

Today

- Choices in discr.
- Working in unstr. discr.
- Nyström
- $\|A_n - A_{\infty}\| \rightarrow 0$
- Auselone's l.h.u.

Announcements

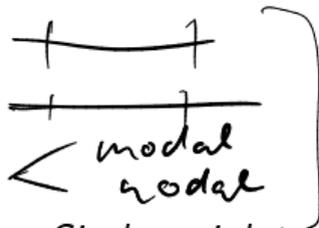
- Presentation schedule
- Project proposals! 

Constructing Discrete Function Spaces

Floating point numbers (*Degrees of Freedom* or *DoFs*) \leftrightarrow Functions

Discretization relies on three things:

▶ Base/reference domain



▶ Basis of functions

▶ Meaning of DoFs

Related finite element concept: *Ciarlet triple*

Discretization options for a curve?

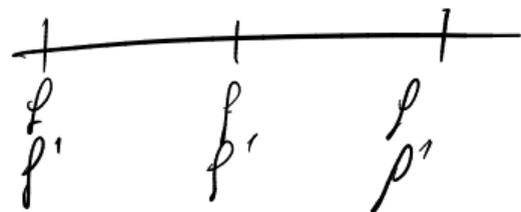


What do the DoFs mean?

$$P_n - P_m = \sum_{i=0}^{n+m} \alpha_i P_i$$

Common DoF choices:

- ▶ Point values of function
- ▶ Point values of (directional?) derivatives
- ▶ Basis coefficients
- ▶ Moments



Often: useful to have both "modes", "nodes", jump back and forth

modal
nodal
pseudo spectral } "spectral"

Why high order?

Order p : Error bounded as $|u_h - u| \leq Ch^p$

Thought experiment:

First order	Fifth order
1,000 DoFs \approx 1,000 triangles	1,000 DoFs \approx 66 triangles
rd. Error: 0.1	Error: 0.1
Error: 0.01 \rightarrow ? 100,000	Error: 0.01 \rightarrow ? 100 triangles

$$\epsilon \sim h$$



$$\epsilon \sim h^5$$

$$\frac{1}{10} \sim h^5$$

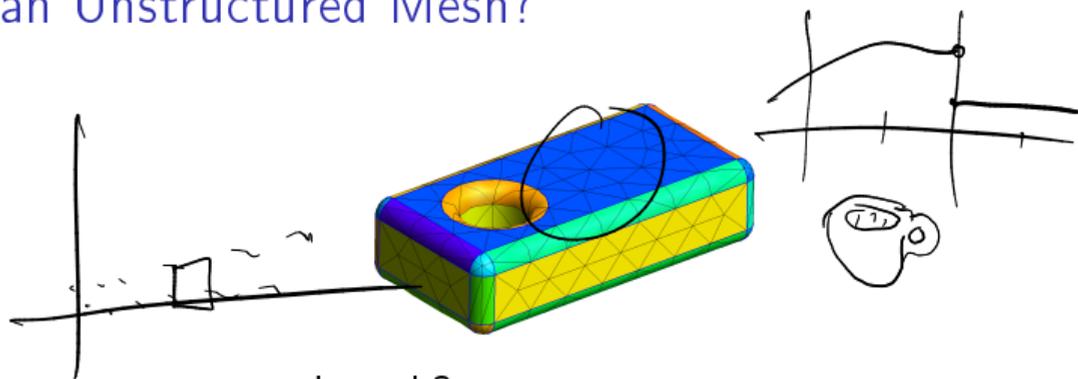
$$h \sim 1.58$$

Complete the table.

Remarks:

- ▶ Want $p \geq 3$ available.
- ▶ **Assumption:** Solution sufficiently smooth
- ▶ Ideally: p chosen by user

What is an Unstructured Mesh?



Why have an unstructured mesh?

- deal with topology
- adaptive
- deal with nonsmoothness

What is the trade-off in going unstructured?

- complexity: data structures
- generated
- reference element

Demo: CAD software

Fixed-order vs Spectral

Fixed-order

Number of DoFs n

\sim

Number of 'elements'

Error $\sim \frac{1}{n^p}$

Examples?

- ▶ Piecewise Polynomials

Spectral

Number of DoFs n

\sim

Number of modes resolved

Error $\sim \frac{1}{C^n}$

Examples?

- ▶ Global Fourier
- ▶ Global Orth. Polynomials

*downside: full matrices,
structured disc.*

What assumptions are buried in each of these?

sufficient smoothness

Fixed-order vs Spectral

What should the DoFs be?

A large, empty rounded rectangular box with a thin black border, intended for the user to provide an answer to the question above.

What's the difficulty with purely modal discretizations?

A large, empty rounded rectangular box with a thin black border, intended for the user to provide an answer to the question above.

Vandermonde Matrices

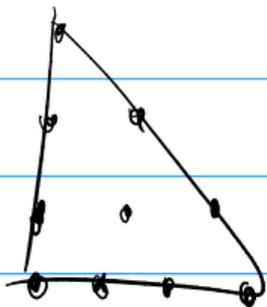
$$\begin{bmatrix} x_0^0 & x_0^1 & \cdots & x_0^n \\ x_1^0 & x_1^1 & \cdots & x_1^n \\ \vdots & \vdots & \ddots & \vdots \\ x_n^0 & x_n^1 & \cdots & x_n^n \end{bmatrix} \begin{bmatrix} a_0 \\ a_1 \\ \vdots \\ a_n \end{bmatrix} = ?$$

