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# A Conforming Reproducing Kernel Framework for Agile Simulation of Problems with Complex Geometries

**UC San Diego**

**JACOBS SCHOOL OF ENGINEERING**  
Structural Engineering



Jacob Koester<sup>1,2</sup>

<sup>1</sup> Sandia National Laboratories, [jkoeste@sandia.gov](mailto:jkoeste@sandia.gov)

<sup>2</sup>Department of Structural Engineering  
Center for Extreme Events Research (CEER)  
University of California, San Diego

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# Outline



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## Introduction

## Background, Meshfree Methods

## Conforming Window Functions

- Construction

- Examples, 2D

- Implementation, 3D

- Examples, 3D

## Addressing Volumetric Locking

- Review of  $\bar{\mathbf{F}}$

- New Projection for  $\bar{\mathbf{F}}$

- Examples using  $\bar{\mathbf{F}}$

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- Aggregating and Decimating

## Comments and Future Work

# Acknowledgments



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**Professor J.S. Chen**

# Analyst's Goal



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A large portion of people using the finite element method are faced with a general task:

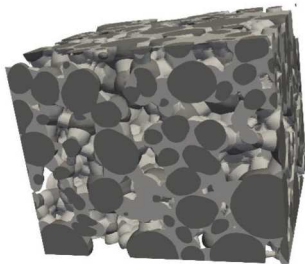
***Deliver critical engineering analyses in a timeframe consistent with project requirements***

# Meshing is Time Consuming

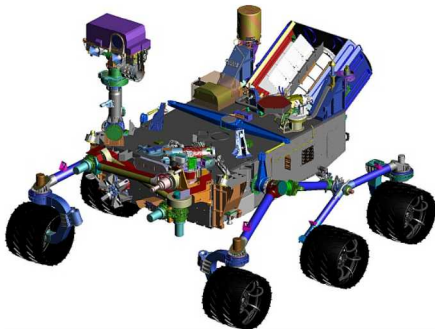


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Challenging engineering analyses are common at Sandia. Goal is to have a general solution, must address the more burdensome models: *multi-body / material, complex geometries, contact, nonlinear materials, dynamic loading*



Lithium-Ion  
Battery Mesostructure



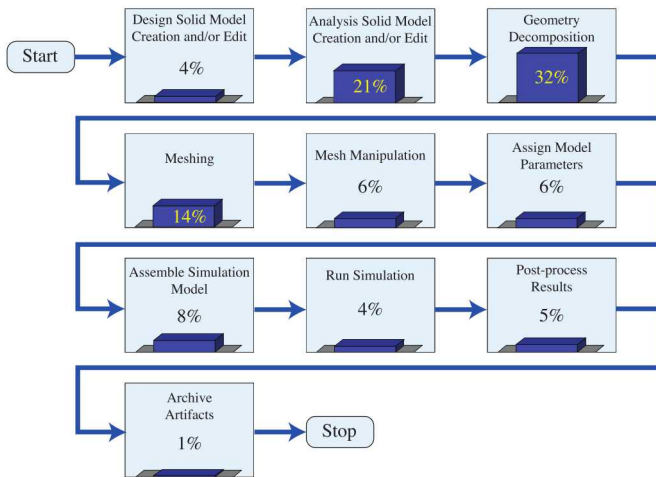
Mars Rover

source: <https://www.nasa.gov>

# Engineering Analysis, Process Cost Breakdown<sup>1,2</sup>



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<sup>1</sup>M. F. Hardwick, R. L. Clay, P. T. Boggs, E. J. Walsh, A. R. Larzelere, and A. Altshuler, "DART system analysis," Sandia National Laboratories, Tech. Rep. SAND2005-4647, 2005.

<sup>2</sup>J. A. Cottrell, T. J. Hughes, and Y. Bazilevs, *Isogeometric analysis: toward integration of CAD and FEA*. John Wiley & Sons, 2009.

# Where do we stand today?



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## Finite Element Methods

- Triangle / tetrahedral elements
  - Meshes are relatively easy to generate
  - Approximation property issues. E.g. volumetric locking
- Quadrilateral / hexahedral elements
  - Better approximation properties
  - Very time consuming to mesh
- Polygonal / polyhedral formulations are a recent research thrust

## Immersed / Embedded Domains

- Mesh is structured and doesn't line up with the domain
- Meshing is trivial
- Challenges in obtaining agreeable quality near the implicit surfaces

# Where do we stand today?



## IsoGeometric Analysis

- Ties simulation to CAD by using the same basis functions for both
- Appealing solution for problems in 2D or shells
- Obtaining a volumetric representation is challenging
- Solution quality tied to the quality of CAD representation

## Meshfree Methods

- Easy to generate approximation functions from point clouds
- Challenges in representing boundaries, integrating



## **Background: Meshfree Methods**

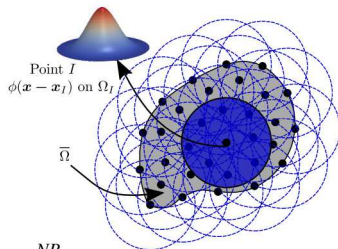
# Reproducing Kernel Overview

Approximate solutions are constructed over a point cloud. Shape functions are constructed as the product of a *kernel function* and a *correction function*

$$u^h(x) = \sum_{I=1}^{NP} \Psi_I d_I; \quad \Psi_I = C(x; x - x_I) \phi_a(x - x_I)$$

$$C(x; x - x_I) = \sum_{i=0}^n b_i(x) (x - x_I)^i \equiv \mathbf{H}^T(x - x_I) \mathbf{b}(x)$$

$$\mathbf{H}^T(x - x_I) = [1, x - x_I, (x - x_I)^2, \dots, (x - x_I)^n]$$



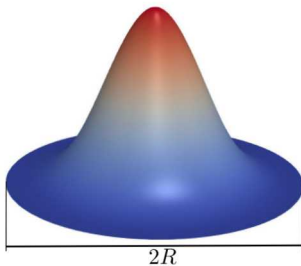
$\mathbf{b}(x)$  is obtained by imposing completeness requirement:  $\sum_{I=1}^{NP} \Psi_I x_I^i = x^i, \quad 0 \leq i \leq n$

$$\mathbf{b}(x) = \mathbf{H}^T(0) \mathbf{M}^{-1}(x) \quad \text{where} \quad \mathbf{M}(x) = \sum_{I=1}^{NP} \mathbf{H}(x - x_I) \mathbf{H}^T(x - x_I) \phi_a(x - x_I)$$

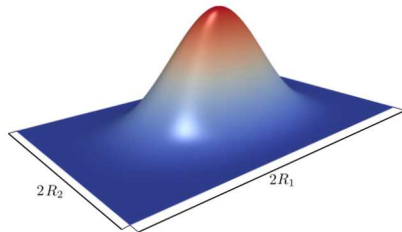
- **Kernel function: compact support, determines smoothness**
- **Correction function: provides completeness**

# Window Functions

Example Euclidean Window / Kernel Functions, Cubic B-Spline



Radial

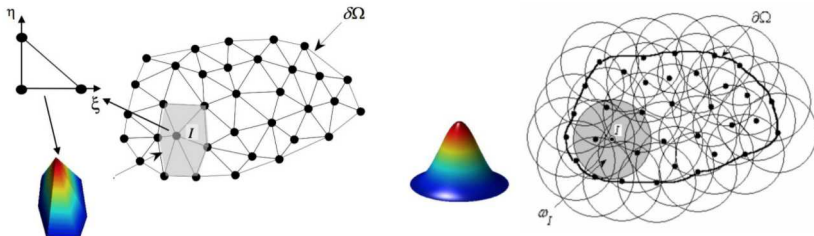


Tensor Product

$$\phi(\bar{r}) = \begin{cases} 1 - 6\bar{r}^2 + 6\bar{r}^3 & \text{for } 0 \leq \bar{r} \leq \frac{1}{2} \\ 2 - 6\bar{r} + 6\bar{r}^2 - 2\bar{r}^3 & \text{for } \frac{1}{2} \leq \bar{r} \leq 1 \\ 0 & \text{otherwise,} \end{cases}$$

$\bar{r} = r(\mathbf{x})/R$ , the normalized distance.

