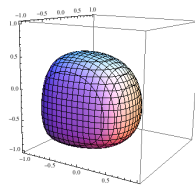
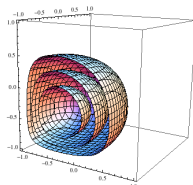
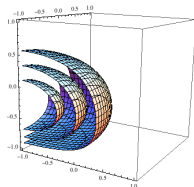
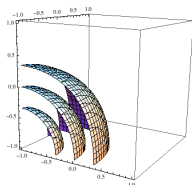
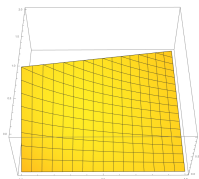
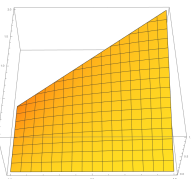
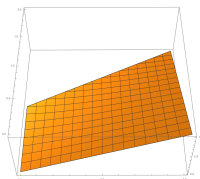
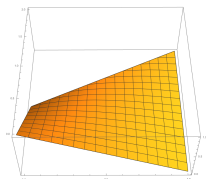


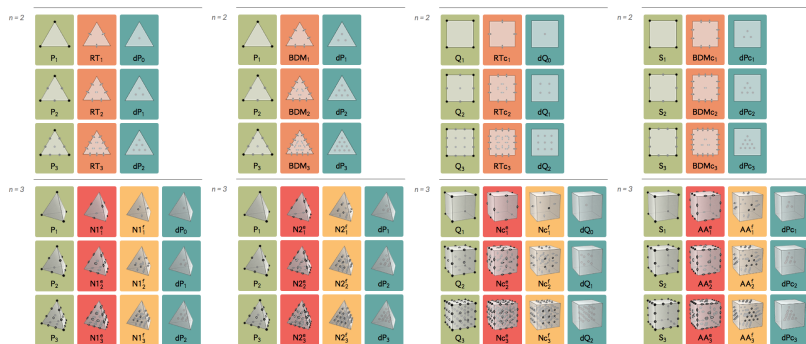
A Plethora of Basis Functions for Quadrilaterals and Hexahedra

Andrew Gillette - University of Arizona



The ‘Periodic Table of the Finite Elements’

ARNOLD, LOGG, “Periodic table of the finite elements,” *SIAM News*, 2014.






- Classification of many common conforming finite element types.
- Squares and cubes occupy the right half of the table.
- The right-most column is the “serendipity” family of finite elements.

Serendipity elements struggle with reference mapping

Quadratic serendipity elements, mapped non-affinely, are only expected to converge at the rate of *linear* elements.

ARNOLD, BOFFI, FALK, "Approximation by Quadrilateral Finite Elements," *Math. Comp.*, 2002

			$\ u - u_h\ _{L^2}$	$\ \nabla(u - u_h)\ _{L^2}$
linear			$O(h^2)$	$O(h)$
quadratic serendipity			$O(h^2)$	$O(h)$
quadratic tensor prod.			$O(h^3)$	$O(h^2)$

Extensions to vector-valued and higher dimensions:

ARNOLD, BOFFI, FALK, "Quadrilateral $H(\text{div})$ Finite Elements," *SINUM*, 2005.

ARNOLD, BOFFI, BONIZZONI, "Finite element differential forms on curvilinear cubic meshes," *Numer. Math.*, 2014

Open source finite element software



FEniCS primarily supports
simplicial elements



deal.iI primarily supports
quad/hex elements

ALNÆS ET AL. "The FEniCS Project Version 1.5" *Archive of Numerical Software* 2015

BANGERTH ET AL. "The deal.iI Library, Version 8.4," *Journal of Num. Math.*, 2016

Neither package supports serendipity elements!

