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# Optimization-Based Coupling for Local and Nonlocal Models

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# Model Coupling as an Optimization Problem

## *Goal: Simulation capability that combines disparate models*

- Restrict use of high-fidelity models to subdomains to reduce overall cost
- Utilize multiscale and/or multiphysics models only where needed
- Overcome challenges resulting from disparate discretization strategies

## *Challenge: Inherent mismatch at model interface*

- Fundamentally different mathematical models
- Discretization schemes that are not directly compatible
- Disparate physics and/or length scales

## *Approach: Cast model coupling as an optimization problem*

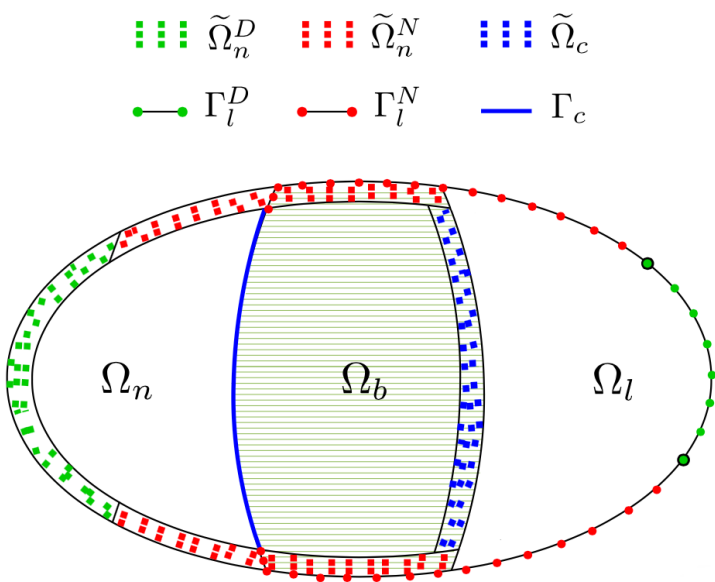
- Minimize difference between solutions in overlap region
- Governing equations of the individual models act as constraints
- Roles of coupling conditions and models are reversed with respect to standard coupling methods

# Optimization Based Local-Nonlocal Coupling

Minimize the mismatch between local and nonlocal models subject to the two models acting independently in their respective domains

$$\min_{u_n, u_l, \theta_n, \theta_l} J(u_n, u_l) = \frac{1}{2} \int_{\Omega_b} (u_n - u_l)^2 d\mathbf{x} = \frac{1}{2} \|u_n - u_l\|_{0, \Omega_b}^2$$

subject to



Nonlocal model

$$\begin{aligned} -\mathcal{L}u_n &= f_n & \mathbf{x} \in \Omega_n \\ u_n &= \theta_n & \mathbf{x} \in \tilde{\Omega}_c \\ u_n &= 0 & \mathbf{x} \in \Omega_n^D \\ -\mathcal{N}(\mathcal{G}u_n) &= 0 & \mathbf{x} \in \tilde{\Omega}_n^N \end{aligned}$$

Local model

$$\begin{aligned} -\Delta u_l &= f_l & \mathbf{x} \in \Omega_l \\ u_l &= \theta_l & \mathbf{x} \in \Gamma_c \\ u_l &= 0 & \mathbf{x} \in \Gamma_l^D \\ \nabla u_l \cdot \mathbf{n} &= 0 & \mathbf{x} \in \Gamma_l^N \end{aligned}$$

where the nonlocal operators are defined as [Du, et al., 2013]:

$$\mathcal{L}u(\mathbf{x}) = 2 \int_{\mathbb{R}^d} (u(\mathbf{y}) - u(\mathbf{x})) \gamma(\mathbf{x}, \mathbf{y}) d\mathbf{y} \quad \mathbf{x} \in \mathbb{R}^d$$

$$\mathcal{N}(v)(\mathbf{x}) = - \int_{\Omega^+} (v(\mathbf{x}, \mathbf{y}) + v(\mathbf{y}, \mathbf{x})) \alpha(\mathbf{x}, \mathbf{y}) d\mathbf{y} \quad \mathbf{x} \in \tilde{\Omega}$$

$$\mathcal{G}(u)(\mathbf{x}, \mathbf{y}) := (u(\mathbf{y}) - u(\mathbf{x})) \alpha(\mathbf{x}, \mathbf{y}) \quad \mathbf{x}, \mathbf{y} \in \mathbb{R}^d$$

Analysis has established existence, uniqueness of solution to coupled problem

D'Elia, M., Perego, M., Bochev, P., and Littlewood, D. A coupling strategy for nonlocal and local diffusion models with mixed volume constraints and boundary conditions. *Computers and Mathematics with Applications* 71, 2218-2230, 2016.