# Boundary-Related Challenges



With FEM, elements represent the domain and approximation functions are tied to elements.

With meshfree methods, approximation functions come from point clouds, boundary information is lost. Creating challenges representing:

- Concave geometries
- Material interfaces
- Essential boundaries

# Model Problem



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Reproducing kernel approximations functions are used in a Galerkin framework, creating the Reproducing Kernel Particle Method (RKPM).

Example, Galerkin form for elastostatics is:

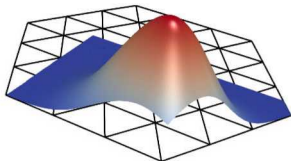
Find  $\mathbf{u}^h \in U^h \subset U$  such that  $\forall \mathbf{v}^h \in V^h \subset V$

$$\int_{\Omega} \boldsymbol{\varepsilon}(\mathbf{v}^h) : \boldsymbol{\sigma}(\mathbf{u}^h) d\Omega = \int_{\Omega} \mathbf{v}^h \cdot \mathbf{b} d\Omega + \int_{\Gamma_h} \mathbf{v}^h \cdot \mathbf{h} d\Gamma$$

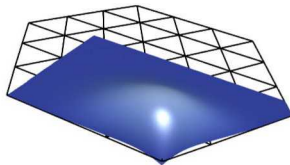
where  $U = H_g^1$  and  $V = H_0^1$ . For Bubnov-Galerkin,  $U^h = V^h$ .

# Function Properties

Window Function,  $\phi$



Approximation Function,  $\Psi$



In general, approximation functions lack Kronecker delta

$$\Psi_I(\mathbf{x}_J) \neq \delta_{IJ},$$

are not interpolatory

$$u^h(\mathbf{x}_I) \neq d_I,$$

and lack the weak Kronecker delta property, which is

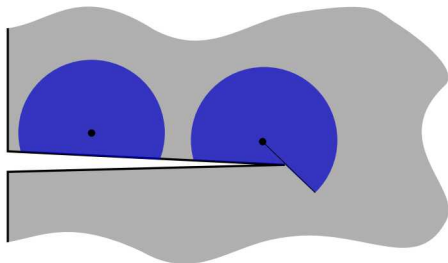
$$\Psi_I(\mathbf{x}) = 0, \quad \forall \mathbf{x} \in \Gamma_g, \quad I \in \mathcal{V}_o,$$

where  $\mathcal{V}_o$  is the set of all points not on the essential boundary,  $\Gamma_g$ .

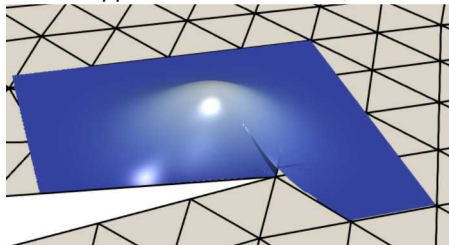
**Approximation spaces are not admissible, i.e.  $V^h \not\subset H_0^1$  and  $U^h \not\subset H_g^1$**

# Addressing Non-Convex Domains

## Visibility Method



## Approximation Function, $\Psi$



Require an internal line-of-sight between evaluation locations and window centers. Resulting approximation functions are discontinuous. This can be problematic as the approximation space is **no longer in  $H^1$** , as required in the Galerkin form, but it has been proven to still converge<sup>3</sup>.

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<sup>3</sup>P. Krysl and T. Belytschko, "Element-free Galerkin method: Convergence of the continuous and discontinuous shape functions," *Computer Methods in Applied Mechanics and Engineering*, vol. 148, no. 3–4, pp. 257–277, 1997.

# Conforming Window Functions<sup>4</sup>

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<sup>4</sup>J. J. Koester and J.-S. Chen, "Conforming window functions for meshfree methods," *Computer Methods in Applied Mechanics and Engineering*, vol. 347, pp. 588–621, 2019.



# Research Goal



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In short

- Building simulation models is very time consuming
- Meshfree methods can efficiently provide approximation spaces but complicated boundaries cause problems

Goal: ***Address the boundary challenges of meshfree methods***

- Should be systematic, requiring little or no user input
- Ideally, retain smooth approximation spaces ( $C^r$ ,  $r > 0$ )

# Conforming Window Functions



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The source of the boundary-related complications are that window functions, and thus approximation functions, are not confined to the domain. To address this, a procedure for creating boundary-conforming window functions has been developed.

The conceptual steps in creating conforming windows are:

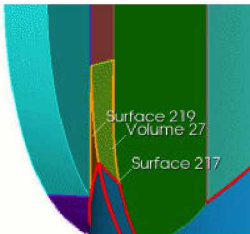
- Choose the **subdivision** strategy and create subdomains for each window
- Define the **function space** (on the subdivisions) for building the window function
- Construct the functions by **specifying the coefficients** of the space

The conforming window functions replace the traditional window functions and the rest of the RK or MLS method remains the same.

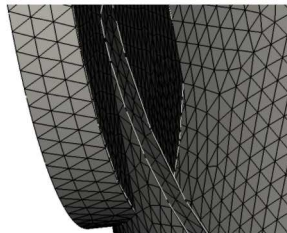
# Subdivisions

Window functions will be defined on **local, overlapping, subdomains** that conform to the domain. A global, contiguous mesh is not required. Some options:

- Tensor product spaces: quadrilaterals, hexahedrons
- **Triangulations:** triangles, tetrahedrons



Example Complicated Boundary



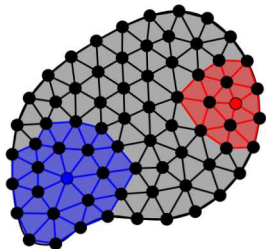
Triangulation

As with FEM meshing, decomposing a body with tensor product subdivisions is challenging, triangulating is much easier.

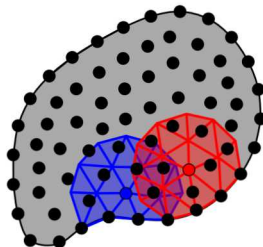
# Subdivision

Overlapping window domains are required to build approximation functions

- Extract “stars” from global triangulation
- Construct local, kernel specific triangulations



Example for two vertices, using star<sup>2</sup>



Local overlapping triangulations

# Function Space for Constructing Window Functions



A means of building window functions on the subdivisions is required.

**Bernstein-Bézier polynomials** are constructed on triangles / tetrahedra and theory exists for creating  $C^r$  space on triangulations.

A bivariate Bernstein-Bézier polynomial:

$$p = \sum_{i+j+k=d} c_{ijk} B_{ijk}^d,$$

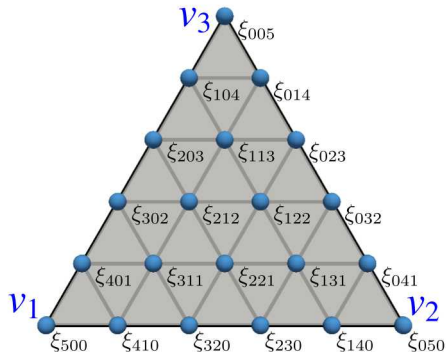
where  $c_{ijk}$  are coefficients and  $B_{ijk}^d$  are Bernstein basis polynomials of degree  $d$ , expressed using the barycentric coordinates,  $b_1, b_2, b_3$

$$B_{ijk}^d := \frac{d!}{i!j!k!} b_1^i b_2^j b_3^k, \quad i + j + k = d.$$

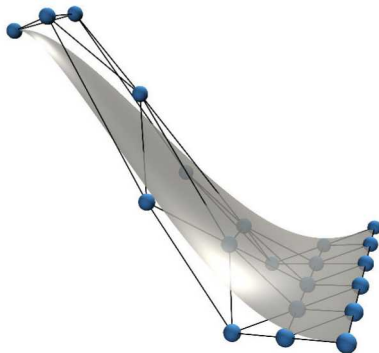
Properties include **partition of unity** and **non-negativity**.