Remainder of this talk

- Recent advances and current uses of quad/hex meshes
- Techniques for finite elements on general quad/hex meshes
- Lessons from an application of serendipity elements for cardiac electrophysiology

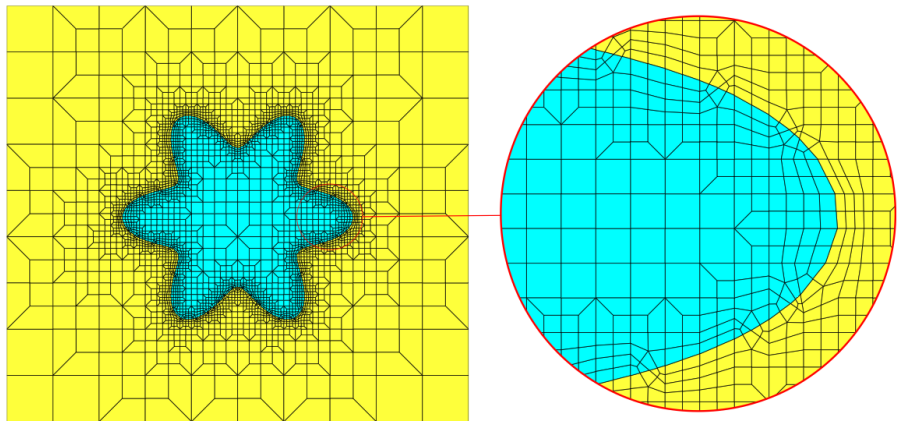
Table of Contents

- 1 Serendipity elements in theory and software
- 2 Recent advances and current uses of quad/hex meshes
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- 4 An application of serendipity elements for cardiac electrophysiology

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- 1 Serendipity elements in theory and software
- 2 Recent advances and current uses of quad/hex meshes**
- 3 Techniques for finite elements on general quad/hex meshes
- 4 An application of serendipity elements for cardiac electrophysiology

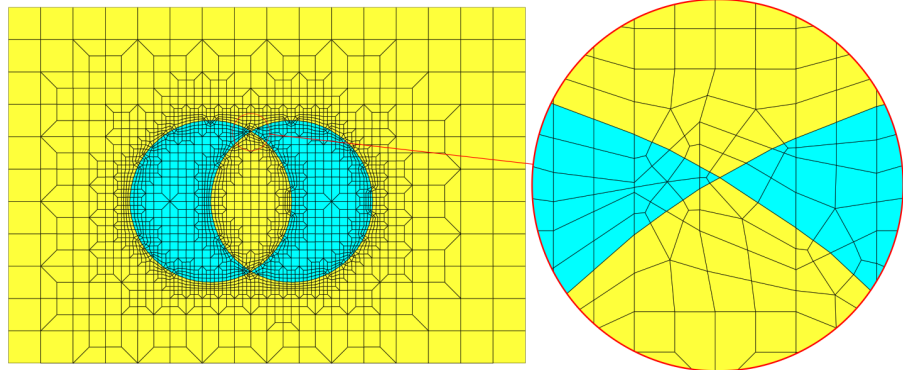
Recent advances in quad meshing



An all-quad mesh conforming to a given curve.

RUSHDI ET AL. "All-quad meshing without cleanup," *Computer-Aided Design*, 2017

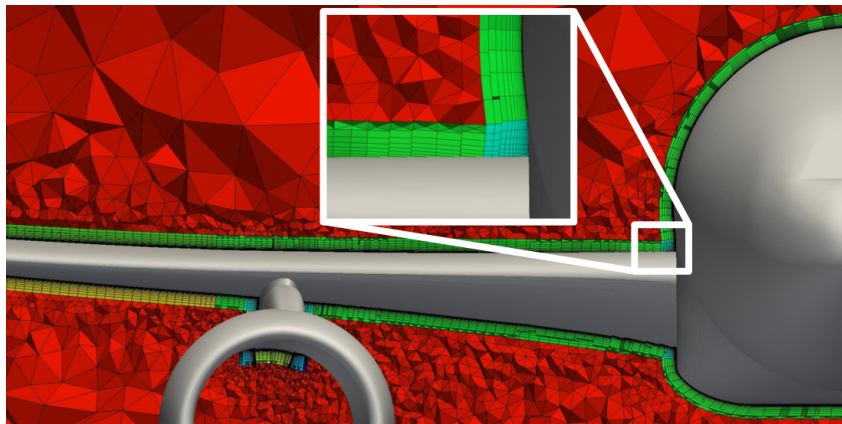
Recent advances in quad meshing



An all-quad mesh conforming to a given curve.

