

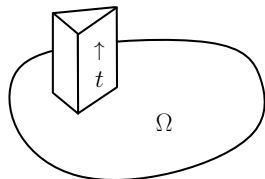
# Polytopal Element Methods: What, Why, and Where?

Andrew Gillette

Department of Mathematics  
University of Arizona

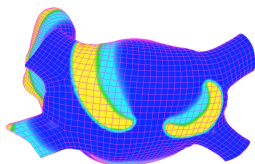
# What are finite element methods?

The **finite element method** is a way to numerically approximate the solution to PDEs.



CHARACTERIZE

Real analysis  
PDEs



DISCRETIZE

Geometry & Topology  
Combinatorics

$$\begin{bmatrix} \mathbf{A} \end{bmatrix} \begin{bmatrix} \mathbf{x} \end{bmatrix} = \begin{bmatrix} \mathbf{b} \end{bmatrix}$$

SOLVE

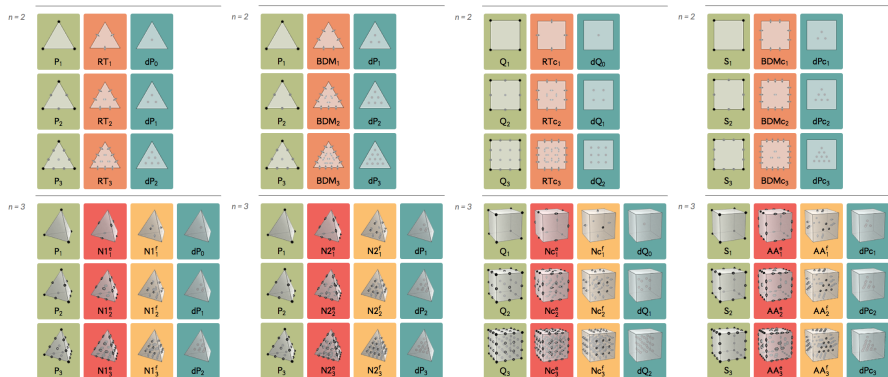
Linear algebra  
Numerical analysis

Examples of research questions related to finite elements:

- Does the PDE have a unique (weak) solution, bounded in some norm?
- How does the discretization affect the quality of the approximate solution?
- Is the solution method optimally efficient?

# Discretization with Simplices or Cubes

Domain meshing with simplices or cubes is now so well-understood that there is a **Periodic Table of Finite Elements**:



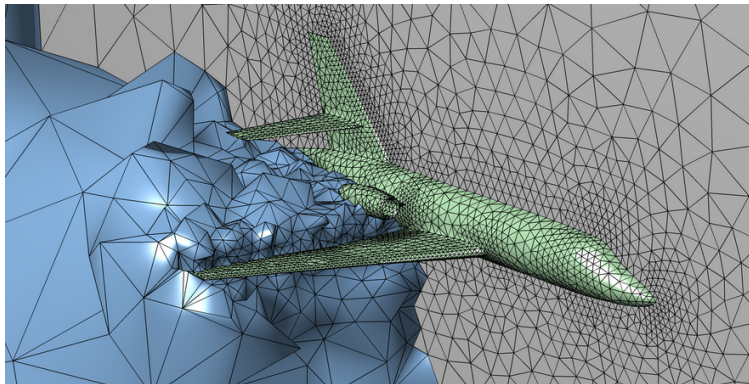
- Viewable online at [femtable.org](http://femtable.org) (and on the wall of my office!)
- Scientific content prepared by Doug Arnold and Anders Logg

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- 1 Why polytopal meshes?
- 2 Wait, what is the finite element method again?
- 3 What are some modern polytopal element methods?
- 4 Generalized barycentric coordinate methods

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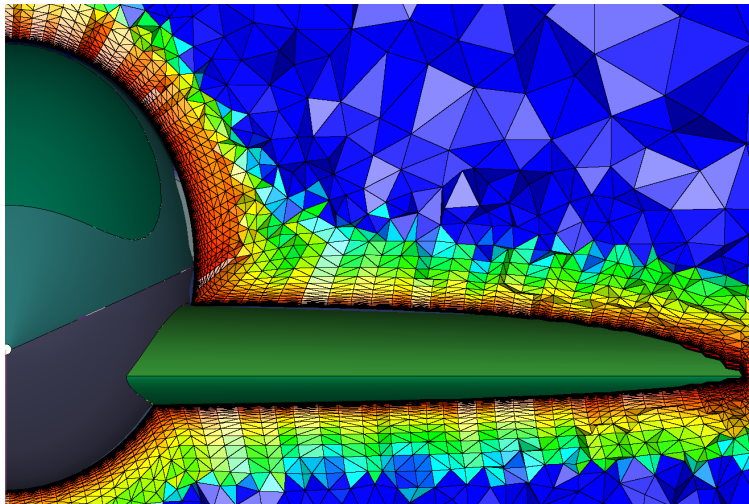
# Volume meshing for Computational Fluid Dynamics



