



Institut für
Kontinuumsmechanik



Leibniz
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Hannover

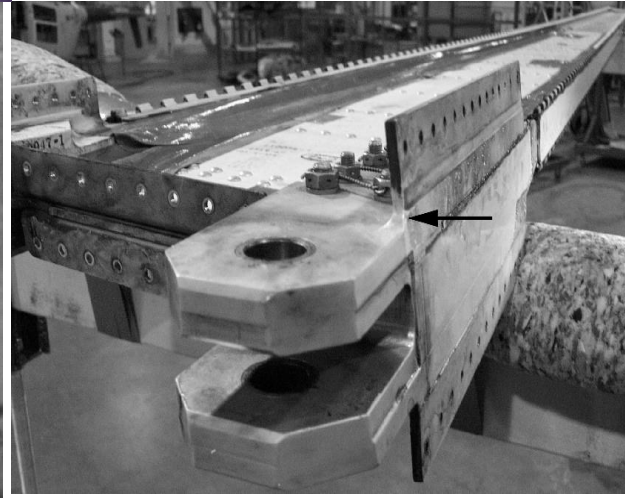
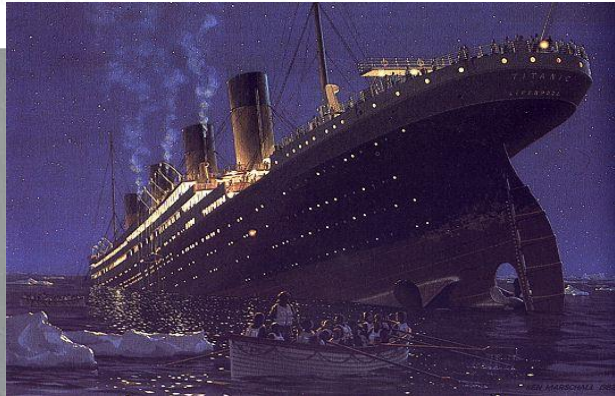
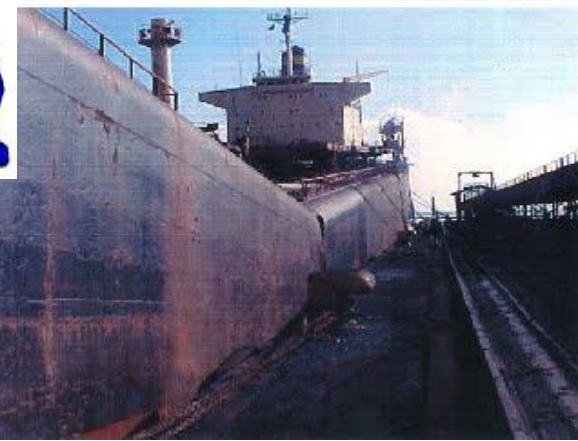
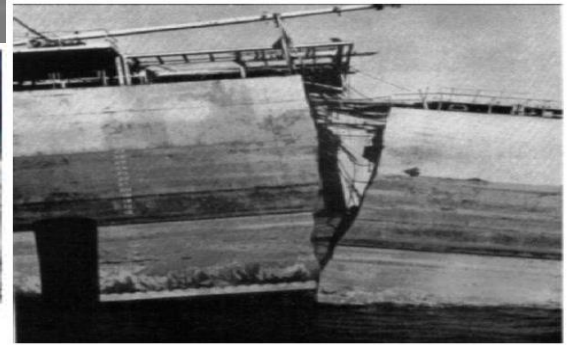
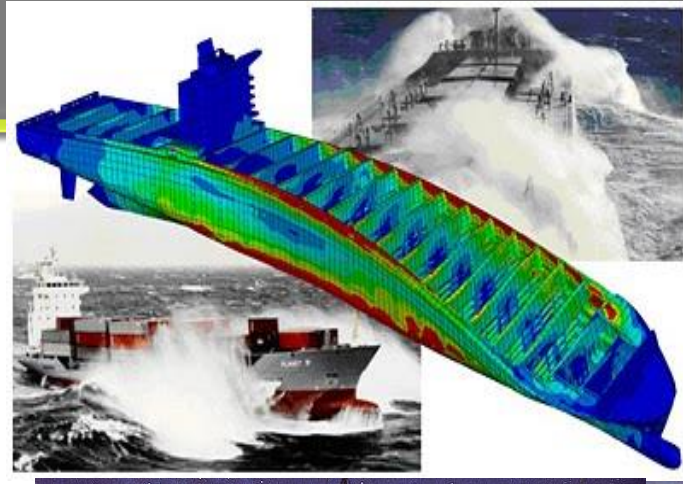
Computational methods for fracture and applications to the design of new polymeric matrix composites

Xiaoying Zhuang

GRK1462 Summer School

Weimar

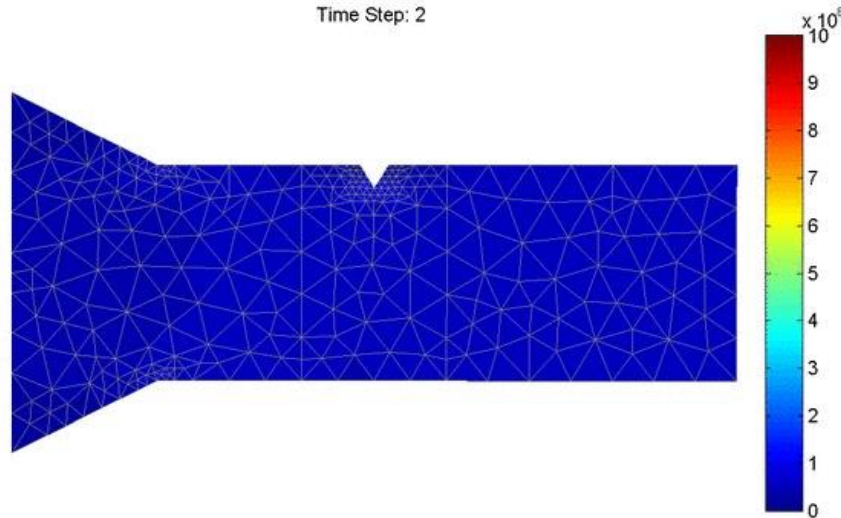
Sep 7 2016



- Goal: Prediction of material/structural failure -> cracks (initiation, propagation, branching, junction)
- Is it necessary to model the crack explicitly?
- How can a crack be modeled?
 - Method that describes the crack kinematics
 - Physical condition in order to initiate or propagate a crack

Motivation

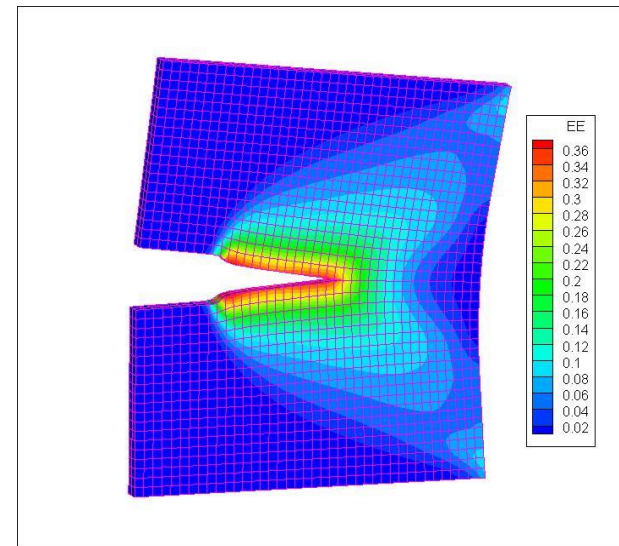




Moes N., Dolbow J., Belytschko T.: A finite element method for crack growth without remeshing. International Journal for Numerical Methods in Engineering, 1999, 46(1) 133-150

Zhang, Ch., Gao, X.-W., Sladek, J. and Sladek, V.: Fracture Mechanics Analysis of 2-D FGMs by a Meshless BEM. Key Engineering Materials, Vols. 324-325, pp. 1165-1172, 2006.

Areias P., Rabczuk T., Camanho P.P.: Initially rigid cohesive laws and fracture based on edge rotations, Computational Mechanics, 2013, 52(4):931 - 947



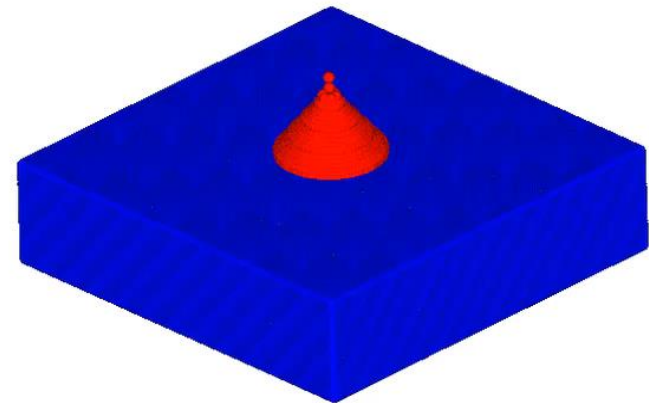
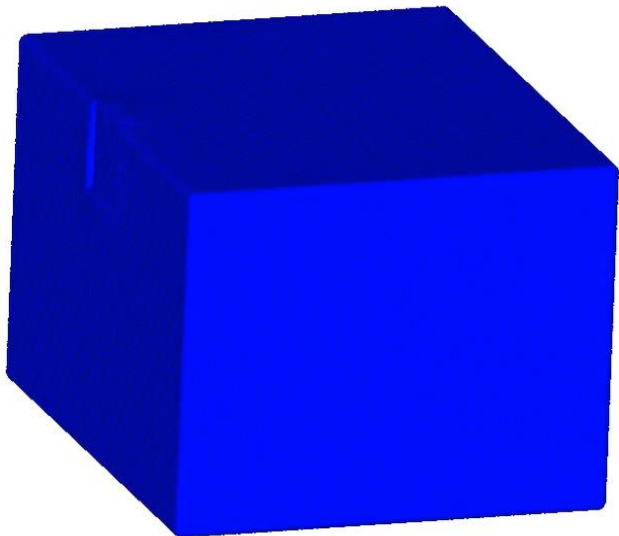
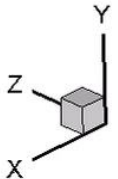
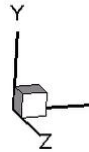
Meshfree methods and particle methods

Meshfree methods for moving boundaries

Computational methods for fracture and
the applications to design of new PMC
X. Zhuang



- Xu X.P., Needleman A.:** Numerical simulations of fast crack growth in brittle solids. *Journal of the Mechanics and Physics of Solids*, **1994**, 42:1397-1434
- Silling S.A.:** Reformulation of elasticity theory for discontinuities and long-range forces, *Journal of the Mechanics and Physics of Solids*, **2000**, 48(1): 175-209
- Sulsky D., Chen Z. Schreyer H.L.:** A particle method for history-dependent materials, *Computer Methods in Applied Mechanics and Engineering*, **1994**, 118, 179-196
- Rabczuk T., Belytschko T.: *Cracking Particles*, a simplified meshfree method for arbitrary evolving cracks, 2004,
- Pandolfi A., Ortiz M.:** An eigenerosion approach to brittle fracture, *International Journal for Numerical Methods in Engineering*, **2012**, 92, 694-714



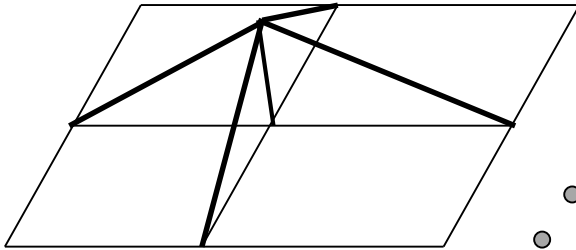
- Computational Methods for Fracture
 - **Meshfree and Particle Methods**
 - Peridynamics
- Application to the design of polymer-matrix composites
 - Framework
 - Models at different length scales
 - Multiscale approach

Advantages:

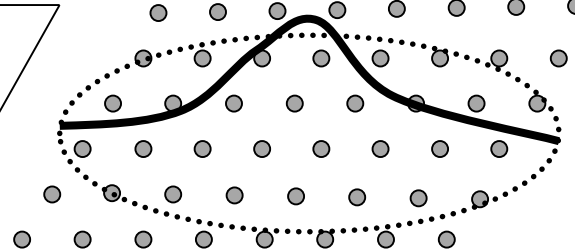
- Implementation of **h-adaptivity** is extremely simple
- Can handle large deformations with ease without loss of accuracy
- Higher continuous approximation
- No jumps in the stress/strain field which yields better accuracy compared to FEM
- No need for mesh generation
- No mesh alignment sensitivity due to isotropic character of the meshfree shape functions

Meshfree approximation (NOT interpolation)

FE



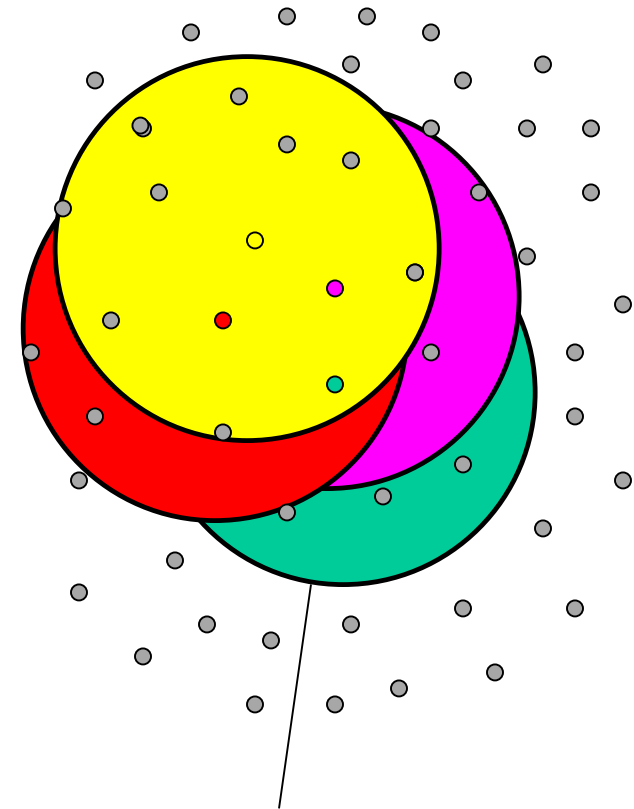
Meshfree



- Central particle
- Neighbor particle

Meshfree approximation

$$u(\mathbf{X}) = \sum_{J \in S} u_J \Phi_J(\mathbf{X})$$



Domain of influence (support)

Basic approximation

$$u(\mathbf{X}) = a_i(\mathbf{X}) p_i(\mathbf{X}) = \mathbf{a}^T \mathbf{p}, \quad \mathbf{p} = [1 \ X \ Y \ Z]$$

Minimize quadratic form

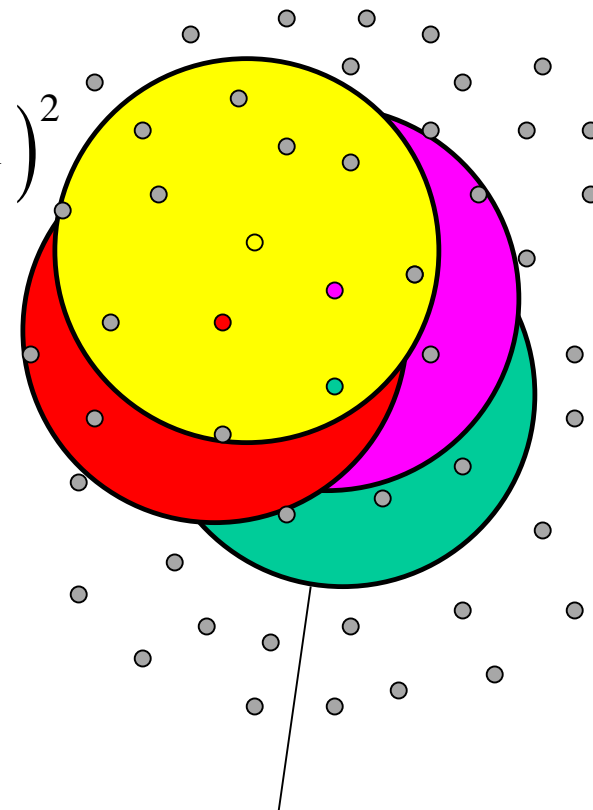
$$S(\mathbf{a}(\mathbf{X})) = \sum_J w(\mathbf{X} - \mathbf{X}_J) \left(\mathbf{a}^T(\mathbf{X}) \mathbf{p}(\mathbf{X}_J) - u_J \right)^2$$

leads to linear equations for \mathbf{a}

can be written in shape function form

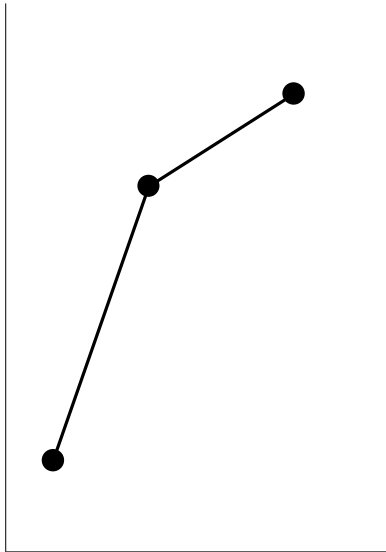
$$u(\mathbf{X}) = \sum_{J \in S} u_J \Phi_J(\mathbf{X})$$

- Central particle
- Neighbor particle

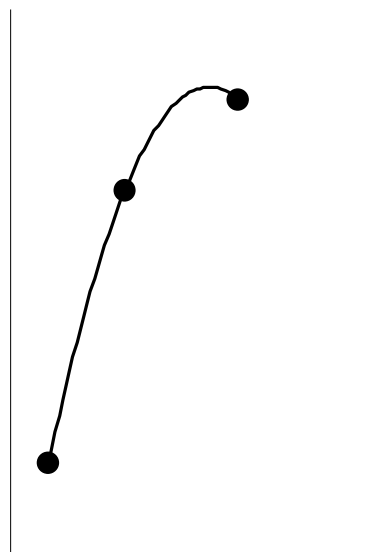


Domain of influence (support)

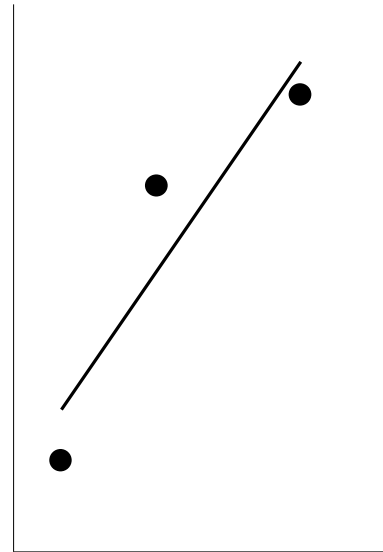
Meshfree approximation (NOT interpolation)



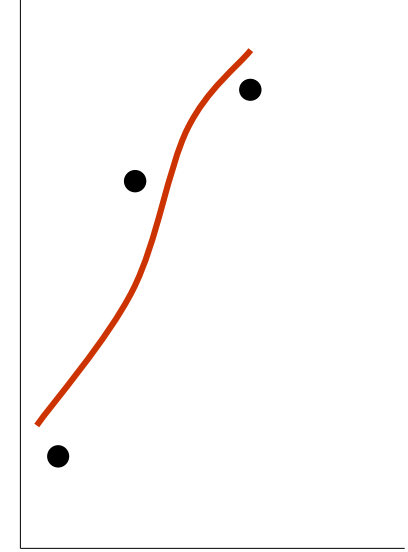
Linear
interpolation



Quadratic
interpolation



Least squares
(linear basis)



Moving least squares
(linear basis)

Finite elements

Meshfree methods

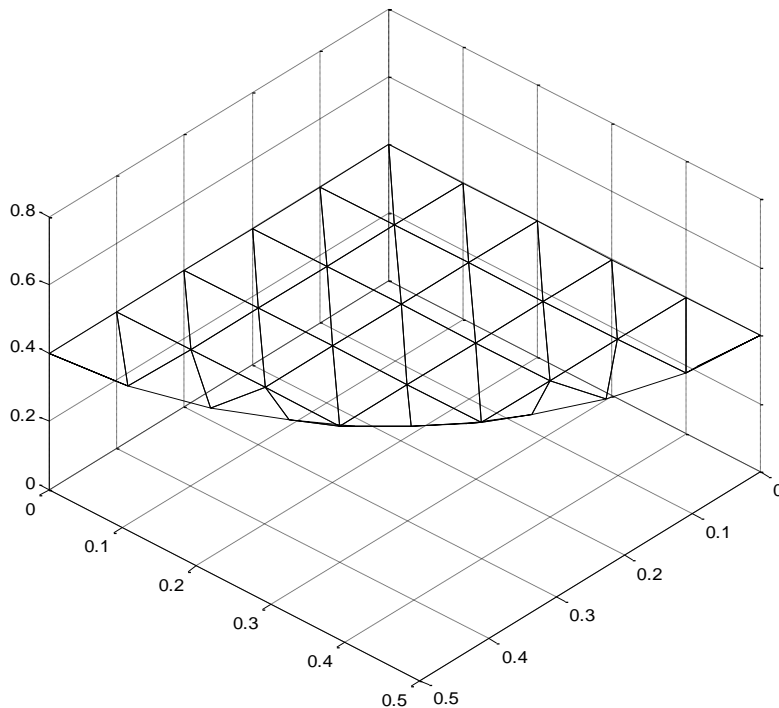
$$u^h(\mathbf{x}) = \sum_I^n \phi_I(\mathbf{x}) u_I$$

Meshfree approximation (NOT interpolation)

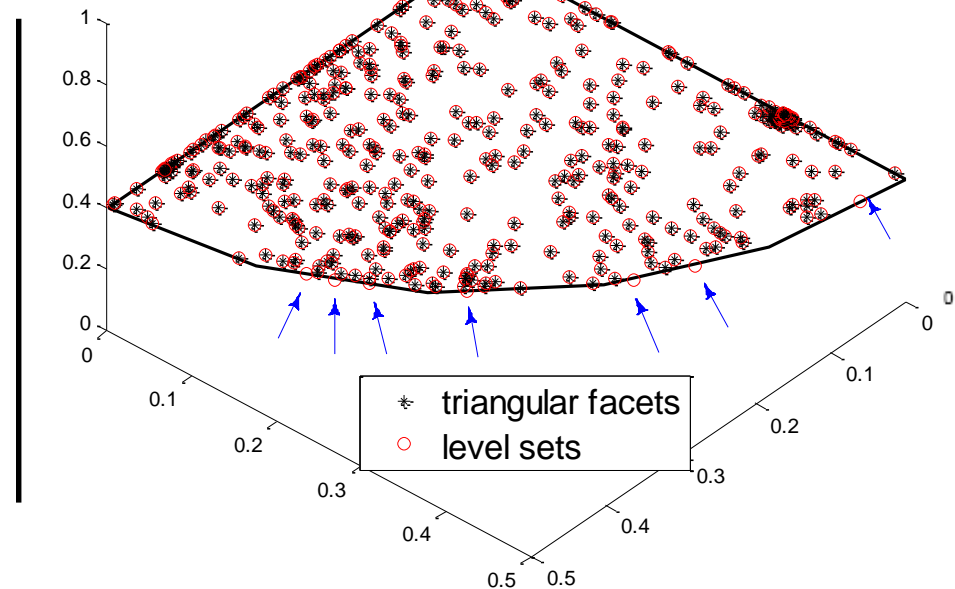
- Crack representation in 3D based on level sets
- Efficient integration strategy at the crack front
- Evaluation of the interaction integral in 3D

Representation of crack geometry

Triangular facets have been used to explicitly represent a crack surface (e.g. Duflot (2006) & Bordas *et al.* (2008)). However, the accuracy of the modelled crack geometry is reduced. For instance, a penny-shaped crack, which is a smooth curve, must be modelled as straight line segments which are C^0 only.