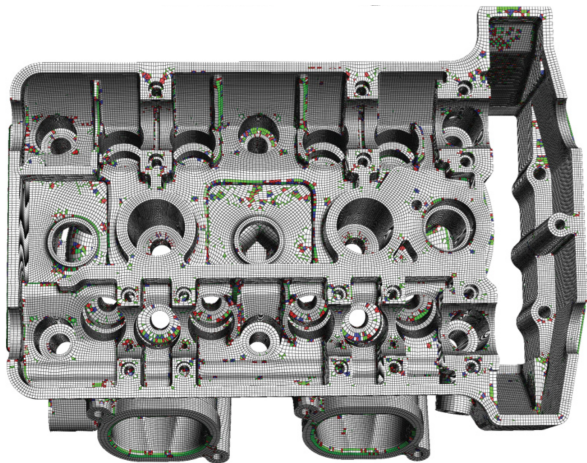
RUSHDI ET AL. "All-quad meshing without cleanup," *Computer-Aided Design*, 2017

Volume meshing for Computational Fluid Dynamics



Hybrid hex / pyramid / prism / tet mesh for CFD, using **ITI Transcendata** software.
(from a keynote address at Geometric Modeling and Processing 2015)

Recent advances in hex-dominant meshing

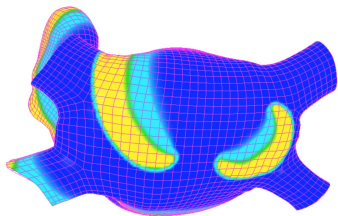
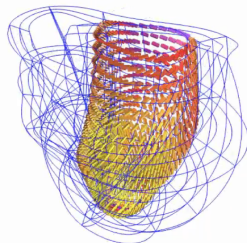
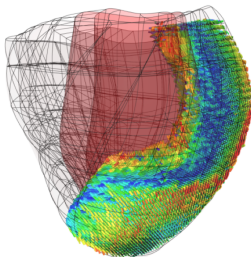
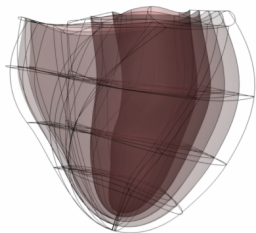


- A hex-dominant mesh with ≈ 1.3 million cells, including ≈ 1 million hexahedra.
- Re-meshed from a mesh of ≈ 10 million tetrahedra.

SOKOLOV ET AL. "Hexahedral-Dominant Meshing," *ACM Trans. Graphics*, 2016

Established models use hexahedral meshes

All-hex meshes of a specific patient's heart are generated and used to create simulations of electrophysiological phenomena.

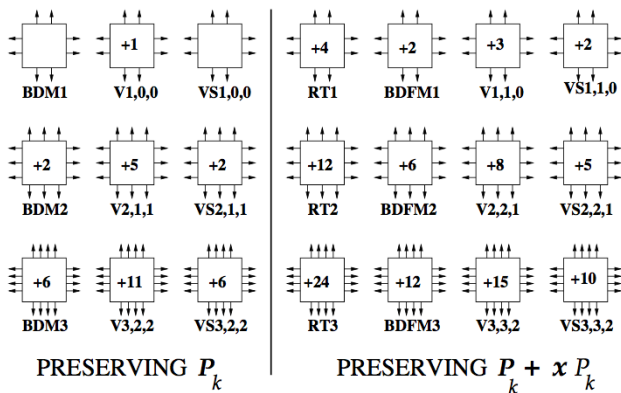


McCULLOCH research group, *Continuity* software
National Biomedical Computation Resource
UC San Diego
2006–2017

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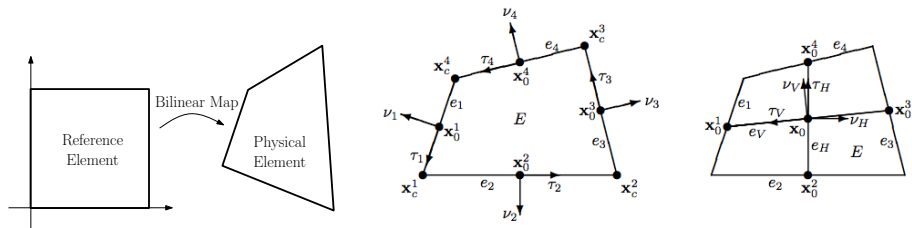
The virtual element technique



- Analogues of conforming finite element spaces on squares can be treated as virtual elements.
- Explicit basis functions are not needed to implement the method.
- Related polygonal element methods (HHO, HDG, WG. . .) may offer similar approaches.

