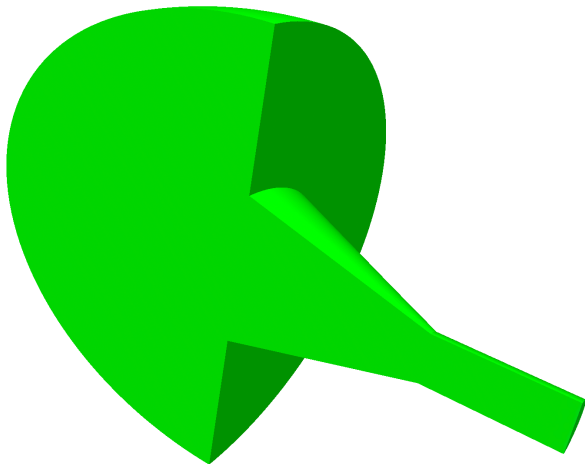


Shape Optimization for Geometrically Inverse Problems

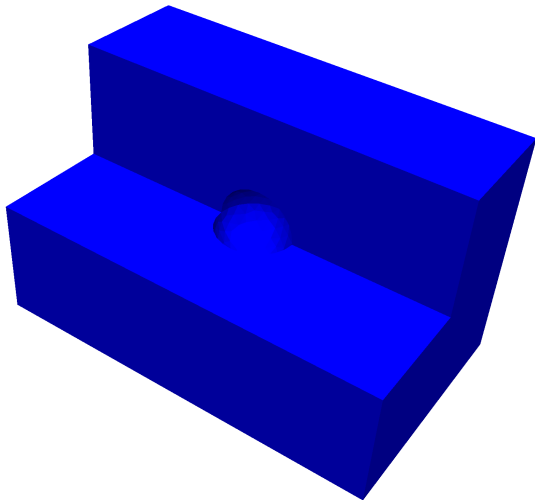
Stephan Schmidt

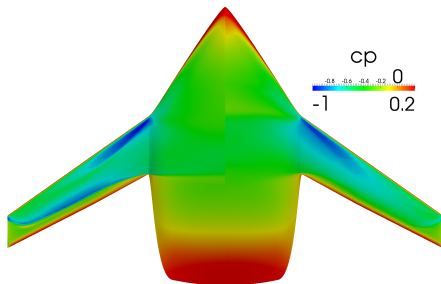
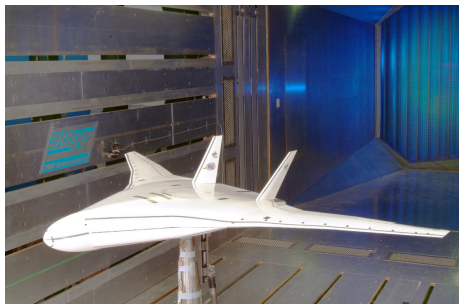
14 October 2019



- General problem formulation allows treatment of general problems
- Design of acoustic (linear wave) horn antenna, $3.5 \cdot 10^9$ unknowns!

Maxwell Scattering Problem (joint with M. Schütte, O. Ebel, A. Walther)





Design study for blended wing-body configurations

- Transonic Inviscid Incompressible CFD
- **> 460,000** surface node positions to be optimized
- Planform constant

Geometric Inverse Problem

$$\min_{(\varphi, \Gamma_{\text{inc}})} J(\varphi, \Omega) := \frac{1}{2} \int_0^T \int_{\Gamma_{i/o}} \|B(n)(\varphi - \varphi_{\text{meas}})\|_2^2 dt ds + \delta \int_{\Gamma_{\text{inc}}} 1 ds$$

subject to

$$\dot{\varphi} + \operatorname{div} F(\varphi) = 0 \quad \text{in } \Omega$$

$$\text{BCs} = g \quad \text{on } \Gamma$$

Acoustics:

$$\frac{\partial u}{\partial t} + \nabla p = 0 \quad \text{in } \Omega,$$

$$\frac{\partial p}{\partial t} + c^2 \operatorname{div} u = 0 \quad \text{in } \Omega,$$

$$\frac{1}{2}(p - c\langle u, n \rangle) = g \quad \text{on } \Gamma_{i/o}$$

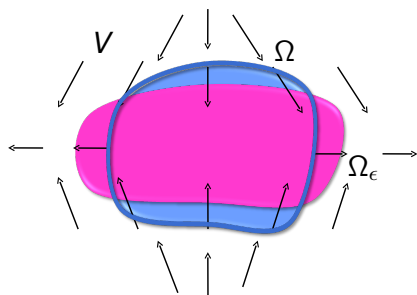
Electromagnetism:

$$\mu \frac{\partial H}{\partial t} = -\nabla \times E \quad \text{in } \Omega,$$

$$\varepsilon \frac{\partial E}{\partial t} = \nabla \times H - \sigma E \quad \text{in } \Omega,$$

$$\text{BCs} = g \quad \text{on } \Gamma_{i/o}$$

Introduction to Shape Optimization



- Directional Derivative

- Shape is modeled by set Ω
- $\Omega_\epsilon := \{x + \epsilon V(x) : x \in \Omega\} \subset \mathcal{D}$
- $J : \mathcal{P}(\mathcal{D}) \rightarrow \mathbb{R}$: target function
- (Directional) derivative of J with respect to Ω ?