*Tetrahedral volume mesh for CFD, using **DistMesh** software.*

*(courtesy of Per-Olof Persson)*

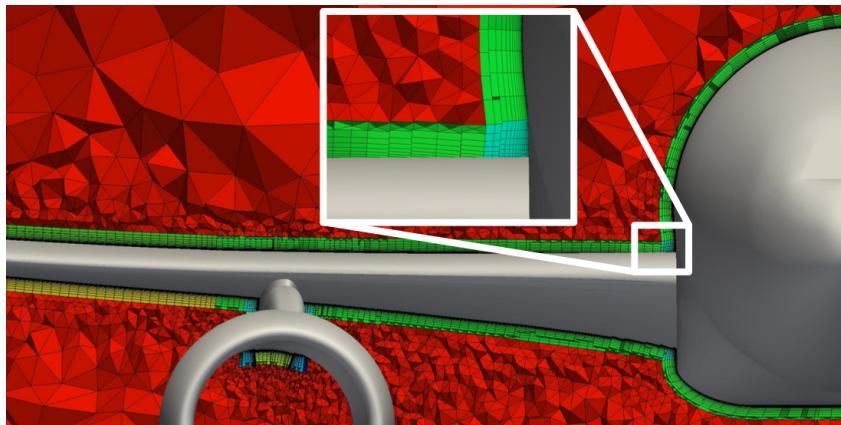
# Volume meshing for Computational Fluid Dynamics



*Tetrahedral volume mesh for CFD, using **Pointwise** software.*

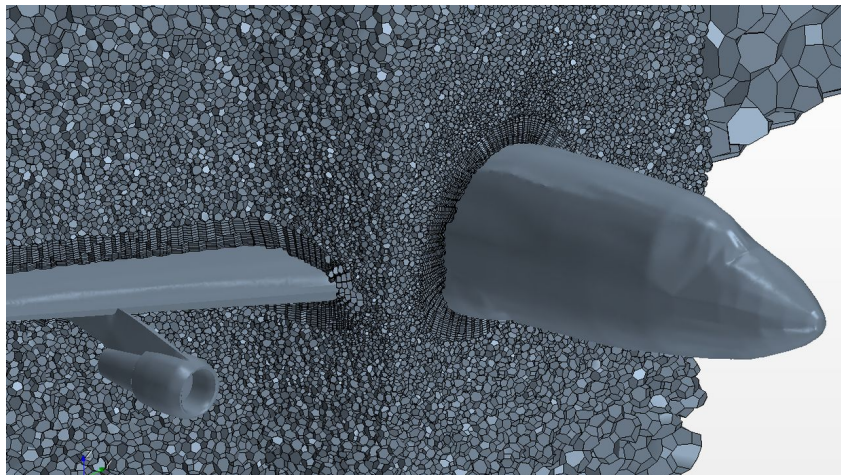
*(from [blog.pointwise.com](http://blog.pointwise.com))*

# 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)*

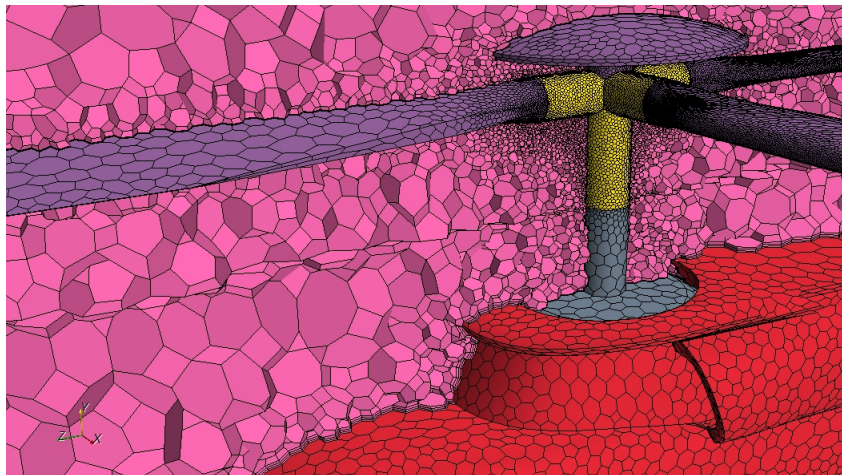
# Volume meshing for Computational Fluid Dynamics



*Body-aligned prismatic polyhedral meshes for CFD, using **CD-adapco** software.*