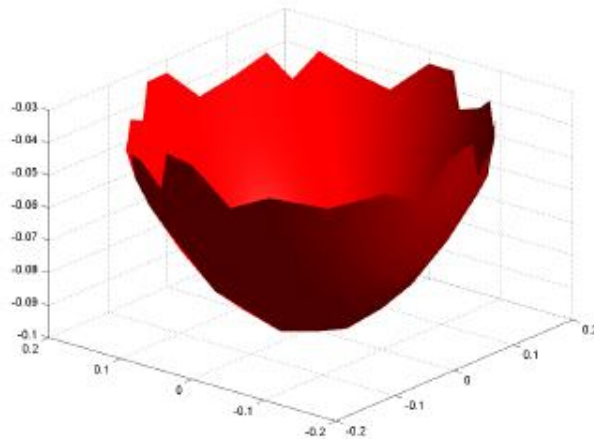


Triangular facets for a penny-shaped crack

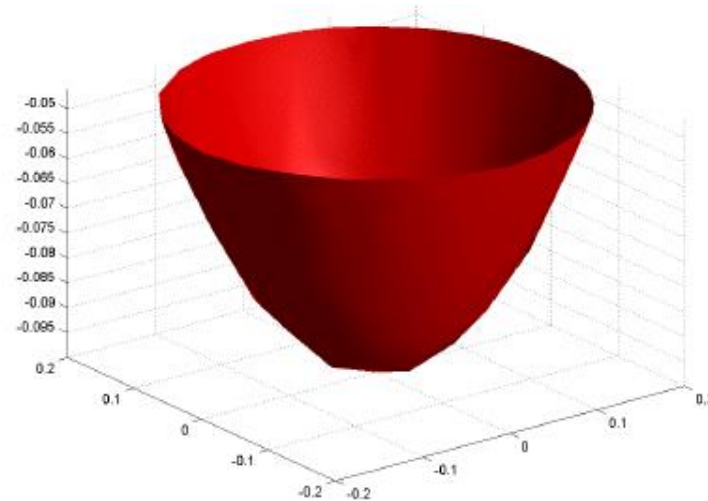


Curvature along crack front is omitted

Representation of crack geometry



(a) By direction interpolation.

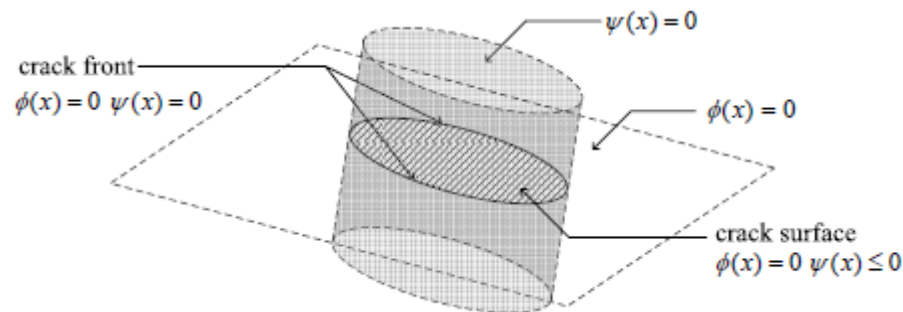


(b) By gradient projection method

A comparison of the crack front found by the direction interpolation and gradient projection method for the lens shaped crack.

Level sets for 3D fracture

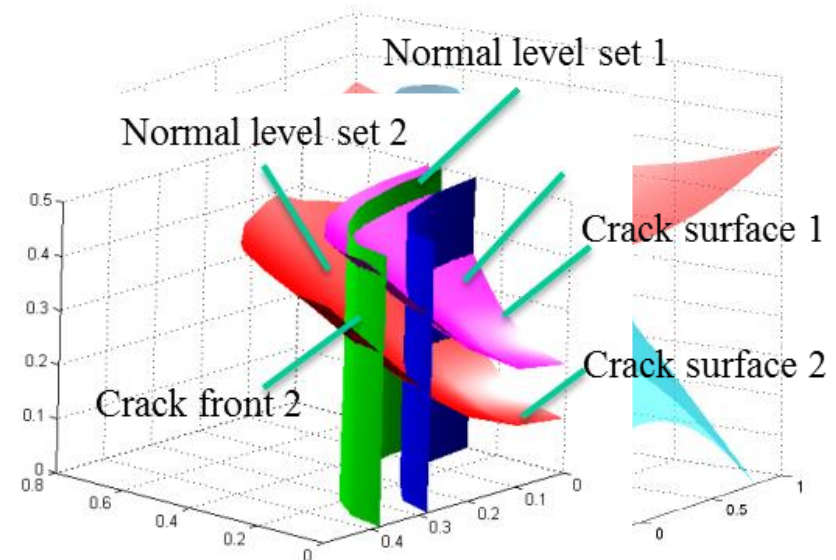
The level sets are particularly advantageous for dealing with arbitrary cracks in 3D, which have curvature both in surface and along the crack front.



$$\begin{array}{lll} \phi(\mathbf{x}) = 0 & \psi(\mathbf{x}) \leq 0 & \text{crack surface} \\ \phi(\mathbf{x}) = 0 & \psi(\mathbf{x}) = 0 & \text{crack front} \end{array}$$

Level sets are advanced by solving the H-J equation:

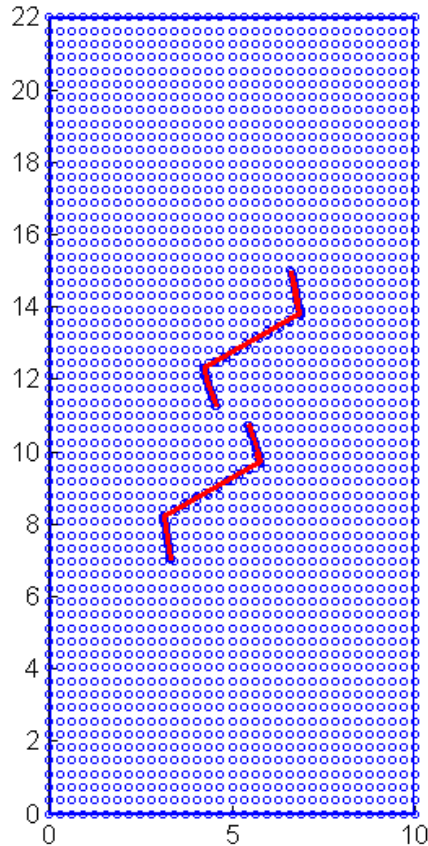
$$\frac{\partial \phi(\mathbf{x})}{\partial t} + v_\phi \nabla \phi(\mathbf{x}) \cdot \nabla \phi_0(\mathbf{x}) = 0$$



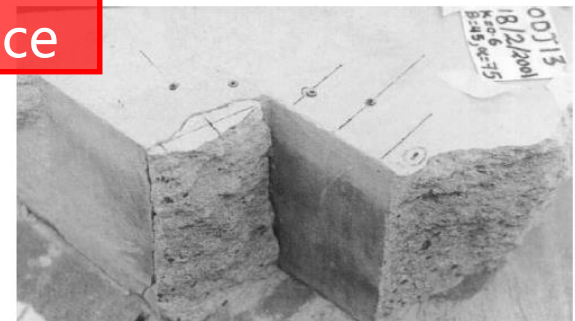
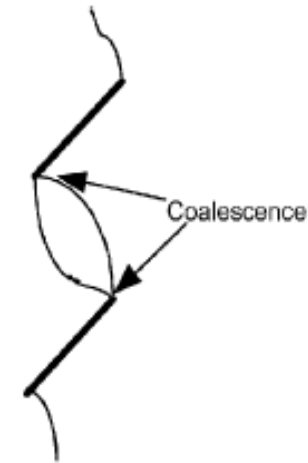
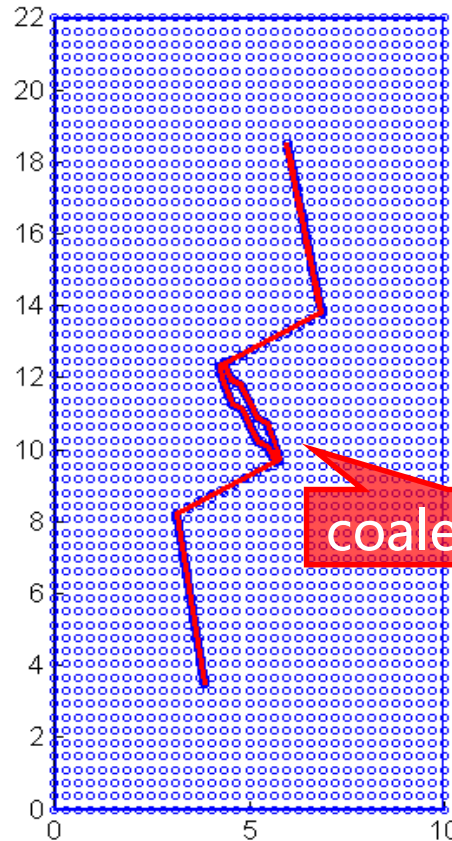
ϕ and ψ of a lens-shaped crack

Shear-compression crack propagation

The crack growth path of offset joints



Zhuang, Huang, Zhu (2012)



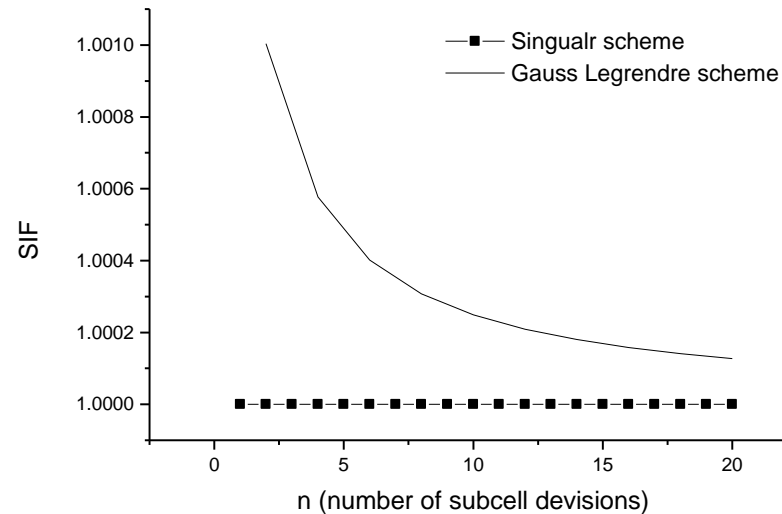
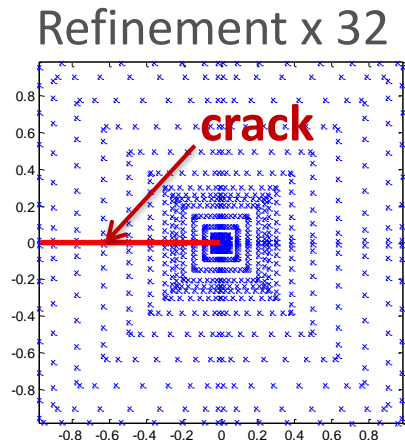
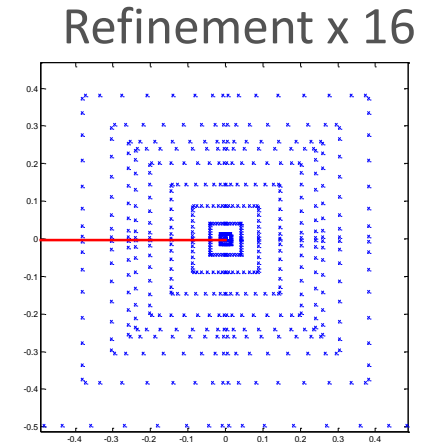
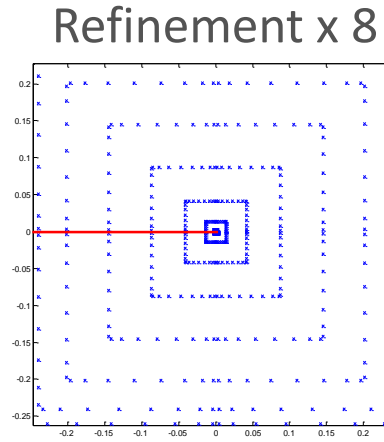
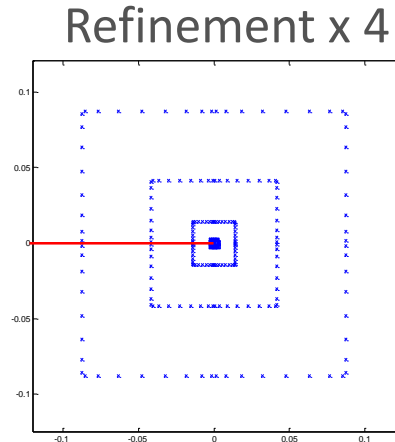
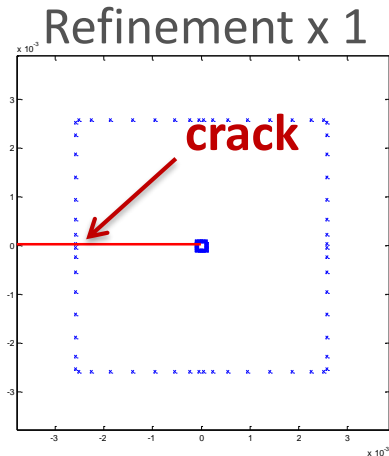
MUGHIEDA et al. (2004) [Geotechnical and
Geological Engineering]

My contributions:

- Crack representation in 3D based on level sets
- Efficient integration strategy at the crack front
- Evaluation of the interaction integral in 3D

Singular integration

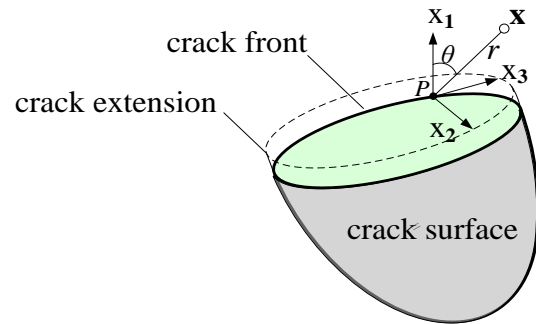
Singular stress around crack tip: $\sigma = f(1/\sqrt{r}, \theta)$



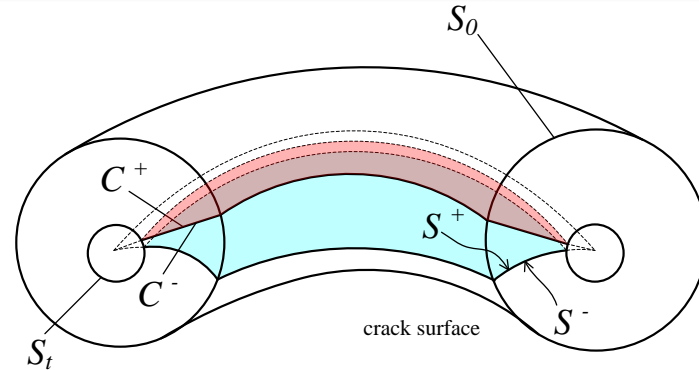
My contributions:

- Crack representation in 3D based on level sets
- Efficient integration strategy at the crack front
- Evaluation of the interaction integral in 3D

Curvilinear coordinates and level sets for curved crack front and non-planar surface



Non-planar crack



Domain integration along crack front

Energy release over curved crack front domain for non-planar crack

$$\bar{I} = \int_{\Omega} (P_{ij,j} q_i + P_{ij} q_{i,j}) d\Omega + \int_{C^+ + C^-} P_{ij} q_i n_j dS + \int_{S^+ + S^-} P_{ij} q_i n_j dS ,$$

Interaction integral form of Eshelby energy momentum tensor in curvilinear coordinates

$$P_{ij} = (\sigma_{ik} \varepsilon_{ik}^{\text{aux}} \delta_{ij} - u_{i,l}^{\text{aux}} \sigma_{ij} - u_{i,l} \sigma_{ij}^{\text{aux}}) ,$$