$$dJ(\Omega)[V] := \lim_{\epsilon \rightarrow 0^+} \frac{J(\Omega_\epsilon) - J(\Omega)}{\epsilon}$$

The Shape Derivative

- Objective function:

$$J_1(\epsilon, \Omega) := \int_{\Omega(\epsilon)} f(\epsilon, x_\epsilon) \, dx_\epsilon \quad \text{or} \quad J_2(\epsilon, \Omega) := \int_{\Gamma(\epsilon)} g(\epsilon, s_\epsilon) \, ds_\epsilon$$

- Take Limit:

$$dJ_1(\Omega)[V] = \left. \frac{d}{d\epsilon} \right|_{\epsilon=0} \int_{\Omega(\epsilon)} f(\epsilon, x_\epsilon) \, dx_\epsilon \quad \text{or} \quad dJ_2(\Omega)[V] = \left. \frac{d}{d\epsilon} \right|_{\epsilon=0} \int_{\Gamma(\epsilon)} g(\epsilon, s_\epsilon) \, ds_\epsilon$$

- Change of Variables = Change in Domain

$$dJ_1(\Omega)[V] = \int_{\Omega} \left. \frac{d}{d\epsilon} \right|_{\epsilon=0} \left[f(\epsilon, T_\epsilon(x)) \cdot |\det DT_\epsilon(x)| \right] dx$$

$$dJ_2(\Omega)[V] = \int_{\Gamma} \left. \frac{d}{d\epsilon} \right|_{\epsilon=0} \left[g(\epsilon, T_\epsilon(s)) \cdot |\det DT_\epsilon(s)| \cdot \|(DT_\epsilon(s))^{-T} n(s)\|_2 \right] ds$$

The Shape Derivative (Weak vs Strong)

- Material Derivative: $df[V] := \frac{d}{d\epsilon} \Big|_{\epsilon=0} f(\epsilon, T_\epsilon(x)) = \langle \nabla f, V \rangle + f'[V]$
- Local / Shape Derivative: $f'(x)[V] := \frac{\partial}{\partial \epsilon} f(0, x)$

$$\begin{aligned} dJ_1(\Omega)[V] &= \int_{\Omega} f(0, x) \operatorname{div}(V) + \frac{d}{d\epsilon} \Big|_{\epsilon=0} f(\epsilon, T_\epsilon(x)) \, dx \\ &= \int_{\Omega} f \operatorname{div} V + df[V] \, dx \quad (\text{Weak/Volume/Distributed Formulation}) \\ &= \int_{\Omega} \operatorname{div}(fV) + f'[V] \, dx = \int_{\Gamma} \langle V, n \rangle f \, ds + \int_{\Omega} f'[V] \, dx \quad (\text{Surface Formulation}) \end{aligned}$$

$$\begin{aligned} dJ_2(\Omega)[V] &= \int_{\Gamma} g \operatorname{div}_{\Gamma} V + dg[V] \, ds \quad (\text{Weak/Volume/Distributed Formulation}) \\ &\stackrel{V \text{ normal}}{=} \int_{\Gamma} \operatorname{div}_{\Gamma}(gV) + \langle V, n \rangle \frac{\partial g}{\partial n} + g'[V] \, ds \\ &= \int_{\Gamma} \langle V, n \rangle \left[\frac{\partial g}{\partial n} + \kappa g \right] + g'[V] \, ds \end{aligned}$$

- if f or g is “glued to mesh” (i.e. FEM function), then $df[V] = f'[V]$.
- if f or g is “fixed w.r.t. V ”, then $f'[V] = 0$.
- Material derivative typically same regularity as state (Berggren, 2010)
- Correction terms make surface formulation exact (Berggren, 2010)

Dido's Problem

Find shape of maximum volume for given surface:

$$\max_{\Omega} J(\Omega) := \int_{\Omega} 1 \, dx$$

s.t.

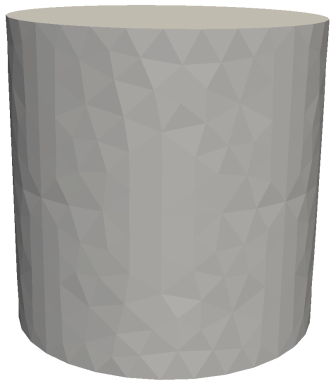
$$\int_{\Gamma} 1 \, ds = A_0$$

Lagrangian:

$$F(\Omega, \lambda) = \int_{\Omega} -1 \, dx + \lambda \left(\int_{\Gamma} 1 \, ds - A_0 \right)$$
$$dF(\Omega, \lambda)[V] = \int_{\Gamma} \langle V, n \rangle [-1 + \lambda \kappa] \, ds \stackrel{!}{=} 0 \quad \forall V$$

Because $\lambda \in \mathbb{R}$: $\kappa = \frac{1}{\lambda} \in \mathbb{R}$. Thus, curvature constant!
Optimality fulfilled by sphere!!

