

Numerical methods for some interface problems

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Thanks to the workshop organizers

Graphics available in the past papers.

Motivation: complex morphological
patterns in cells and membranes

Models: PDEs on surfaces

Studies of multi-component vesicle and membrane mediated protein interaction motivate the development of numerical methods for PDEs (nonlinear diffusion, phase transition models, ...) on:

- a) surfaces (prescribed)
- b) deforming/evolving surfaces (under surface tension, bending energies ...)

Outline:

Finite Volume/Finite Element methods for some PDEs on prescribed surfaces

- explicit surface approximation
- special CVT/CVDT meshes
- spheres, 4-th order equations

Diffuse-interface/Phase-field models for deforming/evolving surfaces

- implicit surface representation
- elastic bending energy models
- adaptive methods

Details can be found at www.math.psu.edu/qdu/Res

Finite volume methods for PDEs on prescribed surfaces

We started with methods for 2nd order PDEs on the **sphere**, taking advantage of the **spherical Centroidal Voronoi Tessellations (SCVT)** and their dual Delaunay Triangulations (CVDT):

Du-Gunzburger-Ju (2003) *Voronoi-based FVMs, optimal Voronoi meshes, and PDEs on the sphere*. Comput. Meth. Appl. Mech. Engrg

Du-Ju (2005), *FVM on spheres & SCVT meshes*, SIAM J. Numer. Anal.

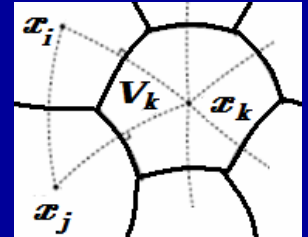
Du-Ju (2005) *Approximations of a Ginzburg-Landau model for superconducting hollow spheres based on SCVT*. Math. Comp.

Properties shown: discrete **gauge invariance**, discrete **maximum principle**, optimality, **superconvergence**, ...

Finite volume methods for PDEs on surfaces

Spherical **Centroidal Voronoi Tessellation**:

VT with generators = mass centers of Voronoi regions constrained (projected) on the sphere



Du-Gunzburger-Ju (2003) *Constrained CVTs for surfaces*, SIAM J. Sci. Comp

$$\bar{x}_k \int_{V_k} \rho(x) = \int_{V_k} x \rho(x)$$

+

$$\bar{x}_k - x_k = O(h^2)$$

$$\rho = 1/4\pi R^2$$

$$\longrightarrow \psi(x_k) \int_{V_k} \rho(x) - \int_{V_k} \psi(x) \rho(x) = O(h^4)$$

$\rho = \rho(x)$: a given smooth density, $\psi = \psi(x)$: any smooth function

Numerical methods for high order PDEs on surfaces

For general surfaces, we also studied the mixed FVM/FEM for linear and nonlinear 4th-order PDEs:

Du-Ju-Tian(2009) *Analysis of a mixed FV discretization of 4th-order equations on general surfaces*, IMA Numerical Analysis

Du-Ju-Tian (2009) *FE Approximation of Cahn-Hilliard on surfaces*

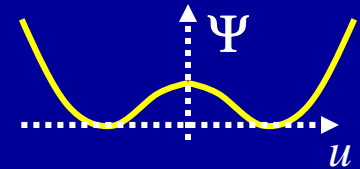
4th order PDEs \longrightarrow systems of 2nd order PDEs

The numerical analysis for FVM followed closely from earlier works on numerical PDEs on surfaces, such as,

G. Dziuk (1988) : FEM for Bertrami. Dziuk-Elliott (2007): surface FEM

Eg: FEM for Cahn-Hilliard on surfaces

$$u_t = \Delta_s p = \Delta_s (\Psi'(u) - \sigma \Delta_s u)$$



$$\left\{ \begin{array}{l} ((U_{n+1}^h - U_n^h)/k, V^h)_{s_h} + (\nabla_{s_h} P_n^h, \nabla_{s_h} V^h)_{s_h} = 0, \\ -(P_n^h, W^h)_{s_h} + \sigma (\nabla_{s_h} (U_{n+1}^h + U_n^h)/2, \nabla_{s_h} W^h)_{s_h} \\ \quad + (g(U_n^h, U_{n+1}^h), W^h)_{s_h} = 0. \end{array} \right.$$

$$g(x, y) = \frac{\Psi(x) - \Psi(y)}{x - y}$$

For C_0 linear element:
 unconditional stability,
 optimal order convergence

Again, follows from Dziuk (1988), Elliott/French/Milner (1989),
 Du-Nicolaides (1991) SINUM (also Furihata 2001 Num Math)