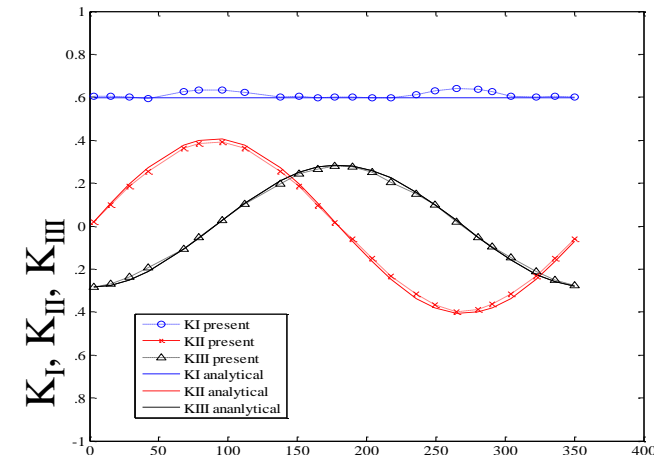
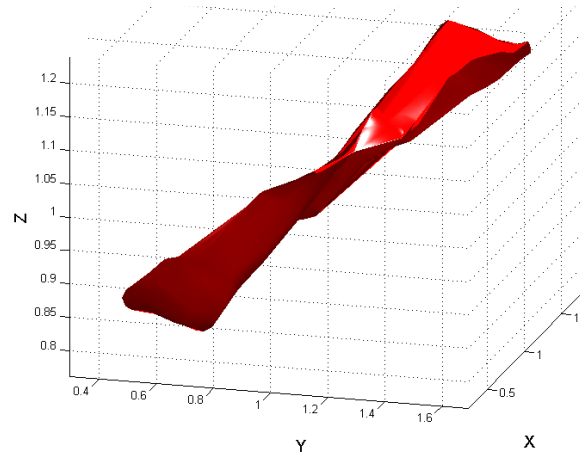
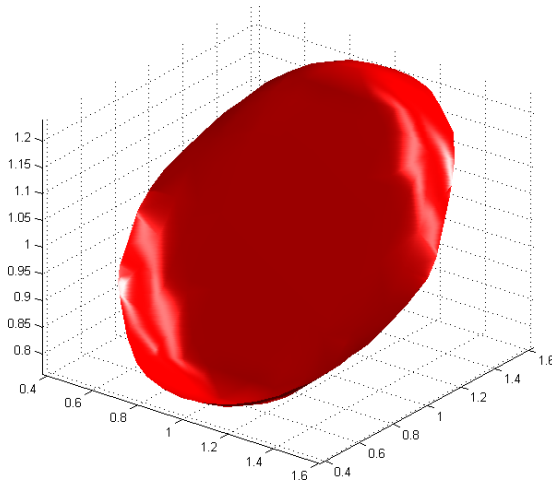
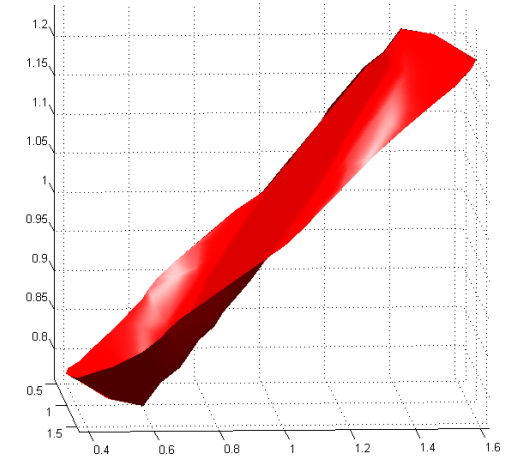
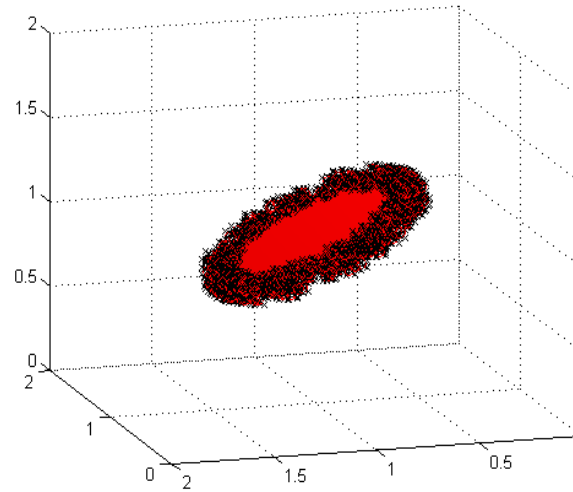
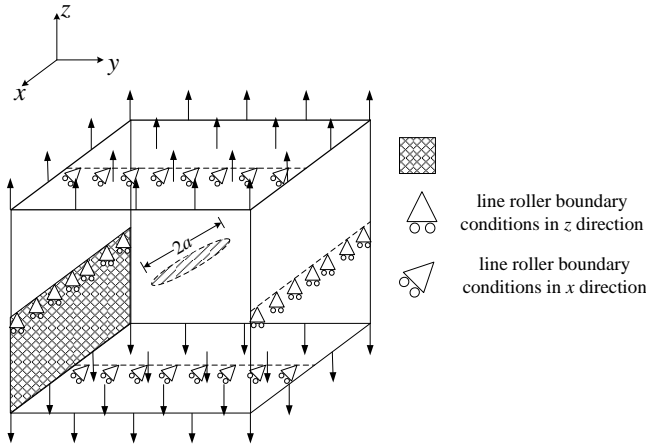
$$\begin{aligned} u_{1,1} \mathbf{e}_1 \otimes \mathbf{e}_1 \otimes \mathbf{e}_1 \frac{1}{h_1} \frac{\partial}{\partial \xi_1} &= u_{1,11} \mathbf{e}_1 \otimes \mathbf{e}_1 \otimes \mathbf{e}_1 \\ u_{1,1} \mathbf{e}_1 \otimes \mathbf{e}_1 \otimes \mathbf{e}_2 \frac{1}{h_2} \frac{\partial}{\partial \xi_2} &= u_{1,12} \mathbf{e}_1 \otimes \mathbf{e}_1 \otimes \mathbf{e}_2 \\ u_{1,1} \mathbf{e}_1 \otimes \mathbf{e}_1 \otimes \mathbf{e}_3 \frac{1}{h_3} \frac{\partial}{\partial \xi_3} &= \frac{h_{3,1}}{h_3} u_{1,1} \mathbf{e}_3 \otimes \mathbf{e}_1 \otimes \mathbf{e}_3 + \frac{h_{3,1}}{h_3} u_{1,1} \mathbf{e}_1 \otimes \mathbf{e}_3 \otimes \mathbf{e}_3 \end{aligned}$$

$$\begin{aligned} \frac{h_{3,1}}{h_3} u_1 \mathbf{e}_3 \otimes \mathbf{e}_3 \otimes \mathbf{e}_1 \frac{1}{h_1} \frac{\partial}{\partial \xi_1} &= -\frac{h_{3,1}^2}{h_3^2} u_1 \mathbf{e}_3 \otimes \mathbf{e}_3 \otimes \mathbf{e}_1 + \frac{h_{3,1}}{h_3} u_{1,1} \mathbf{e}_3 \otimes \mathbf{e}_3 \otimes \mathbf{e}_1 \\ \frac{h_{3,1}}{h_3} u_1 \mathbf{e}_3 \otimes \mathbf{e}_3 \otimes \mathbf{e}_2 \frac{1}{h_2} \frac{\partial}{\partial \xi_2} &= -\frac{h_{3,1} h_{3,2}}{h_3^2} u_1 \mathbf{e}_3 \otimes \mathbf{e}_3 \otimes \mathbf{e}_2 + \frac{h_{3,1}}{h_3} u_{1,2} \mathbf{e}_3 \otimes \mathbf{e}_3 \otimes \mathbf{e}_2 \\ \frac{h_{3,1}}{h_3} u_1 \mathbf{e}_3 \otimes \mathbf{e}_3 \otimes \mathbf{e}_3 \frac{1}{h_3} \frac{\partial}{\partial \xi_3} &= -\frac{h_{3,1}^2}{h_3^2} u_1 \mathbf{e}_1 \otimes \mathbf{e}_3 \otimes \mathbf{e}_3 - \frac{h_{3,1} h_{3,2}}{h_3^2} u_1 \mathbf{e}_2 \otimes \mathbf{e}_3 \otimes \mathbf{e}_3 \\ &\quad - \frac{h_{3,1}^2}{h_3^2} u_1 \mathbf{e}_3 \otimes \mathbf{e}_1 \otimes \mathbf{e}_3 - \frac{h_{3,1} h_{3,2}}{h_3^2} u_1 \mathbf{e}_3 \otimes \mathbf{e}_2 \otimes \mathbf{e}_3 \end{aligned}$$

Meshfree methods and particle methods

Non-planar crack propagation

Computational methods for fracture and the applications to design of new PMC
X. Zhuang

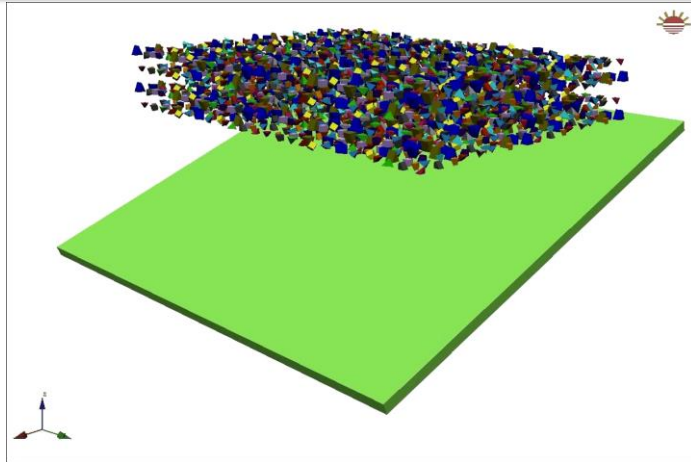


SIF results along crack front θ

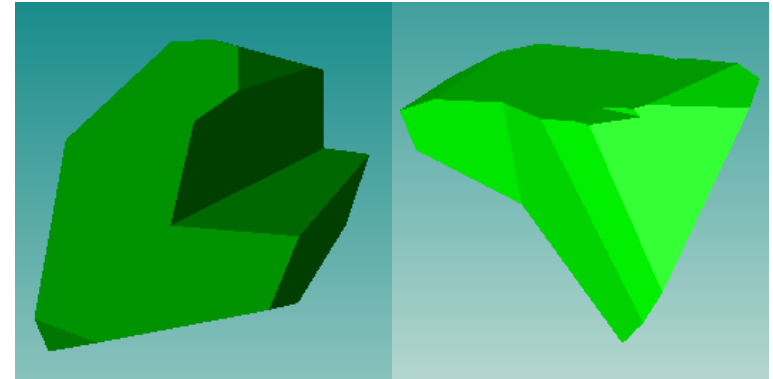
Meshfree methods and particle methods

Discontinuous deformation analysis for blocky system

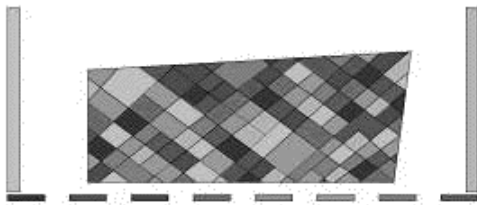
Computational methods for fracture and
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X. Zhuang



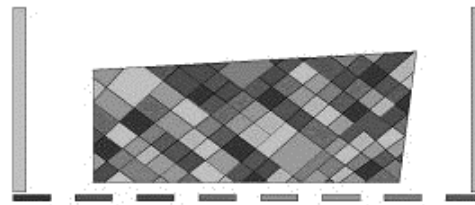
3D DDA model of particle flow



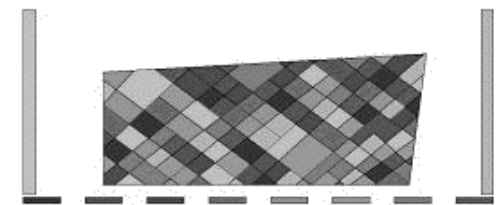
Concave blocks



0.05Hz



0.25Hz



1.0Hz

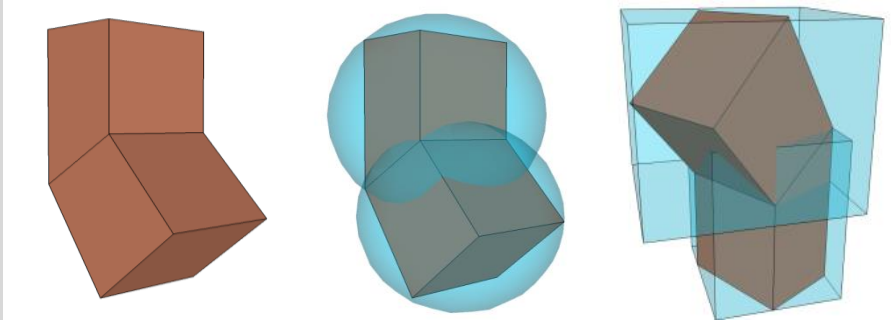
Vibrating screen with different frequency

Meshfree methods and particle methods

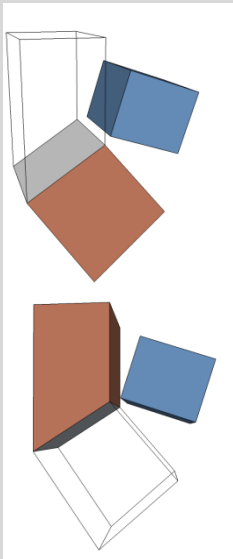
Discontinuous deformation analysis: contact detection

Computational methods for fracture and
the applications to design of new PMC
X. Zhuang

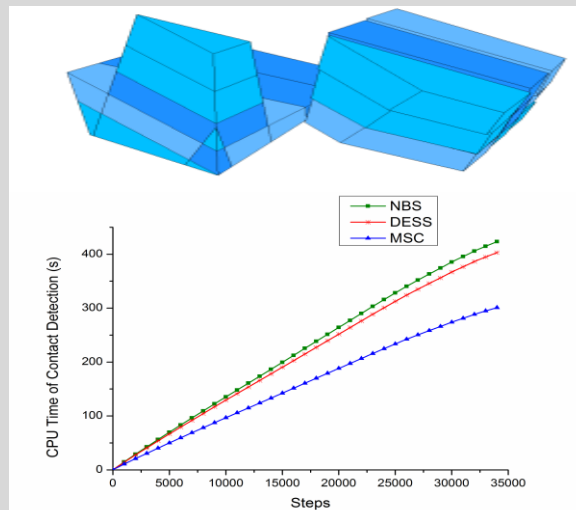
Contact detection is the most expensive part of DDA!



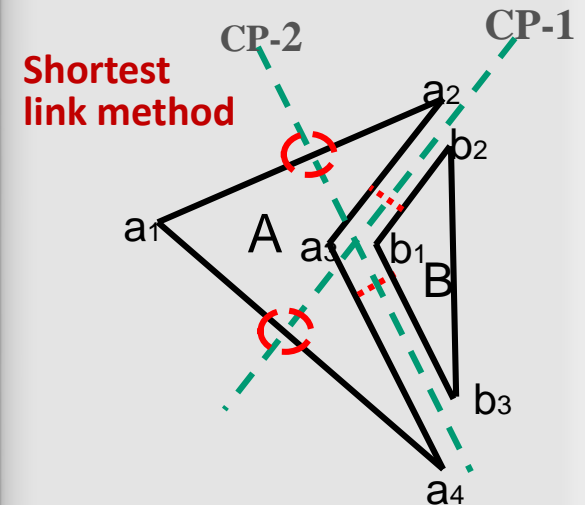
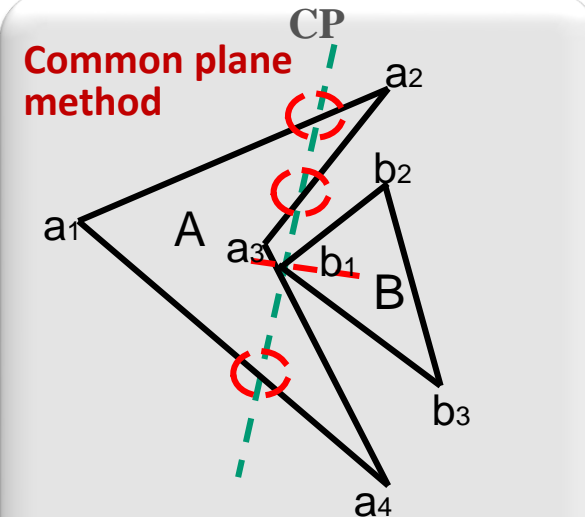
A new multi-shell cover contact detection method



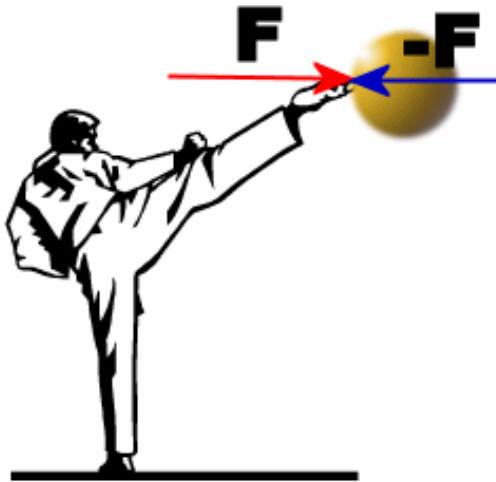
Concave block



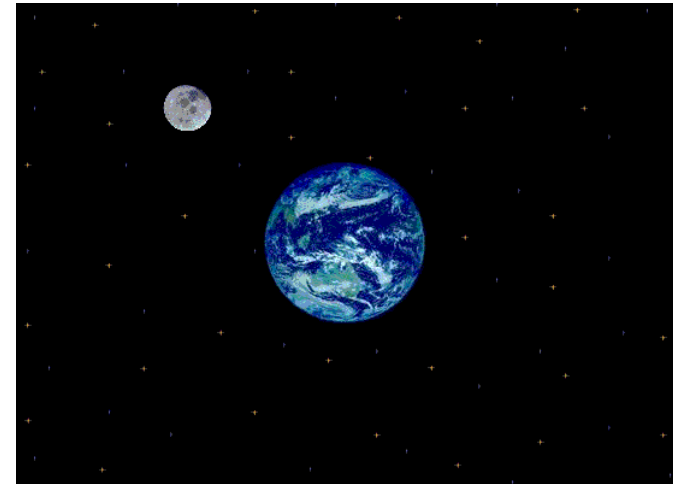
**Contact detection efficiency improved
by multi-shell cover (MSC)**



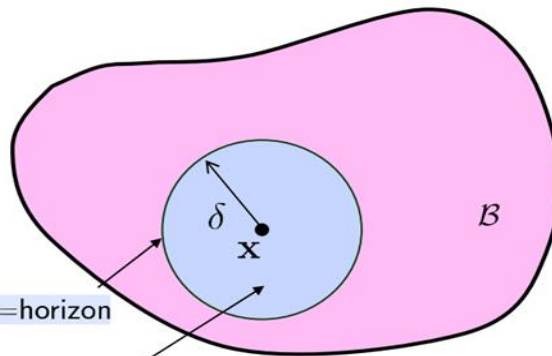
**Conventional methods
invalid for concave block**



Local model



Nonlocal model

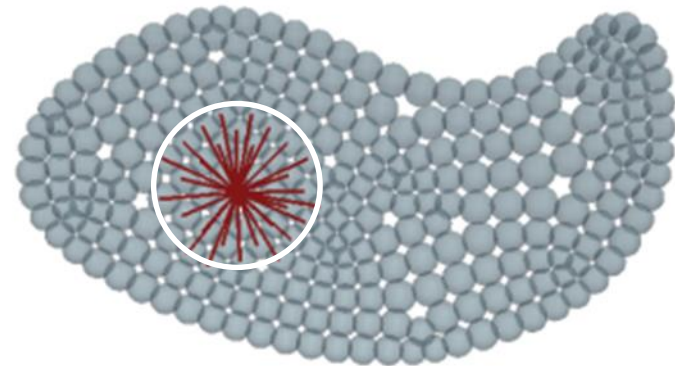


$\delta = \text{horizon}$

$\mathcal{H} = \text{family of } x$

Horizon H_x
Domain where any
particle falling inside
will receive the forces
exerted by x

Peridynamics and horizon of particle



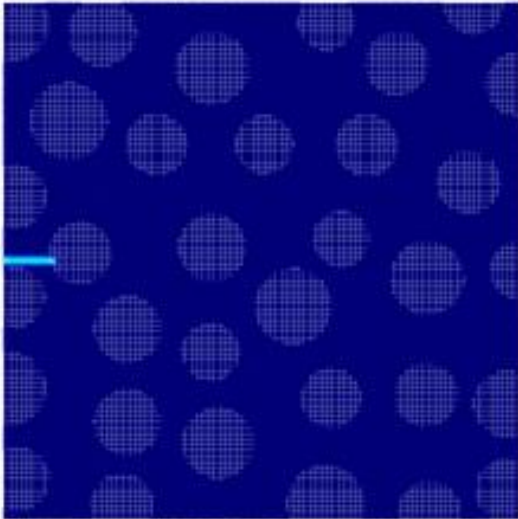
Particles interact each other similar to
planets or atoms

Classical equations of motion has divergence term

$$\rho(\mathbf{x})\ddot{\mathbf{u}}(\mathbf{x}, t) = \nabla \cdot \boldsymbol{\sigma} + \mathbf{b}(\mathbf{x}, t)$$

Peridynamics uses an integral form rather than differential form

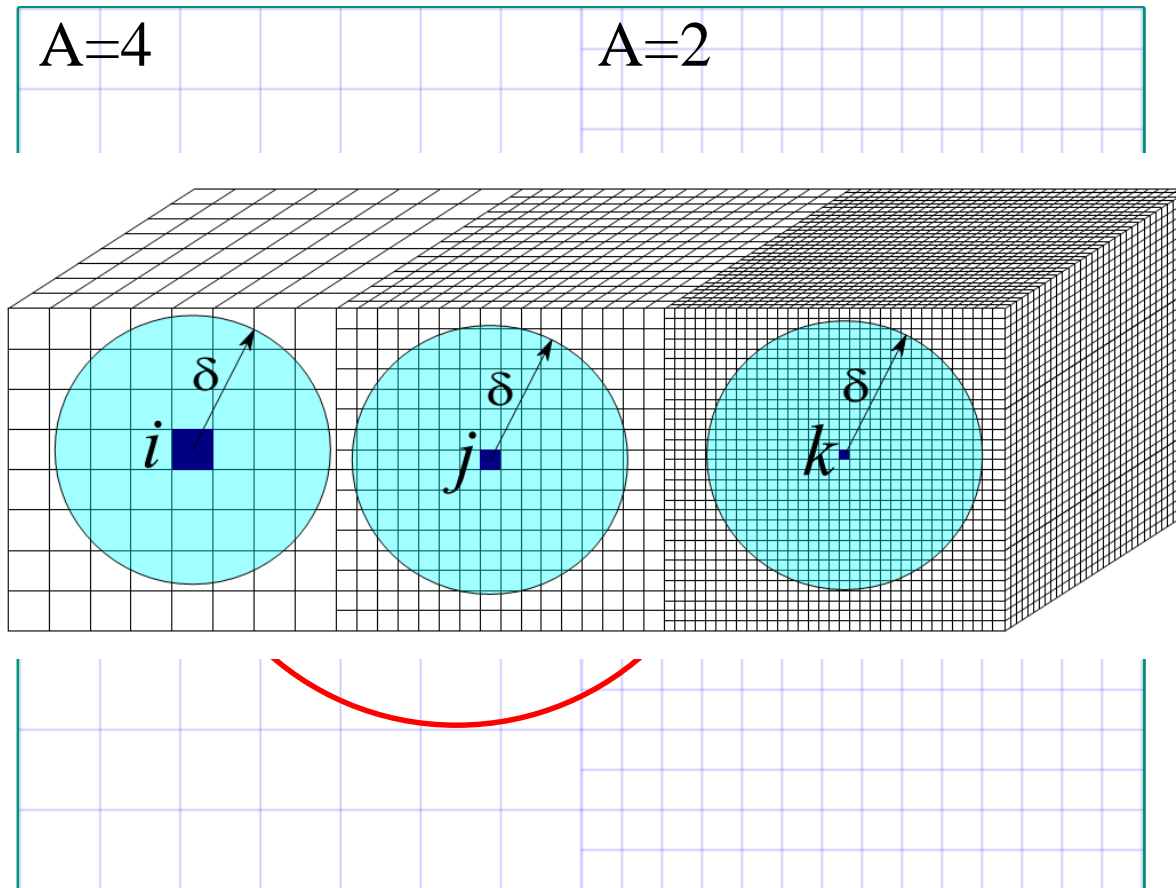
$$\rho(\mathbf{x})\ddot{\mathbf{u}}(\mathbf{x}, t) = \int_{H_{\mathbf{x}}} \mathbf{f}(\mathbf{u}(\mathbf{x}', t) - \mathbf{u}(\mathbf{x}, t), \mathbf{x}' - \mathbf{x}) dV_{\mathbf{x}'} + \mathbf{b}(\mathbf{x}, t)$$



Fractures are the natural outcome!
Crack branching, coalescence...