BEIRÃO DA VEIGA, BREZZI, MARINI, RUSSO “Serendipity face and edge VEM spaces”
Rendiconti Lincei-Matematica e Applicazioni, 2017.

The Arbogast-Correa technique



A finite element space on a general quadrilateral is built in two parts:

- Apply Piola mapping to functions associated to boundary of reference element.
- Define functions on the physical element corresponding to interior degrees of freedom in a way that ensures relevant polynomial approximation properties.

ARBOGAST, CORREA "Two families of $H(\text{div})$ mixed finite elements on quadrilaterals of minimal dimension," *SIAM J. Numerical Analysis*, 2016

The generalized barycentric coordinate technique

Let P be a convex polytope with vertex set V . We say that

$\lambda_{\mathbf{v}} : P \rightarrow \mathbb{R}$ are **generalized barycentric coordinates (GBCs)** on P

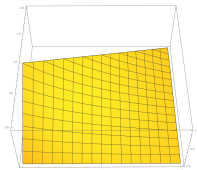
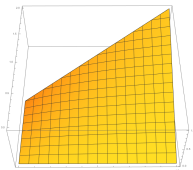
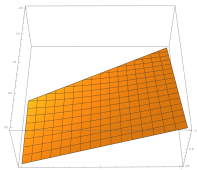
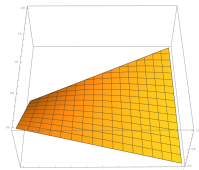
if they satisfy $\lambda_{\mathbf{v}} \geq 0$ on P and $L = \sum_{\mathbf{v} \in V} L(\mathbf{v}_{\mathbf{v}})\lambda_{\mathbf{v}}$, $\forall L : P \rightarrow \mathbb{R}$ linear.

Familiar properties are implied by this definition:

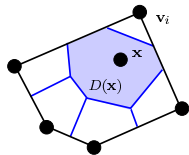
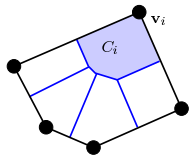
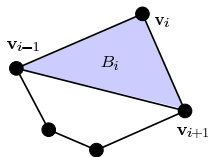
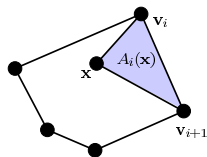
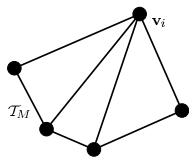
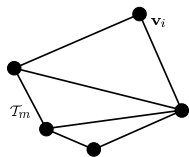
$$\underbrace{\sum_{\mathbf{v} \in V} \lambda_{\mathbf{v}} \equiv 1}_{\text{partition of unity}}$$

$$\underbrace{\sum_{\mathbf{v} \in V} \mathbf{v}\lambda_{\mathbf{v}}(\mathbf{x}) = \mathbf{x}}_{\text{linear precision}}$$

$$\underbrace{\lambda_{\mathbf{v}_i}(\mathbf{v}_j) = \delta_{ij}}_{\text{interpolation}}$$



Many barycentric coordinates are available . . .



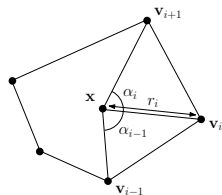
- Triangulation
⇒ [FLOATER, HORMANN, KÓS, A general construction of barycentric coordinates over convex polygons, 2006](#)

$$0 \leq \lambda_i^{T_m}(\mathbf{x}) \leq \lambda_i(\mathbf{x}) \leq \lambda_i^{T_M}(\mathbf{x}) \leq 1$$

- Wachspress
⇒ [WACHSPRESS, A Rational Finite Element Basis, 1975.](#)
⇒ [WARREN, Barycentric coordinates for convex polytopes, 1996.](#)

- Sibson / Laplace
⇒ [SIBSON, A vector identity for the Dirichlet tessellation, 1980.](#)
⇒ [HIYOSHI, SUGIHARA, Voronoi-based interpolation with higher continuity, 2000.](#)

Many barycentric coordinates are available . . .



- Mean value

⇒ FLOATER, *Mean value coordinates*, 2003.

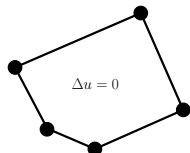
⇒ FLOATER, KÓS, REIMERS, *Mean value coordinates in 3D*, 2005.