*(from [cd-adapco.com](http://cd-adapco.com) image gallery)*

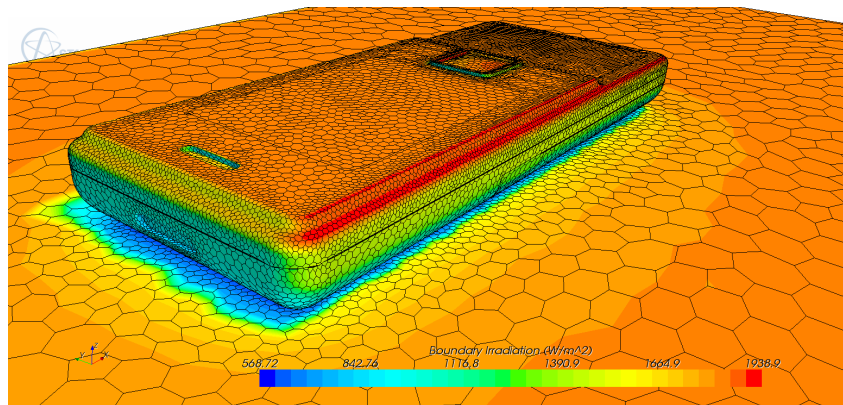
# Volume meshing for Computational Fluid Dynamics



*Polyhedral mesh of a Bell 407 helicopter and surrounding volume.*

*(from cd-adapco.com image gallery)*

# Volume meshing for... cel phone design!



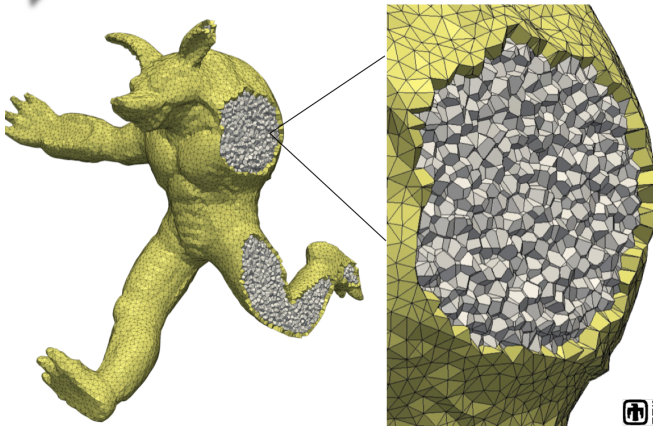
*A polyhedral mesh used to study heat transfer and cooling of a cell phone.*

*(from cd-adapco.com image gallery)*

# Volume meshing at Sandia National Labs



## Armadillo



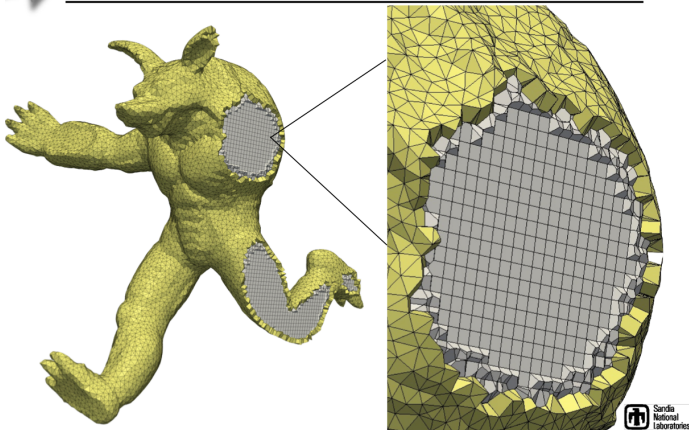
A polyhedral mesh conforming to a surface triangulation using **VoroCrust** software.  
(from Scott Mitchell, Sandia National Labs)

# Volume meshing at Sandia National Labs



hex-dominant mesh is trivial extension  
interior seeds = lattice points (centers of hexes)

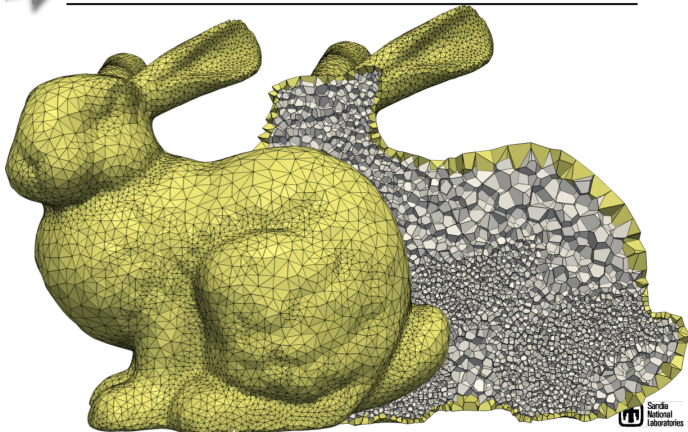
## Armadillo



A polyhedral mesh conforming to a surface triangulation using **VoroCrust** software.  
(from Scott Mitchell, Sandia National Labs)