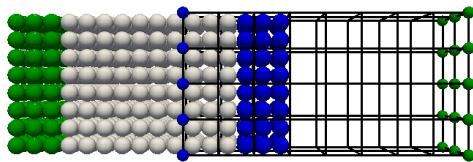
Du, Q., Gunzburger, M., Lehoucq, R.B., and Zhou, K. A nonlocal vector calculus, nonlocal volume-constrained problems, and nonlocal balance laws, *Mathematical Models and Methods in Applied Sciences* 23(03), 493-540, 2013.

# Example: Coupling of Local and Nonlocal Diffusion Models

## *Recovery of linear solution using coupled local-nonlocal model*

- Boundary conditions applied to ends of bar
  - Linear solution imposed over volumetric region of nonlocal model
  - Standard local boundary conditions applied to local model
- Optimization-based approach successfully couples local and nonlocal models

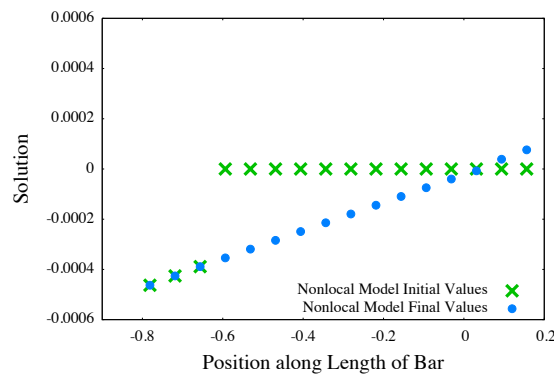
Problem Set-up



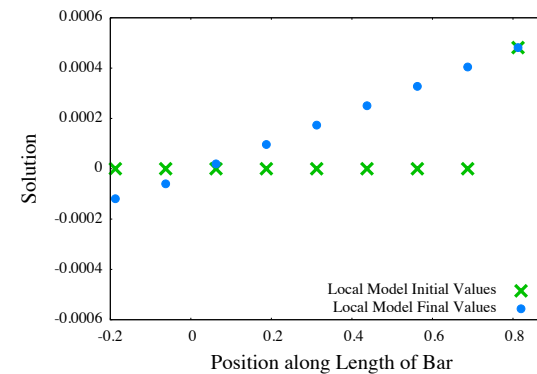
Coupled solution



Solution of local model



Solution of nonlocal model

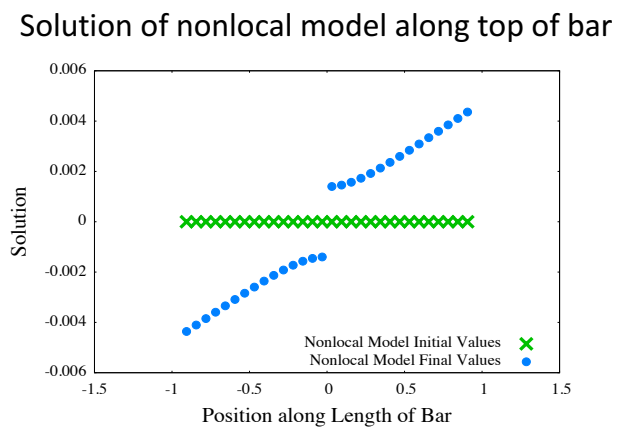
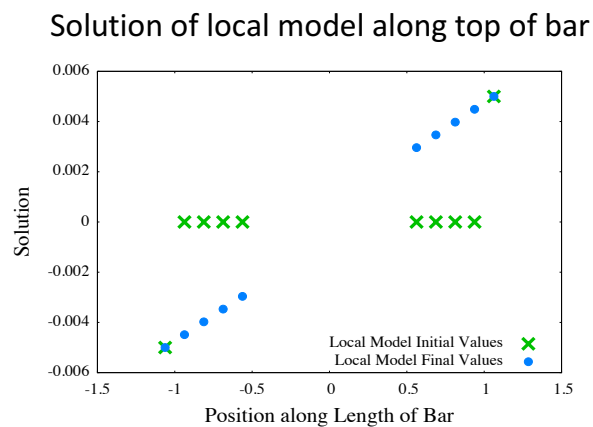
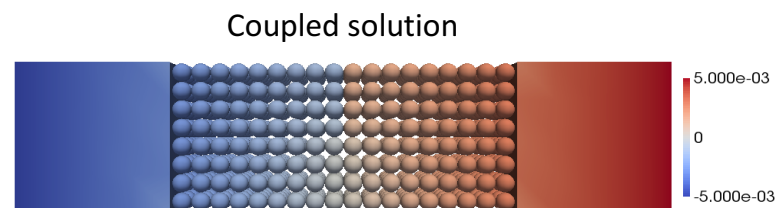
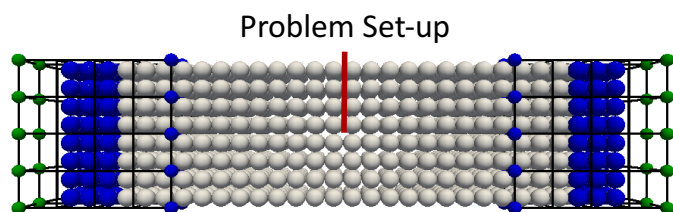




# Example: Local and Nonlocal Diffusion in a Pre-Cracked Bar

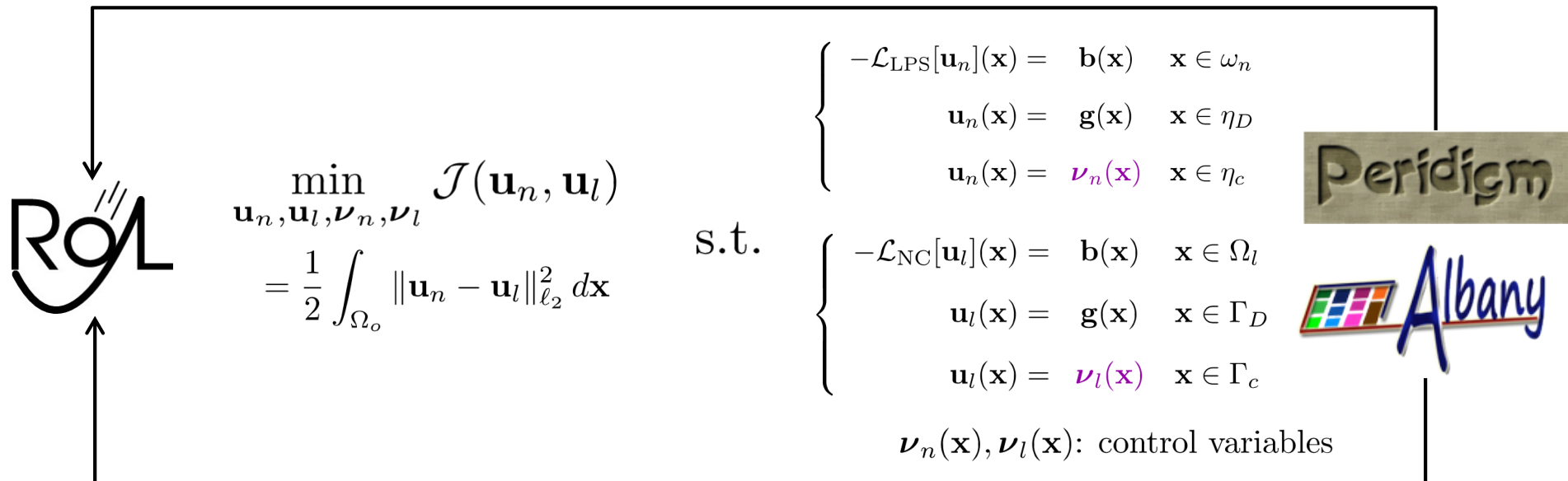
## *Local boundary conditions applied to pre-cracked bar*