Constant horizon constraints in Peridynamics

- Computational cost too expensive when using constant horizon!
- **But non-constant horizon sizes results in spurious wave reflection!**



$$\mathbf{x} \notin H_{\mathbf{x}'} \Rightarrow \mathbf{F}_{\mathbf{x}\mathbf{x}'} = 0$$

$$\mathbf{x}' \in H_{\mathbf{x}} \Rightarrow \mathbf{F}_{\mathbf{x}'\mathbf{x}} \neq 0$$

$$\mathbf{F}_{\mathbf{x}\mathbf{x}'} \neq -\mathbf{F}_{\mathbf{x}'\mathbf{x}}$$

Newton's third law
violated.
Fundamental Symmetry
broken

- Ghost force issue
- Spurious wave reflection

Horizon H_x

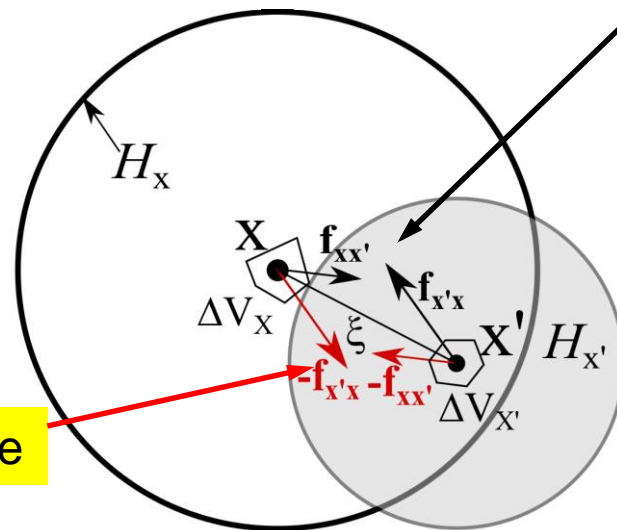
Domain where particle falling inside will receive the forces exerted by x

Dual-Horizon $H'_x = \{x' | x \in H_{x'}\}$.

A union of points whose horizons include x

Inertia force $\rho \ddot{u}(x, t)$

Body force $b(x, t)$



Direct bond force

Reaction bond force

Dual-horizon peridynamics

$$\rho \ddot{u}(x, t) = \int_{x' \in H'_x} f_{xx'}(\eta, \xi) dV_{x'} - \int_{x' \in H_x} f_{x'x}(-\eta, -\xi) dV_{x'} + b(x, t)$$

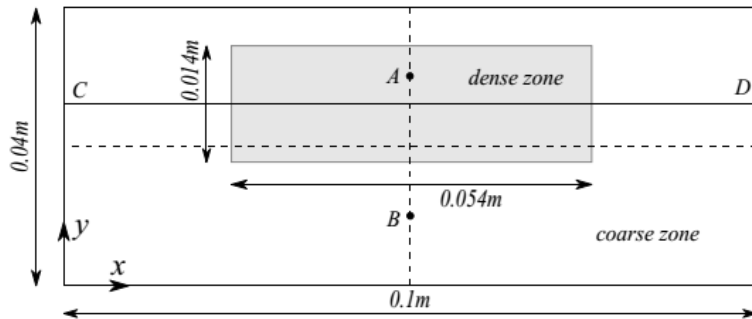
Conventional peridynamics

$$\rho \ddot{u}(x, t) = \int_{H_x} [f_{xx'}(\eta, \xi) - f_{x'x}(-\eta, -\xi)] dV_{x'} + b(x, t),$$

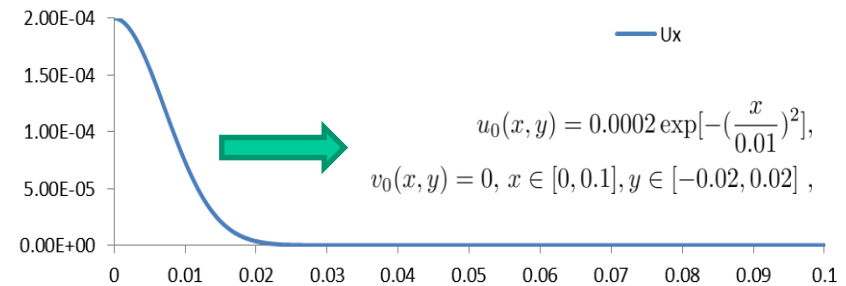
Dual-horizon peridynamics

Variable horizon sizes without any spurious force issue

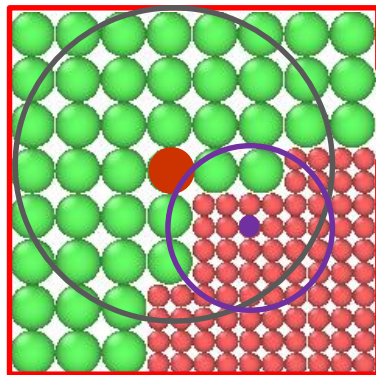
Computational methods for fracture and
the applications to design of new PMC
X. Zhuang



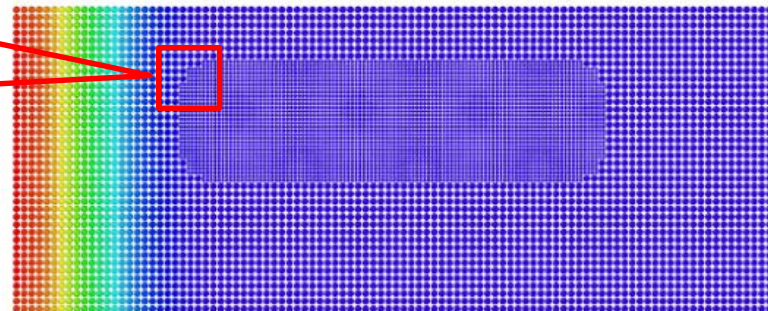
Wave propagation of plate



Initial displacement profile



Variable horizon sizes

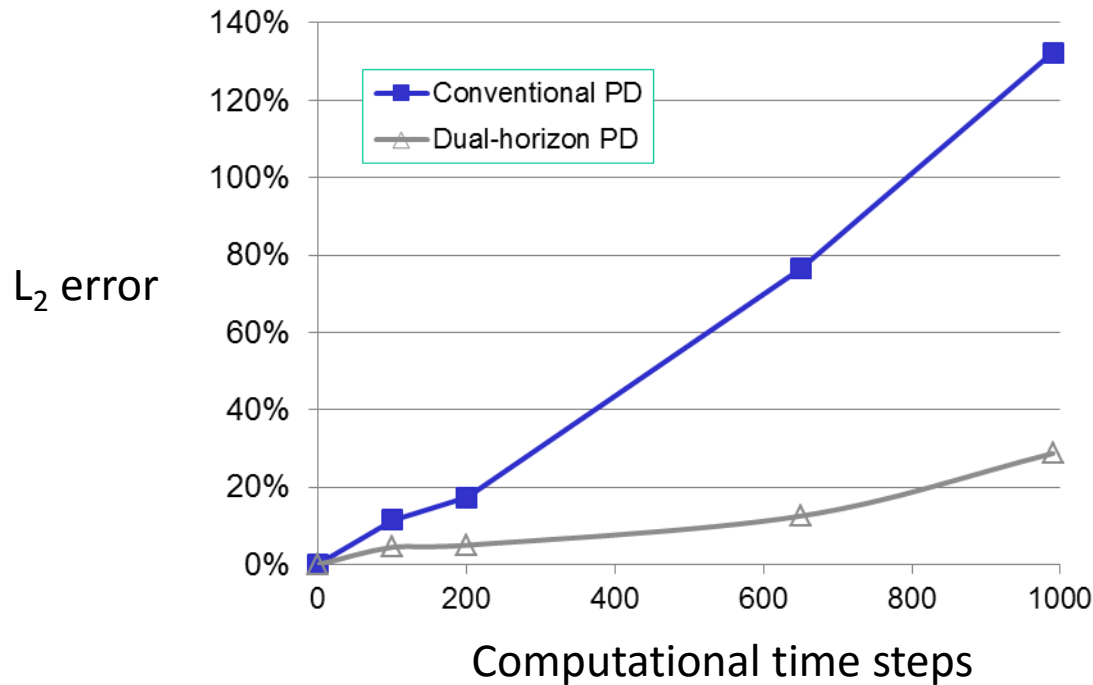


Dual-horizon peridynamics



Conventional peridynamics

L_2 error norm comparison



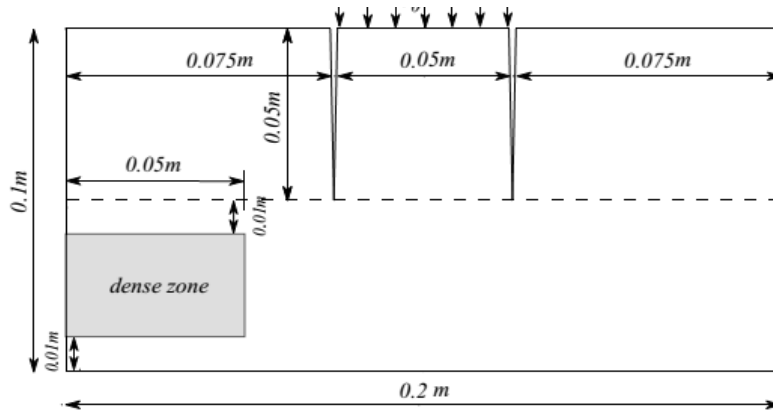
$$\|\text{err}\|_{L_2} = \frac{\|\mathbf{u}^h - \mathbf{u}_{\text{analytic}}\|}{\|\mathbf{u}_{\text{analytic}}\|}, \text{ where } \|\mathbf{u}\| = \left(\int_{\Omega_0} \mathbf{u} \cdot \mathbf{u} d\Omega_0 \right)^{\frac{1}{2}}.$$

Dual-horizon peridynamics

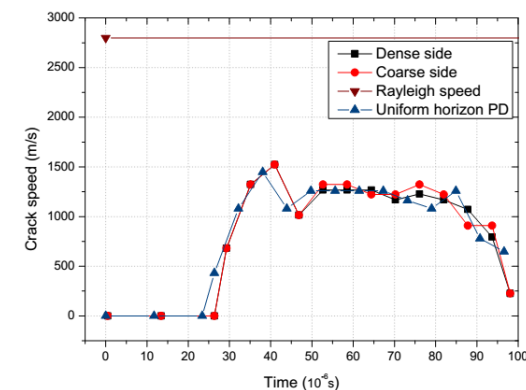
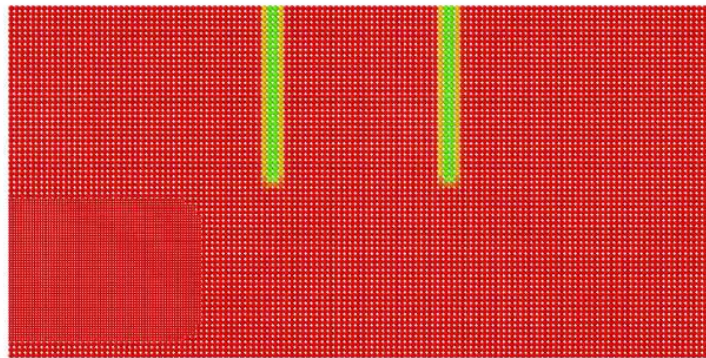
Stable results with varying horizon sizes

Computational methods for fracture and
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X. Zhuang

Kalthoff-Winkler Experiments



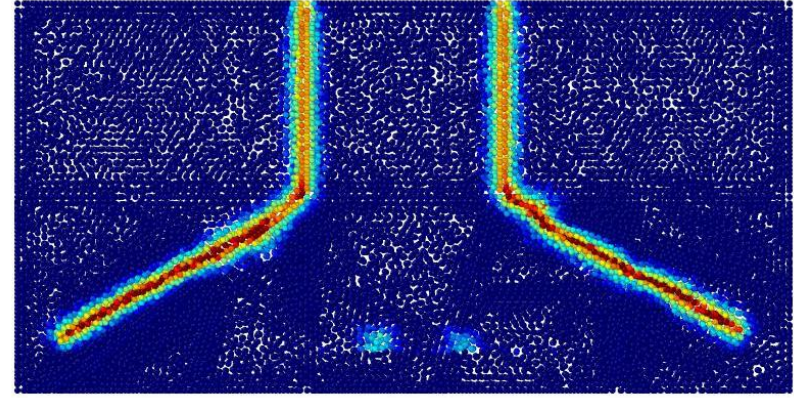
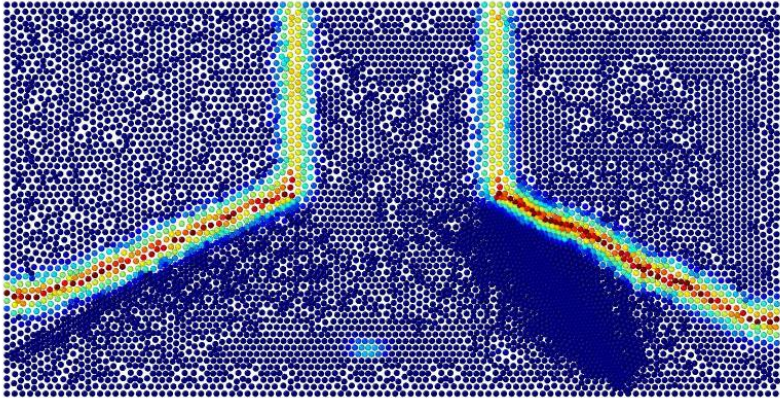
Parameter	value
Density	7800 kg/m ³
Elastic modulus	190 Gpa
Poisson ratio	0.25
G_0	6.9e4 J/m ²
Impact velocity	22m/s
Thickness	0.01m
Total particles	57968



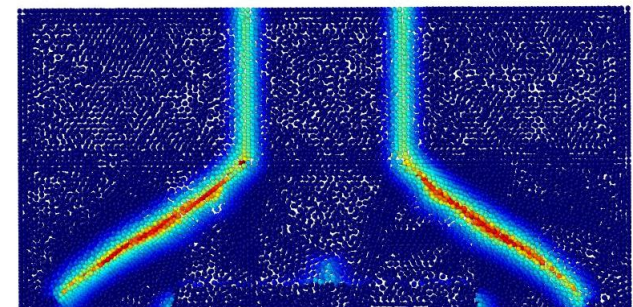
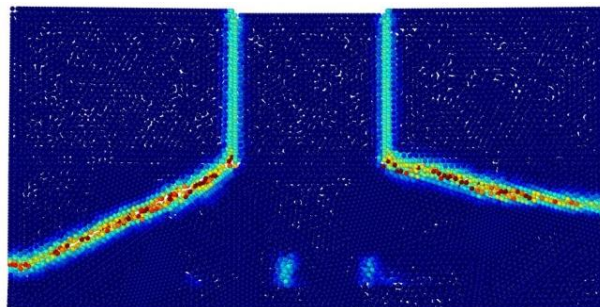
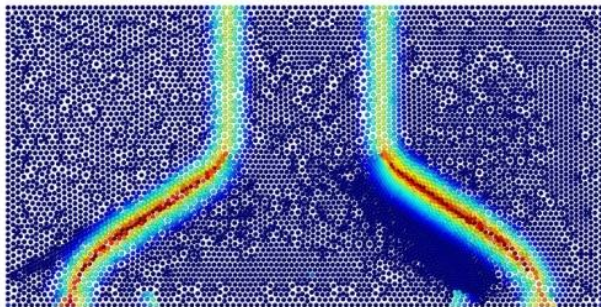
Dual-horizon peridynamics

Stable results with varying horizon sizes

Computational methods for fracture and
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X. Zhuang

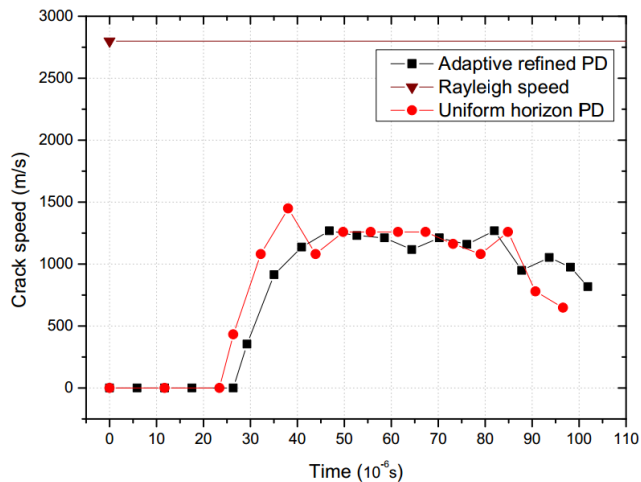
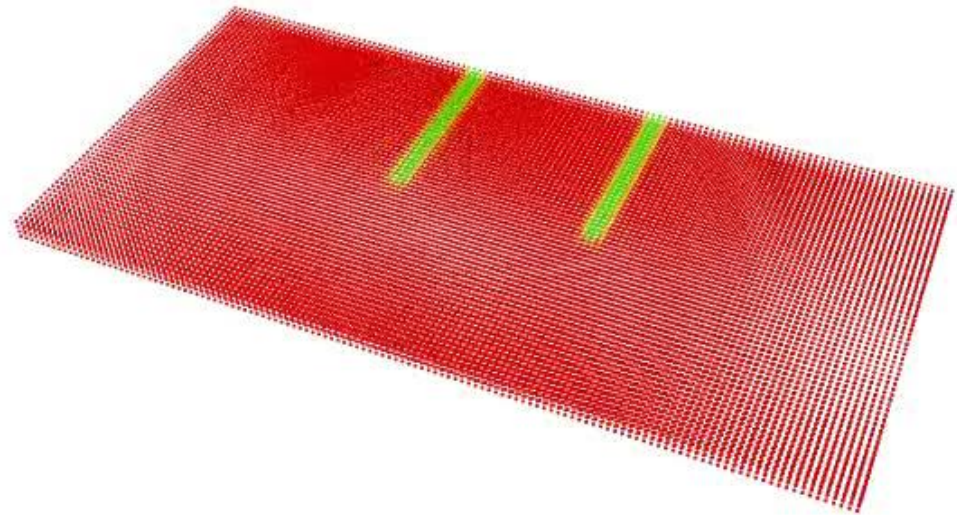
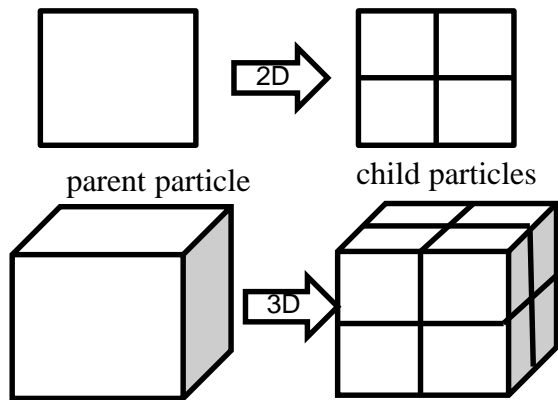