Dido's Problem (Gradient Descent + Newton)



Regularization, Approximate Newton, H^1 -Descent

Shape-descent in H^1 / Sobolev Gradient Method / Approximate Newton can all be motivated by surface area penalization:

$$R(\Gamma) = \int_{\Gamma} 1 \, d\mathbf{s}$$

Then:

$$dR(\Gamma)[V] = \int_{\Gamma} \langle V, n \rangle \kappa \, d\mathbf{s} \quad \text{Curvature Flow, Minimal Surface}$$

$$d^2R(\Gamma)[V, W] = \int_{\Gamma} \langle \nabla_{\Gamma} \langle V, n \rangle, \nabla_{\Gamma} \langle W, n \rangle \rangle + \langle V, n \rangle \langle W, n \rangle \kappa^2 \, d\mathbf{s}$$

Shape Linearization of General Conservation Law

Hyperbolic PDE:

$$\dot{\varphi} + \operatorname{div} F(\varphi) = 0$$

Find $\varphi'[V]$ such that

$$\begin{aligned} 0 &= \int_0^T \int_{\Gamma} \langle V, n \rangle [\langle \lambda, \dot{\varphi} \rangle - \langle F(\varphi), \nabla \lambda \rangle] \, d\mathbf{s} \, dt \\ &+ \int_0^T \int_{\Gamma} \langle V, n \rangle [\langle \nabla(\lambda \cdot F_b^*(\varphi, n)), n \rangle \\ &\quad + \kappa (\lambda \cdot F_b^*(\varphi, n) - D_n(\lambda \cdot F_b^*(\varphi, n)) \cdot n) + \operatorname{div}_{\Gamma} (D_n^T(\lambda \cdot F_b^*(\varphi, n)))] \, d\mathbf{s} \, dt \\ &+ \int_0^T \int_{\Omega} \langle \lambda, \dot{\varphi}'[V] \rangle - \langle DF(\varphi)\varphi'[V], \nabla \lambda \rangle \, dx \, dt + \int_0^T \int_{\Gamma} \langle \lambda, D_{\varphi} F_b^*(\varphi, n)\varphi'[V] \rangle \, d\mathbf{s} \, dt \end{aligned}$$

(Existence Results: Cagnol/ Eller/Marmorat/Zolésio):

Adjoint Equation

Adjoint equation can be read from the shape-linearized equation: Find λ such that

$$\begin{aligned} 0 &= \int_0^T \int_{\Omega} \langle -\dot{\lambda}, \varphi'[V] \rangle - \langle \varphi'[V], D^T F(\varphi) \nabla \lambda \rangle \, dx \, dt \\ &+ \int_0^T \int_{\Gamma} \langle \varphi'[V], D_{\varphi}^T F_b^*(\varphi, n) \cdot \lambda \rangle \, ds \, dt \\ &+ \int_0^T \int_{\Gamma_{i/o}} \langle B^T(n) B(n) \cdot (\varphi - \varphi_{\text{meas}}), \varphi'[V] \rangle \, ds \, dt \end{aligned}$$

\Rightarrow Flux for adjoint can be read: $D_{\varphi}^T F^*(\varphi, n) \cdot \lambda$

Shape Derivative for Tomography Problems

Maxwell (Existence Results: Cagnol/ Eller/Marmorat/Zolésio):

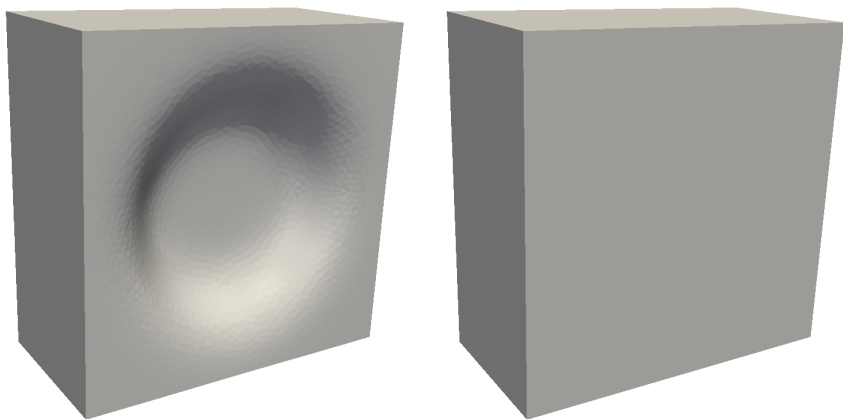
$$\begin{aligned} & dJ(H, E, \Omega)[V] \\ &= \int_0^T \int_{\Gamma_{\text{inc}}} \langle V, n \rangle \left[\langle \lambda_H, \dot{H} \rangle + \frac{1}{\mu} \langle E, \text{curl } \lambda_H \rangle + \langle \lambda_E, \dot{E} \rangle - \frac{1}{\epsilon} \langle H, \text{curl } \lambda_E \rangle + \frac{\sigma}{\epsilon} \langle \lambda_E, E \rangle \right] ds dt \\ &+ \int_0^T \int_{\Gamma_{\text{inc}}} \langle V, n \rangle \text{div} (Zc(H \times \lambda_E)) ds dt \end{aligned}$$