## Bunny – size graded mesh

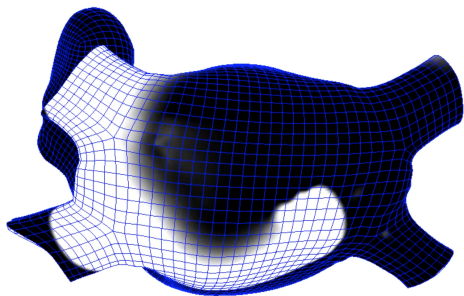
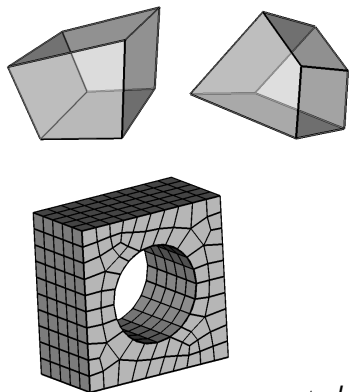


*The requisite Stanford Bunny example using **VoroCrust** software.*

*(from Scott Mitchell, Sandia National Labs)*

# Hexahedral meshing is polyhedral meshing

Meshes of generic hexahedra require a generalized theory of polyhedral discretization, related to but distinct from the theory for perfect tensor product meshes.

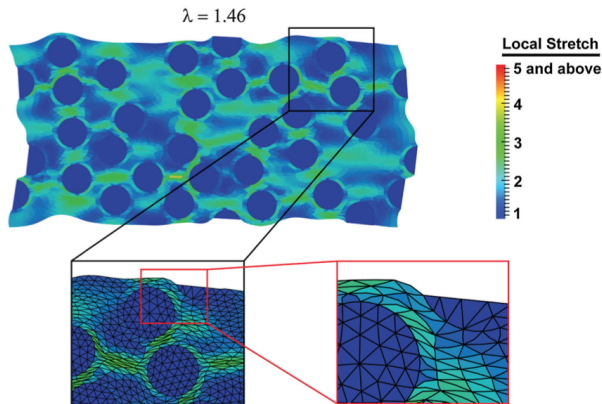


↑ *Heart mesh made using Continuity software, National Biomedical Computation Resource, UCSD*

← *Hole mesh made using CUBIT Geometry and Mesh Generation Toolkit, Sandia National Labs*

# Elasticity modeling

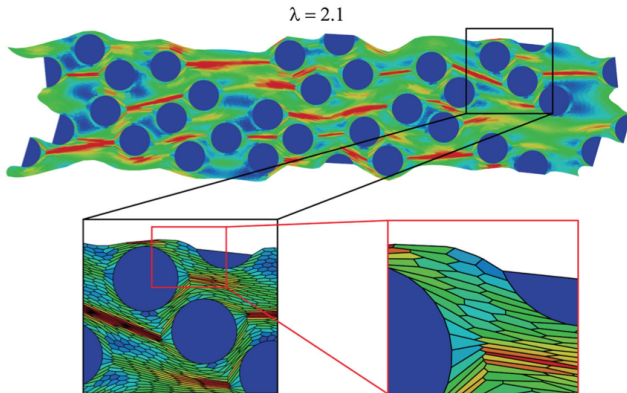
Standard triangular FEM cannot model maximal stretch factors due to numerical errors from the deformation.



(from Chi, Talischi, Lopez-Pamies, Paulino, "Polygonal finite elements for finite elasticity." *International Journal for Numerical Methods in Engineering*, 2015)

# Elasticity modeling

The flexibility of polyhedral meshes allows greater shape deformation and more realistic stretch factors.



*Chi et al. "Polygonal finite elements for finite elasticity."*

*Talischí et al. "Gradient correction for polygonal and polyhedral finite elements."*

*International Journal for Numerical Methods in Engineering, 2015*

# Outline

- 1 Why polytopal meshes?
- 2 Wait, what is the finite element method again?**
- 3 What are some modern polytopal element methods?
- 4 Generalized barycentric coordinate methods

# The Finite Element Method: 1D

The **finite element method** is a way to numerically approximate the solution to PDEs.

**Ex:** The 1D Laplace equation: find  $u(x) \in U$  s.t.

$$\begin{cases} -u''(x) = f(x) & \text{on } [a, b] \\ u(a) = 0, \\ u(b) = 0 \end{cases}$$

*Make the problem easier by making it (seemingly) harder . . .*

**Weak form:** find  $u(x) \in U$  ( $\dim U = \infty$ ) s.t.

$$\int_a^b u'(x)v'(x) dx = \int_a^b f(x)v(x) dx, \quad \forall v \in V \quad (\dim V = \infty)$$

*. . . but we can now search a finite-dimensional space . . .*

**Discrete form:** find  $u_h(x) \in U_h$  ( $\dim U_h < \infty$ ) s.t.

$$\int_a^b u_h'(x)v_h'(x) dx = \int_a^b f(x)v_h(x) dx, \quad \forall v_h \in V_h \quad (\dim V_h < \infty)$$