Dual-horizon peridynamics



Conventional peridynamics

Adaptive refinement along crack paths

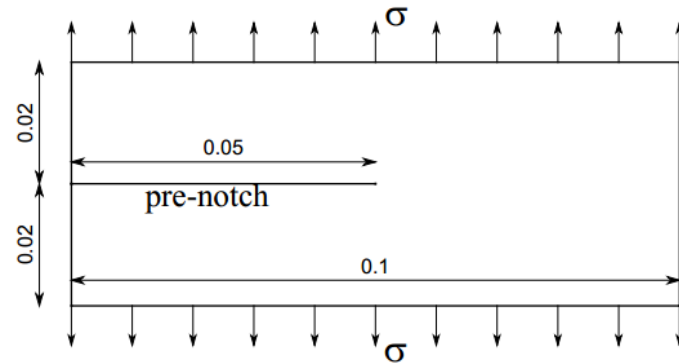


Dual-horizon peridynamics

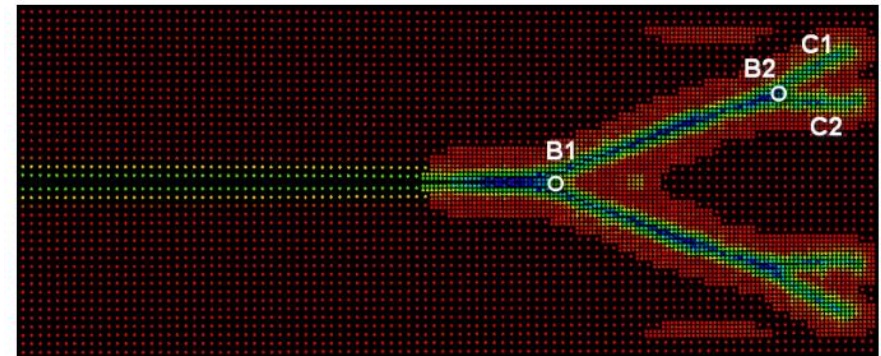
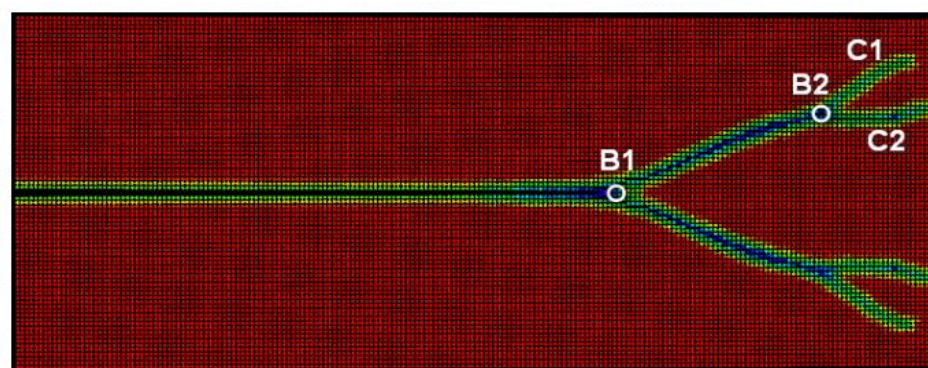
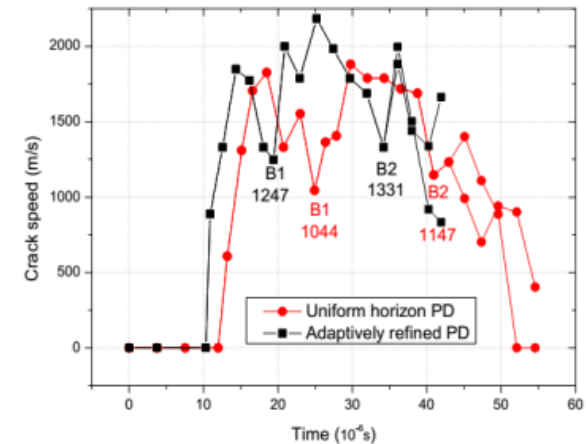
Adaptive refinement

Computational methods for fracture and the applications to design of new PMC
X. Zhuang

Plate with pre-crack subjected to traction



Parameter	value
Density	2440 kg/m ³
Elastic modulus	72 GPa
Poisson ratio	0.33
G_0	135 J/m ²
Traction stress	22 MPa
Thickness	0.01m
Total particles	4000-6424

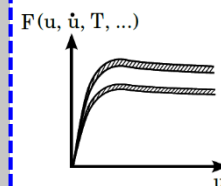
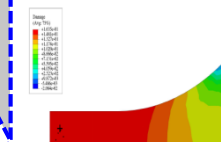
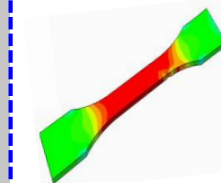
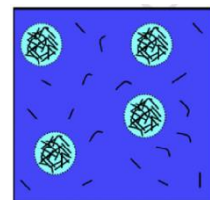
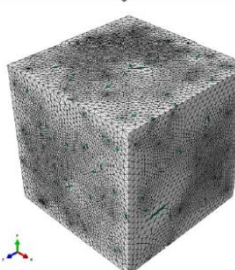
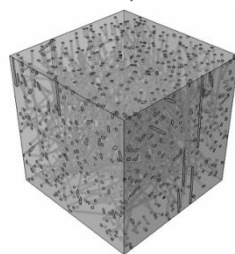
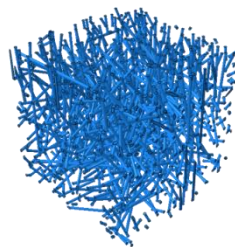
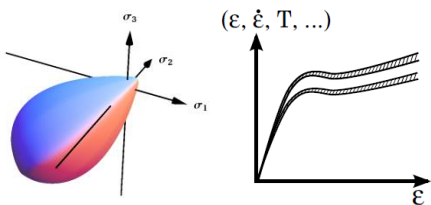
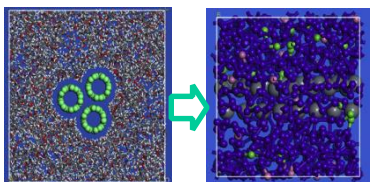
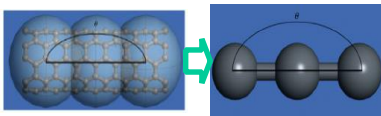
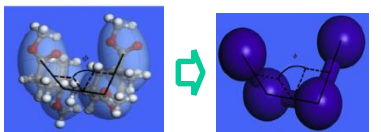


- Computational Methods for Fracture
 - Meshfree and Particle Methods
 - Peridynamics
- Application to the design of polymer-matrix composites
 - Framework
 - Models at different length scales
 - Multiscale approach
 - Sensitivity analysis and optimisation

MULTISCALE SYSTEM

MD \longleftrightarrow Continuum \longleftrightarrow Continuum \longleftrightarrow Continuum

Full atom \rightarrow Coarse-grained



Nano \longrightarrow Micro \longrightarrow Meso \longrightarrow Macro

SENSITIVITY ANALYSIS

OPTIMIZATION



- Topic: Computational Characterization, Testing and Design of Carbon Fiber Based Polymer Matrix Composites
- Budget: 1.65 M Euros
- Duration: Dec 2015 – Nov 2020

Group members

Postdocs



Nanthakumar
Subbiah



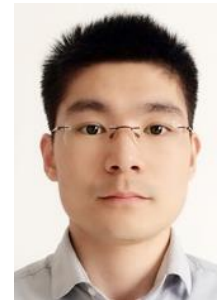
Shuai Zhou
周帅



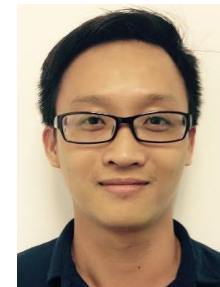
Yiming Zhang
张一鸣



Binh Nguyen Huy



Bo He
何博



Minh

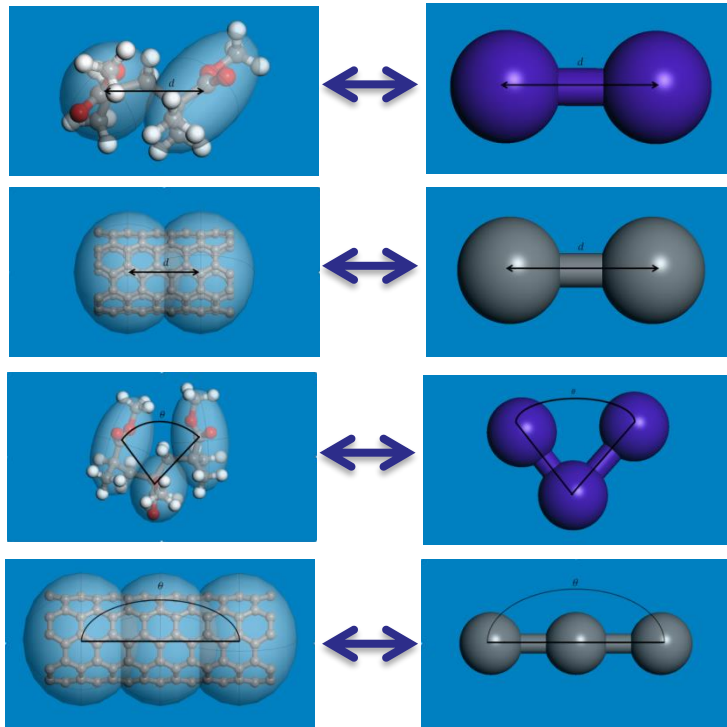


Thai

PhD students

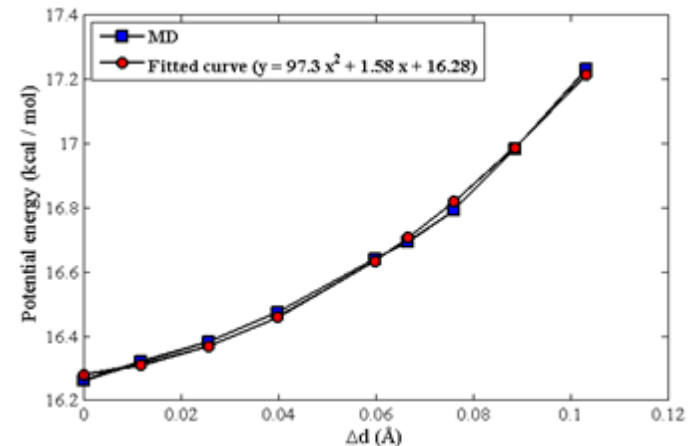
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Coarse-grained model for CNT/polymer



Atomistic model versus coarse-grained model

$$U_{total} = \sum_i E_{b_i} + \sum_j E_{a_j} + \sum_k E_{d_k} + \sum_{lm} E_{vdW_{lm}} + U_0$$



Parametrization of CG force fields.

$$E_b(d) = \frac{k_d}{2} (d - d_0)^2$$

$$E_a(\theta) = \frac{k_\theta}{2} (\theta - \theta_0)^2$$

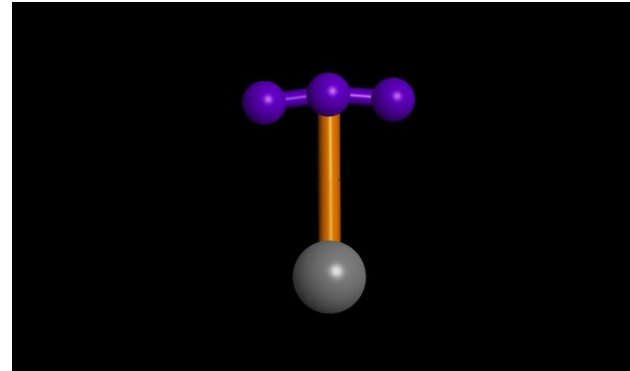
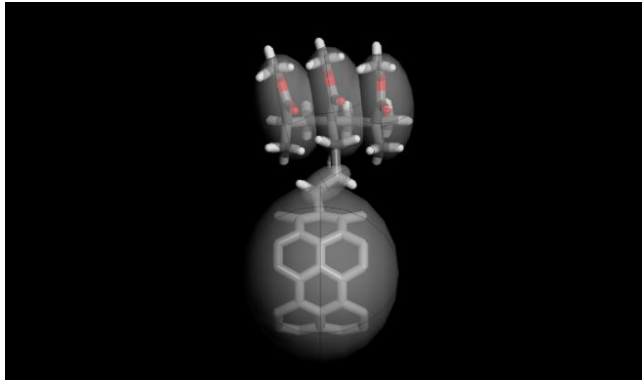
$$E_d(\phi) = \frac{k_\phi}{2} [1 + \cos 2\phi]$$

$$E_{vdW}(r) = D_0 \left[\left(\frac{r_0}{r} \right)^{12} - 2 \left(\frac{r_0}{r} \right)^6 \right]$$

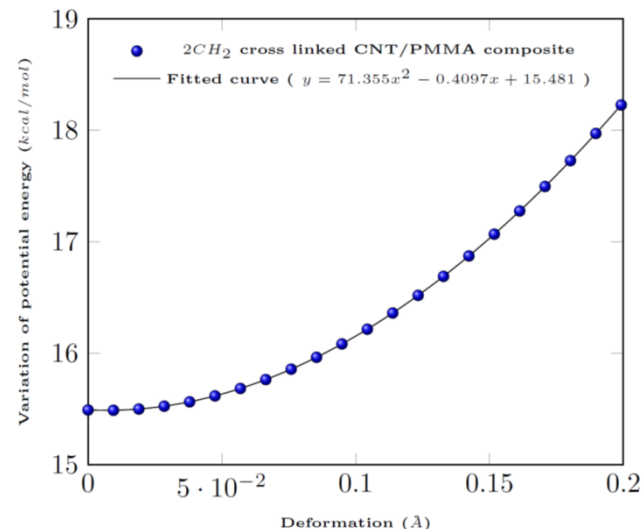
Coarse-grained model for CNT/polymer

Computational methods for fracture and
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X. Zhuang

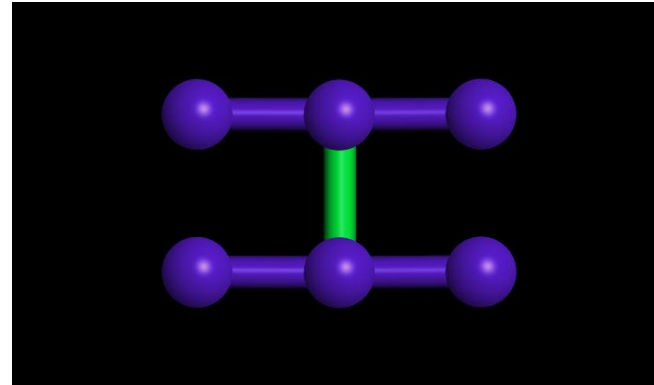
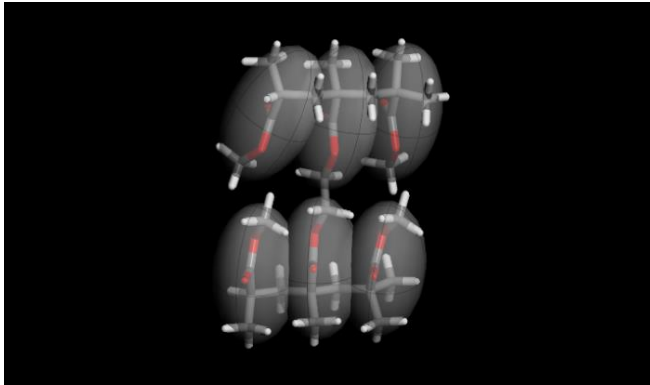
CG model Illustrations of 2CH_2 **cross link** between a PMMA monomer and a CNT resulting from atomistic models.



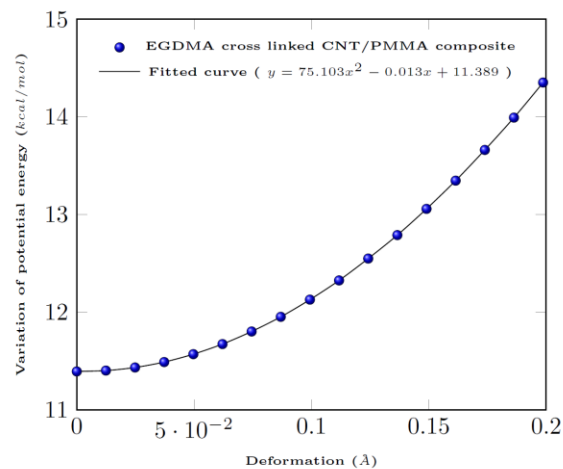
The spring constant is $142.71 \left(\frac{\text{kcal}}{\text{mol}} / \text{\AA}^2 \right)$. The equilibrium distance between two beads is $9.487(\text{\AA})$



EGDMA cross link between two PMMA monomers

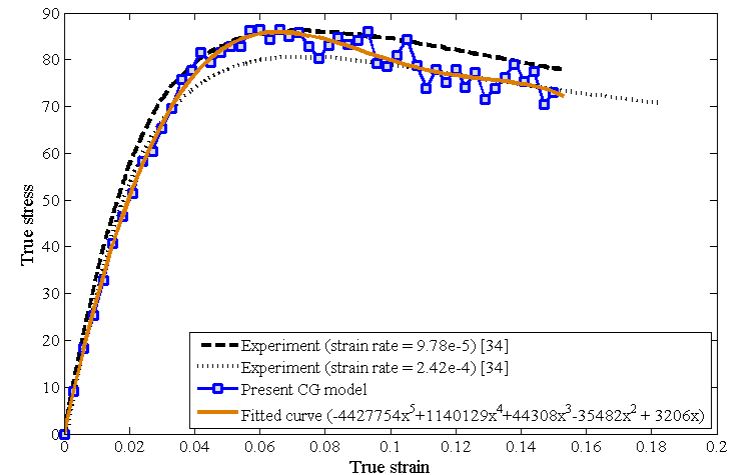
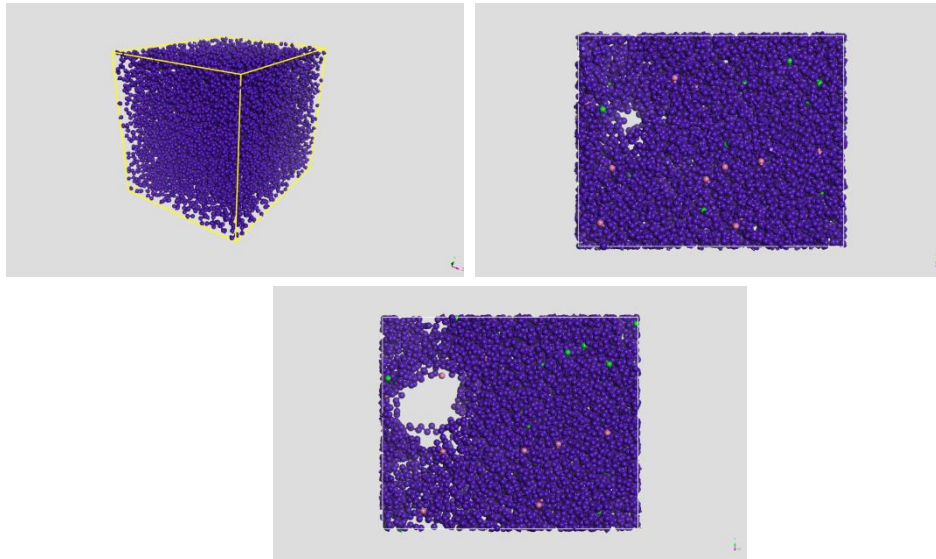


The spring constant is $150.206 \left(\frac{\text{kcal}}{\text{mol}} / \text{\AA}^2 \right)$. The equilibrium distance between two beads is $6.21(\text{\AA})$



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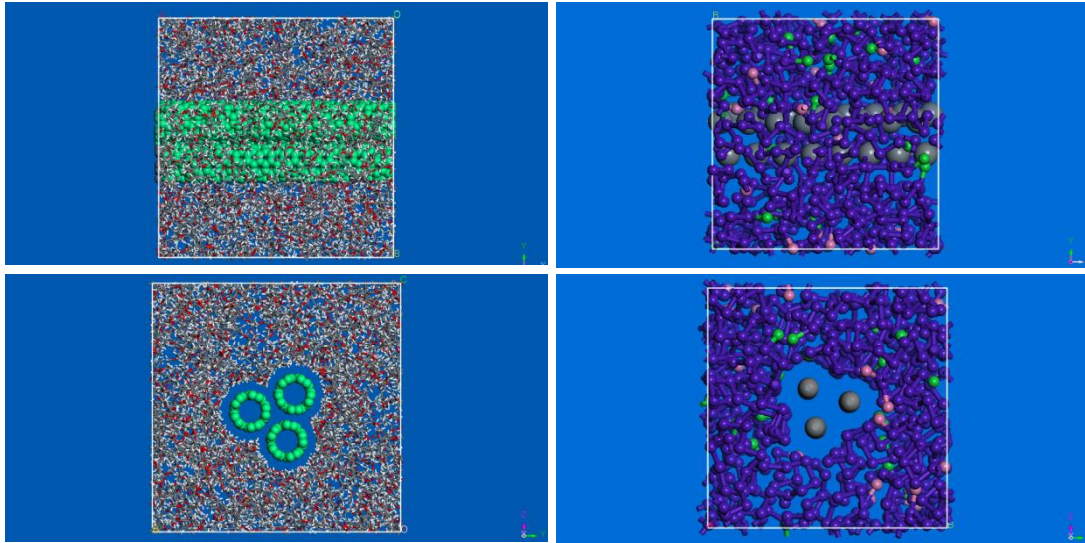


Tensile fracture of a pure PMMA polymer.