Horn/Linear Wave:

$$\begin{aligned} dJ(u, p, \Omega)[V] &= \int_0^T \int_{\Gamma_{\text{horn}}} \langle V, n \rangle \left[\langle \lambda_u, \dot{u} \rangle - p \text{div } \lambda_u + \lambda_p \dot{p} - c^2 \langle u, \nabla \lambda_p \rangle \right] ds dt \\ &+ \int_0^T \int_{\Gamma_{\text{horn}}} \langle V, n \rangle \text{div} (c^2 \lambda_p \cdot u) ds dt \end{aligned}$$

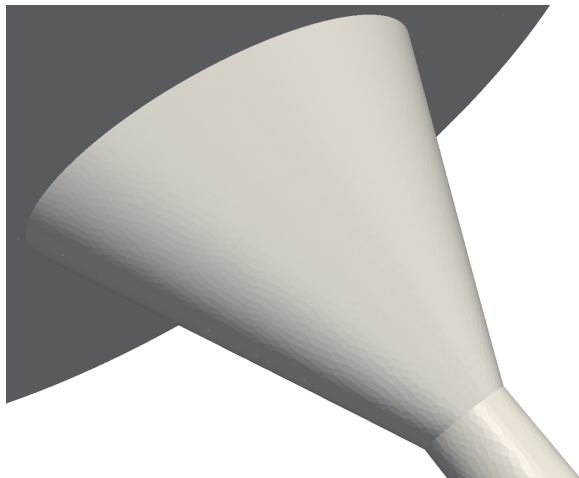
“Backwards in time” adjoint equations for (λ_H, λ_E) and (λ_u, λ_p)

Obstacle Without Antenna



- 4.1 – 12.3 Ghz SINC-puls
- 2.4 – 7.3 cm waves, 3.65 cm obstacle

Optimal Emitter for Acoustics

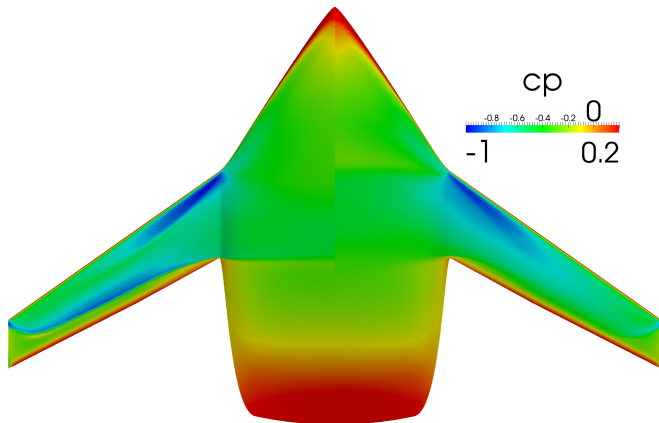


Boundary Data Compression:

$3.5 \cdot 10^9$ unknowns: 26 TB to 3.26 GB, 3 Months on 48 CPUs

(S., Wadbro, Berggren, 2016)

3D Euler Flow: VELA



Shape	C_D	%	C_L	%
460,517	$3.342 \cdot 10^{-3}$	-30.06%	$1.775 \cdot 10^{-1}$	-0.67%

DLR Flow Solver TAU for primal and adjoint equation

$$d^2 J_1[V, W] = \int_{\Omega} f \operatorname{div} V \operatorname{div} W - f \operatorname{tr}(D V D W) \\ + d f[V] \operatorname{div} W + d f[W] \operatorname{div} V + d^2 f[V, W] \, d x$$

- Material and Spatial Derivatives do not commute:

$$d(Df)[V] = Ddf[V] - DfDV$$

- Excessively long expressions with normal, curvature or PDEs
- Typically rank deficient

Incompressible CFD

cooling and tidal turbine placement

$$\min_{(u,p,\Omega)} E_{NS}(u, p, \Omega) := \frac{1}{2} \int_{\Omega} \mu \sum_{j,k=1}^3 \left(\frac{\partial u_k}{\partial x_j} \right)^2 dA$$

subject to

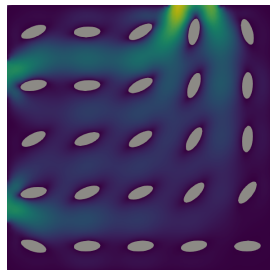
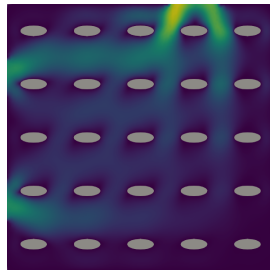
$$-\mu \Delta u + \rho u \nabla u + \nabla p = 0 \quad \text{in } \Omega$$

$$\operatorname{div} u = 0$$

$$u = u_+ \quad \text{on } \Gamma_+$$

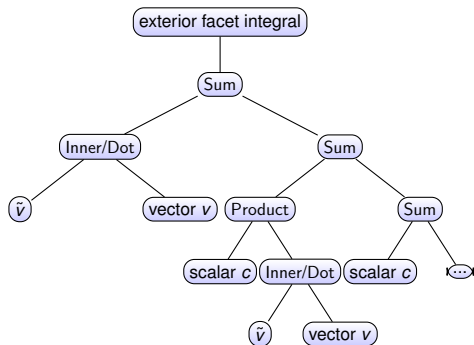
$$u = 0 \quad \text{on } \Gamma_0$$

$$pn - \mu \frac{\partial u}{\partial n} = 0 \quad \text{on } \Gamma_-$$



FEM-Multimesh Implementation

Automatic Shape Derivatives in FEniCS/UFL



- Change expression into “maximally expanded form”
- Sort all sums closest to integral
- Apply rules to each sub-branch
- Pattern Recognition Problems
- Argument UFL derivatives in dolfin-adjoint/pyadjoint with release 2018.1