# Bernstein-Bézier Polynomial

Domain points and Bézier patch for a triangle with polynomial order,  $d = 5$ .



Domain points



Bézier patch with triangulation of  
B-coefficients

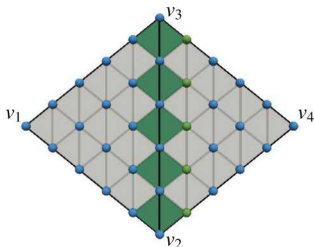
# Smooth Joins

A  $C^r$  smooth join along edge  $e := \langle v_2, v_3 \rangle$  of polynomials  $p$  and  $\tilde{p}$  on triangles  $T := \langle v_1, v_2, v_3 \rangle$  and  $\tilde{T} := \langle v_4, v_3, v_2 \rangle$ :

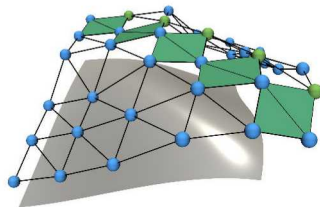
$$D_{\mathbf{u}}^n p(\mathbf{v}) = D_{\mathbf{u}}^n \tilde{p}(\mathbf{v}), \quad \forall \mathbf{v} \in e \text{ and } n = 0, \dots, r,$$

where  $\mathbf{u}$  is any direction not parallel with  $e$ . This leads to the continuity constraints,

$$\tilde{c}_{njk} = \sum_{\nu+\mu+\kappa=n} c_{\nu k+\mu j+\kappa} B_{\nu\mu\kappa}^n(v_4), \quad j+k=d-n, \quad n=0, \dots, r.$$



$C^1$  Join, domain points



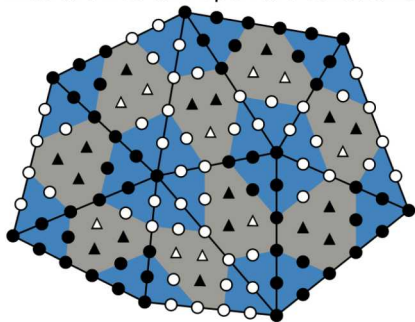
Bézier patch with triangulation of  
B-coefficients

# Smooth Spaces

Example smooth space  $\mathcal{S}_5^{1,2}$  (Argyris Space, quintic,  $C^1$  on edges,  $C^2$  at vertices)

*Minimal determining set* example.

Circles are coefficients associated with a vertex (blue region), triangles for edges, filled are free and open are constrained.



*Nodal minimal determining set:* Values and derivatives set at specific locations (Hermite interpolation) to define functions:

$$\mathcal{N} := \bigcup_{v \in \mathcal{V}} \mathcal{N}_v \cup \bigcup_{e \in \mathcal{E}} \mathcal{N}_e,$$

$$\mathcal{N}_v := \left\{ \epsilon_v D_{\mathbf{x}}^\alpha D_{\mathbf{y}}^\beta \right\}, 0 \leq \alpha + \beta \leq 2,$$

$$\mathcal{N}_e := \left\{ \epsilon_{\boldsymbol{\eta}_e} D_{\mathbf{u}_e} \right\}$$

where  $\boldsymbol{\eta}_e$  and  $\mathbf{u}_e$  are the midpoint and unit vector normal of edge  $e$ .  $\epsilon_t$  is the point evaluation functional defined as  $\epsilon_t f = f(t)$ .



# Building Conforming Window Functions



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Subdivisions with spaces are defined, need to build the window functions by specifying the coefficients of the spaces.

To set the coefficients, Hermite interpolation is used. Function values and derivatives needed at nodal parameter locations. Two methods of determining the values have been developed.

- Star windows: replace Euclidean with graph distances
- Snap windows: projection of traditional window functions to the conforming window space

# Star Window Functions



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Function values and derivative for Hermite interpolation.

## **Modify a traditional, radial cubic B-spline window function**

Traditional window function:

$$\phi(\bar{r}) = \begin{cases} 1 - 6\bar{r}^2 + 6\bar{r}^3 & \text{for } 0 \leq \bar{r} \leq \frac{1}{2} \\ 2 - 6\bar{r} + 6\bar{r}^2 - 2\bar{r}^3 & \text{for } \frac{1}{2} \leq \bar{r} \leq 1 \\ 0 & \text{otherwise,} \end{cases}$$

$\bar{r} = r(\mathbf{x})/R$ , the normalized distance.

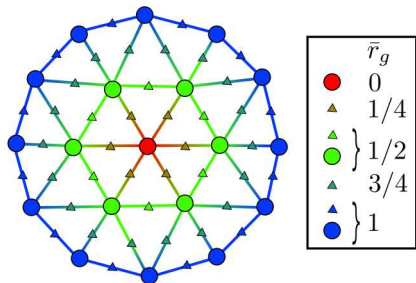
## **Replace $\bar{r}$ with $\bar{r}_g$ , the normalized graph distance:**

$$\bar{r}_g = \begin{cases} 1 & \forall v_I \in \mathcal{N}_b, v_0 \notin \mathcal{N}_b \\ d_g(v_0, v_I)/R_g & \text{otherwise} \end{cases}$$

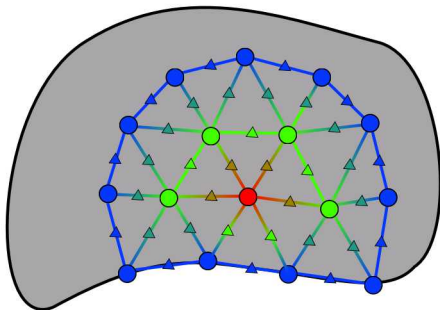
$d_g(v_0, v_I)$  is the graph distance (integer) between vertex  $v_I$  and the center  $v_0$ ,  $R_g$  is the chosen graph extent (an integer, e.g.  $\text{star}^{R_g}$ ),  $\mathcal{N}_b$  is the set of nodal parameter locations on conforming boundaries.

# Normalized Graph Distances

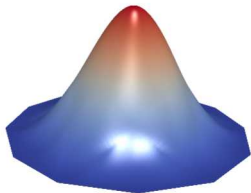
Normalized graph distances,  $d_g$ , at the  $\mathcal{S}_5^{1,2}$  nodal parameter locations for a second order stars:



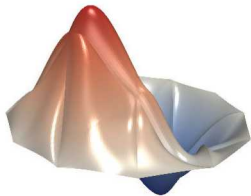
Away from a boundary



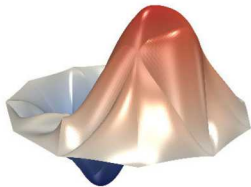
Near a boundary



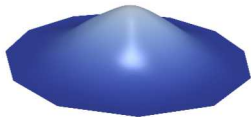
(a)  $\phi$



(b)  $\phi_{,x}$



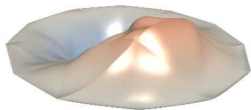
(c)  $\phi_{,y}$



(d)  $\Psi$



(e)  $\Psi_{,x}$

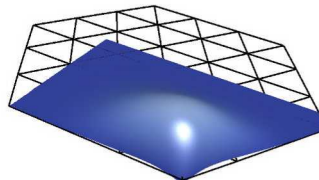
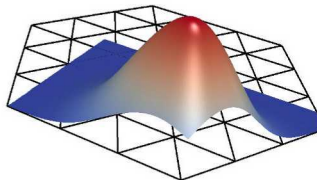