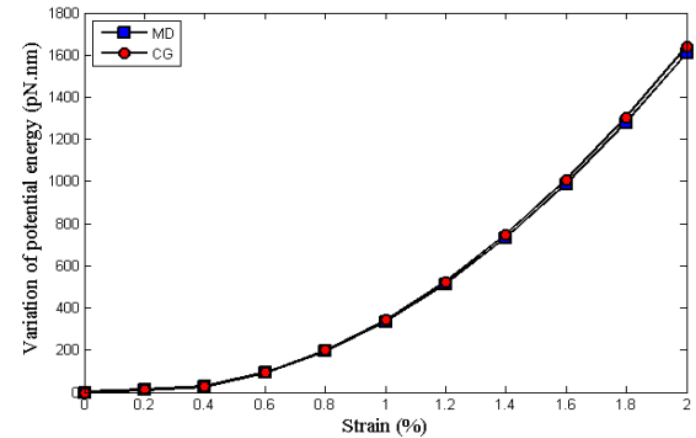
	Experiment (Strain rate= 2.42×10^{-4})	Experiment (Strain rate= 9.87×10^{-5})	Present CG model
Young's modulus (GPa)	3.27	3.12	2.88
Yield strength (MPa)	56.6	51.4	52.30
Tensile strength (MPa)	86.9	79.6	85.82
Critical strain	0.165	0.178	0.159

Coarse-grained model for CNT/polymer

Computational methods for fracture and
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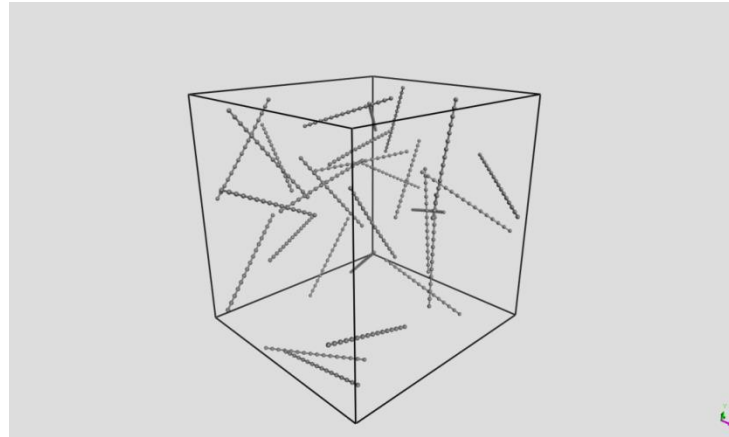
Atomistic and coarse-grained RVE of a CNT/PMMA composite.



Variation of potential energy of the composite versus strain

Volume fraction of CNTs (%)	CG (GPa)	MD (GPa)
10 (3 CNTs)	73.39	72.54
13.38 (4 CNTs)	97.13	96.05
16.73 (5 CNTs)	122.05	121.30
20 (6 CNTs)	145.49	145.34

Tensile strength w.r.t. fiber length and wt%

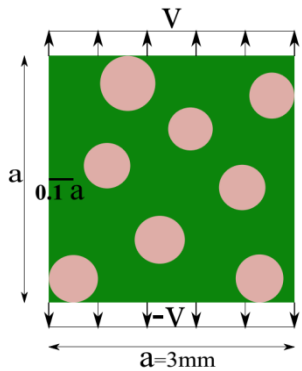


Tensile strength of CNT/PMMA composites

wt (%)	Young' s modulus (GPa)	Tensile strength (MPa)
5	3.05	92.44
8	3.11	94.80
10	3.24	99.63

<i>L/D</i>	Young's modulus (GPa)	Tensile strength (MPa)
14.7	3.11	94.80
29.4	3.59	101.82
44.1	4.01	111.61

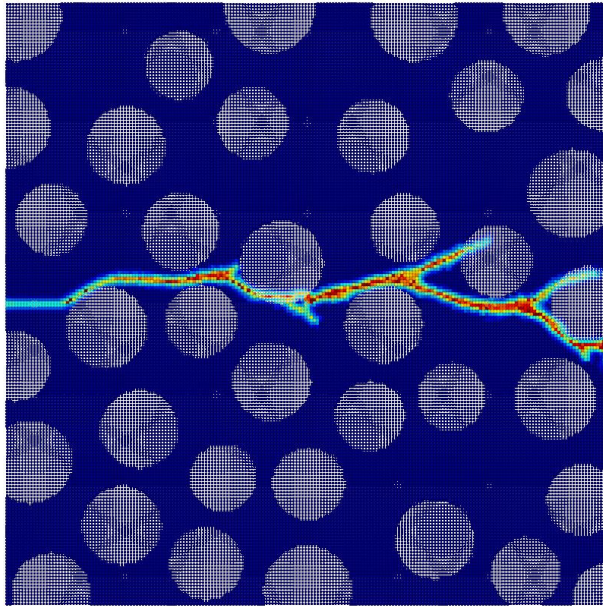
Crack propagation of two-phase composites



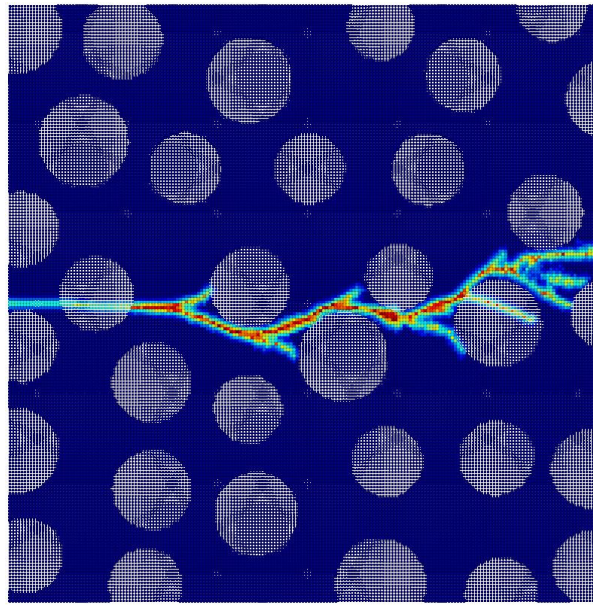
Boundary condition $v=0.5 \text{ m/s}$

Critical stretch is $s_0(\delta) = \sqrt{\frac{4\pi G_0}{9E\delta}}$

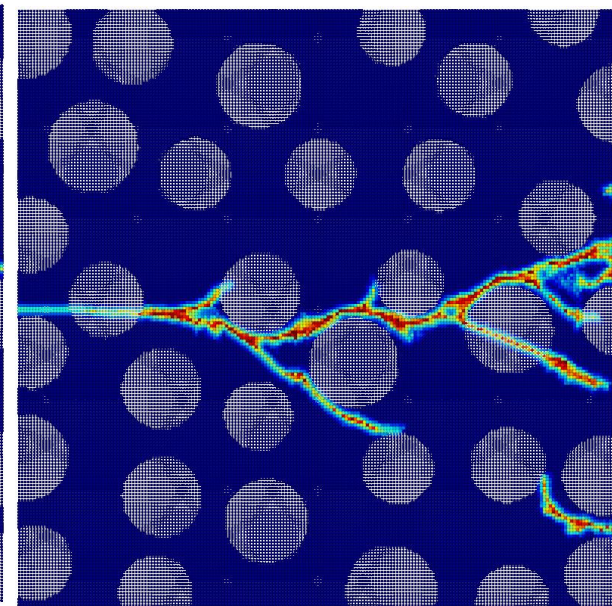
Type	E (Gpa)	Poisson's ratio	G_0 (J/m2)
Matrix	72	1/3	40
Reinforcement	144	1/3	80



Case 1: $v=0.5\text{m/s}$

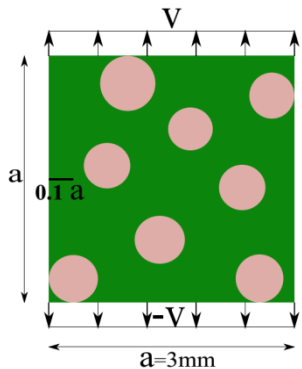


Case 2: $v=0.5\text{m/s}$



Case 3: $v=2\text{m/s}$

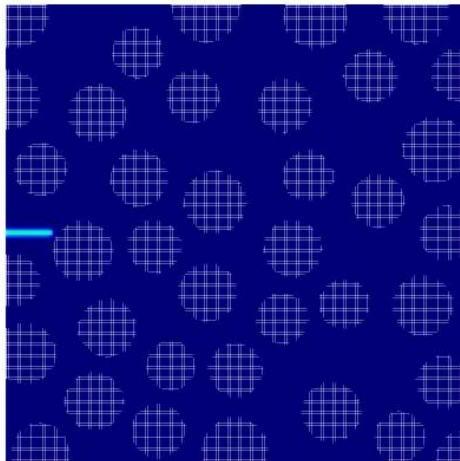
Crack propagation of two-phase composites



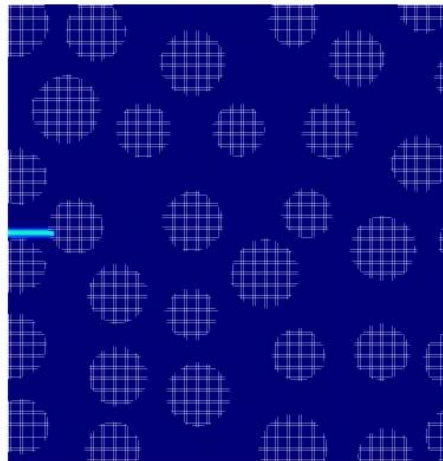
Boundary condition $v=0.5 \text{ m/s}$

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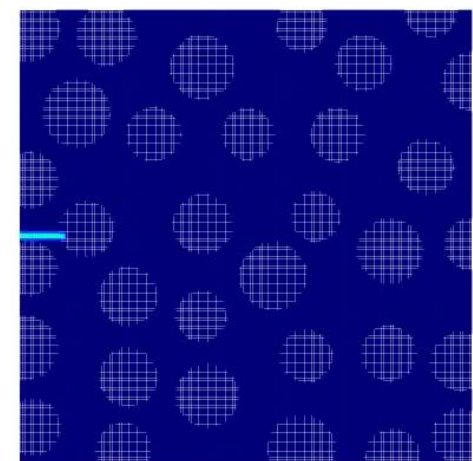
Type	E (Gpa)	Poisson's ratio	G_0 (J/m ²)
Matrix	72	1/3	40
Reinforcement	144	1/3	80



Case 1: $v=0.5\text{m/s}$



Case 2: $v=0.5\text{m/s}$



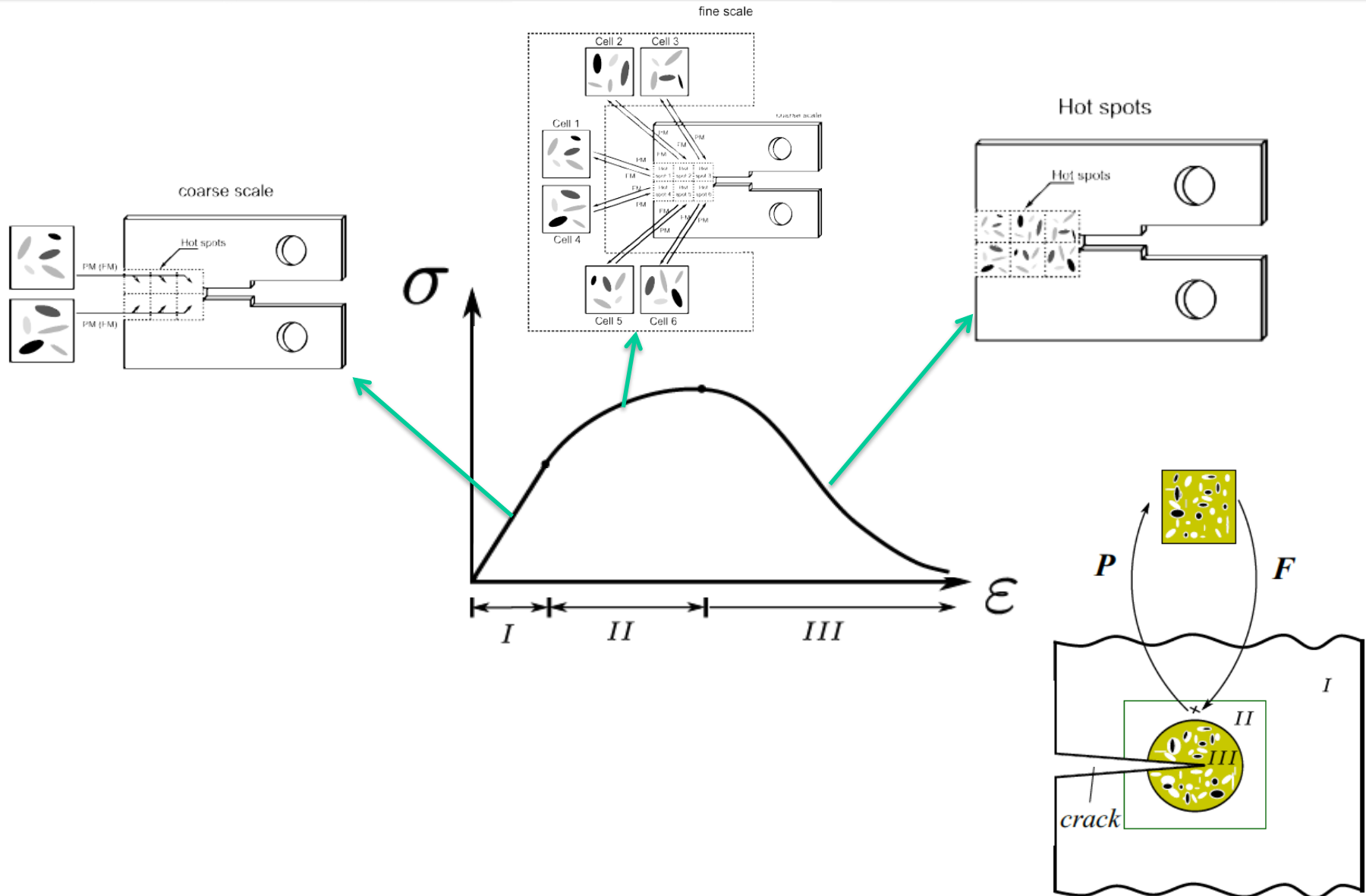
Case 3: $v=2\text{m/s}$

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Multiscale method

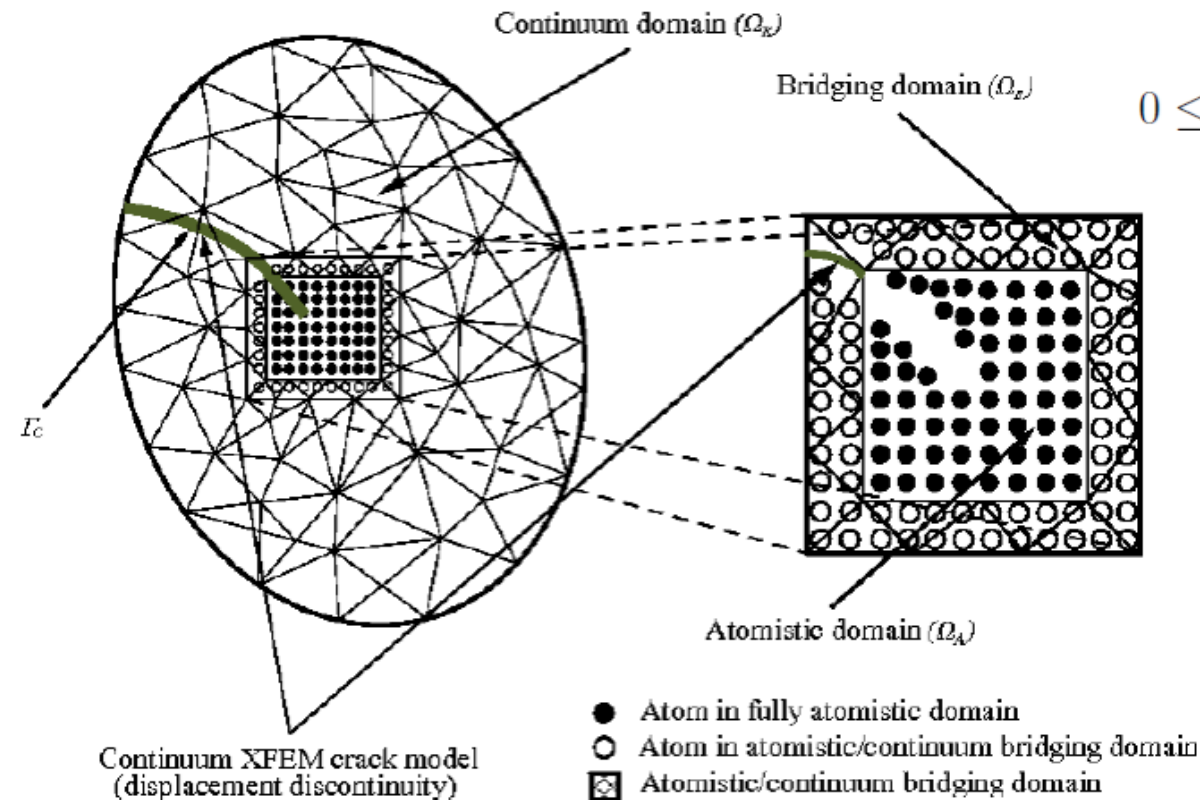
Bridging models at different length scales

Computational methods for fracture and
the applications to design of new PMC
X. Zhuang



Multiscale method

Bridging models at different length scales



$$w^A(\mathbf{x}) + w^K(\mathbf{x}) = 1 \quad \forall \mathbf{x} \in \Omega$$

$$0 \leq w^i(\mathbf{x}) \leq 1, \quad i = A, K, \quad \forall \mathbf{x} \in \Omega$$

$$w^A(\mathbf{x}) = 1 \quad \forall \mathbf{x} \in \Omega_A \setminus \Omega_B$$

$$w^K(\mathbf{x}) = 1 \quad \forall \mathbf{x} \in \Omega_K \setminus \Omega_B$$

$$W^K(\mathbf{u}) = W_{int}^K(\mathbf{u}) + W_{ext}^K(\mathbf{u}) + W_{kin}^K(\mathbf{u})$$

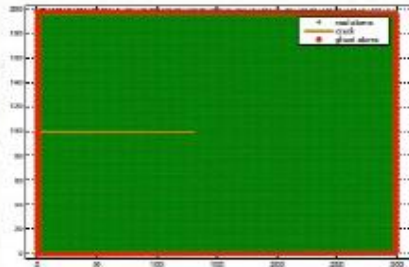
$$W_{int}^K(\mathbf{u}) = \int_{\Omega^K} w^K(\mathbf{x}) \frac{1}{2} \boldsymbol{\sigma} : \boldsymbol{\epsilon} d\Omega$$

$$W(\mathbf{u}, \mathbf{d}^A, \lambda) = W^K(\mathbf{u}) + W^A(\mathbf{d}^A) + W^B(\mathbf{u}, \mathbf{d}^A, \lambda)$$

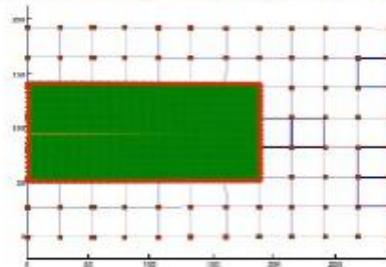
$$W^B(\mathbf{u}, \mathbf{d}^A, \lambda) = \int_{\Omega_B} \lambda \cdot \delta \mathbf{u} d\Omega = \sum_{I \in \mathcal{W}^B} \int_{\Omega_B} \lambda(\mathbf{x}) \cdot (\mathbf{u}(\mathbf{x}) - \mathbf{u}_I^A) \delta(\mathbf{x} - \mathbf{x}_I^A)$$