# The Finite Element Method: 1D

Suppose  $u_h(x)$  can be written as linear combination of  $V_h$  elements:

$$u_h(x) = \sum_{v_i \in V_h} u_i v_i(x)$$

The discrete form becomes: find coefficients  $u_i \in \mathbb{R}$  such that

$$\sum_i \int_a^b u_i v_i'(x) v_j'(x) dx = \int_a^b f(x) v_j(x) dx, \quad \forall v_j \in \text{basis for } V_h \quad (\dim V_h < \infty)$$

Written as a linear system:

$$[\mathbb{K}]_{ji} [u]_i = [f]_j, \quad \forall v_j \in \text{basis for } V_h$$

With some functional analysis we can prove:  $\exists C > 0$ , independent of  $h$ , s.t.

$$\underbrace{\|u - u_h\|_{H^1(\Omega)}}_{\text{error between cnts and discrete solution}} \leq \underbrace{Ch \|u\|_{H^2(\Omega)}}_{\text{bound in terms of 2nd order osc. of } u}, \quad \underbrace{\forall u \in H^2(\Omega)}_{\text{holds for any } u \text{ with bounded 2nd derivs.}}$$

where  $h$  = maximum width of elements use in discretization.

# The Finite Element Method: 2D and 3D

The discrete form becomes: find coefficients  $u_i \in \mathbb{R}$  such that

$$\int_E u_i \nabla v_i \cdot \nabla v_j = \int_E f v_j, \quad \forall v_j \in \text{basis for } V_h \quad (\dim V_h < \infty)$$

We still have a linear system,  $[\mathbb{K}]_{ji} [u]_i = [f]_j$ , but the key question is:

***How do we compute the entries of the “stiffness matrix”  $\mathbb{K}$ ?***

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Two basic approaches:

- 1 Choose the basis functions  $\{v_i\}$  wisely.

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- 2 Don't.

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Two basic approaches:

- 1 Choose the basis functions  $\{v_i\}$  wisely.
- 2 Don't. That is, don't choose *any* basis functions.

# The first two polytopal element methods

## Mimetic finite differences

1960s-present

*(The “don’t choose basis functions” approach.)*

- Idea is to mimic key properties like conservation laws, symmetry of solutions, duality of variables, etc.
- ‘Straightforward’ to implement.
- Popular at Los Alamos & other national labs.
- Difficult to analyze error.

## Generalized barycentric coordinates

1970s-present

*(The “choose basis functions wisely” approach.)*

- Idea is to generalize basis functions for simple shapes to general polygons and polyhedra.
- More obstacles to implementation.
- Popular with mathematicians and computer graphics researchers.
- Easier to analyze error.

# How to not choose basis functions

Choose a solution space  $V_h$  that contains some polynomial space  $\mathcal{P}_r$ .

Let  $\Pi : V_h \rightarrow \mathcal{P}_r$  denote the  $(L^2)$ -projection to  $\mathcal{P}_r$ .

Let  $I$  be the identity operator.

Write:

$$\int_E \nabla \phi_i \nabla \phi_j = \underbrace{\int_E \nabla \Pi \phi_i \cdot \nabla \Pi \phi_j}_A + \underbrace{\int_E \nabla (I - \Pi) \phi_i \cdot \nabla (I - \Pi) \phi_j}_B$$

To compute  $A$ : an integral of two polynomials  $\implies$  can compute exactly.

To compute  $B$ : if  $\phi_i \in \mathcal{P}_r$ , then  $(I - \Pi)\phi_i = 0 \implies$  integral is 0

if  $\phi_j \in \mathcal{P}_r$ , then  $(I - \Pi)\phi_j = 0 \implies$  integral is 0

if  $\phi_i, \phi_j \notin \mathcal{P}_r \implies$  use some kind of trick to approximate.

This idea is very popular for polytopal element methods because  
*you never have to specify what the  $\phi_i$  are!*

# Outline

- 1 Why polytopal meshes?
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# A few kinds of polytopal element methods. . .

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Moreover, some kinds of \* \* \* methods are the same as \* \* \* methods. . .

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Moreover, some kinds of \*\*\* methods are the same as \*\*\* methods. . .

*“Polytopal Element Methods in Mathematics and Engineering”*

→ Special NSF-funded workshop held at Georgia Tech in Oct 2015

→ Slides from talks: <http://www.poems15.gatech.edu/>

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# The generalized barycentric coordinate approach

Choose specific  $\phi_i$  related to polygonal / polyhedral geometries, and then compute

$$\int_E \nabla \phi_i \nabla \phi_j$$

What properties should the  $\phi_i$  have?

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.

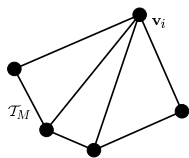
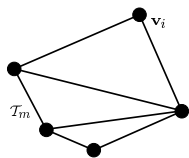
Familiar properties are implied by this definition:

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

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

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

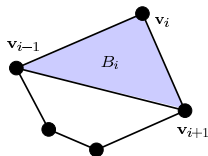
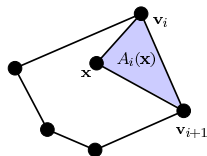
# Many generalizations to choose from ...