- Boundary conditions applied to local model only
  - Avoids difficulties in applying volume constraints to nonlocal model
- Optimization-based approach successfully couples local and nonlocal models
- Nonlocal model provides solution in vicinity of crack



## *Extension of the optimization-based coupling approach of D'Elia, et al., to local-nonlocal coupling for 3D elasticity*

- Classical (local) elasticity model provided by *Albany/LCM* code
- Peridynamic (nonlocal) elasticity model provided by *Peridigm* code
- *Rapid Optimization Library (ROL)* utilized for minimization of functional



# Local and Nonlocal Elasticity Models

## Nonlocal model

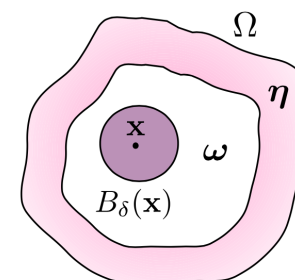
- Peridynamic model of solid mechanics with linearized Linear Peridynamic Solid (LPS) constitutive model
- Strong form solved using the meshless method of Silling and Askari

$$-\mathcal{L}_{\text{LPS}}[\mathbf{u}](\mathbf{x}) = \mathbf{b}(\mathbf{x}), \quad \mathbf{x} \in \omega \text{ with constraints in } \eta$$

$$\mathcal{L}_{\text{LPS}}[\mathbf{u}](\mathbf{x}) = \int_{\Omega \cap B_\delta(\mathbf{x})} \{ \mathbf{T}[\mathbf{x}] \langle \mathbf{x}' - \mathbf{x} \rangle - \mathbf{T}[\mathbf{x}'] \langle \mathbf{x} - \mathbf{x}' \rangle \} dV_{\mathbf{x}'}$$

$$B_\delta(\mathbf{x}) = \{ \mathbf{x}' \in \mathbb{R}^d : \|\mathbf{x} - \mathbf{x}'\| \leq \delta \}$$

$$\mathbf{T}[\mathbf{x}] \langle \boldsymbol{\xi} \rangle = \frac{3K-5G}{m} \omega(\|\boldsymbol{\xi}\|) \theta(\mathbf{x}) \boldsymbol{\xi} + \frac{15G}{m} \omega(\|\boldsymbol{\xi}\|) \frac{\boldsymbol{\xi} \otimes \boldsymbol{\xi}}{\|\boldsymbol{\xi}\|^2} (\mathbf{u}(\mathbf{x} + \boldsymbol{\xi}) - \mathbf{u}(\mathbf{x}))$$



bounded body  $\Omega = \omega \cup \eta$   
 $\omega$ : domain  
 $\eta$ : interaction domain  
 $\delta$ : interaction radius

## Local model

- Navier-Cauchy equations of classical elasticity
- Standard finite element approach applied to solve the variational form

$$-\mathcal{L}_{\text{NC}}[\mathbf{u}](\mathbf{x}) = \mathbf{b}(\mathbf{x}), \quad \mathbf{x} \in \Omega \text{ with conditions on } \partial\Omega$$

$$\mathcal{L}_{\text{NC}}[\mathbf{u}](\mathbf{x}) := \left[ \left( K + \frac{1}{3}G \right) \nabla(\nabla \cdot \mathbf{u})(\mathbf{x}) + G \nabla^2 \mathbf{u}(\mathbf{x}) \right]$$

Silling, S.A. Reformulation of elasticity theory for discontinuities and long-range forces. *Journal of the Mechanics and Physics of Solids*, 48:175-209, 2000.

Silling, S.A., and Askari, E. A meshfree method based on the peridynamic model of solid mechanics. *Computers and Structures*, 83:1526-1535, 2005.

Silling, S.A. Linearized theory of peridynamic states, *Journal of Elasticity* 99, 85-1111, 2010.

