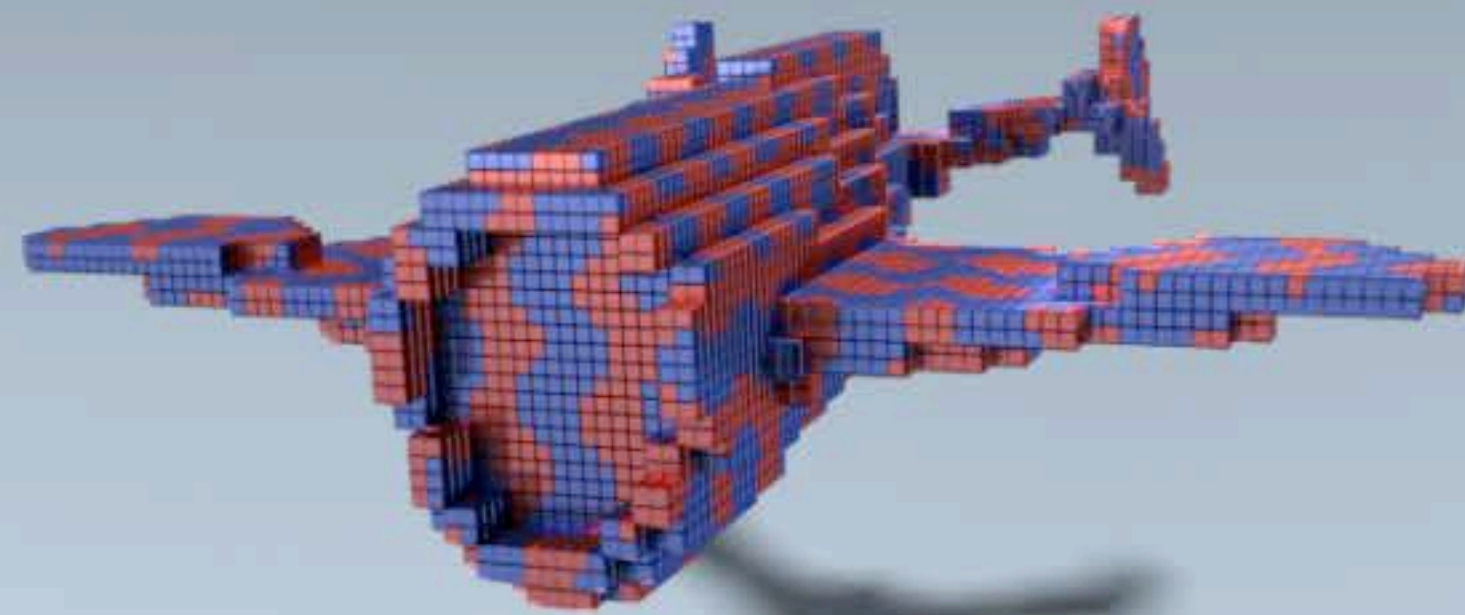




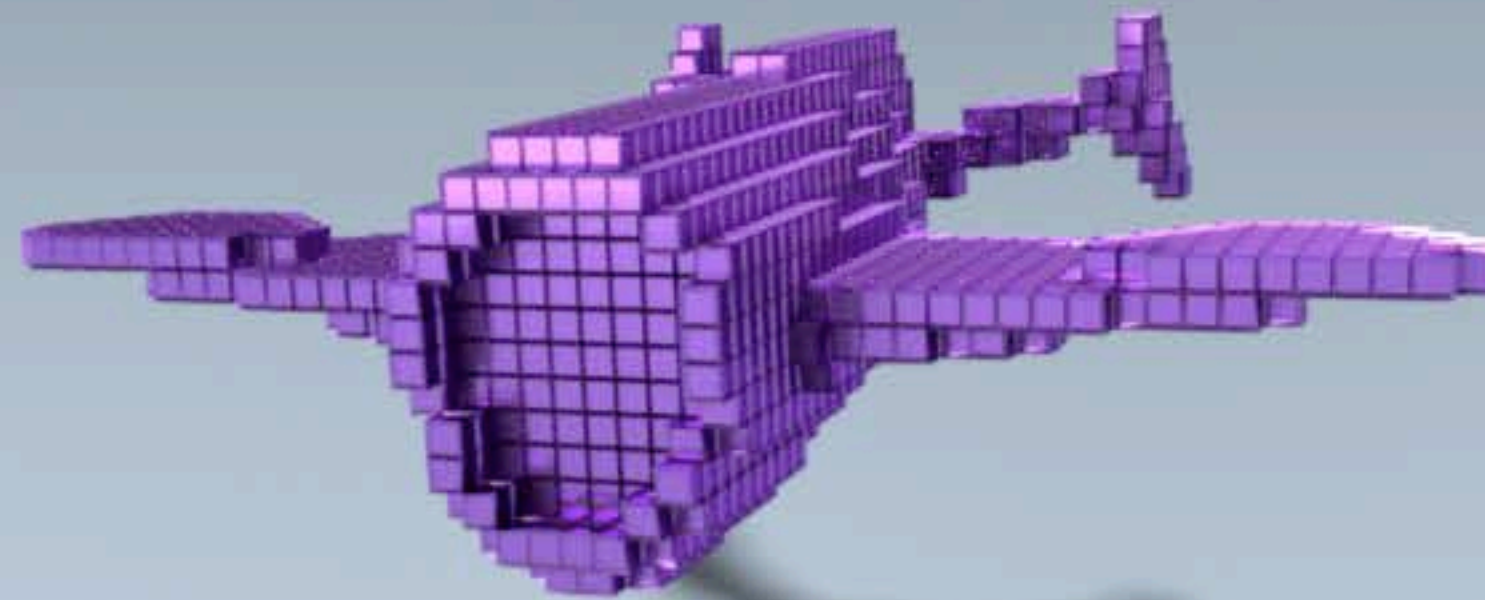
# Dynamics



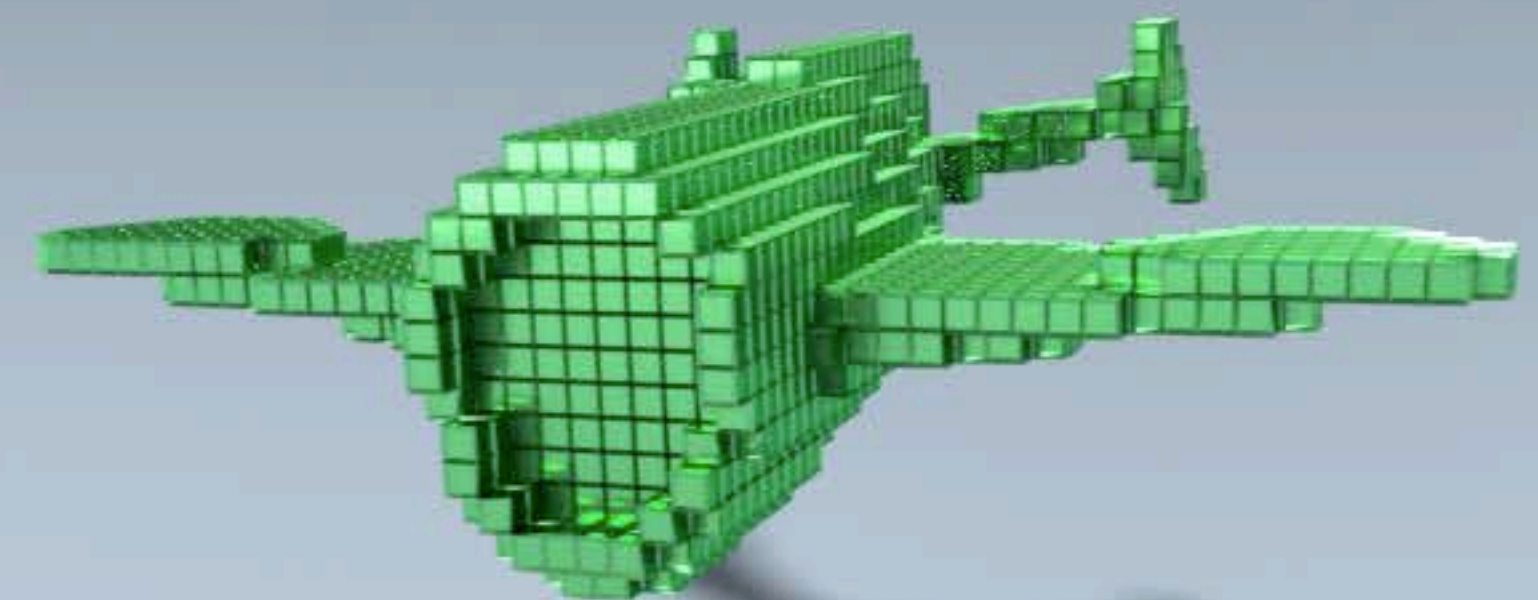
Fine: trilinear basis



Coarse: optimized basis