- **Triangulation**

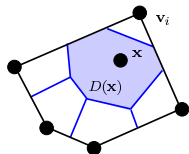
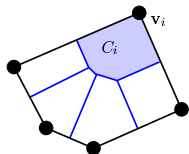
⇒ **FLOATER, HORMANN, KÓS**, *A general construction of barycentric coordinates over convex polygons*, 2006

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



- **Wachspress**

⇒ **WACHSPRESS**, *A Rational Finite Element Basis*, 1975.

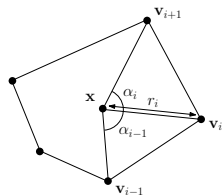


- **Sibson / Laplace**

⇒ **SIBSON**, *A vector identity for the Dirichlet tessellation*, 1980.

⇒ **HIYOSHI, SUGIHARA**, *Voronoi-based interpolation with higher continuity*, 2000.

# Many generalizations to choose from . . .



- **Mean value**

⇒ FLOATER, *Mean value coordinates*, 2003.

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

- **Harmonic**

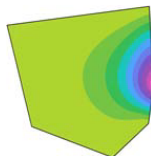
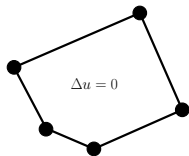
⇒ WARREN, *Barycentric coordinates for convex polytopes*, 1996.

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

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

- **Maximum Entropy** ⇒ HORMANN, SUKUMAR, *Maximum Entropy Coordinates for Arbitrary Polytopes*, 2008.

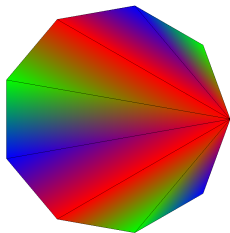
← (this figure is from the above paper)



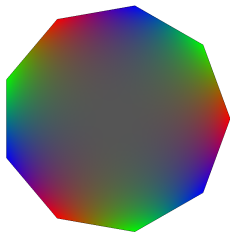
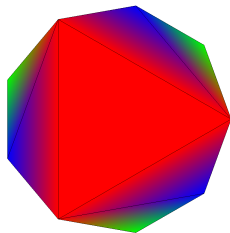
Also: moving least squares coordinates, barycentric coordinates on surfaces, . . .

# Comparison via 'eyeball' norm

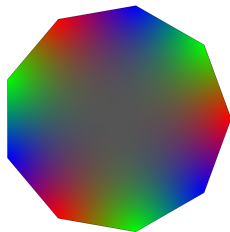
Triangulated



Triangulated



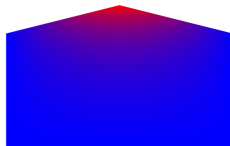
Wachspress



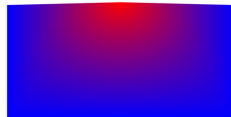
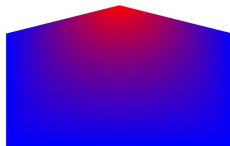
Mean Value

# Comparison via 'eyeball' norm

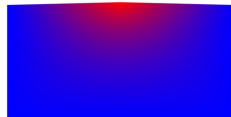
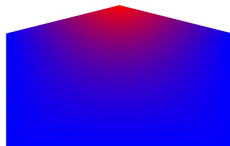
Wachspress



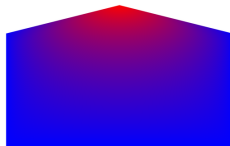
Sibson



Mean Value



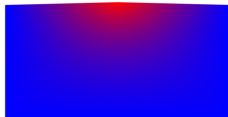
Discrete Harmonic



# Interplay of gradients and geometry



Wachspress

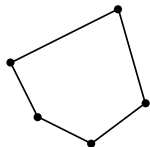


Mean Value

Choice of  $\{\phi_i\}$  + control of geometry

$\Rightarrow$  bounds on  $|\nabla\phi_i|$

$\Rightarrow$  robust computation of  $\int_E \nabla\phi_i \nabla\phi_j$



Revisiting ***a priori*** error estimates for finite element methods.

$P$ , a polygon or polytope geometry.

$u$ , a function from  $P$  to  $\mathbb{R}$ , known only at the vertices of  $P$ .

$\mathcal{I}u$ , an interpolant for  $u$  over  $P$ .

$C$ , a constant depending on the geometry of  $P$

$$\underbrace{|u - \mathcal{I}u|_{H^1(P)}}$$

error between function  
and its interpolation

$$\leq \underbrace{C \cdot \text{diam}(P)} \underbrace{|u|_{H^2(P)}} ,$$

bound depends on size  
and geometry of  $P$

$$\underbrace{\forall u \in H^2(P)}$$

estimate holds for any  $u$  with  
bounded 2nd derivatives

# The 40 year history of the triangular case

$$|u - \mathcal{I}u|_{H^1(P)} \leq C \cdot \text{diam}(P) |u|_{H^2(P)}, \quad \forall u \in H^2(P)$$

If  $P$  is a triangle, the **maximum angle condition** refers to the fact that  $C$  can be large when  $P$  has a large interior angle.