Problems with deforming/Evolving Surfaces

Biomimetic cell membrane: fluid bilayer
vesicle formed by amphiphilic lipids

Multi-component vesicle:
cholesterol rich
or depleted

Membrane-bound protein diffusion

Bending Elasticity Model of Single-component GUV

- **Earlier studies:** Canhem 70, Helfrich 73, Evans 79, Fung, ...
- **Hypothesis: vesicle Γ minimizes bending elasticity energy, subject to volume/area constraints**

$$\min \quad E = \int_{\Gamma} H^2 ds$$

subj. to volume/area constraints

Related to the Willmore problem

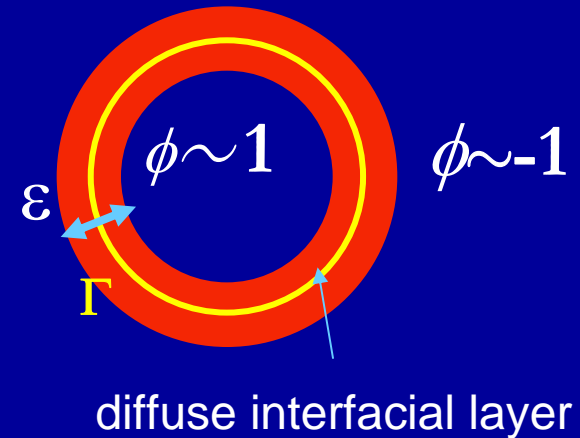
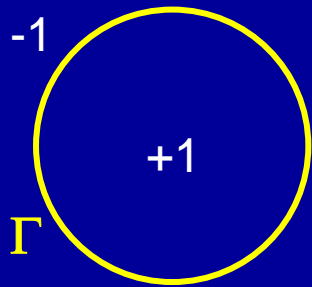
Special case of Helfrich energy

Diffuse Interface Description of Surfaces/Interfaces

- Examples: Cahn-Hilliard equation discussed earlier
- Sharp interfaces \rightarrow diffuse interfaces characterized by some order parameters (**phase field** functions)
 - Eg: phase field simulations of microstructure evolution (Yu-Hu-Chen-Du, JCP 2005)
- Idea goes back to van de Waals
Ginzburg-Landau, Cahn-Hilliard, Halperin-Hohenberg,...

Diffuse Interface/Phase Field

To describe an interface Γ , a smooth **phase field function** ϕ is introduced to label the two sides, with nearly constant values except in a thin (*diffuse*) layer



- Interface Γ : zero level set of ϕ
- Geometry of Γ : surface area

Phase Field Bending Energy Model

- **Geometric calculus translates into phase field calculus for mean curvature square energy** Du-Liu-Wang JCP 2004

$$\min \int_{\Gamma} H^2 ds$$

subject to
area and
volume
constraint

$$\min \frac{c}{\epsilon} \int_{\Omega} \left(\epsilon \Delta \phi + \frac{1}{\epsilon} (\phi^2 - 1) \phi \right)^2 dx$$

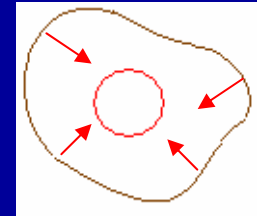
$$\text{subject to } \int_{\Omega} \phi(x) dx = \alpha$$

$$\int_{\Omega} \left(\frac{\epsilon}{2} |\nabla \phi|^2 + \frac{1}{4\epsilon} (\phi^2 - 1)^2 \right) dx = \beta$$

- **Extension to other geometric features, curvatures ...**
Du-Liu-Wang JCP 2006, Du-Liu-Ryham-Wang CPAA 2005
- **Sharp interface analysis:** D-L-R-W Nonlinearity 05, Wang 07
DeGiorgi Conjecture: Moser, Roger-Schatzle

Strategy: Phase Field Calculus

Geometric calculus: variation of surface area/surface tension leads to mean curvature



$$\int_{\Gamma} ds \quad \xleftrightarrow[\Gamma\text{-limit}]{} \quad \int_{\Omega} \left(\frac{\epsilon}{2} |\nabla \phi|^2 + \frac{1}{4\epsilon} (\phi^2 - 1)^2 \right) dx$$