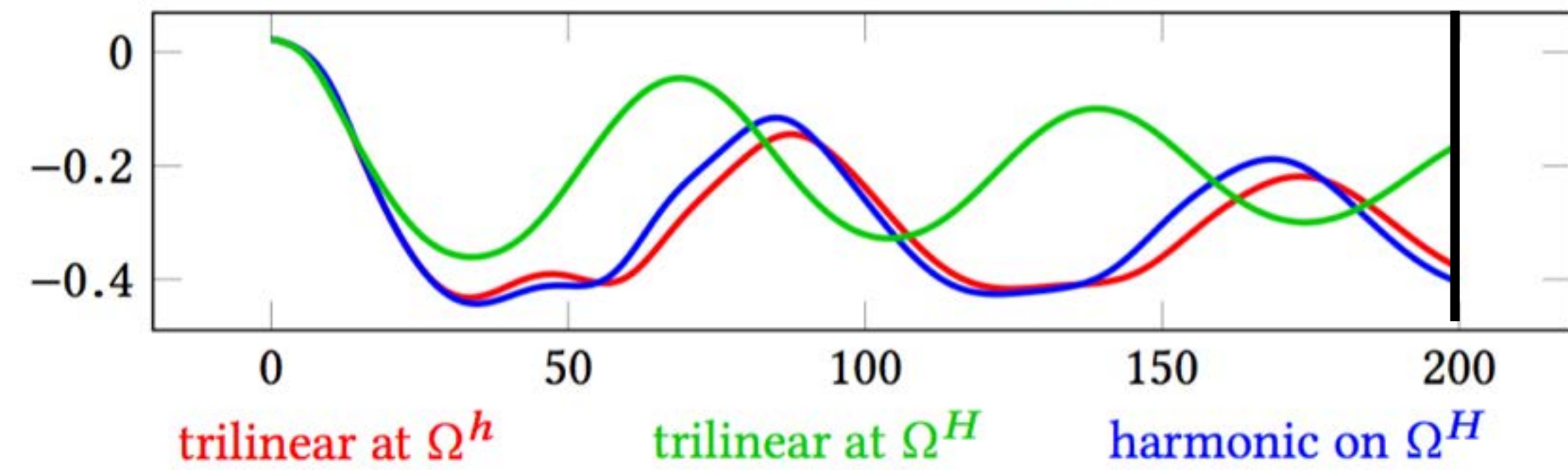


Coarse: trilinear basis

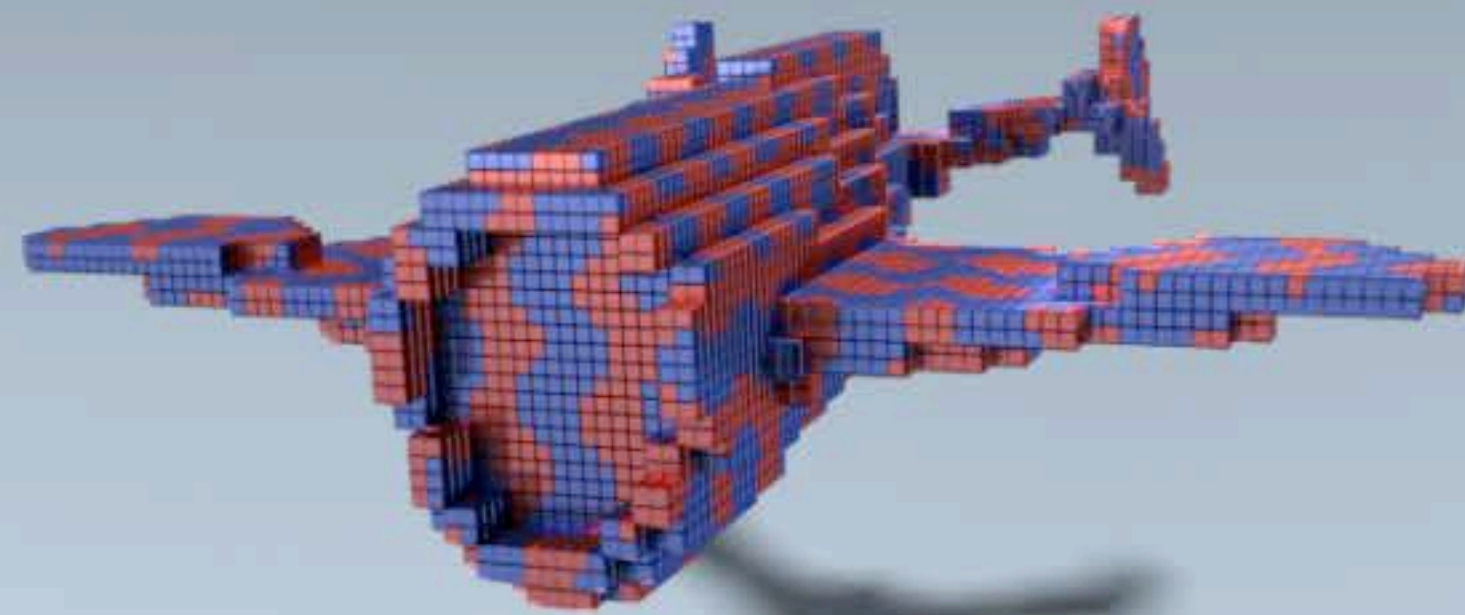




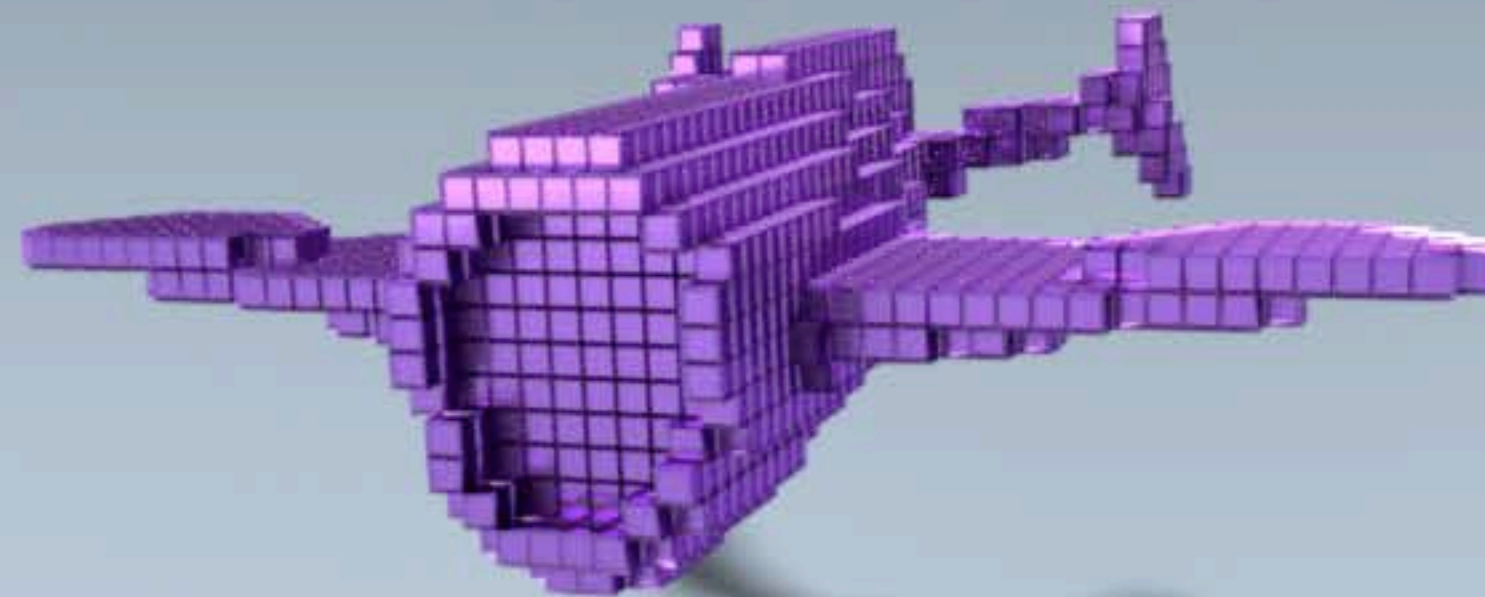
# Dynamics



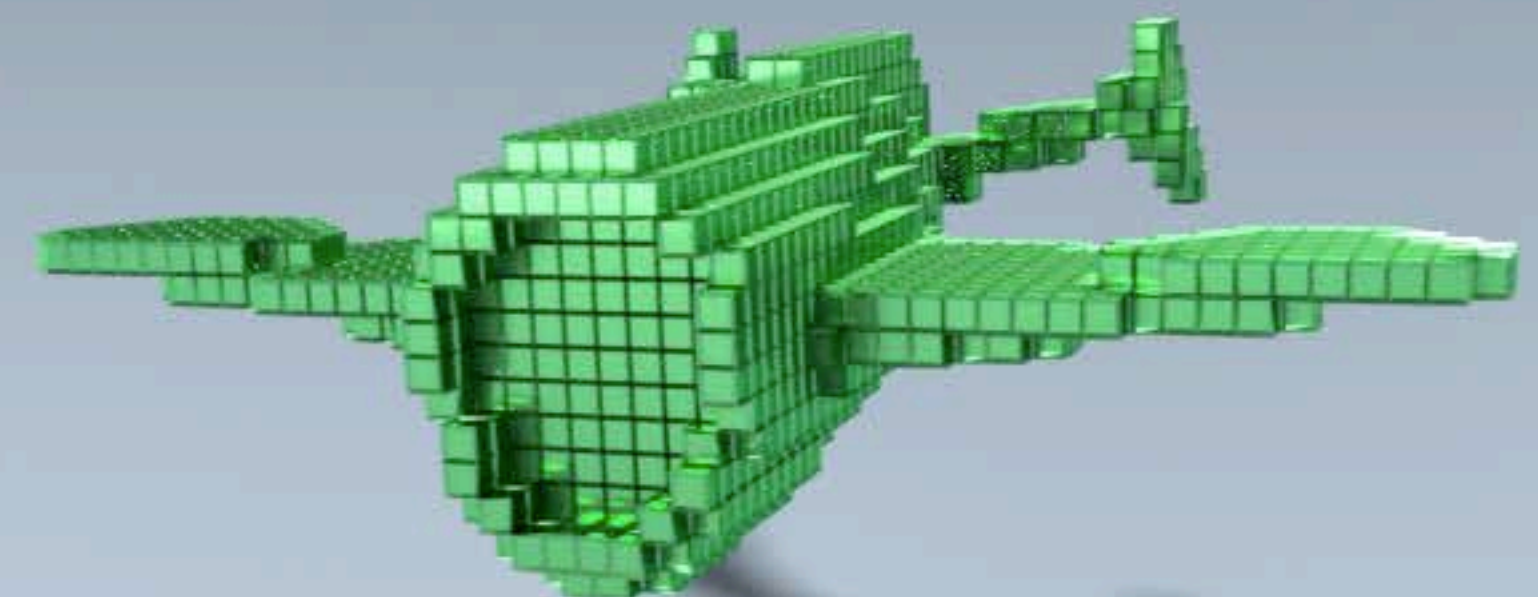
