

# Integral Equations and Fast Algorithms

## Lecture 24: Projection error, Intro to quadrature

CS 598AK · November 14, 2013

# Outline

IE discretization: Projection

Singular quadrature

# Céa's Lemma: Convergence for Projection

$X$  Banach spaces,  $A : X \rightarrow X$  injective,  $P_n : X \rightarrow X_n$

## Theorem (Céa's Lemma [Kress LIE Thm 13.6])

*Convergence of the projection method*

$\Leftrightarrow$  *There exist  $n_0$  and  $M$  such that for  $n \geq n_0$*

- $P_n A : X_n \rightarrow X_n$  are invertible,*
- $\|(P_n A)^{-1} P_n A\| \leq M.$*

*In this case,*

$$\|\varphi_n - \varphi\| \leq (1 + M) \inf_{\psi \in X_n} \|\varphi - \psi\|$$

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*In this case,*

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Extreme example: Mean-as-only-DoF

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## Theorem (Céa's Lemma [Kress LIE Thm 13.6])

Convergence of  $P_n A^{-1} P_n$

$\Leftrightarrow$  There exist  $n_0$

1.  $P_n A : X_n \rightarrow X_n$  invertible
2.  $\|(P_n A)^{-1} P_n\| \leq C$

In this case,

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Core message of the theorem?

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Domain/range of  $(P_n A)^{-1} P_n A$ ?

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Relationship to conditioning?

## Céa's Lemma

$X$  Banach space

### Theorem (Céa's)

Convergence of

$\Leftrightarrow$  There exist  $n$

1.  $P_n A : X_n \rightarrow X_n$
2.  $\|(P_n A)^{-1} P_n A\| < 1$

In this case,

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- Solve for  $\varphi_n$
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## Céa's Lemma

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Exact projection methods: hard. (Why?)



## Céa's Lemma

$X$  Banach space

### Theorem (Céa's)

Convergence of

$\Leftrightarrow$  There exist  $n$

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What if we implement a perturbation?

# Perturbations of projection methods

- $A : X \rightarrow X$  bounded linear operator
- with bounded inverse
- Projection method converges for  $A$  (Céa)
- $B : X \rightarrow X$  bounded linear 'perturbation' operator

## Theorem (Perturbations of projection methods [Kress LIE Thm 13.7])

*If*

- $\|P_n B|_{X_n}\| \rightarrow 0$  ( $n \rightarrow \infty$ ), **or**
- $B$  compact and  $A + B$  has no nullspace

*then*

*the projection method still converges for  $A + B$ .*

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Ingredients to showing that a projection (e.g. Galerkin) method works?

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Ingredients to showing that a projection (e.g. Galerkin) method works?

Compare and contrast with Nyström.

## Which to use?

Quote Kress LIE, 2nd ed., p. 244 (Sec. 14.1):

*[. . .] the Nyström method is generically stable whereas the collocation and Galerkin methods may suffer from instabilities due to a poor choice of basis for the approximating subspace.*

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*In principle, for the Galerkin method for equations of the second kind the same remarks as for the collocation method apply. As long as numerical quadratures are available, in general, the Galerkin method cannot compete in efficiency with the Nyström method. Compared with the collocation method, it is less efficient, since its matrix elements require double integrations.*

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Need good quadratures to use Nyström.

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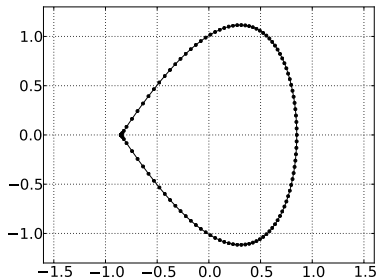
*In principle, for the Galerkin method for equations of the second kind the same remarks as for the collocation method apply. As long as numerical quadratures are available, in general they compete in efficiency with the Nyström method. Compared with the Nyström method, Galerkin has the advantage since its matrix elements are not subject to the same numerical errors as the Nyström matrix elements.*

Need good quadratures to use Nyström.

Remaining advantage of Galerkin:  
Can be made not to break for non-second-kind.



# Galerkin without the pain

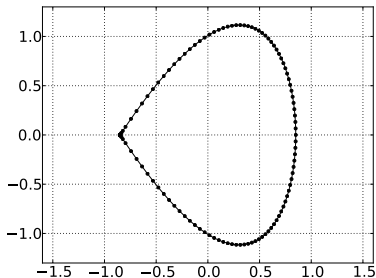


**Problem:** Singular behavior  
at corner points.

Density may blow up.