- Harmonic

⇒ WARREN, SCHAEFER, HIRANI, DESBRUN, *Barycentric coordinates for convex sets*, 2007.

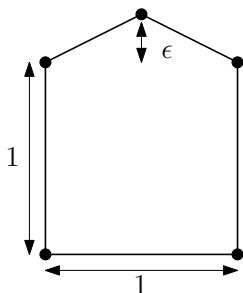
⇒ CHRISTIANSEN, *A construction of spaces of compatible differential forms on cellular complexes*, 2008.

⇒ Similar to virtual elements



Many more papers could be cited (maximum entropy coordinates, moving least squares coordinates, surface barycentric coordinates, etc...)

Large angle experiment



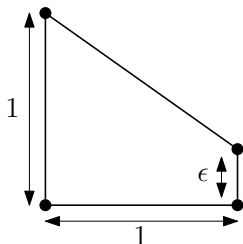
On a **single** element with a large angle:

- Set boundary values on domain shown from $u(x, y) = 0.77223(x - 0.331)^2 + 1.1123(y + 0.177344)^2$
- Compute harmonic (**hm**), Wachspress (**wa**), mean value (**mv**), discrete harmonic (**dh**), moving least squares (**ls-***), and maximum entropy (**me-***) coordinates as $\epsilon \rightarrow 0$
- Report $|u_h^{\text{hm}}|_{H^1}$ and $|u_h^{\text{hm}} - u_h^*|_{H^1}$

ϵ	hm	wa	mv	dh	ls-1	ls-2	ls-3	me-t	me-u
0.1600	1.3e0	2.6e-1	6.0e-2	2.3e-1	1.8e-1	2.2e-2	5.4e-2	7.9e-2	5.1e-1
0.0400	1.3e0	1.3e0	1.1e-1	1.5e0	3.6e-1	5.4e-2	1.2e-1	1.6e-1	2.2e0
0.0100	1.3e0	3.1e0	1.3e-1	3.9e0	4.4e-1	6.5e-2	1.4e-1	1.9e-1	5.1e0
0.0025	1.3e0	6.4e0	1.3e-1	8.3e0	4.5e-1	6.7e-2	1.4e-1	2.0e-1	9.3e0
0.0000	1.3e0	-	1.3e-1	-	4.5e-1	6.8e-2	1.5e-1	2.0e-1	-

Only *some* coordinates lose interpolation quality as the geometry degenerates.
(in this case, **wa**, **dh**, and **me-u**).

Short edge experiment

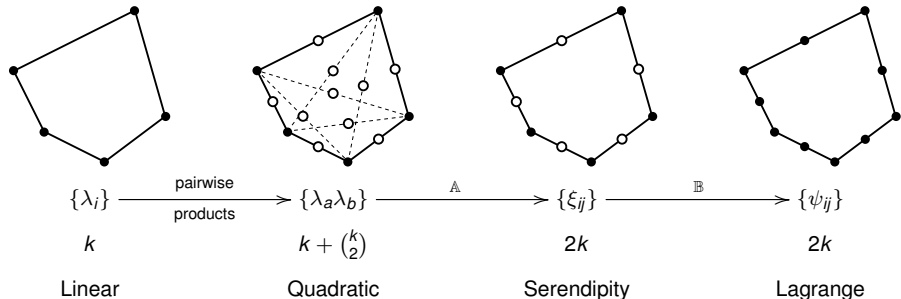


On a quadrilateral with a very short edge:

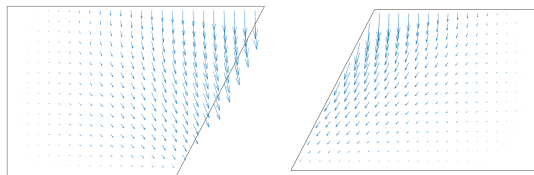
ϵ	hm	wa	mv	dh	ls-1	ls-2	ls-3	me-t	me-u
0.1600	7.5e-1	1.1e-1	4.0e-2	2.3e-1	2.2e-1	3.4e-2	6.5e-2	2.5e-1	7.3e-1
0.0400	8.5e-1	3.9e-2	1.2e-2	8.3e-2	9.0e-2	1.3e-2	2.9e-2	9.6e-2	4.6e-1
0.0100	8.9e-1	1.2e-2	3.2e-3	1.6e-1	2.9e-2	4.3e-3	1.0e-2	3.0e-2	2.5e-1
0.0025	9.1e-1	3.3e-3	6.7e-4	3.7e-3	7.9e-3	1.2e-3	3.2e-3	8.9e-3	9.9e-2

In this case, *none* of the coordinates lose interpolation quality as the geometry degenerates!