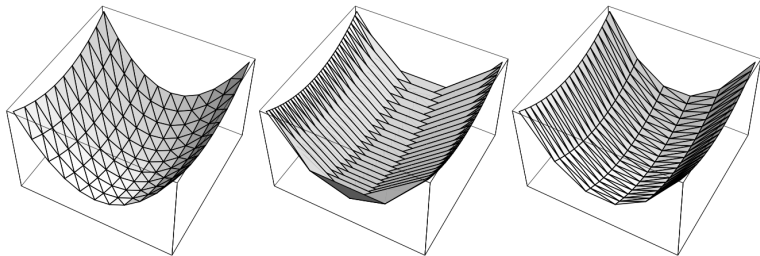


Figure from: [Shewchuk](#): What is a good linear element? *Int'l Meshing Roundtable*, 2002.

[Babuška, Aziz](#): On the angle condition in the finite element method, *SINUM*, 1976.

[Jamet](#): Estimations d'erreur pour des éléments finis. . . *RAIRO Analyse Numérique.*, 1976.

[Rippa, Schiff](#): Minimum energy triangulations for elliptic problems, *CMAME*, 1990.

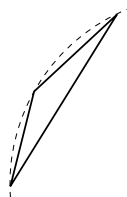
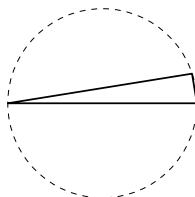
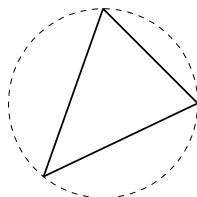
[Shenk](#): Uniform error estimates for certain narrow Lagrange finite elements, *Math. Comp.*, 1994.

[Warren et al](#): Barycentric coordinates for convex sets, *Adv. Comp. Math.*, 2007.

# The triangular case, revisited

The **aspect ratio** of a polygon  $P$  is  $\frac{\text{diam}(P)}{\text{max radius of an inscribed circle}}$ .

The **circumradius** of a triangle  $T$  is  $R_T :=$  radius of circle through the vertices of  $T$ .



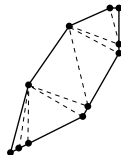
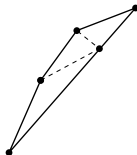
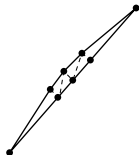
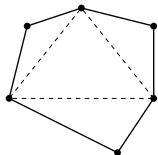
aspect ratio	small	<b>large</b>	large
circumradius	small	<b>small</b>	large
$C$	small	<b>small</b>	large

On triangles, a large aspect ratio does not necessarily imply that  $C$  is large...  
... but a large circumradius always does.

# Polygonal shape quality measures

The **aspect ratio** of a polygon  $P$  is  $\frac{\text{diam}(P)}{\max \text{ radius of an inscribed circle}}$ .

The **circumradius** of a triangle  $T$  is  $R_T :=$  radius of circle through the vertices of  $T$ .



polygon  
aspect  
ratio

good

**bad**

bad

okay?

quality  
of trian-  
gulation

good

**good**

bad

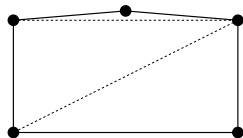
okay?

On polygons, a large aspect ratio does not correlate in a clear way with the circumradii of triangulations of its vertices

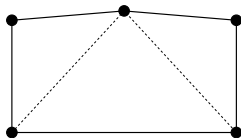
# Polygonal shape quality measures

The **aspect ratio** of a polygon  $P$  is  $\frac{\text{diam}(P)}{\text{max radius of an inscribed circle}}$ .

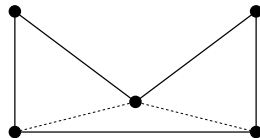
The **circumradius** of a triangle  $T$  is  $R_T :=$  radius of circle through the vertices of  $T$ .



not Delaunay  
max  $R_T$  large



Delaunay  
max  $R_T$  small

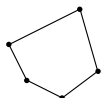


(constrained) Delaunay  
max  $R_T$  large  
(and no alternative  
triangulation possible!)

Over all possible triangulations of the vertices of a polygon, the **constrained Delaunay triangulation** will have the minimal maximum circumradius.

# Two related interpolants on polygons

The **harmonic interpolant** is the solution to


$$\begin{cases} \Delta(\mathcal{I}_P u) = 0, & \text{on } P, \\ \mathcal{I}_P u = g_u. & \text{on } \partial P. \end{cases}$$

where  $g_u : \partial\Omega \rightarrow \mathbb{R}$  is the piecewise linear function equal to  $u$  at the vertices of  $P$ .