Multiscale method

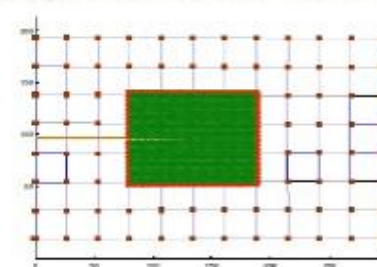
Coarse graining of fractures



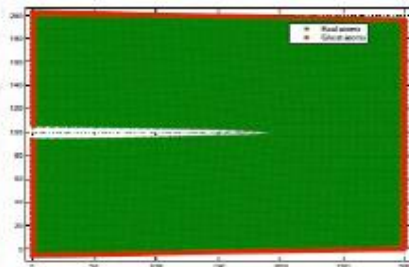
(a) MS model after the first LS



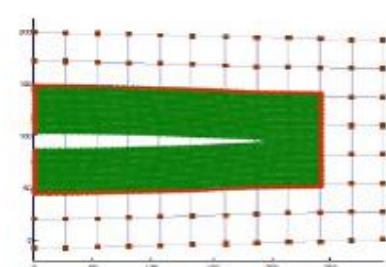
(b) BSM model after the first LS



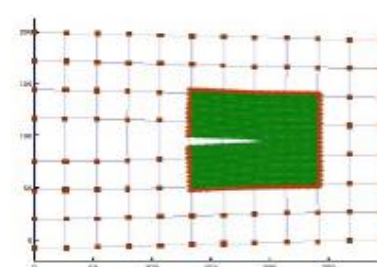
(c) XBSM model after the first LS



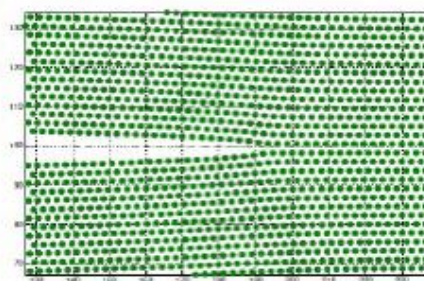
(d) MS model after the final LS



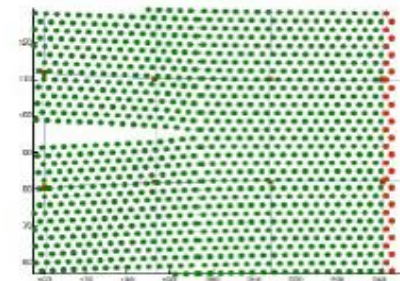
(e) BSM model after the final LS



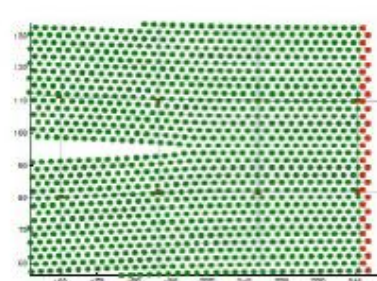
(f) XBSM model after the final LS



(g) zoom of MS model after the final LS



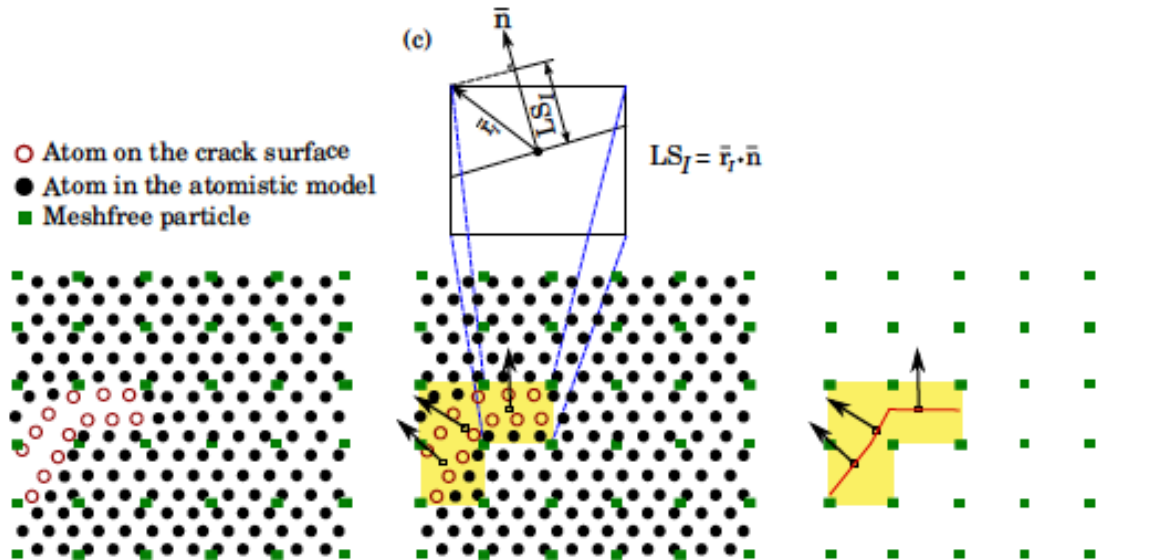
(h) zoom of BSM model after the final LS



(i) zoom of XBSM model after the final LS

Multiscale method

Coarse graining of fractures



- Estimate the atoms on the crack surface (CSP).
- Calculate the normal of atoms on the crack surface.
- Identify the regions with atoms on the crack surface
- Estimate the effective normal

Multiscale method

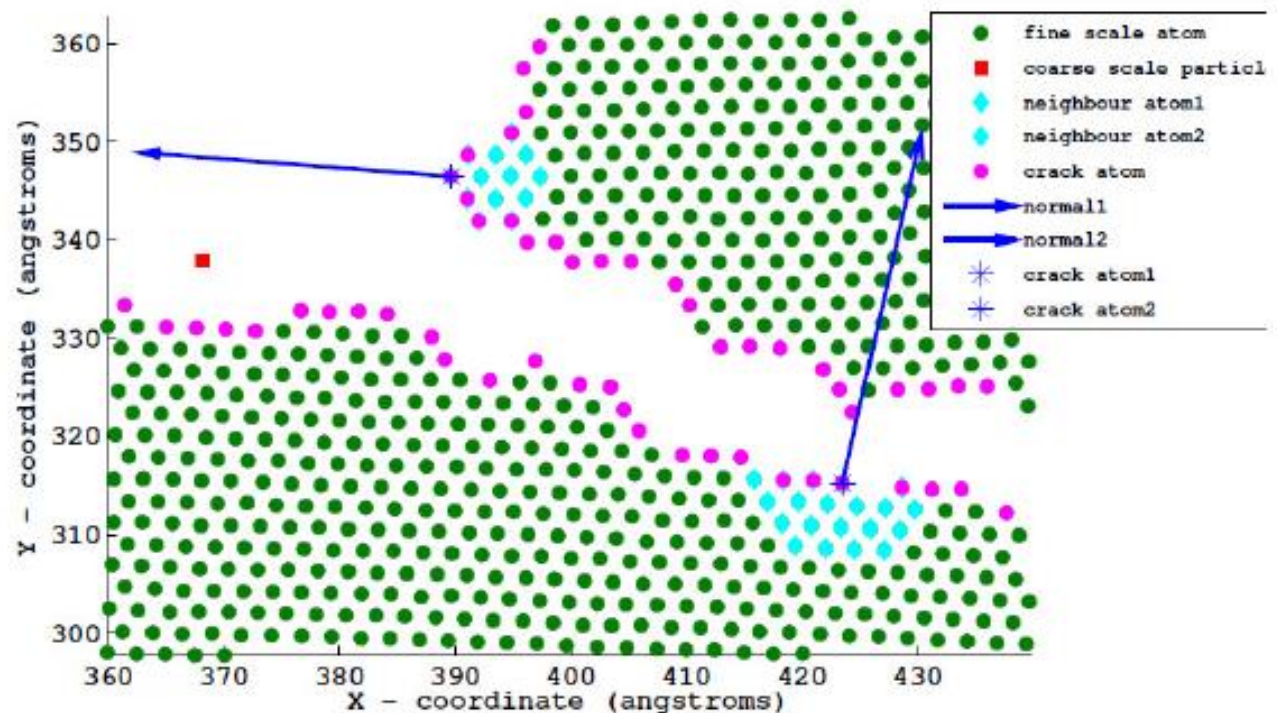
Coarse graining of fractures

$$CSP_{\alpha} = \sum_{\beta=1}^{n^{nb}/2} |\mathbf{r}_{\alpha\beta} + \mathbf{r}_{\alpha(\beta+n^{nb}/2)}|^2$$

Defect	csp_{α}/a_0^2	Range $\Delta csp_{\alpha}/a_0^2$
Perfect lattice	0.0000	$csp_{\alpha} < 0.1$
Partial dislocation	0.1423	$0.01 \leq csp_{\alpha} < 2$
Stacking fault	0.4966	$0.2 \leq csp_{\alpha} < 1$
Surface atom	1.6881	$csp_{\alpha} > 1$

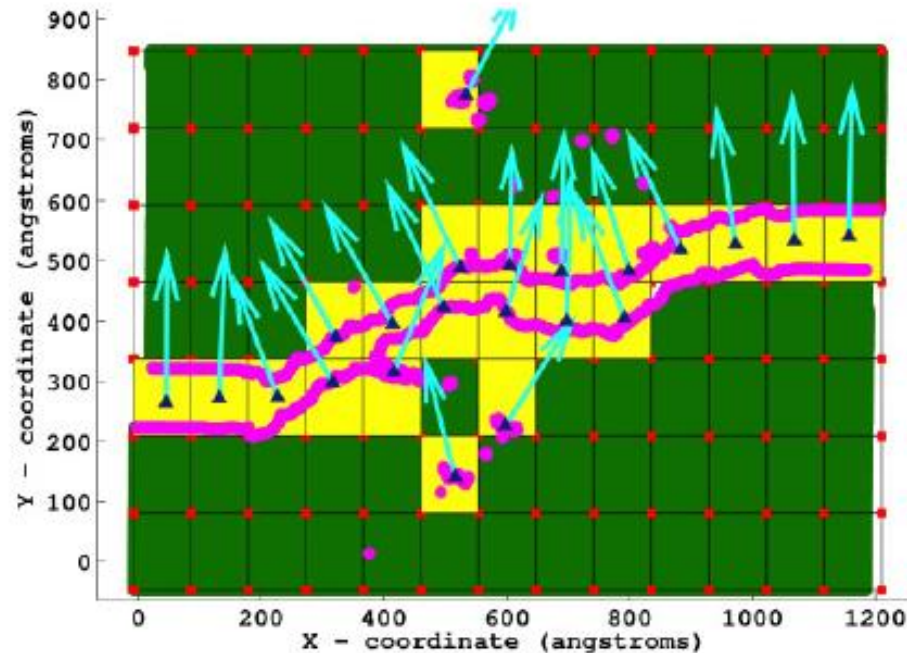
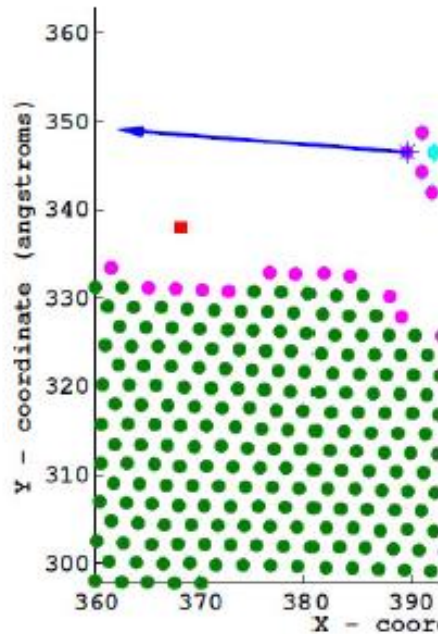
$$\mathbf{r}_{\alpha}^{cog} = \frac{\sum_{\beta=1}^{n^{nb}} \mathbf{r}_{\beta}}{n^{nb}}$$

$$\mathbf{n}_{\alpha}^{cog} = \mathbf{r}_{\alpha} - \mathbf{r}_{\alpha}^{cog}$$



- Estimate the effective normal

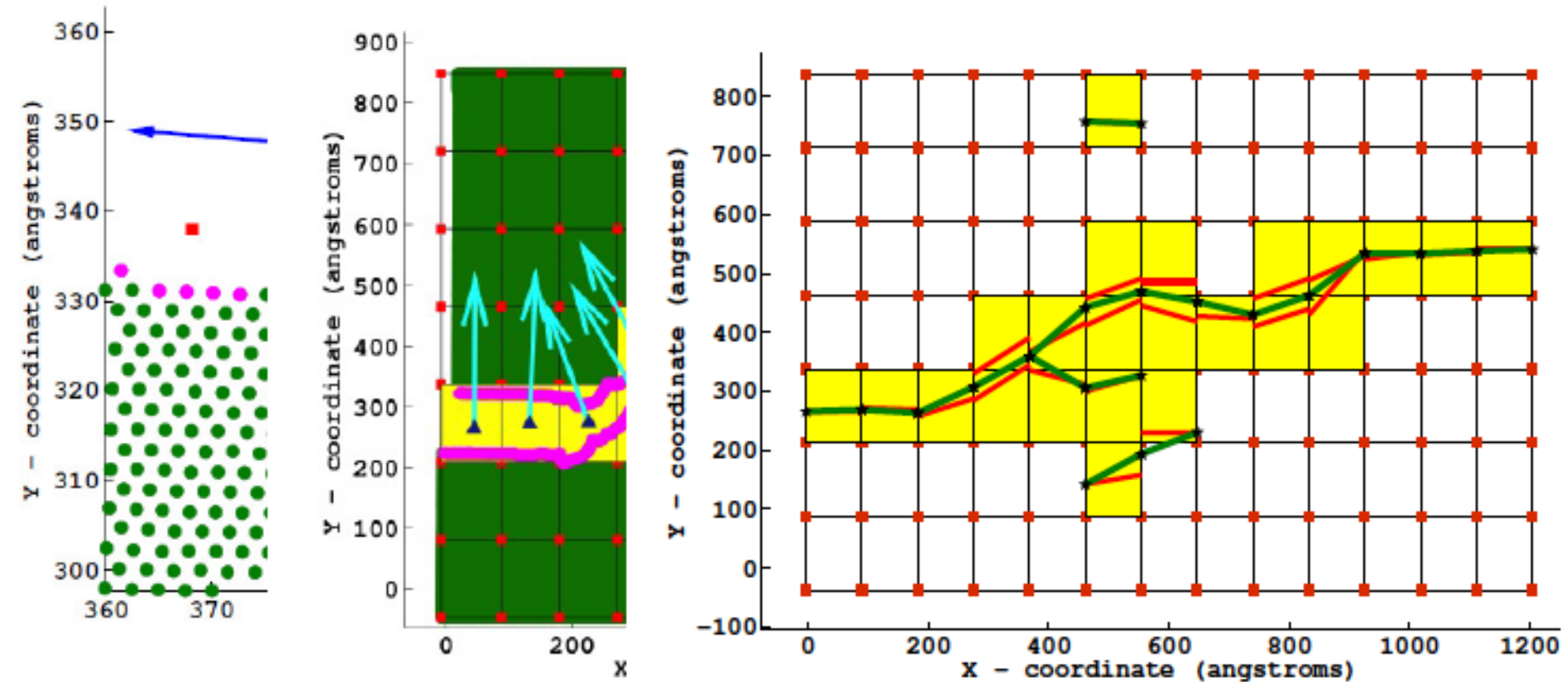
$$\mathbf{r}_{\text{cr}}^{\text{cog}} = \frac{\sum_{\alpha=1}^{n^{\text{cacr}}} \mathbf{r}_{\alpha}^{\text{cog}}}{n^{\text{cacr}}}, \quad \mathbf{n}_{\text{cr}}^{\text{cog}} = \frac{\sum_{\alpha=1}^{n^{\text{cacr}}} \mathbf{n}_{\alpha}^{\text{cog}}}{n^{\text{cacr}}}$$