(f)  $\Psi_{,y}$

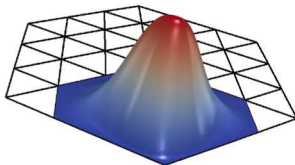
Figure: Interior conforming windows and approximation functions

# Conforming to Essential Boundary

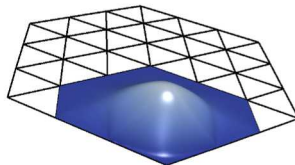
Non-  
conforming at  
essential  
boundary



Conforming at  
essential  
boundary



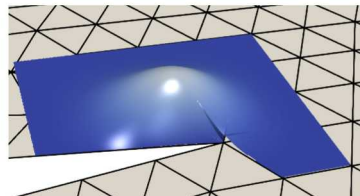
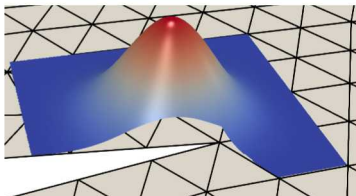
$\phi_I$   
(Window Function)



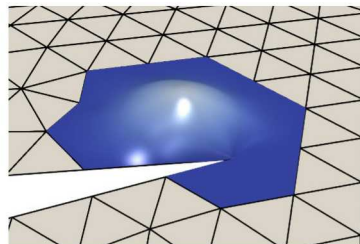
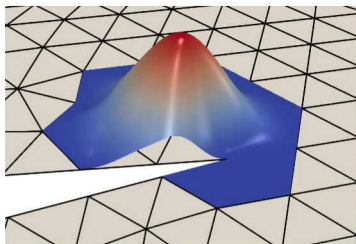
$\psi_I$   
(Approximation Function)

## Near Non-Convex Region

Non-  
conforming  
window with  
visibility check



Conforming  
window with  
convexity  
improvement



$\phi_I$   
(Window Function)

$\psi_I$   
(Approximation Function)

# Snap Star



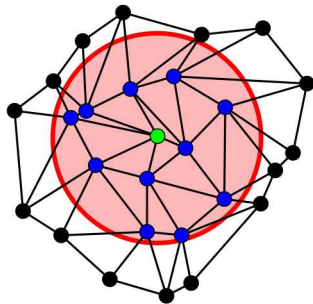
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Project traditional window function to conforming window space.

- Use all elements that are contained or intersect a Euclidean ball
- Use normalized **Euclidean distance** for nodal locations inside the ball
- Set the normalized distance for nodal location outside the ball

## Properties

- Less sensitive to quality of the triangulation
- Retains control for conforming to boundaries, improving near non-convex regions



# Snap Star



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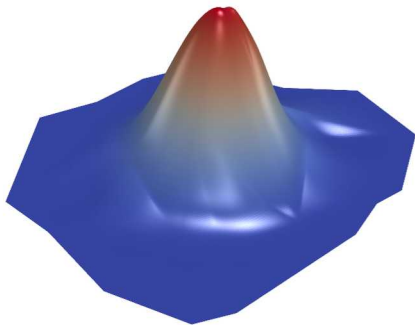


Figure: Snap Star

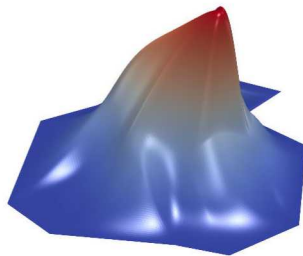


Figure: Star<sup>2</sup>



# Local Star

Construct window function using local triangulations, not from a global mesh

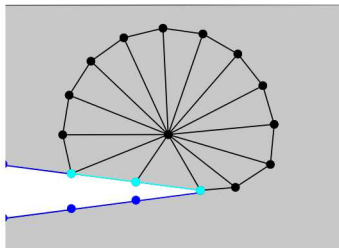


Figure: Local Triangulation

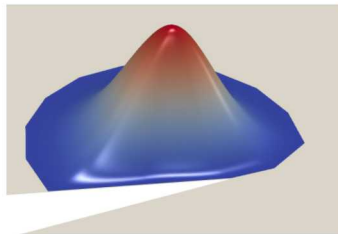


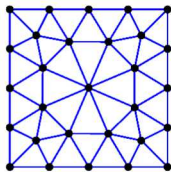
Figure: Local Star

## **Examples, 2D**

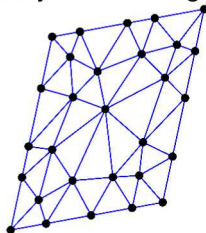
Conforming Reproducing Kernel (CRK)

# Essential Boundary Conditions

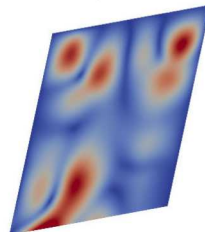
Elastic, patch test. Boundary conditions give a linear displacement field.



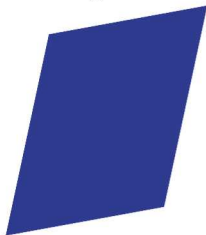
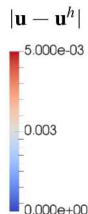
Undeformed  
triangulation



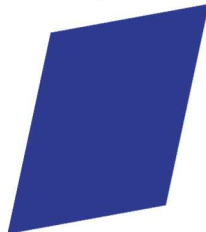
Deformed  
triangulation



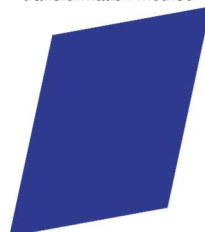
RKPM,  
transformation method



CRK  $star^2$



CRK snap



CRK local

# Essential Boundary Conditions



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Patch test error:

Method	$L^2$	$H_1$
RKPM with transformation method	2.05e-03	2.44e-02
CRK, $star^2$ , static condensation	7.65e-17	1.04e-15
CRK, snap, static condensation	8.57e-17	1.78e-15
CRK, local, static condensation	6.55e-17	8.63e-15

Transformation method:

- $\Psi_I(\mathbf{x}_J) = \delta_{IJ}$
- $u^h(\mathbf{x}_I) = d_I$
- No Weak Kronecker-delta, inadmissible approximation spaces

Conforming window:

- $\Psi_I(\mathbf{x}_J) \neq \delta_{IJ}$
- $u^h(\mathbf{x}_I) = d_I$
- Weak Kronecker-delta  $\rightarrow$  **admissible approximation spaces**
- $\rightarrow$  **Directly impose values along entire boundary** (like FEM)

# Non-Convex Domain

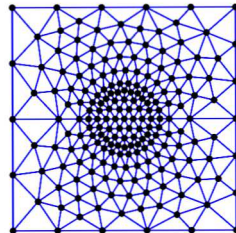
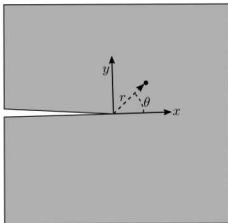
## An elastic plate with an edge crack

- $E = 3.E7$ ,  $\nu = 0.3$
- Mode I loading
- Exact displacement along edges (except re-entrant edges)
- Plane strain
- $\lambda = 0.5$
- $Q = 1/3$

$$\sigma_{xx} = \lambda r^{\lambda-1} [(2 - Q(\lambda + 1)) \cos((\lambda - 1)\theta) - (\lambda - 1) \cos((\lambda - 3)\theta)]$$

$$\sigma_{yy} = \lambda r^{\lambda-1} [(2 + Q(\lambda + 1)) \cos((\lambda - 1)\theta) + (\lambda - 1) \cos((\lambda - 3)\theta)]$$

$$\sigma_{xy} = \lambda r^{\lambda-1} [(\lambda - 1) \sin((\lambda - 3)\theta) + Q(\lambda + 1) \sin((\lambda - 1)\theta)]$$