By **Dirichlet's principle**,  $\mathcal{I}_P u$  is also the minimizer of  $H^1$  semi-norm:

$$\mathcal{I}_P u = \operatorname{argmin} \left\{ |v|_{H^1(P)} : v = g_u \text{ on } \partial P \right\}$$

The **triangulation interpolant**, denoted  $\mathcal{I}_T u$ , is the piecewise linear interpolation of  $g_u$  with respect to a triangulation  $\mathcal{T}$  of the vertices of  $P$ .

**Theorem:** There exists a constant  $C > 0$  such that for any polygon  $P$ , and all triangulations  $\mathcal{T}$  of  $P$ ,

$$|u - \mathcal{I}_T u|_{H^1(P)} \leq C \left( \max_{T \in \mathcal{T}} R_T \right) |u|_{H^2(P)}, \quad \forall u \in H^2(P),$$

where  $R_T$  denotes the circumradius of triangle  $T$ .

G., **RAND** Interpolation Error Estimates for Harmonic Coordinates On Polytopes, arXiv:1504.00599 2015.

# Sharpness of the theorem

**Theorem:**  $\exists C > 0, \forall P, \forall u \in H^2(P), \forall \mathcal{T}$  of  $P$ ,  
 $|u - \mathcal{I}_P u|_{H^1(P)} \leq C \left( \max_{T \in \mathcal{T}} R_T \right) |u|_{H^2(P)}.$

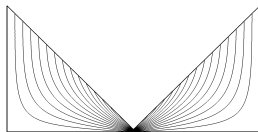
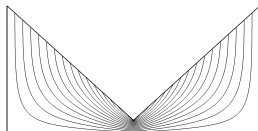
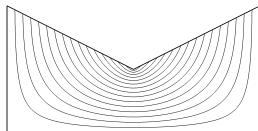
**Lemma:** Set  $u(x, y) := x^2$ .

Consider a sequence of polygon-vertex-edge tuples  $(P_i, \mathbf{v}_i, e_i)_{i=1}^\infty$ , such that  $\text{dist}(\mathbf{v}_i, e_i) \rightarrow 0$  as  $i \rightarrow \infty$  and there exists  $K > 0$  independent of  $i$ , s.t.  $d(\mathbf{v}_i, \partial e_i) > K$ .

Then regardless of the **convexity** of the  $P_i$ ,

$$\lim_{i \rightarrow \infty} \frac{|u - \mathcal{I}_{P_i} u|_{H^1(P_i)}}{|u|_{H^2(P_i)}} = \infty.$$

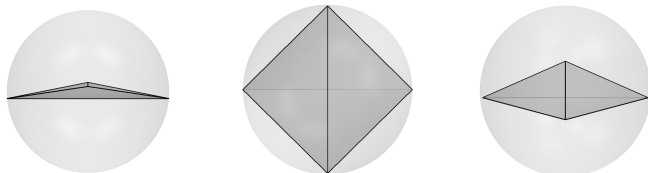
Thus, the harmonic interpolant, in general, has no sharper *a priori* estimate than estimates derived by triangulation of the domain!



# Polyhedral shape quality measures

The **aspect ratio** of a polyhedron  $P$  is  $\frac{\text{diam}(P)}{\text{max radius of an inscribed sphere}}$ .

The **circumradius** of a tetrahedron  $T$  is  $R_T := \text{radius of sphere through vertices of } T$ .



**Sliver tetrahedra** have poor interpolation properties ( $C$  is large), but their circumradii are not necessarily large. Thus, a direct analogue of the theorem to 3D is not possible.

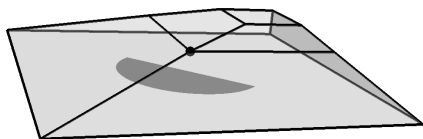
# Conclusions for polyhedra

**Theorem:** Fix  $\gamma > 2$ . There exists a constant  $C > 0$  depending only on  $\gamma$  such that for any polyhedron  $P$  with aspect ratio less than  $\gamma$ ,

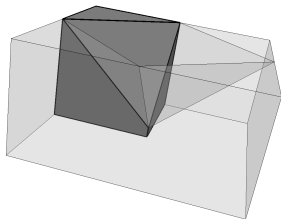
$$|u - \mathcal{I}_P u|_{H^1(P)} \leq C \operatorname{diam}(P) |u|_{H^2(P)}, \quad \forall u \in H^2(P).$$

**Convex element:** The  $H^1$ -error in the harmonic interpolant cannot be bounded if a vertex can be arbitrarily close to a non-adjacent face.

**Non-convex element:** The  $H^1$ -error in the harmonic interpolant can remain bounded, even when a vertex and non-adjacent face are close.



convex



non-convex

# Acknowledgments



THE UNIVERSITY  
OF ARIZONA®

Alexander Rand    CD-adapco

Thanks for the invitation to speak!

Slides and pre-prints: <http://math.arizona.edu/~agillette/>