# 3D Elasticity: Linear Patch Test

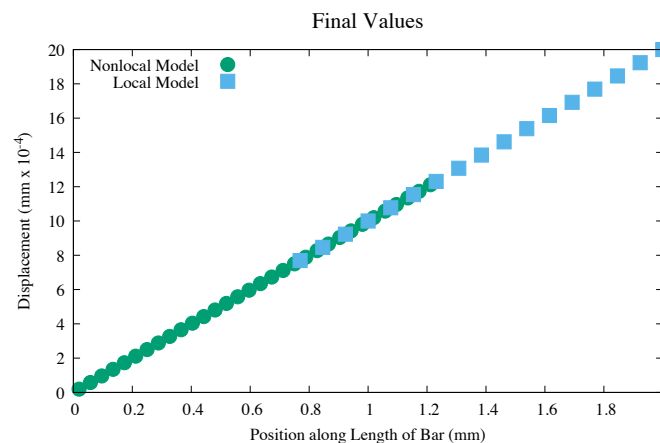
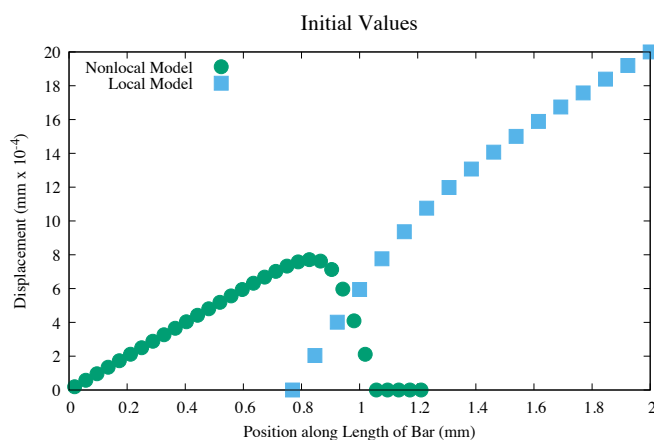
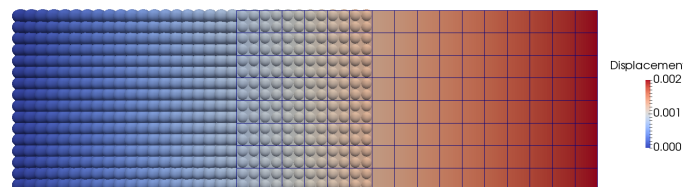
## *Recovery of linear solution using coupled local-nonlocal model*

- Constraints applied at all free surfaces
  - Linear solution imposed over volumetric regions of nonlocal model
  - Standard local boundary conditions applied to surfaces of local model
- Optimization-based approach successfully recovers analytic solution (linear)

Model Parameters

Bulk modulus	160.0 GPa
Shear modulus	96.0 GPa
Horizon	0.0541 L

L = length of bar



# 3D Elasticity: Quadratic Patch Test

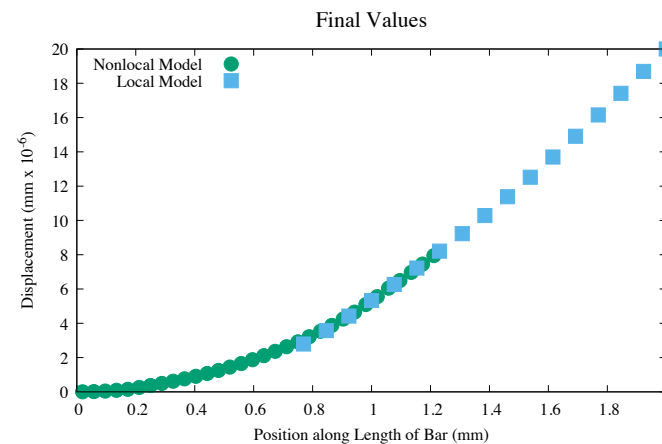
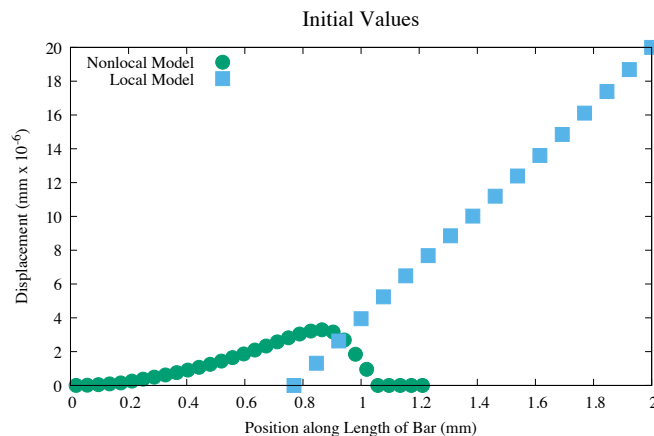
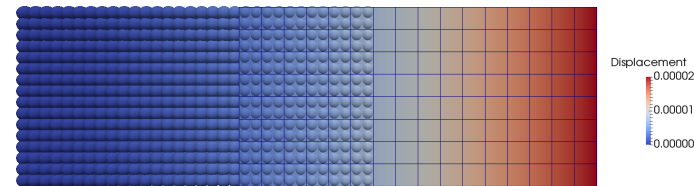
## *Recovery of quadratic solution using coupled local-nonlocal model*