# Results Comparison



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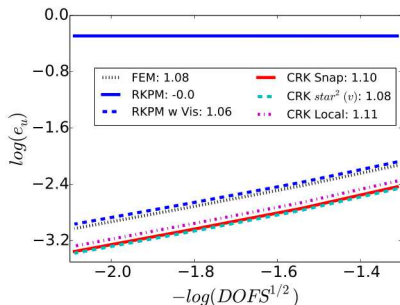


Figure: Convergence in  $u$

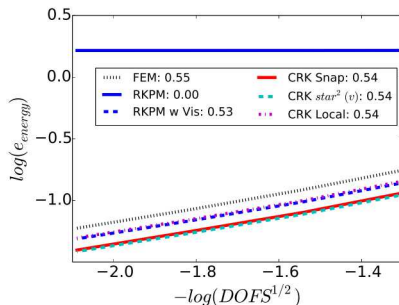
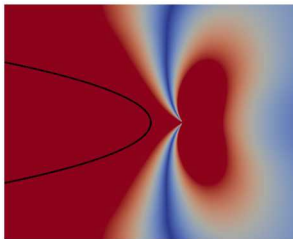
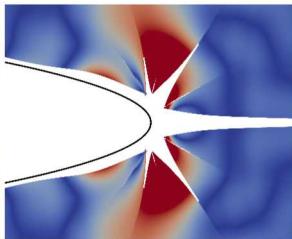


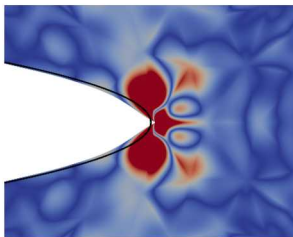
Figure: Convergence in energy



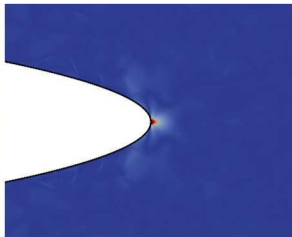
(a) RKPM



(b) RKPM, visibility criteria



(c) CRK, star convex



(d) Enriched CRK

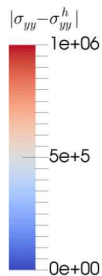
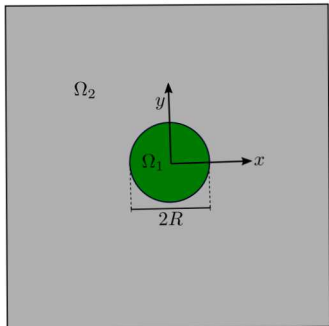


Figure: Error in  $\sigma_{yy}$  near the crack tip. Nodal spacing  $h_1 = 0.02$ .

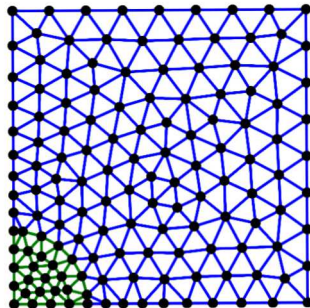
# Panel with an Inclusion

## An elastic panel with an inclusion

- (4x4) panel,  $R = 1$  for inclusion
- Inclusion:  $E = 10.E4$ ,  $\nu = 0.3$
- Panel:  $E = 10.E3$ ,  $\nu = 0.3$



- Tension in  $x$  direction
- Exact displacement on symmetry planes
- Exact traction on other edges





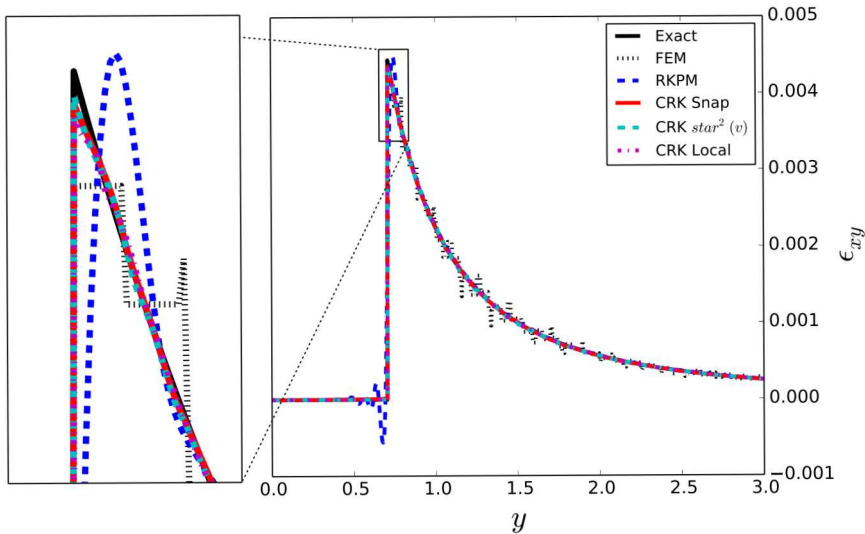


Figure:  $\epsilon_{xy}$  near the material interface.

# Results Comparison



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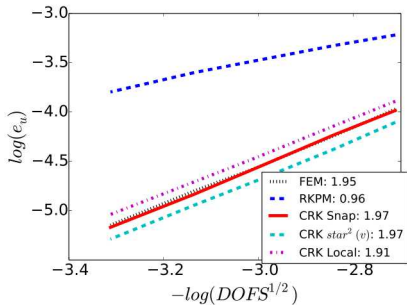


Figure: Convergence in  $u$

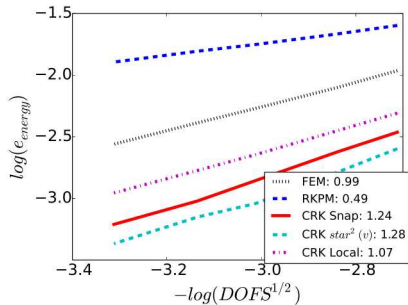


Figure: Convergence in energy

## **3D Implementation**

# 3D Conforming Windows



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The steps for creating conforming window in three dimensions directly translate from two dimensions

- **Subdivision:** triangulations  $\rightarrow$  tetrahedral partitions
- **Function spaces:** Bernstein-Bézier spaces on triangulations  $\rightarrow$  tetrahedral partitions
- **Specifying the coefficients:** More parameters for the extra dimension

However, complexity increases for smooth Bernstein-Bézier spaces in three dimensions. Evaluation of window values is more expensive.

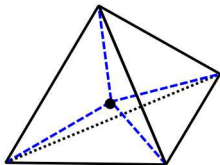
# Spaces on Tetrahedral Partitions



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Extending  $\mathcal{S}_5^{1,2}$  (the Argyris Space) to three dimensions leads to  $\mathcal{S}_9^{1,4,2}(\Delta)$ , where 1, 4, 2 is the smoothness at the faces, vertices and edges, respectively.

The solution to decrease complexity has been to define spaces on *splits* of tetrahedral partition. For example, a  $C^1$  space on the *Alfeld split*,  $\mathcal{S}_5^1$



Alfeld Split

Required coefficients at different locations:

Space	Vertex	Face	Edge	Tetrahedron
$\mathcal{S}_9^{1,4,2}$	35	8	7	4
$\mathcal{S}_5^1$	10	2	3	1

(locations in un-split tetrahedral partition)

# Simplification of Conforming Kernel Implementation



For conforming window functions, adding a constraint to the process greatly reduces the complexity.