H

Consistency in
energy (functional)
and variation (force)



$$-\epsilon \Delta \phi + \frac{1}{\epsilon} (1 - \phi^2) \phi$$

Phase Field Calculus

→ basis for phase field bending elasticity model

Phase Field Calculus for Bending Elasticity

$$\begin{array}{ccc}
 \int_{\Gamma} H^2 ds & \longleftrightarrow & \frac{c}{\epsilon} \int_{\Omega} \left(\epsilon \Delta \phi + \frac{1}{\epsilon} (1 - \phi^2) \phi \right)^2 dx \\
 \downarrow & & \downarrow \\
 \Delta_{\Gamma} H + H(2H^2 - K) & \longleftrightarrow & \Delta f - \frac{1}{\epsilon^2} (3\phi^2 - 1) f \\
 \text{Geometric calculus} & & \text{Phase field calculus} \\
 & & f = -\epsilon \Delta \phi + \frac{1}{\epsilon} (1 - \phi^2) \phi
 \end{array}$$

Again: a consistent phase field model

Bending energy/Willmore functional

Some other relevant works:

Image inpainting: use of Euler's elastica

Chan-Kang-Shen, Esedoglu-Shen, March-Dozio

Amphiphilic layer: a Ginzburg-Landau approach

Grompp-Schick, Misbah, Campelo-Hernandez, Gao-Feng-Gao

Willmore problem: given surface boundary, flow

Deckelnick-Dziuk, Clarenz-Diewald-Dziuk-Rumpf, Grzibovskis-Heintz

Action minimization: a time dependent variation

Kohn-Reznikoff-Tonegawa

Gamma-limit:

DeGiorgi, Moser, Roger-Schatzle

Numerical Analysis of FE Approximation

Mixed formulation: $\mathbf{TZ}=\mathbf{F}(\mathbf{Z})$ with a linear \mathbf{T} of the form

$$\begin{pmatrix} A & B & 0 \\ B & 0 & C \\ 0 & C & 0 \end{pmatrix}$$

T: nested saddle point problem (Chen-Du-Zou SINUM 1999)

F: a compact nonlinear perturbation

– **Thm**: *convergence* (Du-Wang, IJNAM 2006)

– **Thm**: *optimal H^1 error estimates* (Du-Zhu, JCM 2006)

Application of Brezzi-Raviart-Rappaz

– **Thm**: *optimal L^2 error estimates* (Zhu, thesis)

Extension of Aubin-Nitsche

Dependence on ε ?

Multi-component vesicles

Recent experimental studies of multicomponent membranes revealed intricate domain structures of biological importance

A two component example:

Total energy =

Bending elastic energy

+ line tension

subject to

fixed total volume

and

fixed individual phase areas



Baumgart et al, 2003

Multi-component vesicles

- Phase field description of deformable multicomponent membrane: **multiple phase field functions for both the vesicle (co-dimension 1 surface) and phase boundary (co-dimension 2 curve) of individual components**

$$E_L(\phi, \psi) + E_b(\phi, \psi)$$

Modeling multi-component membranes

- **Phase field simulations (Wang-Du 2007 J Math Bio)**

Comparison of simulation with experiment (Baumgart 2003)

Similar ideas can be used to model variation of concentration

Related works: Chen/Niu/Shi 2008, Lowengrub/Xu/Voigt 2008,
Ursell/Klug/Phillips 2009, Elliott-Stinner-Styles-Welford 2009

Similar extension: membrane with free edges

- An open membrane is taken as a closed membrane with two components, with zero bending rigidity in one of them

(Wang-Du 2007)

Saitoh-Takiguchi-
Tanaka-Hotani

Capovilla-Guven-
Santiago

Umeda-Suezaki-
Takiguchi-Hotani

Ouyang-Tu

Phase Field/Diffuse Interface Modeling

- Simple, systematic derivation (geometry, energy, ...)
- Interface capturing (no need for explicit tracking)
- Consistent to conventional sharp interface description
- Bridge effects from multiple scales/random processes
- Effective for complex interfacial dynamics

efficient numerical algorithms

Extensive studies in the literature

For Allen-Cahn, Cahn-Hilliard, Phase Field, Diffuse-Interface

- **FD/FV/FE/Spectral/Multigrid/Adaptive**

Fix/Lin, Caginalp, Elliott/French, Du/Nicolaides, Wang/Sekerka, Fife/Mackenny, Braun/Murray, Chen/Hoffmann, Karma/Rappel, Provatas/Goldenfeld/Dantzig, Mackenzie/Robertson, Garcke/Rumpf/Weikard, Anderson/McFadden/Wheeler, Deckelnick/Dziuk/Elliott, Kessler/Nochetto/Schmidt, Furihata, Feng/Prohl, Kornhuber/Krause, Barrett/Garcke/Nürnberg, Wise/Lowengrub/Kim/Johnson, Ratz/Voigt, Bartels, Chen/Shen, Yue/Feng/Liu/Shen, Xia/Xu/Shu, ...