Multiscale method

Coarse graining of fractures

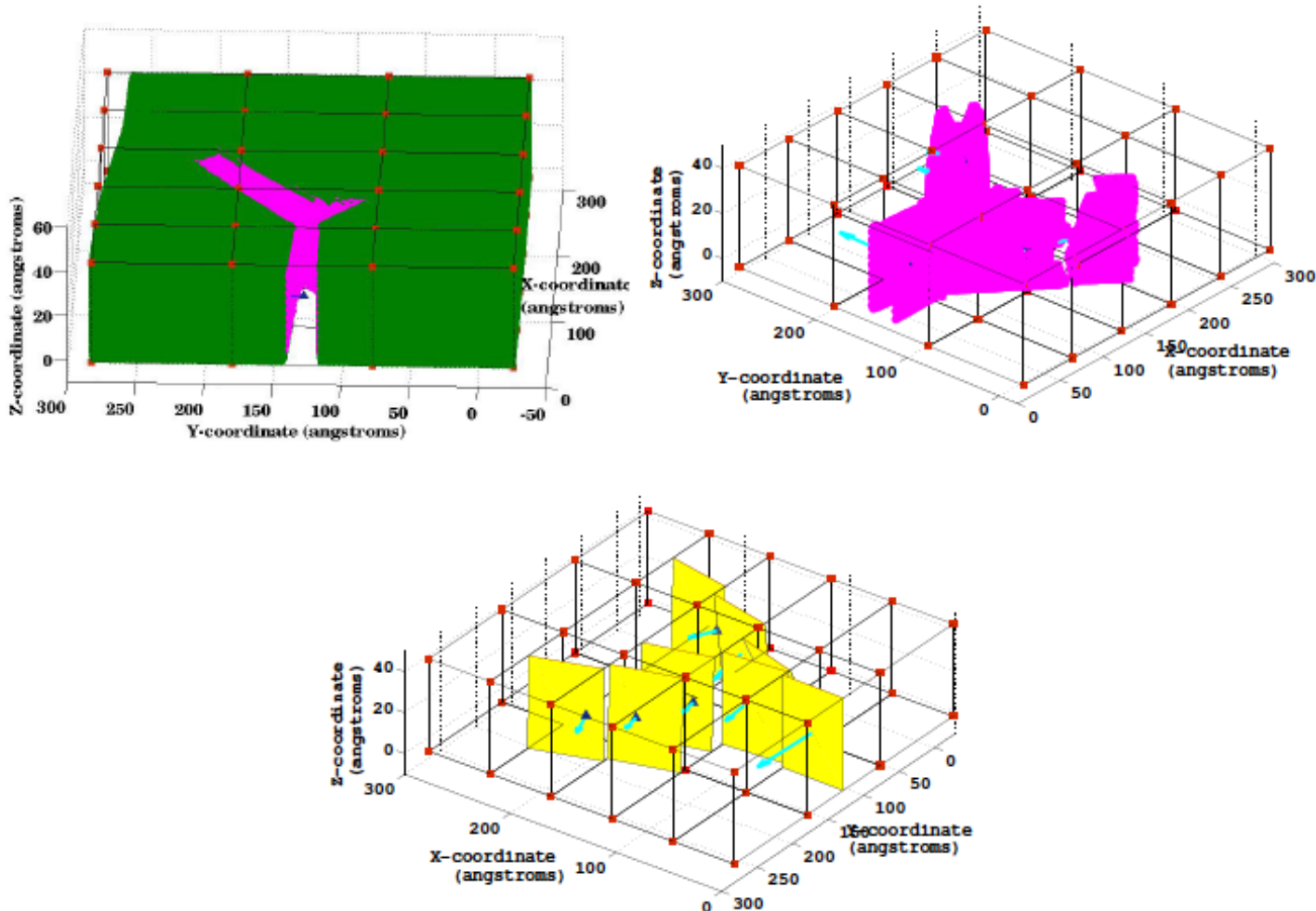
- Generate smooth crack surface



Multiscale method

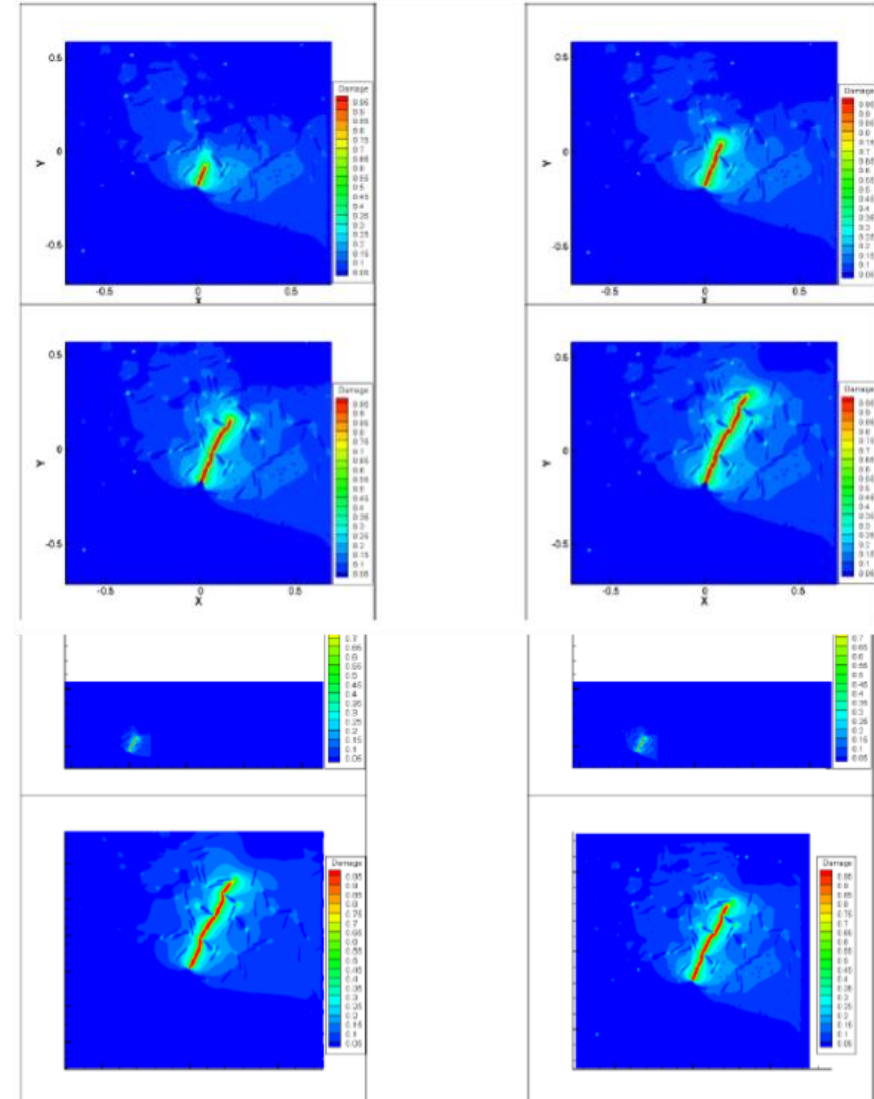
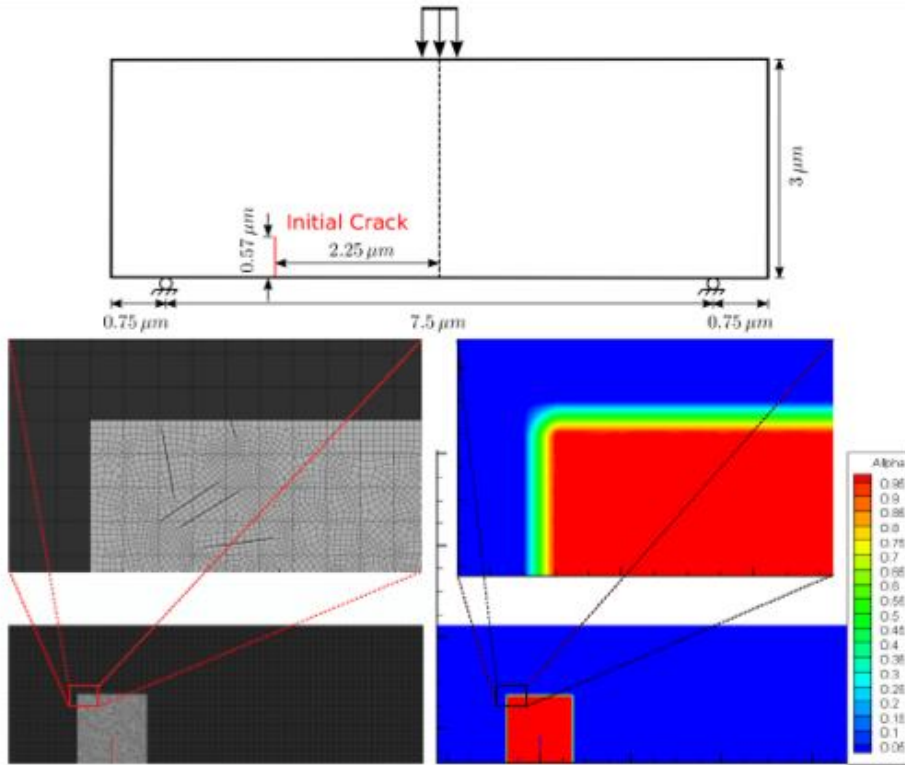
Coarse graining of fractures

- Generate smooth crack surface



Multiscale method

Coarse graining of fractures



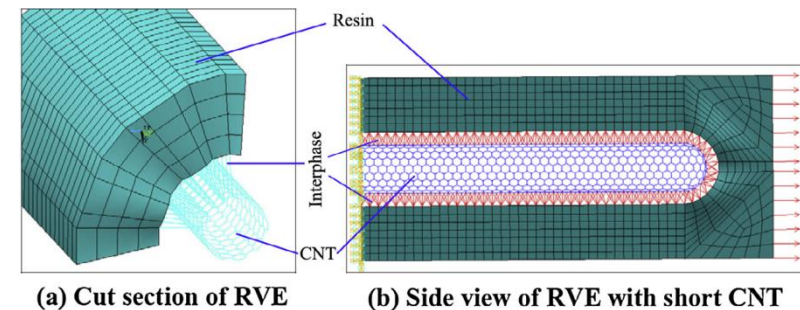
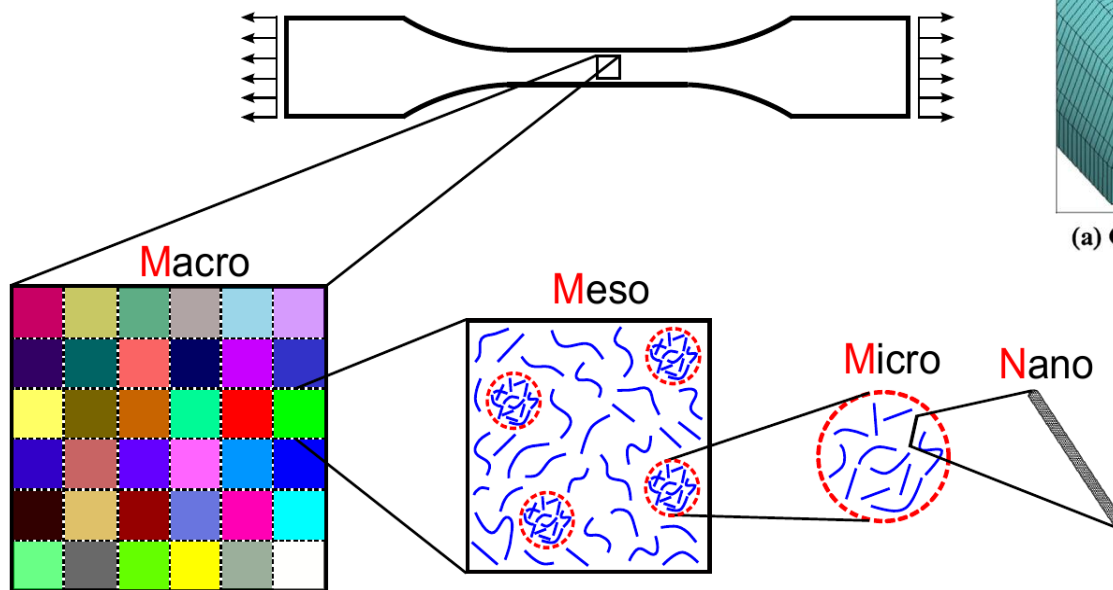
- Framework
- Computational models of polymer-matrix composites
 - Models at different length scales
 - Multiscale approach
- Uncertainty quantification and optimization
 - Sensitivity analysis
 - **Probabilistic optimization**

Nano-scale: material properties and the structure of the SWNT

Micro-scale: the SWNT embedded in the polymer matrix in the presence of the interphase is modeled and replaced by an EF

Meso-scale: the SWNT waviness, the agglomeration and the SWNT orientation

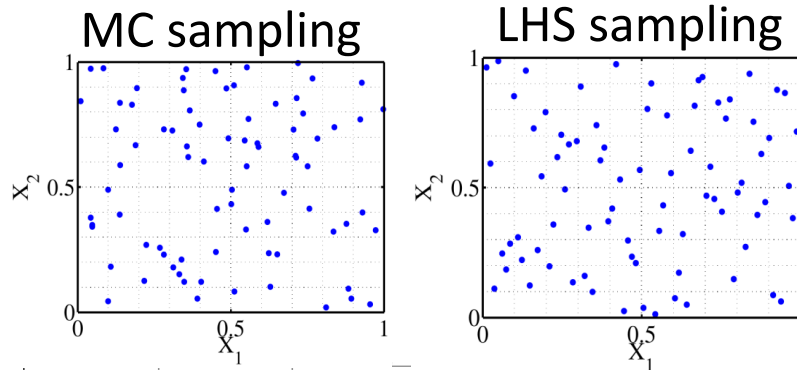
Macro-scale: the volume fraction

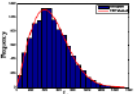
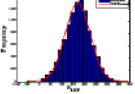
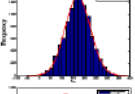
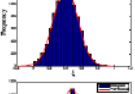
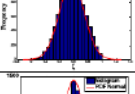
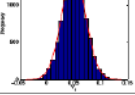


$$\xi = \frac{V_{inclusion}^{RVE}}{V^{RVE}}, \quad \zeta = \frac{V_{inclusion}^r}{V^r},$$

$$V^r = V_{inclusion}^r + V_m^r$$

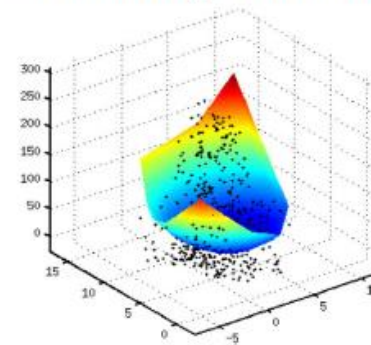
1. Sampling



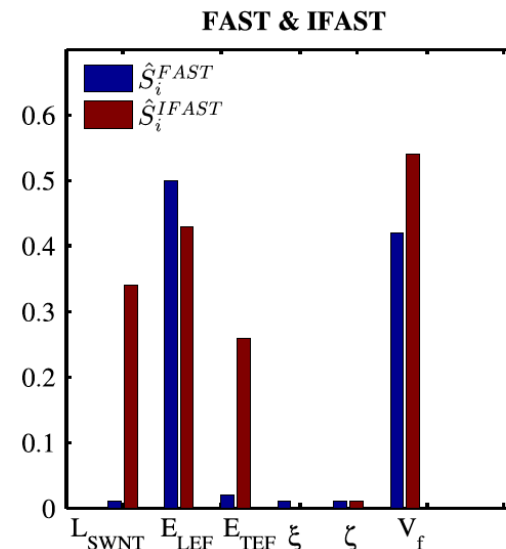
Level	Inputs	mean	standard deviation	Type of distribution
Nano/Micro	$L_{SWNT} (X_1)$	488.34	249.18	
Meso	$E_{LEF} (X_2)$	169.18	55.85	
	$E_{TEF} (X_3)$	169.18	55.85	
	$\xi (X_4)$	0.4	0.15	
	$\zeta (X_5)$	0.58	0.18	
Macro	$V_f (X_6)$	5 %	2%	

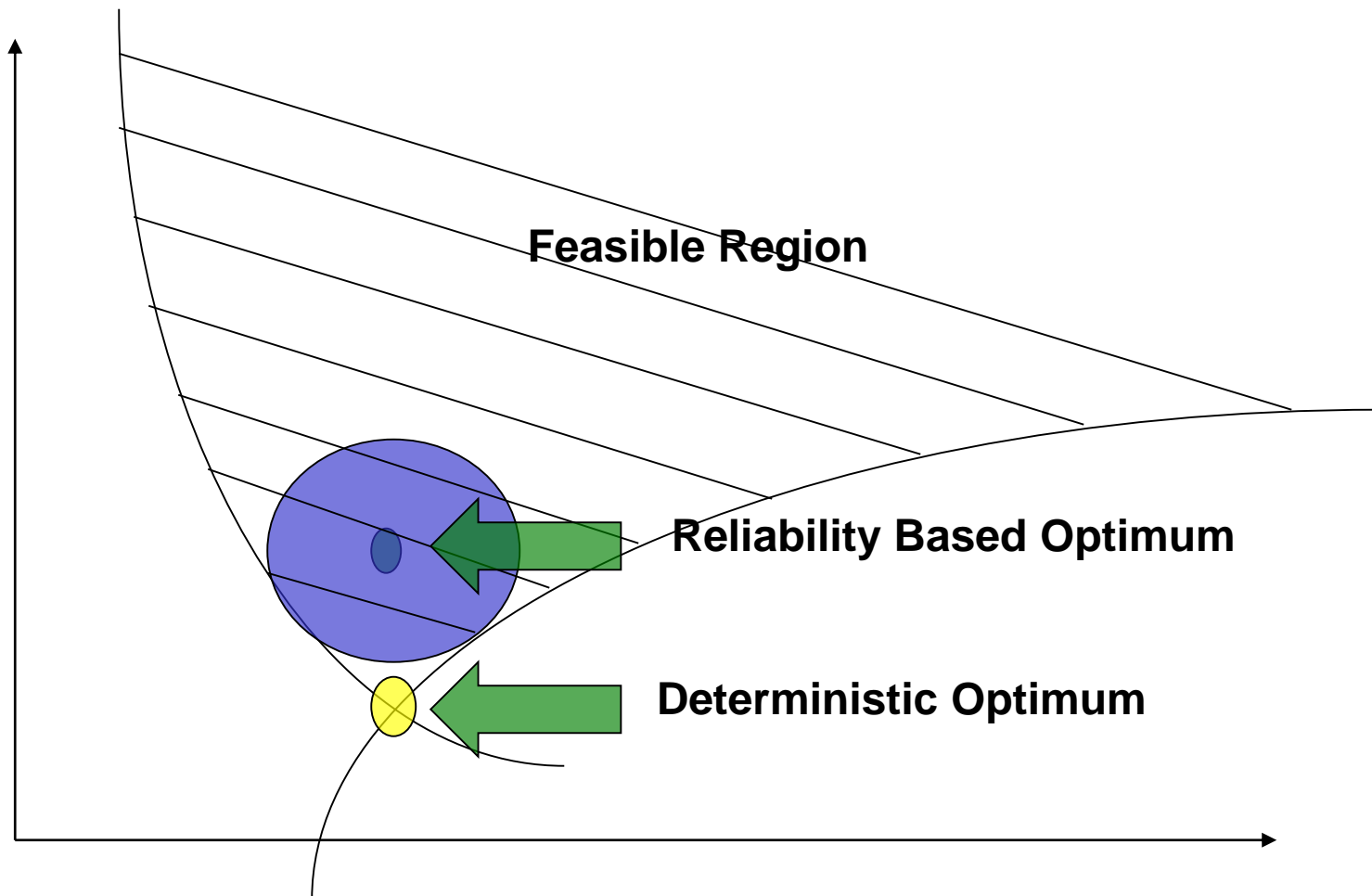
2. Surrogate Model

Quadratic regression model

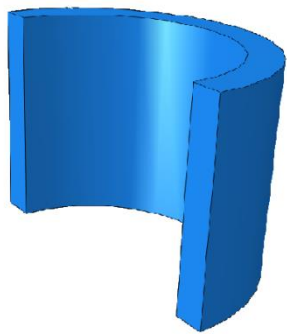


3. Sensitivity Analysis

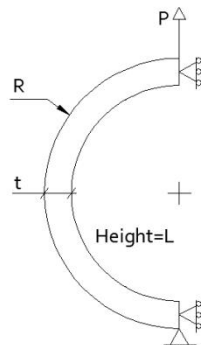




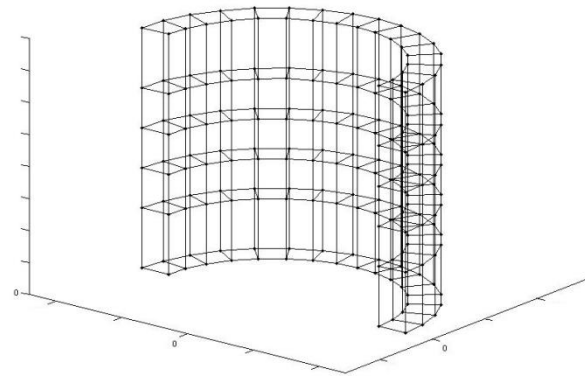
Thick cylinder subjected to line load



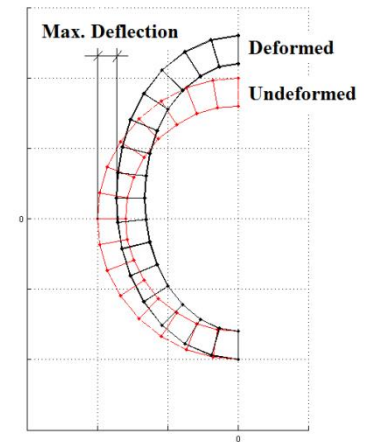
a)



b)



c)



d)

Parameter	R_c	L_c	E_m	ν_m	P	LSF	β	Obj.Func.
Value	1	1.5	10	0.3	$\mu = 1000$ $\sigma = 200$	Max. trans. deflect. $7 e^{-3}$	3	% CNT + t_c
Type	D	D	D	D	N	D	D	D

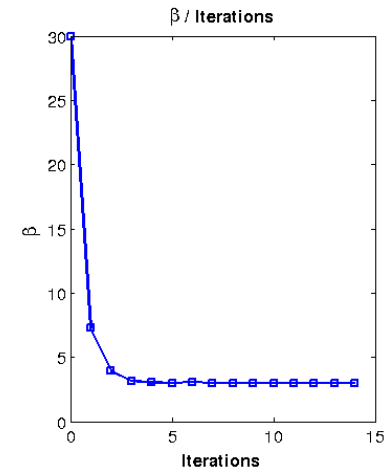
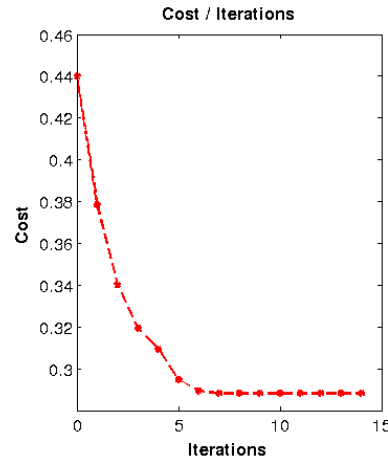
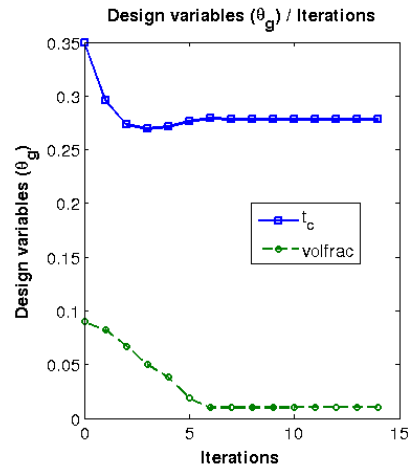
Length: m, E : GPa, P : Applied load (KN/m), ν : Poisson ratio, m : matrix, c : cylinder

D : deterministic, N : normal distribution, μ : mean value, σ : standard deviation β : Reliability Index

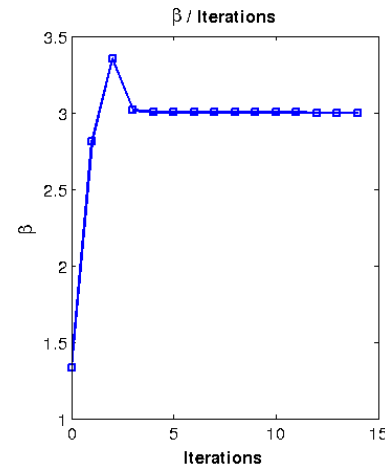
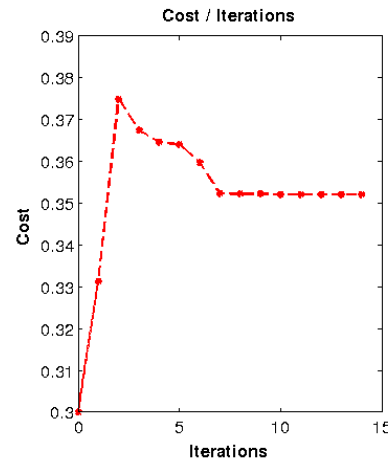
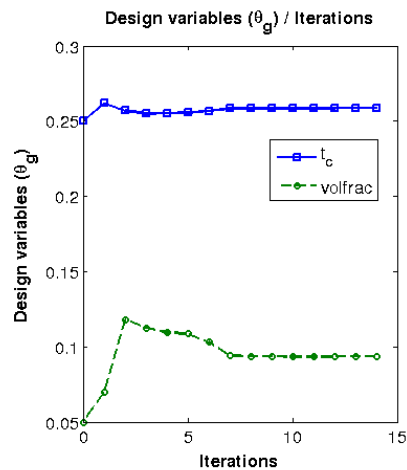
$$1\% < \text{volfrac\%} < 10\% \text{ \& } 0.1 < t_c < 0.4$$

Minimization of the CNT content and the cylinder thickness simultaneously

a)



b)



Thank you for your attention!