Freely Available: www.bitbucket.org/Epoxid/femorph

Weak Navier–Stokes Shape Derivative

Optimality:

$$0 = \int_{\Omega} \|\nabla u\|^2 \operatorname{div} V + 2\langle (DV)^T \nabla u, \nabla u \rangle - \mu \langle (DV)^T \nabla u, \nabla \lambda^u \rangle \\ - \mu \langle \nabla u, (DV)^T \nabla \lambda^u \rangle - \rho \langle \lambda^u, DuDVu \rangle + p \operatorname{tr}(D\lambda^u DV) - \lambda^p \operatorname{tr}(DuDV) \, dx$$

Use adjoint to eliminate material derivatives: Find (λ^u, λ^p) such that:

$$0 = \int_{\Omega} 2\langle \nabla(du), \nabla u \rangle + \mu \langle \nabla(du), \nabla \lambda^u \rangle + \rho[\langle \lambda^u, D(du)u \rangle + \langle \lambda^u, Du \cdot du \rangle] \\ - dp \cdot \operatorname{div} \lambda^u + \lambda^p \operatorname{div} du \, dx, \quad \text{for all } (du, dp) \text{ and Dirichlet BCs}$$

Not shown: Volume and Centroid, Hessian (MUCH too long)

See also:

- (Yang, Stadler, Moser, Ghattas (2011))
- (Brandenburg, Lindemann, Ulbrich, Ulbrich (2012))

SQP Strategy

- Build the full KKT-System (state + shape + adjoint)
- No approximations

Volume Hessian has large Kernel:

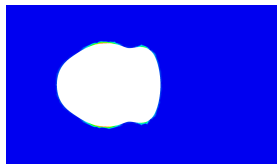
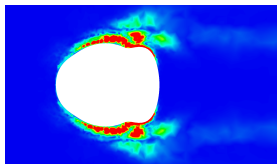
- SQP: Find W , such that

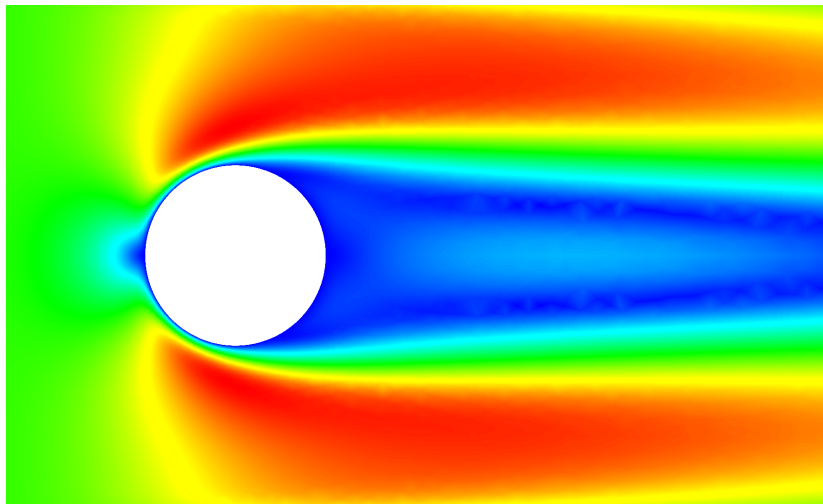
$$KKT(V, W, \dots) + \langle V, W \rangle_{\Omega} + 0.1 \langle \nabla V, \nabla W \rangle_{\Omega} = dL(V, \dots)$$

- Testfunction: V , Trialfunction W
- KKT and dL generated with automatic symbolic calculation

Mesh Defo:

- Boundary trace of W as Dirichlet BC in Laplace mesh deformation
- Inexact PDE \Rightarrow Spurious volume movement (One Shot)





Validation of the Hessian: (joint with J. Dokken, SIMULA)

Numerical tests have shown that for certain types of integrals, the Taylor expansion can be truncated after the Hessian with no error!!

Validation of the Hessian: (joint with J. Dokken, SIMULA)

Numerical tests have shown that for certain types of integrals, the Taylor expansion can be truncated after the Hessian with no error!!

Suppose $df[V] = 0$. Then, in 1D:

$$\begin{aligned}d^2 J(\Omega)[V, W] &= \int_{\Omega} \operatorname{div} V \operatorname{div} W - \operatorname{tr}(DV DW) \, dx \\ &= \int_{\Omega} \frac{\partial V}{\partial x} \frac{\partial W}{\partial x} - \frac{\partial V}{\partial x} \frac{\partial W}{\partial x} \, dx = 0 \quad \forall V, W\end{aligned}$$

What about 2D?