- **High order spatial and time discretization**

Du/Zhu (2004, 2005): spectral + Exponential time difference

Du/Zhang (2009 SISC): high order ~ more effective (in sharp interface limit)

For smooth interface: $\left\{ \begin{array}{l} \text{Cost ratio on the same uniform mesh} \sim \text{constant} \\ \text{Mesh size ratio} \sim \text{dependent on interfacial width} \end{array} \right.$

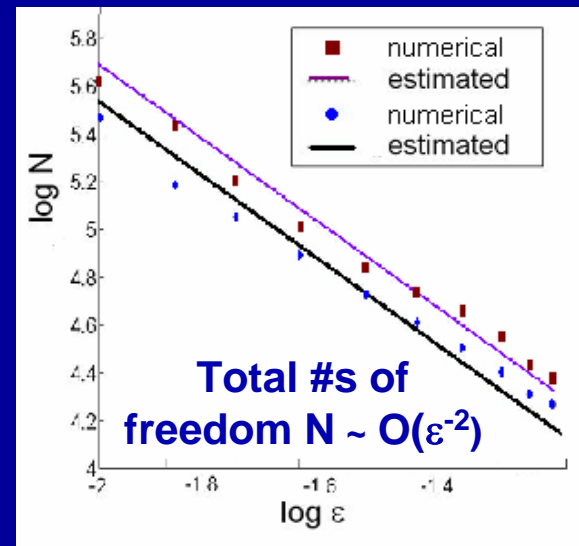
Singular interface? nonuniform adaptive mesh?

Adaptive methods

- Adaptive methods greatly improves the efficiency (Provatas-Goldenfeld-Dantzig, Mackenzie/Robertson, Tonhardt-Amberg, Braun-Murray, Feng-Wu, Bänsch-Haußer-Lakkis-Li-Voigt, ...)
- Adaptive FEM for vesicle deformation based on residual type a posteriori error estimates (Du-Zhang SISC 2008)
- **3D** Computation gets reduced to **2D** complexity

mesh density

code developed by Jian Zhang



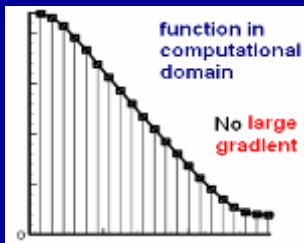
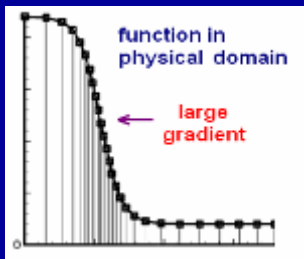
anisotropic adaptivity?

Moving-Mesh Spectral methods

Yu-Chen-Du 2006, Feng-Yu-Hu-Liu-Du-Chen 2006

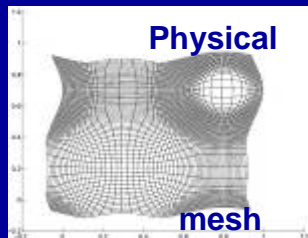
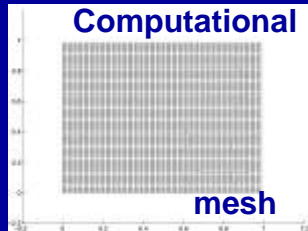
To better represent interfacial region by Fourier spectral:

Moving mesh Fourier spectral: **following works of Winslow, Nakashashi-Deiwert, Bayliss-Kuske-Matkowsky, Huang-Ren-Russell, Mackenzie-Robertson, Cenicerros-Hou,...** , **but to the Fourier spectral setting**



- Large gradient in physical domain requires high resolution, thus necessitates fine uniform mesh
- To make grids clustered near physical interface, a map is used between the computational and physical domain so that the grids still remain uniform in the computational domain

Moving Mesh/Fourier Spectral (MMFS)



- **MMFS (Moving Mesh Fourier spectral):** mesh evolves with the solution to provide better resolution in the physical domain
- Moving mesh equation is determined by a monitor function w and a mobility function μ

$$x_t^j(\xi, t) = \mu \nabla_{\xi} \cdot (w \nabla_{\xi} x^j)$$

$$x(\xi, t) - \xi \text{ is periodic}$$

- Overcome the complication of inhomogeneous coefficients due to mesh motion to allow FFT, reduce overall system size and improve accuracy. Performance gain despite of the overhead