Higher order and vector-valued GBC elements



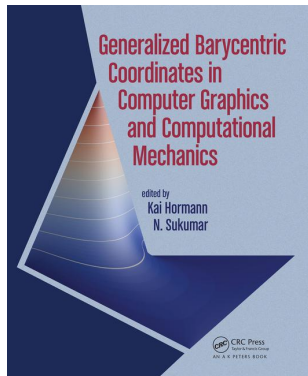
RAND, G, BAJAJ, "Quadratic Serendipity Finite Element on Polygons Using Generalized Barycentric Coordinates," *Math. Comp.*, 2011.



Can also do Whitney-like constructions: $\{\lambda_i \nabla \lambda_j\}$

G, RAND, BAJAJ, "Construction of Scalar and Vector Finite Element Families on Polygonal and Polyhedral Meshes," *CMAM*, 2016.

Other applications of GBCs



- Shape quality metrics and analysis
- Discrete Laplacians
- Mesh parameterization
- Shape deformation
- Self-supporting surfaces
- Extreme deformations
- BEM-based FEM
- Virtual element methods
- ... *and much more!*

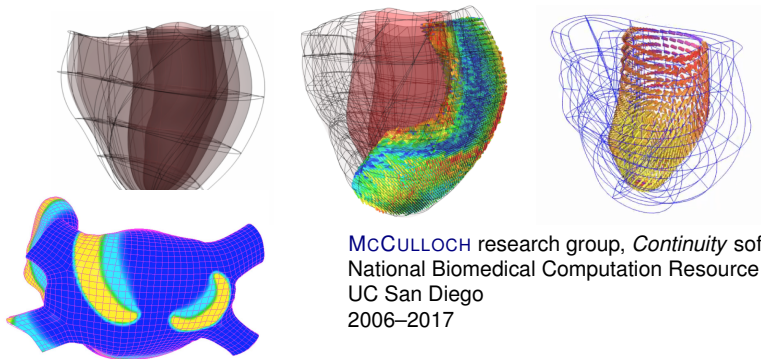
Book available October 31, 2017 from CRC Press.

Outline

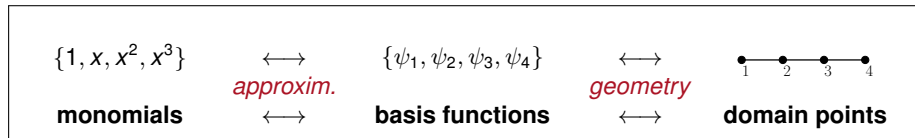
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Returning to the cardiac electrophysiology example...

- An established code at UCSD uses **cubic tensor product** Hermite-style basis functions to carry out finite element simulations.
- Would an analogous serendipity basis help here, even without accounting for the non-affine geometry mappings?

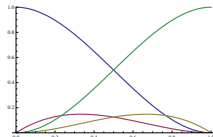


Cubic Hermite Geometric Decomposition: 1D



Cubic Hermite Basis
on $[0, 1]$

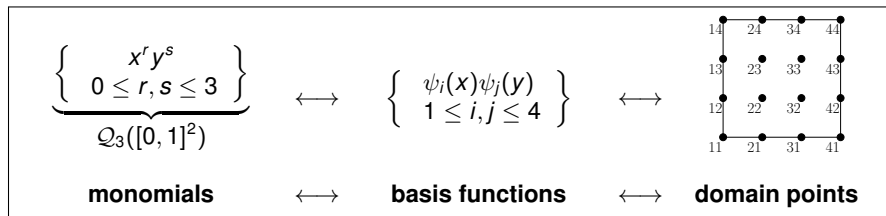
$$\begin{bmatrix} \psi_1 \\ \psi_2 \\ \psi_3 \\ \psi_4 \end{bmatrix} := \begin{bmatrix} 1 - 3x^2 + 2x^3 \\ x - 2x^2 + x^3 \\ x^2 - x^3 \\ 3x^2 - 2x^3 \end{bmatrix}$$