- Boundary conditions / nonlocal constraints
  - Linear solution imposed over volumetric regions of nonlocal model
  - Standard local boundary conditions applied to surfaces of local model
  - Body force applied to internal domains
- Optimization-based approach successfully recovers analytic solution (quadratic)

Model Parameters

Bulk modulus	160.0 GPa
Shear modulus	96.0 GPa
Horizon	0.0541 L

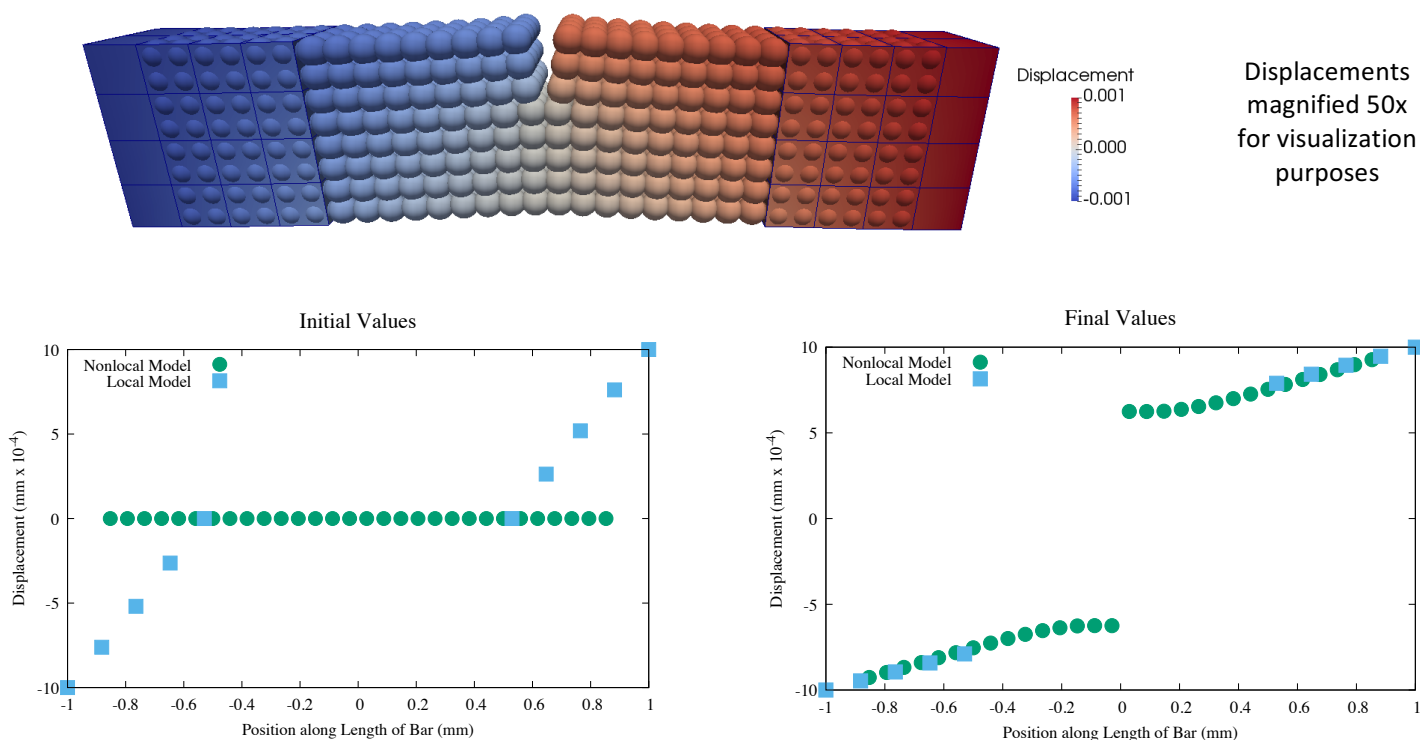
L = length of bar



# Bar with Pre-Crack Loaded in Tension

## *Combination of local and nonlocal models for “best of both worlds”*

- Boundary conditions applied only to local model