3rd order shape derivative:

$$\begin{aligned} & d^3 J(\Omega)[V, W, X] \\ &= \int_{\Omega} f \operatorname{div} V \operatorname{div} W \operatorname{div} X - f \operatorname{tr}(DV DX) \operatorname{div} W - f \operatorname{tr}(DW DX) \operatorname{div} V \\ &\quad + f \operatorname{tr}(DV DX DW + DV DW DX) \\ &\quad + df[V] \operatorname{div} W \operatorname{div} X + df[W] \operatorname{div} V \operatorname{div} X + df[X] \operatorname{div} V \operatorname{div} W \\ &\quad - df[X] \operatorname{tr}(DV DW) - df[V] \operatorname{tr}(DW DX) - df[W] \operatorname{tr}(DV DX) \\ &\quad + d^2 f[V, X] \operatorname{div}(W) + d^2 f[W, X] \operatorname{div}(V) + d^2 f[V, W] \operatorname{div}(X) + d^3 f[V, W, X] dx \end{aligned}$$

Suppose $df[V] = 0$. Then what?

3rd Derivative in 2D is Zero

$$\begin{aligned}\operatorname{tr}(DA DB)\operatorname{div} C &= \left(\frac{\partial a_1}{\partial x_1} \frac{\partial b_1}{\partial x_1} + \frac{\partial a_1}{\partial x_2} \frac{\partial b_2}{\partial x_1} + \frac{\partial a_2}{\partial x_1} \frac{\partial b_1}{\partial x_2} + \frac{\partial a_2}{\partial x_2} \frac{\partial b_2}{\partial x_2} \right) \left(\frac{\partial c_1}{\partial x_1} + \frac{\partial c_2}{\partial x_2} \right) \\ &= \frac{\partial a_1}{\partial x_1} \frac{\partial b_1}{\partial x_1} \frac{\partial c_1}{\partial x_1} + \frac{\partial a_1}{\partial x_1} \frac{\partial b_1}{\partial x_1} \frac{\partial c_2}{\partial x_2} + \frac{\partial a_1}{\partial x_2} \frac{\partial b_2}{\partial x_1} \frac{\partial c_1}{\partial x_1} + \frac{\partial a_1}{\partial x_2} \frac{\partial b_2}{\partial x_1} \frac{\partial c_2}{\partial x_2} \\ &\quad + \frac{\partial a_2}{\partial x_1} \frac{\partial b_1}{\partial x_2} \frac{\partial c_1}{\partial x_1} + \frac{\partial a_2}{\partial x_1} \frac{\partial b_1}{\partial x_2} \frac{\partial c_2}{\partial x_2} + \frac{\partial a_2}{\partial x_2} \frac{\partial b_2}{\partial x_2} \frac{\partial c_1}{\partial x_1} + \frac{\partial a_2}{\partial x_2} \frac{\partial b_2}{\partial x_2} \frac{\partial c_2}{\partial x_2}\end{aligned}$$

Sum up all similar terms... get zero!

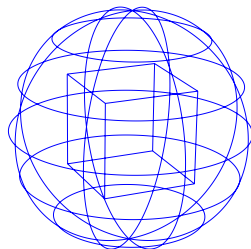
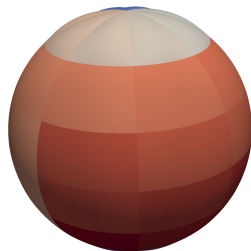
Proposition:

If the material derivatives vanish, then the $n + 1$ directional shape derivative in n -dimensions is always zero.

Example:
Geoelectrical Impedance Tomography:

$$\begin{aligned} \text{Minimize} \quad & \frac{1}{2} \sum_{i=1}^r \int_{\Gamma_2} |u_i - z_i|^2 ds + \beta R(\Gamma_1) \\ \text{s.t.} \quad & \begin{cases} -\Delta u_i = 0 & \text{in } \Omega, \\ \frac{\partial u_i}{\partial n} = 0 & \text{on } \Gamma_1, \\ \frac{\partial u_i}{\partial n} + \alpha u_i = f_i & \text{on } \Gamma_2 \end{cases} \end{aligned}$$

- z_i given measurement data
- Previously:
 R surface area:
Laplace Smoothing/Curvature Flow
- **Idea:** Regularization to favor kinks
- **Idea:** Total Variation of the Normal!



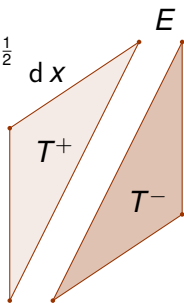
Total Variation for Surfaces and Manifold S^2

Classical Total Variation:

$$|u|_{TV(\Omega)} := \int_{\Omega} \|\nabla u\|_2 \, dx = \int_{\Omega} \left(\|(Du) e_1\|^2 + \|(Du) e_2\|^2 \right)^{\frac{1}{2}} \, dx$$

$$|u|_{DTV(\Omega)} := \sum_T \int_T \|\nabla u\|_2 \, dx + \sum_E \int_E \|[[u]]\| \, ds$$

$$\stackrel{r \equiv 0}{=} \sum_E |E| |u^+ - u^-|$$



New difficulty here: Γ is a manifold and n maps to S^2

$$|n|_{TV(\Gamma)} := \int_{\Gamma} \left(\|(D_{\Gamma} n) \xi_1\|_{\mathfrak{g}}^2 + \|(D_{\Gamma} n) \xi_2\|_{\mathfrak{g}}^2 \right)^{1/2} \, ds$$