Generalized Vandermonde Matrices

$$\begin{bmatrix} \phi_0(x_0) & \phi_1(x_0) & \cdots & \phi_n(x_0) \\ \phi_0(x_1) & \phi_1(x_1) & \cdots & \phi_n(x_1) \\ \vdots & \vdots & \ddots & \vdots \\ \phi_0(x_n) & \phi_1(x_n) & \cdots & \phi_n(x_n) \end{bmatrix} \begin{bmatrix} a_0 \\ a_1 \\ \vdots \\ a_n \end{bmatrix} = \begin{bmatrix} ? \\ \vdots \\ ? \end{bmatrix}$$

modul coeffs

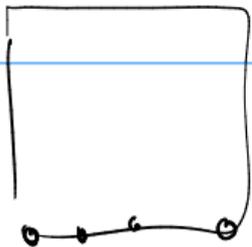
nodal coefficients



$P^3 \rightarrow$

$x^i y^j \quad |+j| \leq 3$

$0 \leq i \leq 3$
 $0 \leq j \leq 3$



Q_3

$x^i y^j$

Generalized Vandermonde Matrices

$$\begin{bmatrix} \phi_0(x_0) & \phi_1(x_0) & \cdots & \phi_n(x_0) \\ \phi_0(x_1) & \phi_1(x_1) & \cdots & \phi_n(x_1) \\ \vdots & \vdots & \ddots & \vdots \\ \phi_0(x_n) & \phi_1(x_n) & \cdots & \phi_n(x_n) \end{bmatrix} \text{MODAL COEFFS} = \text{NODAL COEFFS}$$

- ▶ Node placement? **Demo:** Interpolation node placement
- ▶ Vandermonde conditioning? **Demo:** Vandermonde conditioning
- ▶ What about multiple dimensions?
 - ▶ **Demo:** Visualizing the 2D PKDO Basis
 - ▶ **Demo:** 2D Interpolation Nodes

Common Operations

(Generalized) Vandermonde matrices simplify common operations:

▶ Modal \leftrightarrow Nodal ("Global interpolation")

▶ Filtering

▶ Up-/Oversampling

▶ Point interpolation (Hint: solve using V^T)

▶ Differentiation

▶ Indefinite Integration

▶ Inner product

▶ Definite integration

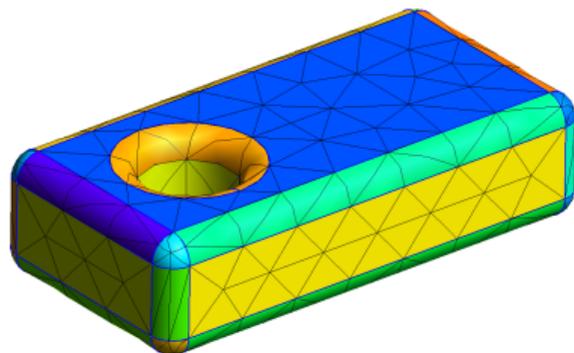


$$p^3 \rightarrow p^2$$



$$\begin{aligned} \vec{\alpha}_p \vec{\alpha}_g &= (V^T \vec{p})^T (V^T \vec{g}) \\ &= \frac{1}{n} \vec{p}^T V^T V \vec{g} \end{aligned}$$

Unstructured Mesh



- ▶ Design a data structure to represent this $[N_{elements}, n_i, N_{nodes}]$
- ▶ Compute normal vectors
- ▶ Compute area
- ▶ Compute integral of a function
- ▶ How is the function represented?

Integral Equation Discretizations: Overview

$$\phi(x) - \int_{\Gamma} K(x, y) \phi(y) dy = f(x)$$

$\frac{p_{ik} v}{\omega}$ \downarrow \downarrow
 \downarrow \downarrow

Nyström

- ▶ Approximate integral by quadrature:
 $\int_{\Gamma} f(y) dy \rightarrow \sum_{k=1}^n \omega_k f(y_k)$
- ▶ Evaluate quadrature'd IE at quadrature nodes, solve

Projection

- ▶ Consider residual:
 $R := \phi - A\phi - f$
- ▶ Pick projection P_n onto finite-dimensional subspace
 $P_n \phi := \sum_{k=1}^n \langle \phi, v_k \rangle w_k \rightarrow$
DOFs $\langle \phi, v_k \rangle$
- ▶ Solve $P_n R = 0$

Projection/Galerkin

- ▶ Equivalent to projection: Test IE with test functions
- ▶ Important in projection methods: *sub-space* (e.g. of $C(\Gamma)$)

Name some generic discrete projection bases.

Polynomials \rightarrow Projection basis = density unknown
 $\delta(x-y_j)$ \rightarrow Galerkin
 \neq \rightarrow Petrov-Galerkin

Collocation and Nyström: the same?

collocation has to be exact.

Are projection methods implementable?

no.

Nyström Discretizations (I)

Nyström consists of two distinct steps:

1. Approximate integral by quadrature:

$$x \in [\dots] \quad \varphi_n(x) - \sum_{k=1}^n \omega_k K(x, y_k) \varphi_n(y_k) = f(x) \quad (1)$$

2. Evaluate quadrature'd IE at quadrature nodes, solve discrete system

$$\varphi_j^{(n)} - \sum_{k=1}^n \omega_k K(x_j, y_k) \varphi_k^{(n)} = f(x_j) \quad (2)$$

with $x_j = y_j$ and $\varphi_j^{(n)} = \varphi_n(x_j) = \varphi_n(y_j)$

Is version (1) solvable?

inf. rows, n columns ... ?

Nyström Discretizations (II)

What's special about (2)?

Solution density also only known at point values. But: can get approximate continuous density. How?

Assuming the IE comes from a BVP. Do we also only get the BVP solution at discrete points?