  - Simple and well understood
- Peridynamic model applied in vicinity of crack
  - Nonlocal model is best suited to model crack region

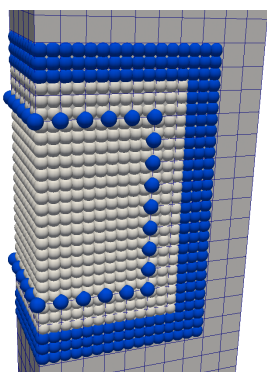


# Tension Test

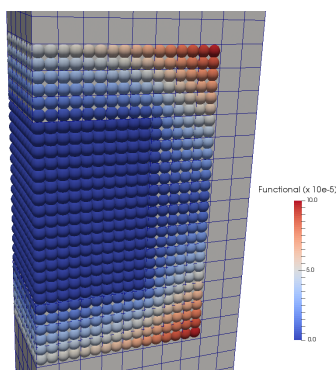
## *Application of coupling strategy to realistic geometry*

- Boundary conditions applied only to local model
- Peridynamic model restricted to small subdomain

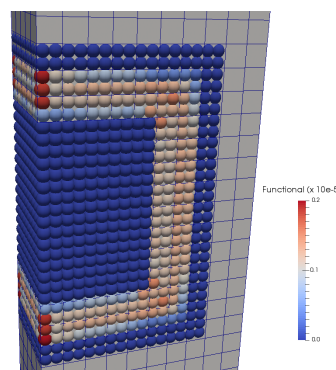
Control nodes



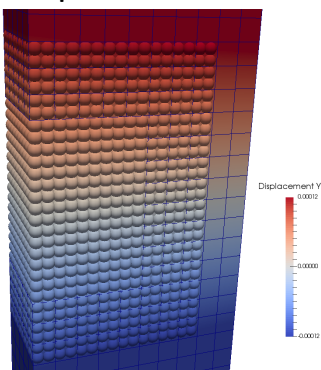
Initial functional values  
 $J = 1.41e-2$



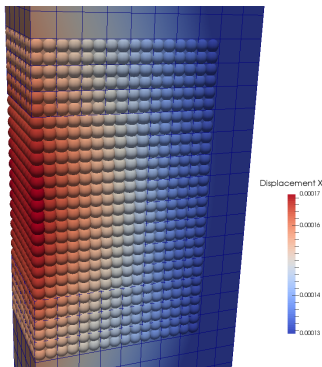
Final functional values  
 $J = 4.31e-6$