**Require integration points to be nodal locations (i.e. Hermite interpolation locations) of the window function space.** In other words, triangulate the integration points.

- Values are set at nodal locations, determination of coefficients and evaluation of Bernstein-Bézier function is not required.
- As such, *no construction of Bernstein-Bézier spaces required*. Values are explicitly set at the integration points, implied elsewhere.
- Pairs well with integration using smoothed gradients<sup>5</sup>

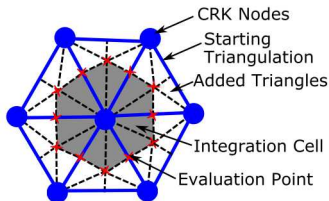
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<sup>5</sup>J.-S. Chen, C.-T. Wu, S. Yoon, and Y. You, "A stabilized conforming nodal integration for Galerkin mesh-free methods," *International Journal for Numerical Methods in Engineering*, vol. 50, no. 2, pp. 435–466, 2001.

# Simplified Kernel Construction

Example: Stabilized Conforming Nodal Integration (SCNI) with boundary edge integration using trapezoid rule. Triangulations extracted from a global mesh.

- Input triangulation in blue
- A *Powell-Sabin split* (black-dashes) is used to create nodal integration domains (shaded region)
- The split also provides the window function triangulations
- A boundary integral is completed using values at nodal parameter locations (red marks) and provided the smoothed strain-displacement matrix  $\tilde{\mathbf{B}}$  or deformation gradient  $\tilde{\mathbf{F}}$ , used in the SCNI method.



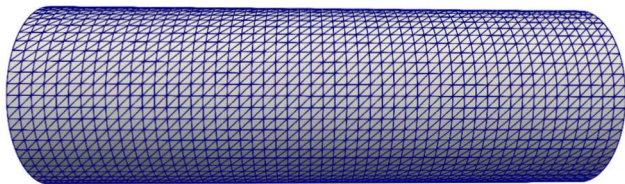
## 3D Examples



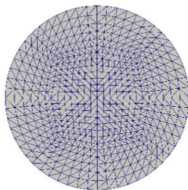
# Taylor Bar Impact

Dynamic problem, solved using explicit time integration (central difference).

- Height =  $2.346\text{cm}$
- Radius =  $0.391\text{cm}$
- Initial velocity =  $373\text{m/s}$
- J2 plasticity with power law hardening
- Axial displacement fixed on impact face

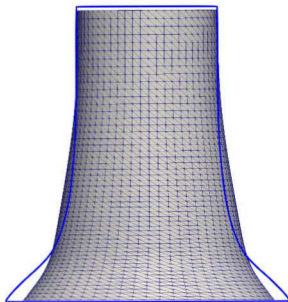


Side View

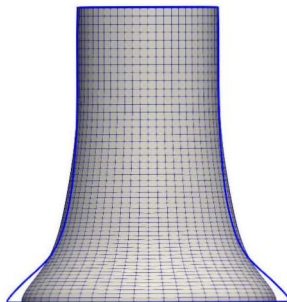


End View

# 3D Example: Taylor Bar Impact



CRK,  
Tet Integration



FEM Hex  
Reduced Integration

- CRK Tet Integration: tet elements as gradient smoothing domains
- FEM Hex: reduced integration w/ hourglass control
- Blue Line: reference displacement outline (highly refined SD Hex)

# Taylor Bar Results



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The predictions have issues: volumetric locking, oscillations in hydrostatic stress



Hydrostatic Stress

## Addressing Volumetric Locking<sup>6</sup>

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<sup>6</sup>G. Moutsanidis, J. Koester, M. Tupek, Y. Bazilevs, and J.-S. Chen, " $\overline{\mathbf{B}}$  and  $\overline{\mathbf{F}}$  approaches for the treatment of near-incompressibility in meshfree and immersed-particle methods," *Computational Particle Mechanics*, accepted.

# Volumetric Locking in FEM and Meshfree Methods



As material approaches incompressibility, approximations spaces have challenges meeting the constraint and providing a reasonable displacement field. This has been addressed in FEM in a few ways:

- Mixed methods with both pressure and displacement degrees-of-freedom (DOFS)
  - Should satisfy LBB condition
  - More expensive, complicated
- Reduced integration
  - Projects volumetric and deviatoric response to a lower order space
  - Efficient, requires stabilization, setting of parameters
- $\bar{\mathbf{B}}$  and  $\bar{\mathbf{F}}$ 
  - Projects volumetric response to a lower order space, keeps deviatoric as-is
  - Improved coarse mesh accuracy, more expensive per DOF

# Volumetric Locking in Meshfree Methods



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The techniques from FEM have have been extended into meshfree methods. A popular approach is Stabilized Conforming Nodal Integration (SCNI):

- Comparable to reduced order elements
- Provides consistent integration for meshfree methods
- Efficient, has low energy modes requiring additional stabilization and setting of parameters

**Goal:** Develop a method that addressing volumetric locking and:

- Does not require setting stabilization parameters
- Is variationally consistent, efficient

Leverage ideas from SCNI and  $\bar{\mathbf{B}}$  and  $\bar{\mathbf{F}}$ .

## Review of and $\bar{\mathbf{F}}$



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The  $\bar{\mathbf{B}}$  method for small strains is extended to finite deformation with the  $\bar{\mathbf{F}}$  method. The current position  $\mathbf{x}$  of particle that was originally at location  $\mathbf{X}$  is given by

$$\mathbf{x} = \phi(\mathbf{X}, t) \text{ with displacement } \mathbf{u} = \phi(\mathbf{X}, t) - \mathbf{X} = \mathbf{x} - \mathbf{X}$$

The deformation gradient is defined as

$$\mathbf{F} = \frac{\partial \mathbf{x}}{\partial \mathbf{X}} = \frac{\partial \mathbf{X} + \mathbf{u}}{\partial \mathbf{X}} = \frac{\partial \mathbf{X}}{\partial \mathbf{X}} + \frac{\partial \mathbf{u}}{\partial \mathbf{X}} = \mathbf{I} + \frac{\partial \mathbf{u}}{\partial \mathbf{X}}$$

A multiplicative split is used to decompose the deformation gradient

$$\mathbf{F} = \mathbf{F}^{dil} \mathbf{F}^{dev}$$

$$\text{with } \det \mathbf{F} = J = \det \mathbf{F}^{dil}, \quad \det \mathbf{F}^{dev} = 1, \quad \mathbf{F}^{dev} = J^{-1/3} \mathbf{F}, \quad \mathbf{F}^{dil} = J^{1/3} \mathbf{I}$$

The volumetric part of  $\mathbf{F}$  is replaced with a projected value

$$\bar{\mathbf{F}} = \bar{\mathbf{F}}^{dil} \mathbf{F}^{dev},$$

where

$$\bar{\mathbf{F}}^{dil} = \pi(\mathbf{F}^{dil}) = \overline{J^{1/3}} \mathbf{I},$$

## **New Projection for $\overline{F}$**



## New Projection for $\bar{\mathbf{F}}$



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A  $\bar{\mathbf{F}}$ -based projection is designed to be compatible with the window simplification procedure. The projection leverages the *smoothed gradient* operator.

$$\tilde{\nabla} f(\Omega_L) = \frac{1}{V_L} \int_{\Omega_L} \nabla f \, d\Omega,$$
$$V_L = \int_{\Omega_L} d\Omega,$$

where  $\Omega_L$  is the smoothing volume surrounding corresponding to a material point  $L$ . Applying the divergence theorem leads to