Fine: trilinear basis



Coarse: optimized basis



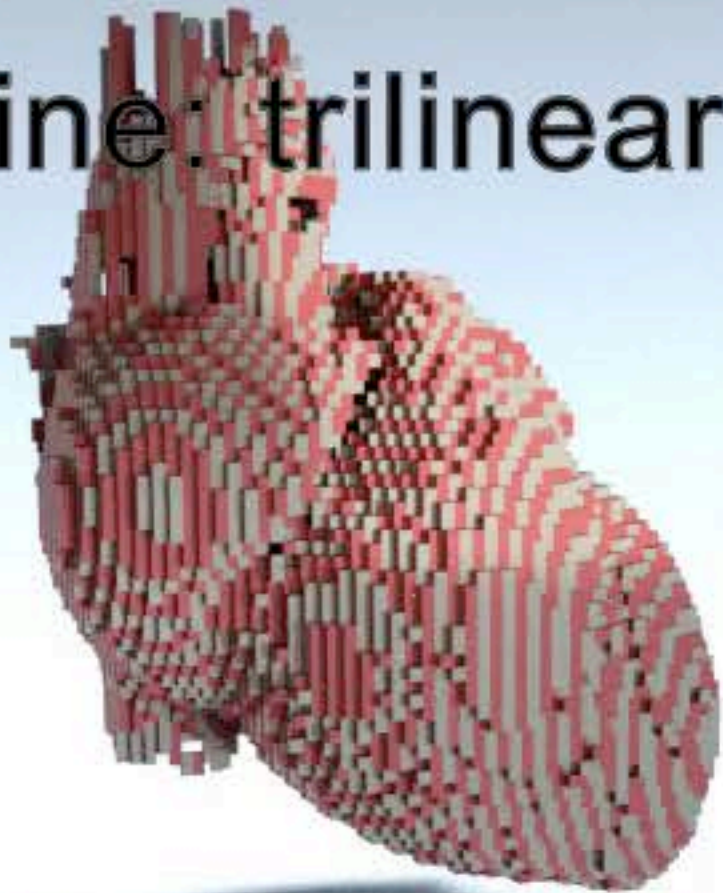
Coarse: trilinear basis



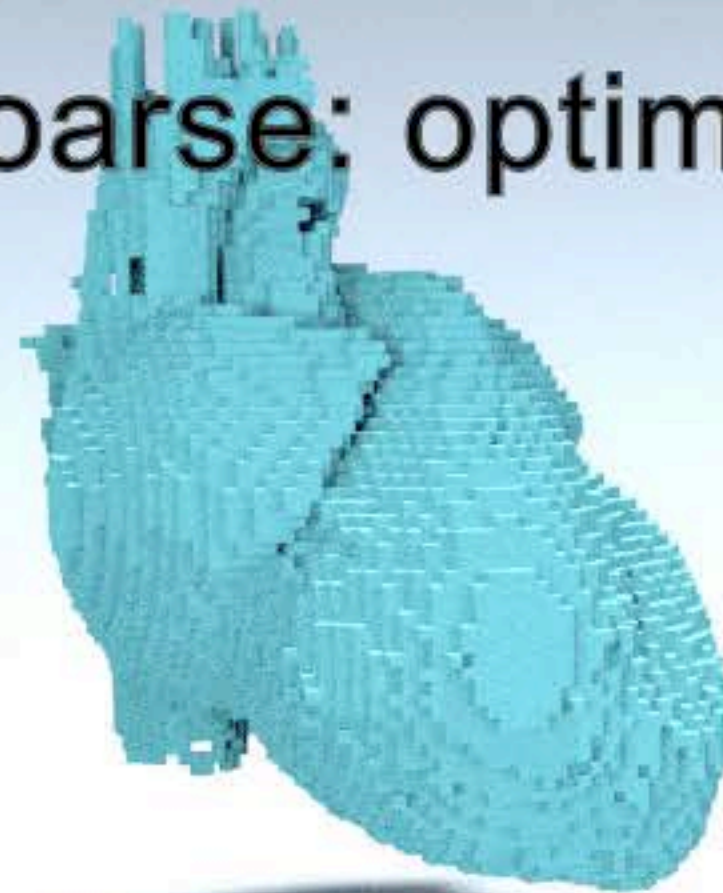


# Dynamics

Fine: trilinear