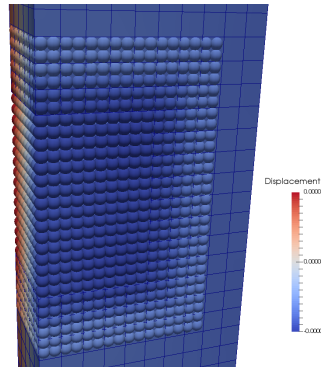
Displacement Y



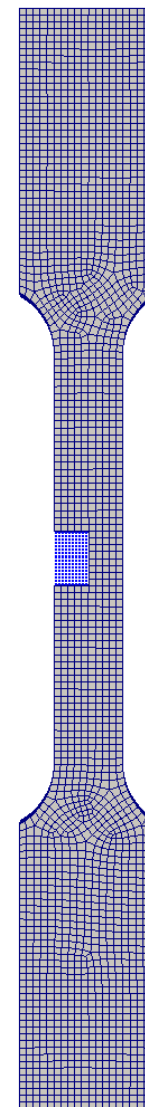
Displacement X



Displacement Z



Influence of peridynamic  
surface effect



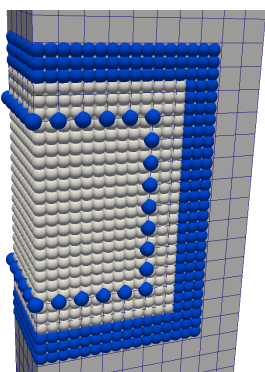


# Tension Test with Pre-Crack

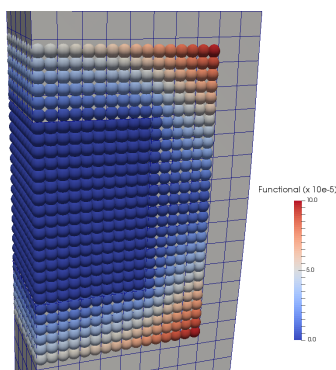
## *Application of coupling strategy to realistic geometry*

- Boundary conditions applied only to local model
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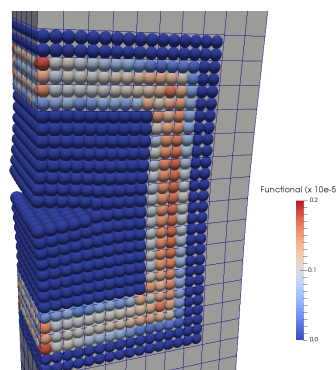
Control nodes



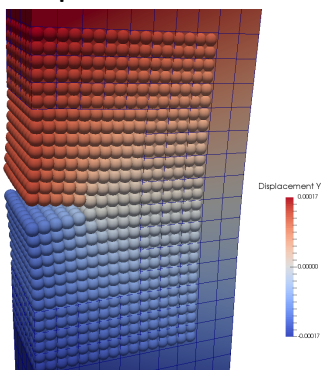
Initial functional values  
 $J = 1.41e-2$



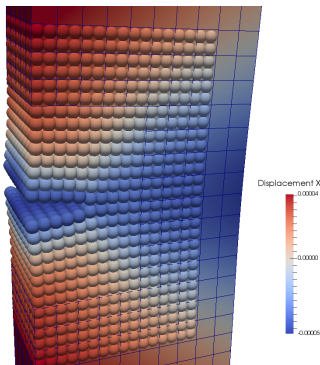
Final functional values  
 $J = 3.80e-6$



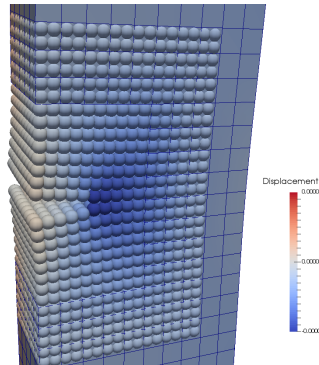
Displacement Y



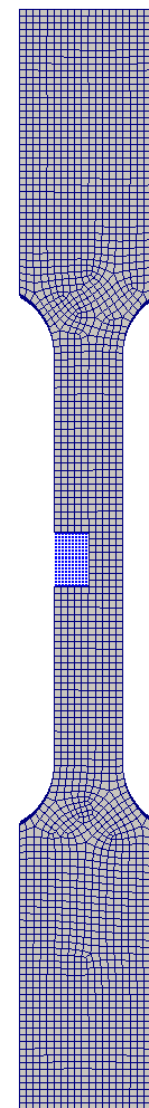
Displacement X



Displacement Z



Displacements  
magnified 50x  
for visualization  
purposes





# Ongoing Work

## *Improvements to optimization-based local-nonlocal coupling strategy*

- Improvements in computational efficiency
  - Initial guess for solution on control nodes (utilize fully-local solution?)
  - Obtain second derivative information analytically (i.e., without finite difference) for use with ROL optimization routines
- Quasi-statics
- Crack growth
- Explicit dynamics

Questions?

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<https://peridigm.sandia.gov>

<https://github.com/gahansen/albany>