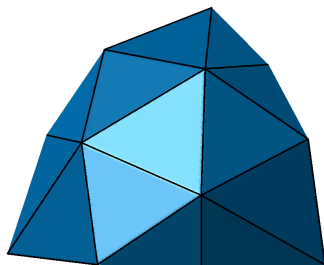
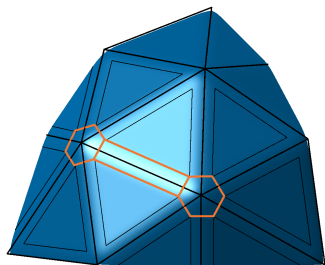
$$|n|_{DTV(\Gamma)} := \sum_E |E| d(n_E^+, n_E^-) = \sum_E |E| \left| \log_{n_E^+} n_E^- \right|_2$$

Properties of $|n|_{TV(\Gamma)}$ and $|n|_{DTV(\Gamma)}$

Let $\{\Gamma_\varepsilon\}$ denote a family of smooth approximations of Γ_h obtained by mollification, with normal vector fields n_ε . Then

$$|n_\varepsilon|_{TV(\Gamma_\varepsilon)} \rightarrow |n|_{DTV(\Gamma_h)} \quad \text{as } \varepsilon \searrow 0.$$

Proof: Utilize different convergence orders for edges and vertex caps



Properties of $|n|_{TV(\Gamma)}$ and $|n|_{DTV(\Gamma)}$

Properties of $|n|_{TV(\Gamma)}$:

Spheres are stationary points among all surfaces Γ of constant area.

Proof: By construction: Derive shape derivative and use that integrand is spatially constant on a sphere

Properties of $|n|_{TV(\Gamma)}$ and $|n|_{DTV(\Gamma)}$

Properties of $|n|_{TV(\Gamma)}$:

Spheres are stationary points among all surfaces Γ of constant area.

Proof: By construction: Derive shape derivative and use that integrand is spatially constant on a sphere

Properties of $|n|_{DTV(\Gamma)}$:

The icosahedron and the cube with crossed diagonals are stationary points within the class of triangulated surfaces Γ_h of constant area and identical connectivity.

Proof: By construction

Bergmann, Herrmann, Herzog, Schmidt, Vidal-Núñez (in review)



Sketch of Proof for Continuous Case

Same strategy as with Dido's Problem:

$$g(\varepsilon, s_\varepsilon) = \left(\kappa_{1,\varepsilon}^2(s_\varepsilon) + \kappa_{2,\varepsilon}^2(s_\varepsilon) \right)^{\frac{1}{2}} = \left(|(D_\Gamma n_\varepsilon) \xi_{1,\varepsilon}|_{\mathfrak{g}}^2 + |(D_\Gamma n_\varepsilon) \xi_{2,\varepsilon}|_{\mathfrak{g}}^2 \right)^{\frac{1}{2}}$$

Shape/Material derivative:

$$g'[V] \stackrel{\text{tangent argument}}{=} dg[V] = \frac{1}{g(s)} \sum_{i=1}^2 g((D_\Gamma n) \xi_i, d[(D_\Gamma n) \xi_i][V])$$

Tangents with Gram-Schmidt:

$$d \xi_1[V] = (DV) \xi_1 - (\xi_1^\top (DV) \xi_1) \xi_1$$

$$d \xi_2[V] = (DV) \xi_2 - (\xi_2^\top (DV) \xi_2) \xi_2 - (\xi_1^\top (DV + DV^\top) \xi_2) \xi_1.$$

$$\text{On sphere: } g(s) = (\kappa_1^2(s) + \kappa_2^2(s))^{\frac{1}{2}} = \frac{\sqrt{2}}{r}$$

Shape Derivative Lagrangian with tangential Stokes:

$$d \mathcal{L}(0, \lambda)[V] = \left[\frac{2}{r} \left(\frac{1}{\sqrt{2}r} + \lambda \right) \right] \int_{\Gamma} \langle V, n \rangle ds$$

ADMM Optimization for $|n|_{DTV(\Gamma)}$

Not (shape-) differentiable:

$$\min_{\Gamma} \frac{1}{2} |u(\Gamma) - z|_2^2 + \beta |n|_{DTV(\Gamma)}$$

Idea: ADMM: Solve independently for Γ , d and b

$$\min_{\Gamma, d} \frac{1}{2} |u(\Gamma) - z|_2^2 + \beta \sum_E |E| |d_E|_2 + \frac{\lambda}{2} \sum_E |E| \left| d_E - \log_{n_E^+} n_E^- - b_E \right|_2^2$$

- Γ -problem: smooth shape problem, adjoint calculus
- Parallel transport: $b_E \in \mathcal{T}_{n_E^+} \mathcal{S}^2$

• d -problem:

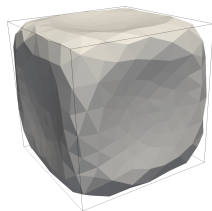
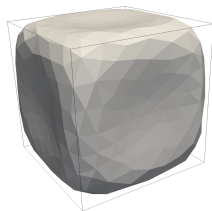
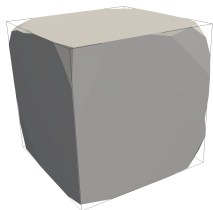
$$d_E = \text{shrink}(b_E + \log_{n_E^+} n_E^-, \frac{\beta}{\lambda})$$