Coarse: optimized



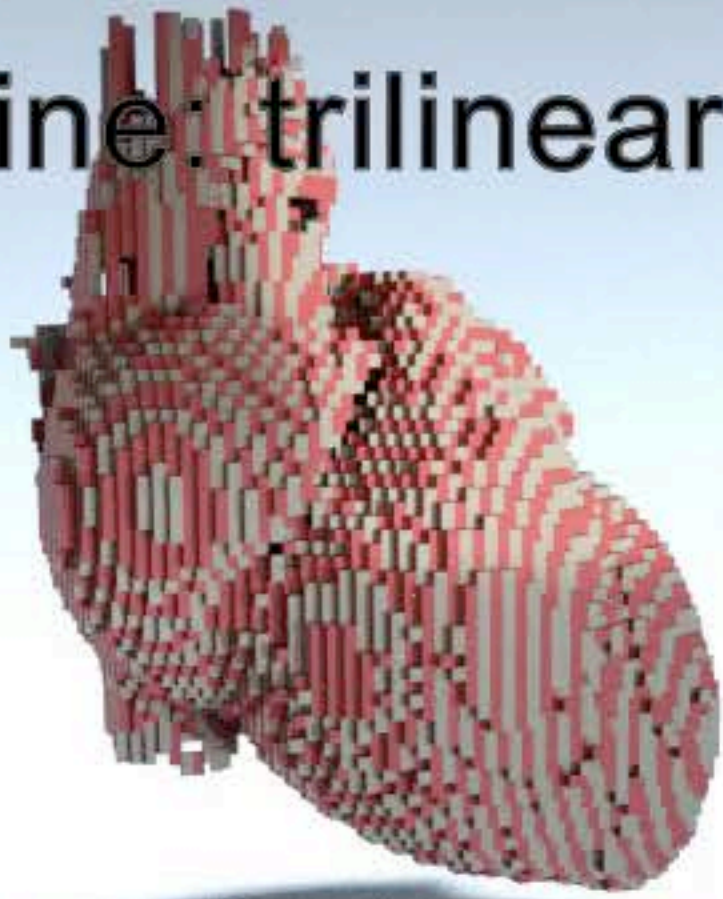
Coarse: trilinear



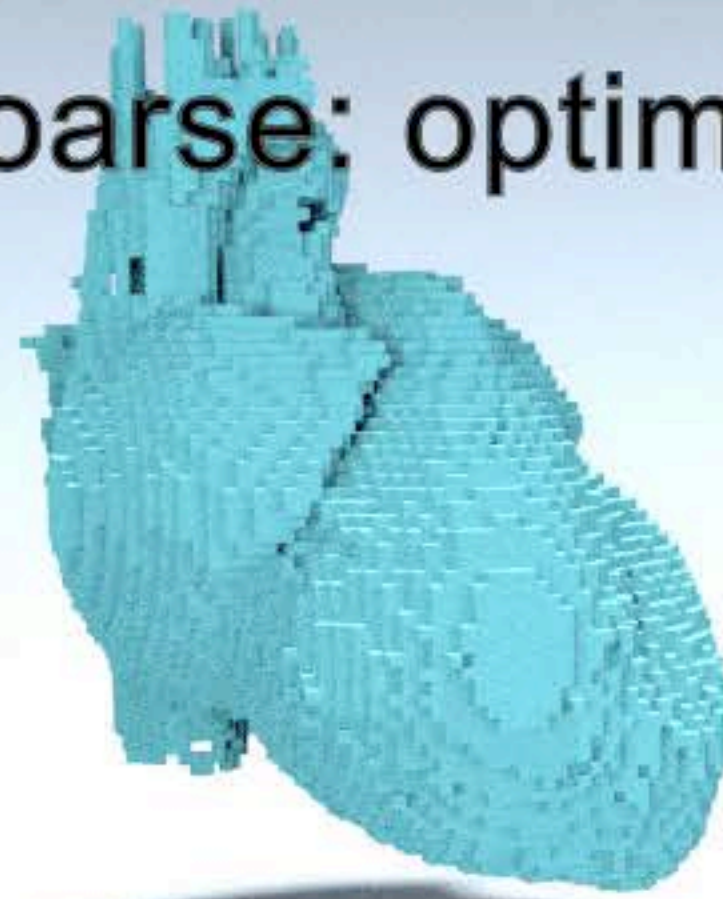


# Dynamics

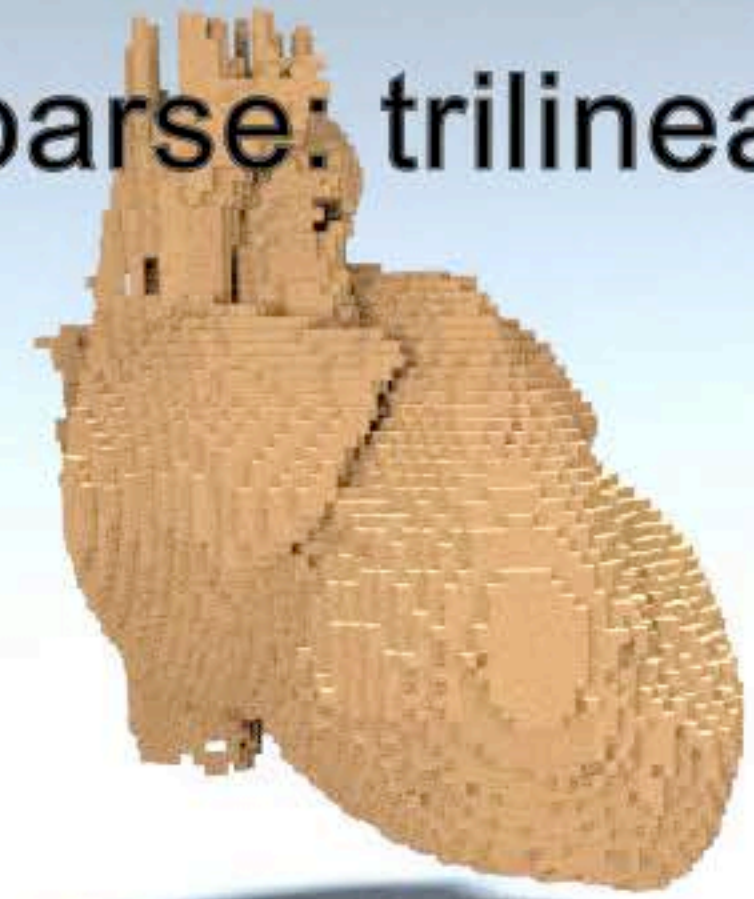
Fine: trilinear