Approximation: $x^r = \sum_{i=1}^4 \varepsilon_{r,i} \psi_i$, for $r = 0, 1, 2, 3$, where $[\varepsilon_{r,i}] = \begin{pmatrix} 1 & 0 & 0 & 1 \\ 0 & 1 & -1 & 1 \\ 0 & 0 & -2 & 1 \\ 0 & 0 & -3 & 1 \end{pmatrix}$

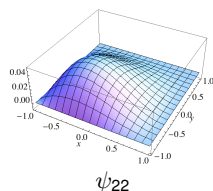
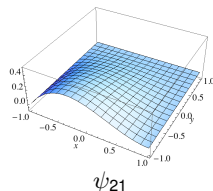
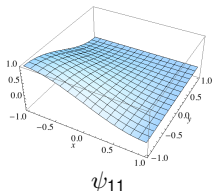
Geometry: $u = u(0)\psi_1 + u'(0)\psi_2 - u'(1)\psi_3 + u(1)\psi_4$, $\forall u \in \underbrace{\mathcal{P}_3([0, 1])}_{\text{cubic polynomials}}$

Cubic Hermite Geometric Decomposition: 2D



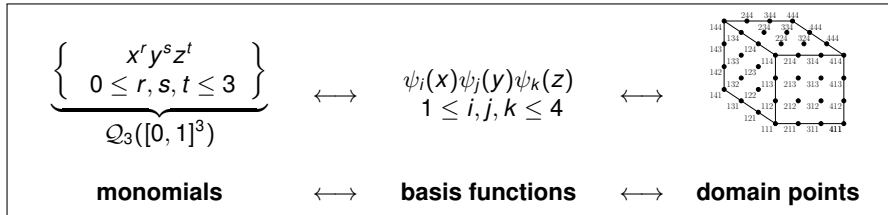
Approximation: $x^r y^s = \sum_{i=1}^4 \sum_{j=1}^4 \varepsilon_{r,i} \varepsilon_{s,j} \psi_{ij}$, for $0 \leq r, s \leq 3$, $\varepsilon_{r,i}$ as in 1D.

Geometry:



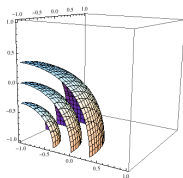
$$u = u|_{(0,0)} \psi_{11} + \partial_x u|_{(0,0)} \psi_{21} + \partial_y u|_{(0,0)} \psi_{12} + \partial_x \partial_y u|_{(0,0)} \psi_{22} + \dots, \quad \forall u \in \mathcal{Q}_3([0, 1]^2)$$

Cubic Hermite Geometric Decomposition: 3D

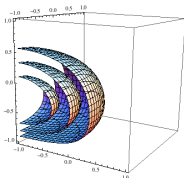


Approximation: $x^r y^s z^t = \sum_{i=1}^4 \sum_{j=1}^4 \sum_{k=1}^4 \varepsilon_{r,i} \varepsilon_{s,j} \varepsilon_{t,k} \psi_{ijk}$, for $0 \leq r, s, t \leq 3$, $\varepsilon_{r,i}$ as in 1D.

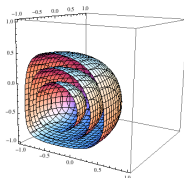
Geometry: Contours of level sets of the basis functions:



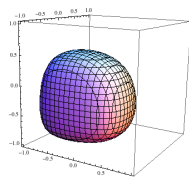
ψ_{111}



ψ_{112}

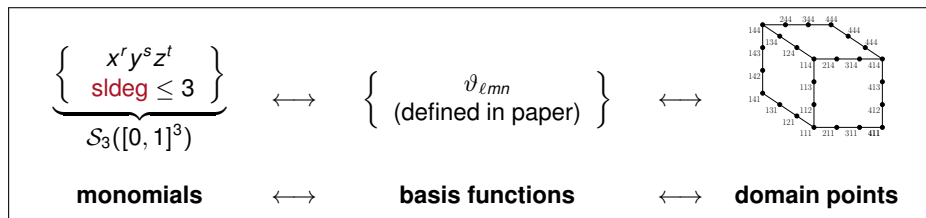


ψ_{212}



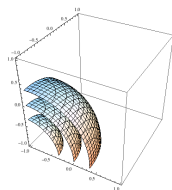
ψ_{222}

Cubic Hermite Serendipity Geom. Decomp: 3D

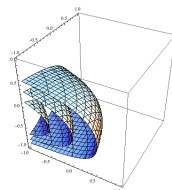


Approximation: $x^r y^s z^t = \sum_{\ell mn} \varepsilon_{r,i} \varepsilon_{s,j} \varepsilon_{t,k} \vartheta_{\ell mn}$, for superlinear degree $(x^r y^s z^t) \leq 3$

Geometry:



ϑ_{111}

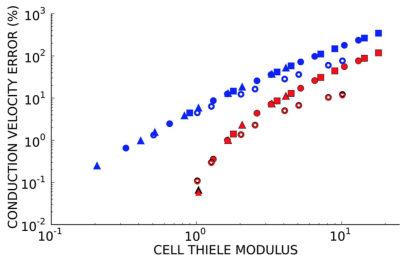
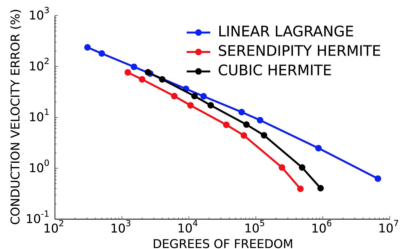


ϑ_{112}

$$\begin{aligned}
 u &= u|_{(0,0,0)} \vartheta_{111} \\
 &+ \partial_x u|_{(0,0,0)} \vartheta_{211} \\
 &+ \partial_y u|_{(0,0,0)} \vartheta_{121} \\
 &+ \partial_z u|_{(0,0,0)} \vartheta_{112} \\
 &+ \dots \\
 \forall u &\in S_3([0, 1]^3)
 \end{aligned}$$

G., "Hermite and Bernstein style basis functions. . ." *Proc. Approx. Theory XIV*, 2014.

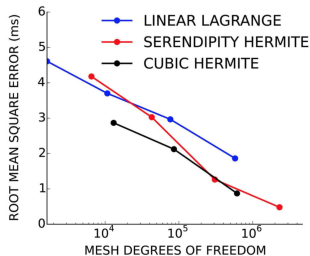
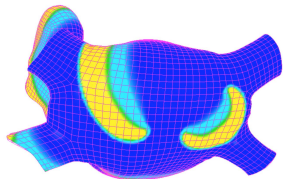
Cardiac electrophysiology example



Benchmark electrophysiology experiments:

- Simulate electrical propagation in a $20 \times 7 \times 3$ mm domain of cardiac tissue, governed by a monodomain equation (reaction-diffusion PDE).
- For error in the quantity of interest (conduction velocity), a cubic serendipity element with Hermite-like basis functions presented the best results in terms of per-DoF cost.
- Further, the dimensionless parameter cell Thiele modulus was found to be a good predictor of this error, with both cubic order elements (red and black) performing similarly. *Shapes and fills identify model and diffusivity choices.*

Cardiac electrophysiology example



Patient-specific geometry experiments:

- Goal is to accurately and efficiently estimate “activation times” for the electrical propagating through the heart (*eventually: in the OR while the patient is sedated!*)
- Solution with tensor product cubic elements with Hermite-like functions on the finest resolution mesh was taken to be a “fully converged” solution
- For error in the quantity of interest (RMS error in activation time) both cubic order elements had smaller error than linear elements, in terms of per-DoF cost.
- The results provide proof-of-concept for the use of higher order serendipity elements on coarse meshes of patient-specific geometry, to clinically-relevant levels of precision in estimates of physical quantities of interest.

A takeaway message

VINCENT, GONZALES, G., VILLONGCO, PEZZUTO, OMENS, HOLST, McCULLOCH
“High-order interpolation methods for cardiac monodomain simulations,”
Frontiers in Physiology 2015.

- Measurements of error and computational cost that practitioners care about in regards to quad/hex elements may be different than those studied by the math community.
- Additional implementations of quad/hex techniques are needed in order to see widespread adoption of methods that align with the supporting theory.

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Slides and Pre-prints

<http://math.arizona.edu/~agillette/>