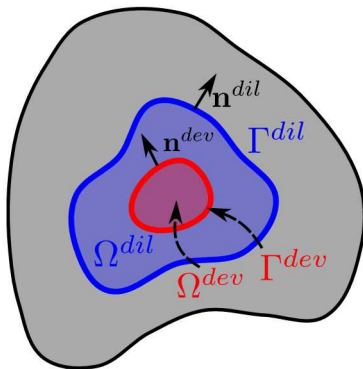
$$\tilde{\nabla} f(\Omega_L) = \frac{1}{V_L} \int_{\Gamma_L} f \mathbf{n} \, d\Gamma,$$

$\mathbf{n}$  is the outward facing surface normal for boundary  $\Gamma_L$  of the smoothing volume. A smoothed deformation gradient  $\mathbf{F}$  around material point  $L$  to give

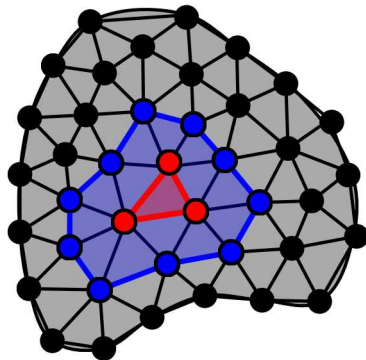
$$\tilde{F}_{ij}(\Omega_L) = \frac{1}{V_L} \int_{\Omega_L} \left( \frac{\partial u_i^h}{\partial X_j} + \delta_{ij} \right) d\Omega = \frac{1}{V_L} \int_{\Omega_L} \left( \frac{\partial u_i^h}{\partial X_j} \right) d\Omega + \delta_{ij} = \frac{1}{V_L} \int_{\Gamma_L} u_i^h n_j \, d\Gamma + \delta_{ij}$$

# New Projection for $\bar{\mathbf{F}}$

For the conforming window  $\bar{\mathbf{F}}$  method two different domains are used for each material point, a smaller domain  $\Omega_L^{dev}$  provides the deviatoric portion and a larger domain  $\Omega_L^{dil}$  provides the dilatational portion.



Nested smoothing domains



Meshed domains

# New Projection for $\bar{\mathbf{F}}$



For  $\bar{\mathbf{F}}$  at material point  $L$ , we have

$$\bar{\mathbf{F}}_L = \bar{\mathbf{F}}_L^{dil} \mathbf{F}_L^{dev},$$

with the deviatoric part coming from the smoothed deformation gradient of the smaller cell,

$$\mathbf{F}_L^{dev} = \tilde{\mathbf{F}}(\Omega_L^{dev}),$$

and the dilatational part coming from the smoothed deformation gradient of the larger cell,

$$\begin{aligned} \bar{\mathbf{F}}_L^{dil} &= \overline{J^{1/3}}(\Omega_L^{dil}) \mathbf{I}, \\ \bar{J}(\Omega_L^{dil}) &= \frac{1}{V^{dil}} \sum_{c \in C} V_c J_c, \quad V^{dil} = \sum_{c \in C} V_c, \end{aligned}$$

where  $C$  is the collection of cells/elements in the volumetric domain. This allows  $J$  to be computed one time for every cell then aggregated as needed for  $\bar{J}$

## Examples using $\overline{F}$

## 3D Example: Taylor Bar Impact



CRK,  
Tet Integration



CRK,  
SCNI



CRK,  
 $\bar{\mathbf{F}}$

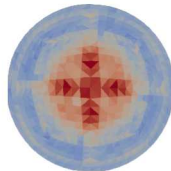
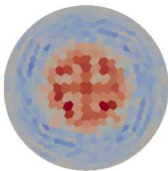
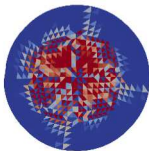
- CRK Tet Integration: tet elements as gradient smoothing domains
- CRK  $\bar{\mathbf{F}}$ : tet elements for  $\mathbf{F}^{dev}$ , star of elements  $\bar{\mathbf{F}}^{dil}$ .
- Blue Line: reference displacement outline (highly refined SD Hex)

# Taylor Bar, Axial Stress



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Hex mesh converted to tets



CRK, Tet Integration

CRK, SCNI

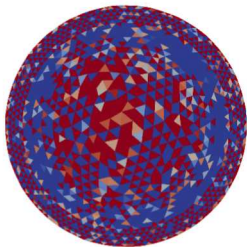
CRK,  $\bar{F}$

# Taylor Bar, Axial Stress

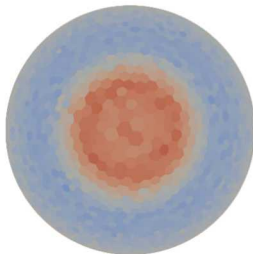
Tet mesh (not converted from hex mesh)

Stress

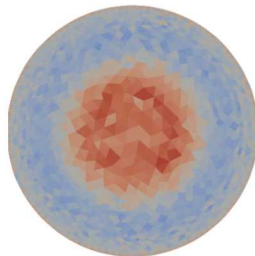
-3.0e+08 -2e+8 -1e+8 0 1e+8 2e+8 3.0e+08



CRK, Tet Integration



CRK, SCNI



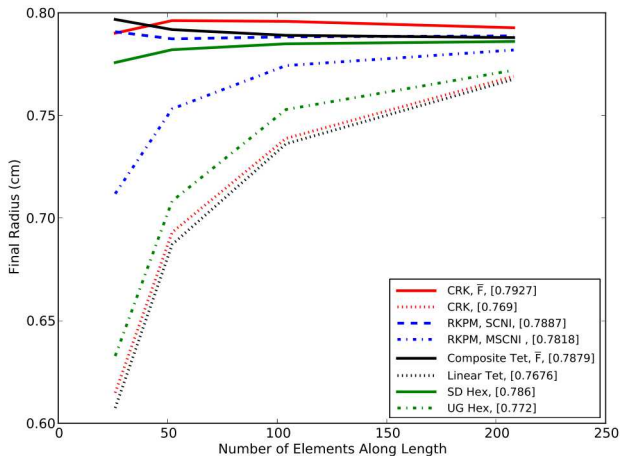
CRK,  $\bar{F}$

# Taylor Bar Impact



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## Convergence of radial displacement with mesh refinement



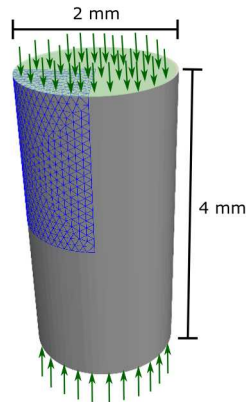


# Compression of Elastomer Billet



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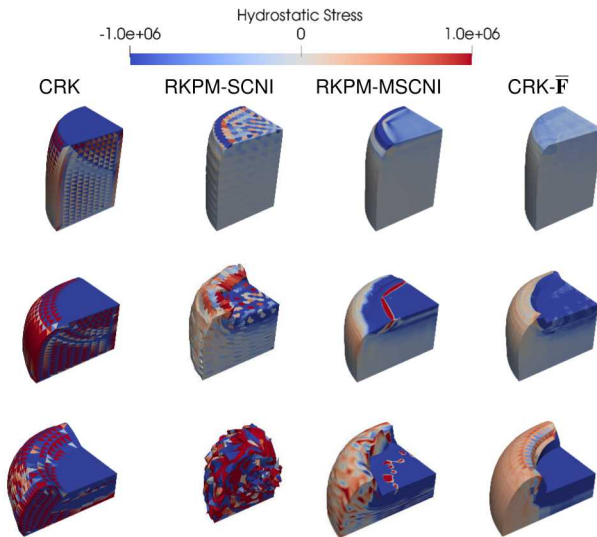
- Compressed from both ends
- No in-plane deformation on the ends, free elsewhere
- Symmetric, 1/8 of domain simulated
- Gent Model:  $K = 100$  MPa,  $E = 1$  MPa  
 $\rightarrow \nu = 0.4983$
- CRK: *star*<sup>2</sup> kernel
- $\bar{\mathbf{F}}$  uses each tetrahedron for  $\mathbf{F}^{dev}$  and the star of elements around each tetrahedron for  $\bar{\mathbf{F}}^{dil}$ .
- Compared with Modified SCNI (MSCNI) with stabilization coefficient  $\alpha = 0.05$ .