• b -update:

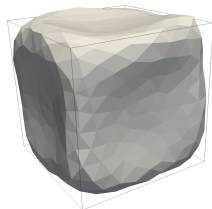
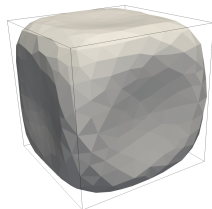
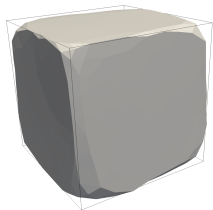
$$b_E := b_E + \log_{n_E^+} n_E^- - d_E$$

Geoelectric Reconstruction of a Cube

noise
free



input
noise

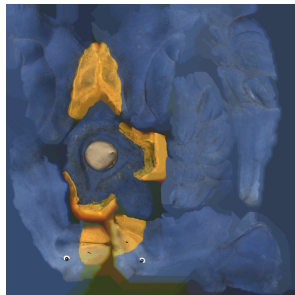
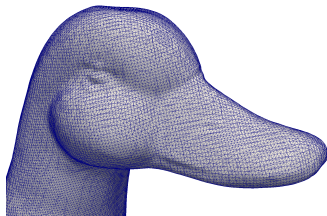
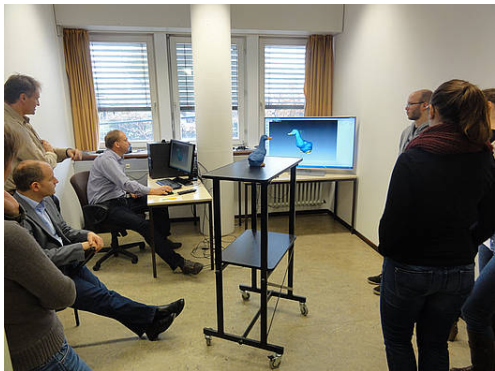


$$|n|_{DTV(\Gamma)} \\ \beta = 10^{-6}$$

$$\text{perimeter} \\ \beta = 5 \cdot 10^{-5}$$

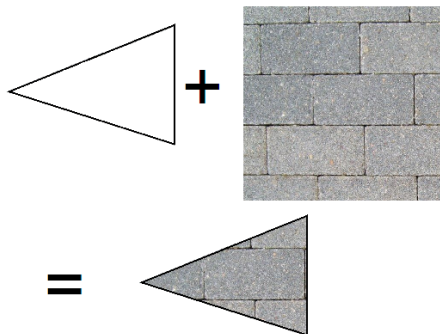
$$\text{perimeter} \\ \beta = 2 \cdot 10^{-5}$$

Fully integrated DG-Suite



3D Scan \Rightarrow FEM/DG/Optimization
(FEniCS) \Rightarrow 3D Print

FEM vs Computer Graphics



(Source: Wikipedia)

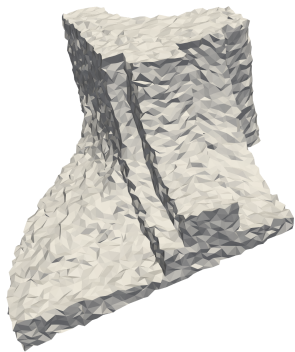
Computer Graphics:

Texture Mapping: Multiple Pixels per Triangle on Surface

Here:

- Convert Geometry + Texture (Bitmap) to DG-FEM on Surface
- Information in Higher Order or Refinement!

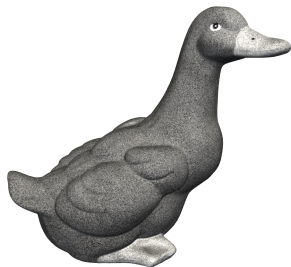
Common 3D Scan Problems



Noisy Geometry:
Tracking Term



Missing Geometry:
Subdomain

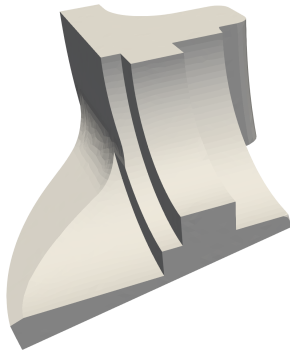


Noisy/Missing Textures:
No shape, different
manifold

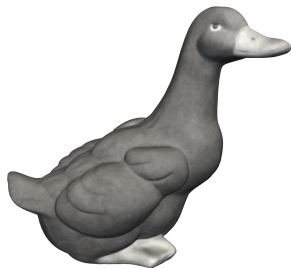
Common 3D Scan Problems: Results



Noisy Geometry



Missing Geometry



Noisy/Missing Textures

Conclusions and Outlook

- Inverse Problems and Surfaces with Kinks!
- Optimization for Variable Geometries and HPC
- 1st, 2nd and 3rd order Shape Derivatives
- $|n|_{TV(\Gamma)}$ and $|n|_{DTV(\Gamma)}$
non-smooth reconstructions