Coarse: optimized

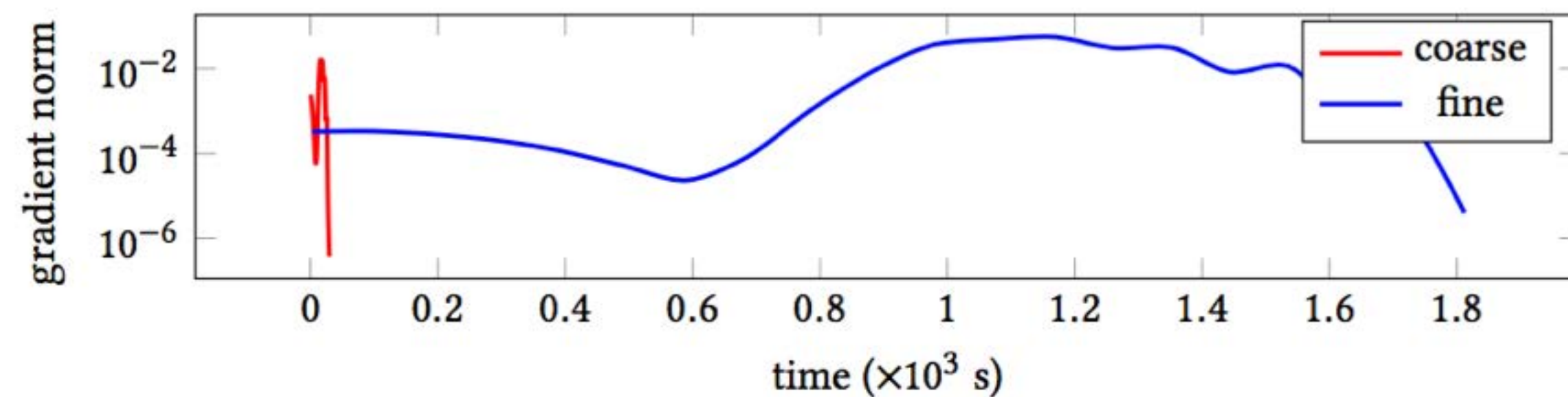
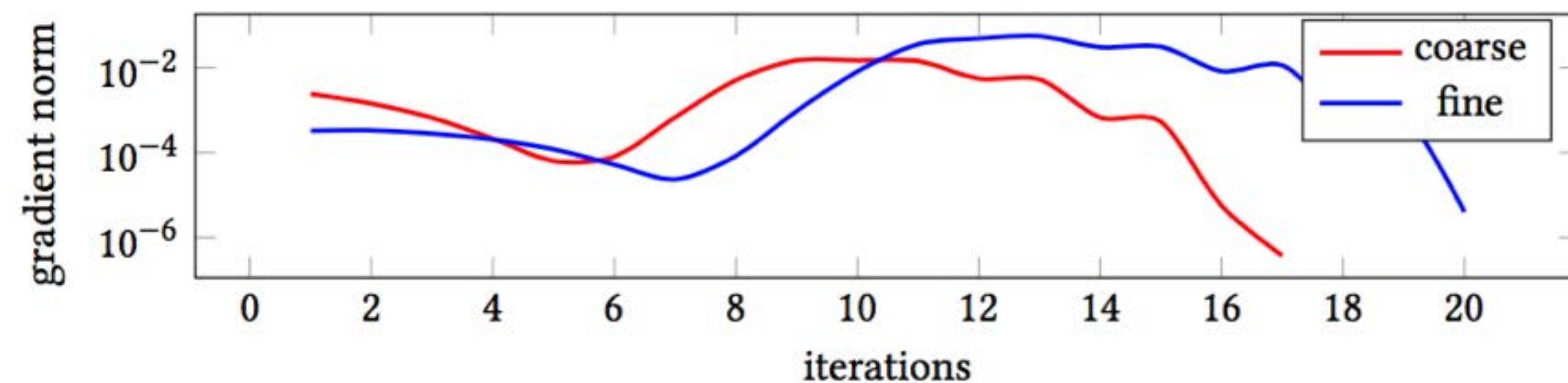
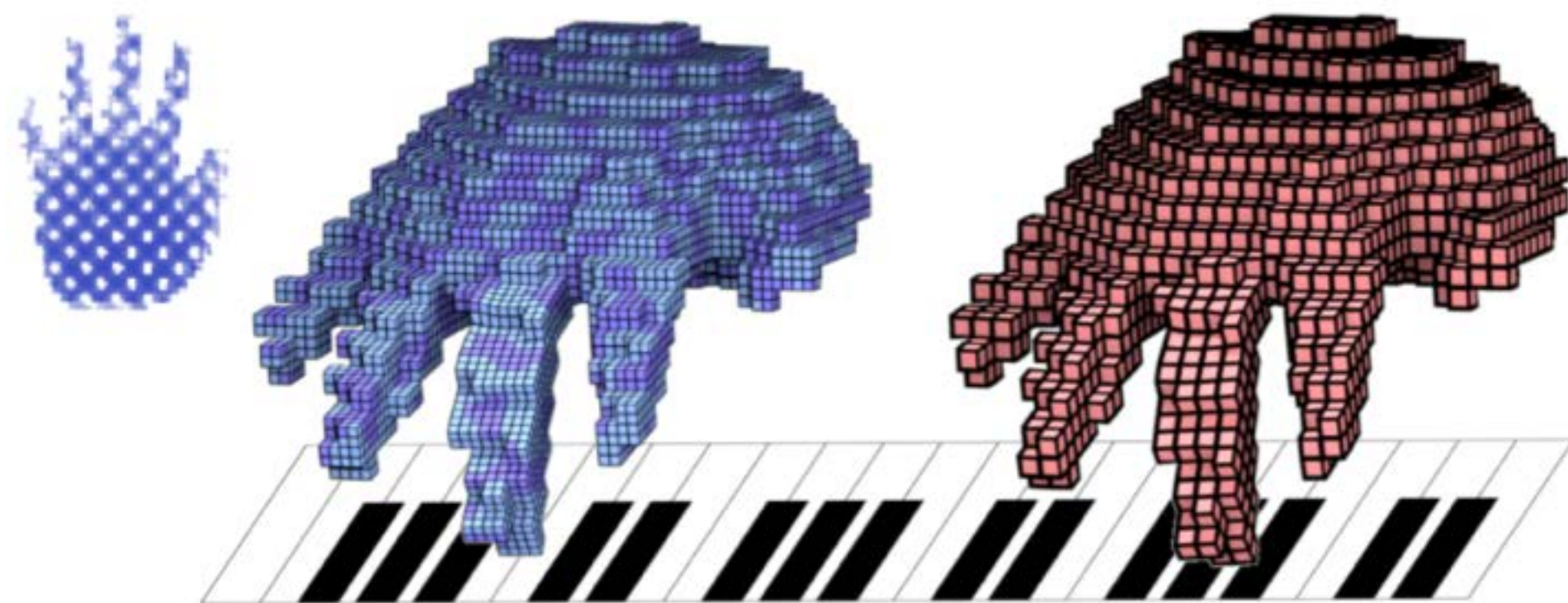


Coarse: trilinear





# Acceleration



***Fine mesh:***  
**# vert: 31337**  
**# elem: 26176**

**Coarse mesh:**  
**# vert: 4627**  
**# elem: 3272**



Future work

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- Varying shape functions for very large deformation.

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- Applied to other problems like acoustics.

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- Varying shape functions for very large deformation.
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- Applied to other problems like acoustics.
- ***Problem-aware basis construction.***

**Thanks!**

**Q&A**