[Bremer et al. '11]

# Galerkin without the pain



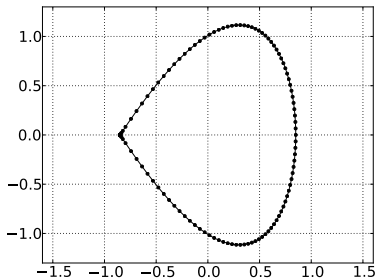
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# Galerkin without the pain



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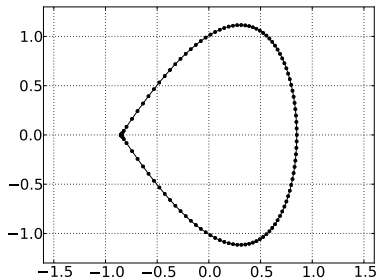
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Conditioning of the discrete system?

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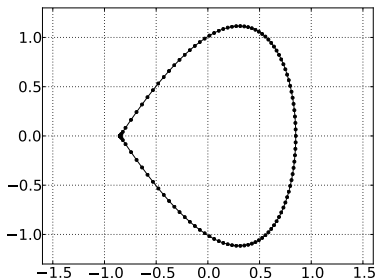


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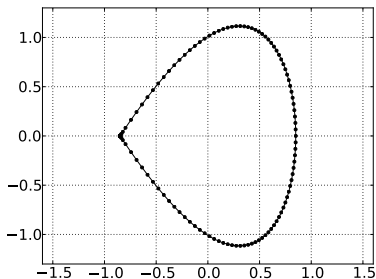
GMRES will flail and break, because it sees  $\ell^2 \sim l^\infty \sim L^\infty$  convergence.

Make GMRES 'see'  $L^2$  convergence by redefining density DOFs:

$$\bar{\sigma}_h := \begin{pmatrix} \sqrt{\omega_1} \sigma(x_1) \\ \vdots \\ \sqrt{\omega_n} \sigma(x_n) \end{pmatrix} = \sqrt{\omega} \sigma_h$$

So  $\bar{\sigma}_h \cdot \bar{\sigma}_h = ?$

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Also fixes system conditioning! Why?

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Special-purpose methods

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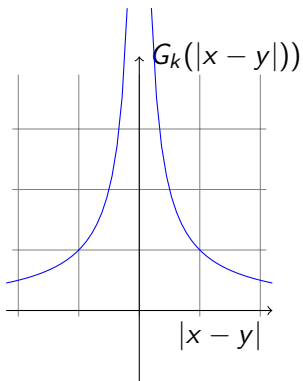
Special-purpose methods



# “Off-the-shelf” approaches

Discuss advantages, drawbacks:

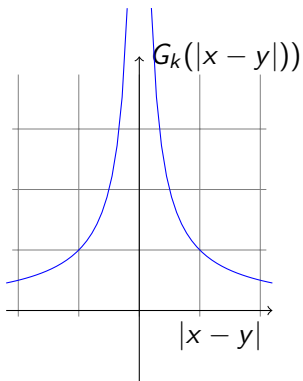
- Why not Gaussian?



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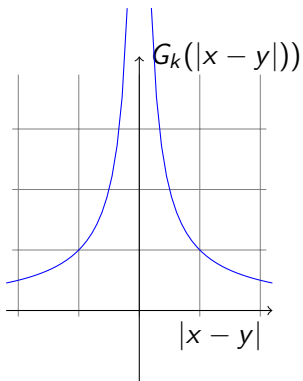
- Why not Gaussian?
- Analytic/symbolic integration



# “Off-the-shelf” approaches

Discuss advantages, drawbacks:

- Why not Gaussian?
- Analytic/symbolic integration
- Adaptive integration



# Kussmaul/Martensen (aka "Kress")

Theorem (A special integral [Kress LIE Lemma 8.21])

$$\frac{1}{2\pi} \int_0^{2\pi} \log \left( 4 \sin^2 \frac{t}{2} \right) e^{imt} dt = \begin{cases} 0 & m = 0, \\ -\frac{1}{|m|} & m = \pm 1, \pm 2, \dots \end{cases}$$

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Exciting?

Kussmaul/Martensen (aka “Kress”)

# KM quadrature demo

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What if you knew how to integrate  
Laplace and wanted to do Helmholtz?

# Singularity subtraction

$$\begin{aligned} & \int \langle \text{Thing } X \text{ you would like to integrate} \rangle \\ & \quad = \int \langle \text{Thing } Y \text{ you } \textit{can} \text{ integrate} \rangle \\ & + \int \langle \text{Difference } X - Y \text{ which is easy to integrate (numerically)} \rangle \end{aligned}$$

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Drawback?

Questions?

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