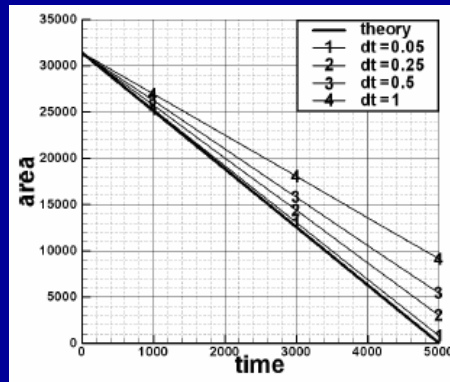
$$X^{m+1} - X^m - \alpha \Delta_{\xi} X^{m+1} =$$

$$\mu \tau \nabla_{\xi} \cdot w (\nabla_{\xi} X^m + I) - \alpha \Delta_{\xi} X^m$$

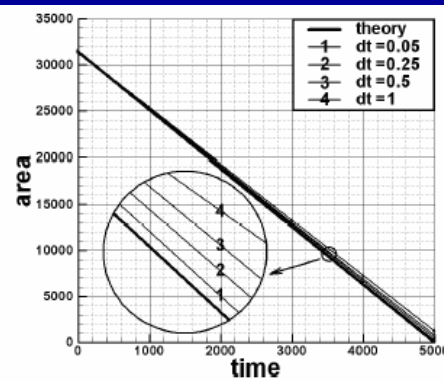
$$\alpha = \mu \tau \max w,$$

Moving Mesh/Fourier Spectral (MMFS)

- **Eg:** growth rate via Allen-Cahn with decreasing interfacial width vs sharp interface limit



UFSIM



AFSIM

Yu-Chen-Du 2006, IWSCE,
Feng-Yu-Hu-Liu-Du-Chen
2006 J. Comp. Phys.
Feng-Yu-Hu-Liu-Du-Chen
2009 Comm. Comp. Phys.

Other applications: vesicle substrate interaction

- **Stem cells differentiate into various cell types including neurons, myoblasts, and osteoblasts depending on the stiffness of substrate that they adhere to (Engler 2006,Cell)**
- **Study mechanics of interaction between single and multi-component vesicles with curved/patterned substrate**
- **Competition between bending & contact energies $\int_{\Gamma_S} w d\Gamma$**

Das– Du 2007

Phys. Rev. E

**Axis-symmetric vesicle
with spherical substrate**

Other applications: vesicle substrate interaction

Single component vesicle interacting with patterned and non-axisymmetric substrate simulated by a phase field model with an adhesion potential

$$\int_{\Gamma} w(d(x, \Gamma_S)) d\Gamma$$

Zhang-Das– Du 2009 J. Comp. Phys

On-going work: interaction of two-component vesicle with patterned substrate

Vesicle Fluid Interaction

**Vesicle/membrane
deformation due to bending energy
and fluid transport**

+

**Incompressible fluid with
extra stress due to
membrane bending**

Vesicle breaking-up in fluid

**Du-Liu-Ryham-Wang
2009 Physica D**

Phase-Field Navier-Stokes Model

Hydrodynamics interaction with flow:

Du-Liu-Wang 2006

Du-Li-Liu 2006

Du-Liu-Ryham-Wang 2009

Du-Li 2009

Phase field
Allen-Cahn/Cahn-Hilliard
fluid transport



Navier-Stokes
Willmore stress

A regularized PFBENS

$$\left\{ \begin{array}{l} \mathbf{u}_t + \mathbf{u} \cdot \nabla \mathbf{u} + \nabla p = \mu \Delta \mathbf{u} + W'(\phi) \nabla \phi, \\ \nabla \cdot \mathbf{u} = 0, \\ \phi_t + \mathbf{u} \cdot \nabla \phi = -\nu \frac{\delta W}{\delta \phi} \end{array} \right.$$

Lemma: Energy law

Theorem: Existence of weak solution (via Galerkin)

Theorem: Uniqueness is shown (for 3d case under extra regularity condition on the velocity profile)

Du-Li-Liu 2007 DCDS

Remark: Results are for given positive ε , μ and ν

Collaborators

- **Lili Ju** (S. Carolina), **Li Tian** (PSU), **Max Gunzburger** (FSU)
Numerical PDEs/SCVTs NSF-DMS
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Peng Yu (Goldman-Sachs), **Jiakou Wang** (Lehman Bro)
Complex/biological fluids NSF-DMS, NIH-NCI

References available at <http://www.math.psu.edu/qdu>

Thank you!