# Compression of Elastomer Billet

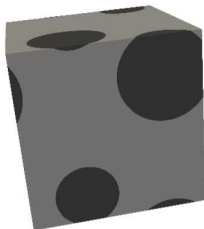


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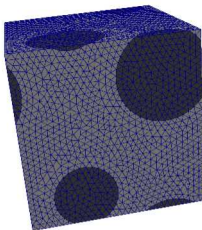


# Carbon Black Rubber

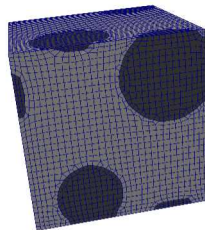
- (29 x 29 x 29 nm) cube
- Shear displacement
- No in-plane deformation on the ends, free elsewhere
- Elastomer, Gent Model:  $G = 950$  kPa,  $K = 920$  MPa  $\rightarrow \nu = 0.4995$
- Inclusions, Elastic:  $E = 25$  GPa,  $\nu = 0.25$
- CRK:  $star^2$  kernel
- $\bar{\mathbf{F}}$  uses each tetrahedron for  $\mathbf{F}^{dev}$  and the star of elements around each tetrahedron for  $\bar{\mathbf{F}}^{dil}$ .



Domain



Example Tet Mesh

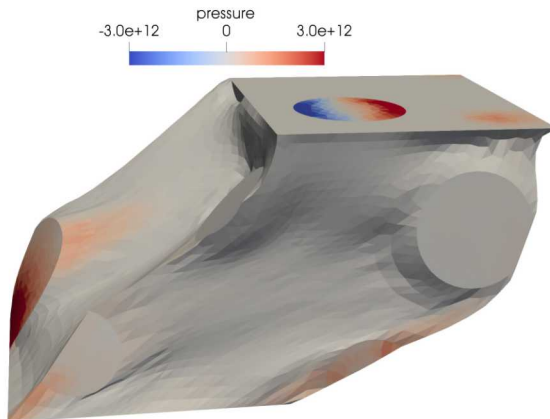


Example Hex Mesh

# Carbon Black Rubber



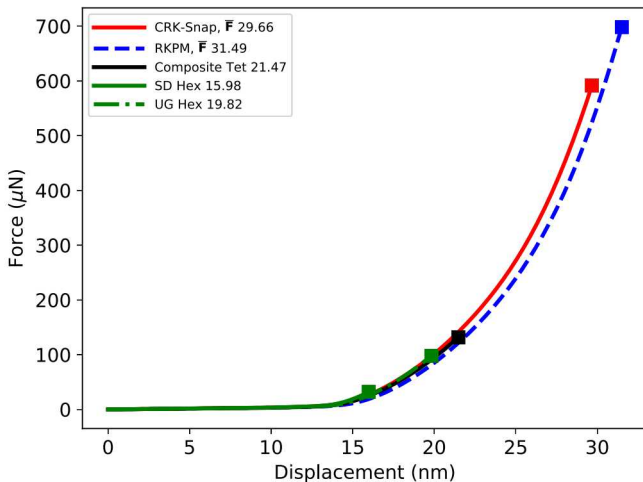
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# Carbon Black Rubber



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## **Working with Low Quality Triangulations**

# Low Quality Triangulations

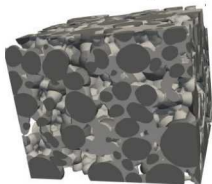


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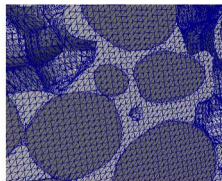
Generating subdivisions of complex geometries is often faced with many challenges

- Small features need to be removed
- Scanned systems may be represented with STLs, requiring extra processing

Challenging to get a mesh of quality tetrahedra. However, many methods exist that readily produce meshes with low quality elements. E.g. Conformal Decomposition Finite Element Method (CDFEM)<sup>7</sup>



Lithium Ion Battery



CDFEM Mesh, Close-Up

**Goal:** Develop and approach to use low quality triangulations but still have agreeable accuracy, robustness and efficiency.

<sup>7</sup>S. A. Roberts, H. Mendoza, V. E. Brunini, and D. R. Noble, "A verified conformal decomposition finite element method for implicit, many-material geometries," *Journal of Computational Physics*, vol. 375, pp. 352–367, 2018.

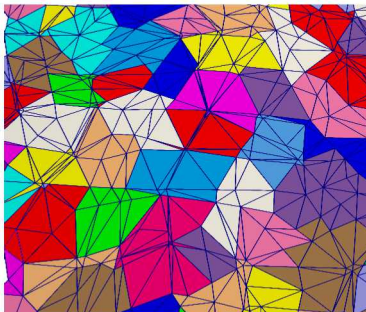
# Addressing Low Quality Meshes



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A method has been developed to work with low quality meshes. In short, use mesh only as a guide.

- **Decimate** by selecting a subset of vertices to be nodes carrying DOFs
- **Aggregate** elements into better shaped integration cells.



Example of clusters



# Addressing Low Quality Meshes



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Laboratories

A k-means clustering process is used to accomplish the aggregation and decimation:

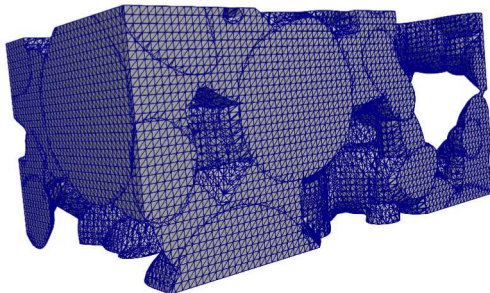
- Group elements into larger integration domains (polyhedra)
  - Added cluster volume limiters to balance cluster size
- Optionally split domains into subdomain and use with  $\bar{\mathbf{F}}$  process
- Select one node per integration domain to carry degrees-of-freedom, the rest just provide structure for the integration domains

# Lithium Ion Battery



Sandia  
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CDFEM mesh with 821,437 elements and 173,917 nodes, aggregated to give 50,000 cells, each containing one node and two subcells. Loaded in compression.

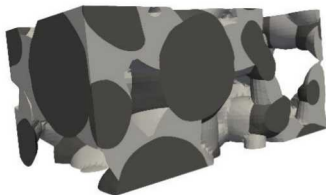


Initial Mesh

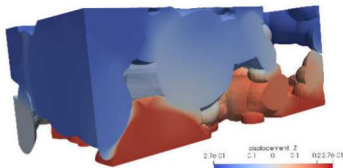
# Lithium Ion Battery



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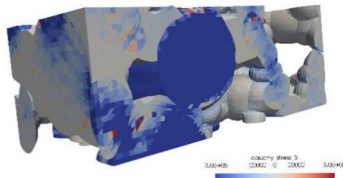
Initial State



Final Displacement



Final State



Final Stress

≈200x time step advantage over a linear tet. Ran to completion

## **Comments and Future Work**

**Goal:** *Improving the Analyst's Response Time*

**Approach:** *Utilize the flexibility that meshfree methods provide, supply more control where needed*

- Conforming window functions to handle boundary / geometry challenges of meshfree methods.
- An  $\bar{\mathbf{F}}$  method was developed to address volumetric locking.
- A decimation and aggregation procedure was created to address low quality triangulations.

Future Work:

- Better classification for element aggregation / pair with other meshing techniques
- Extend to handle fracture, very large deformation

**Questions?**