

# Integral Equations and Fast Algorithms

## Lecture 4: Intro Int.Eq./Compactness

CS 598AK · September 5, 2013

# Today

Integral equations: an introduction, cont'd.

Second-kind equations, Attempt 1: Neumann

Compactness

# Outline

Integral equations: an introduction, cont'd.

Second-kind equations, Attempt 1: Neumann

Compactness

# Linear ODE to Volterra

## Linear, variable-coefficient IVP [Tricomi, 1.8]

$$u^{(n)} + a_1(x)u^{(n-1)} + \dots + a_n(x)u = F(x)$$

$$u(0) = c_0, \quad u'(0) = c_1, \quad \dots, \quad u^{(n-1)}(0) = c_{n-1}$$

Define  $\varphi := u^{(n)}$  and then

$$D^{-1}\varphi(x) = \int_0^x \varphi(y)dy \quad \dots \quad D^{-n} = (D^{-1})^n$$

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Oddly enough:

$$D^{-n}\varphi(x) = \frac{1}{(n-1)!} \int_0^x (x-y)^{n-1} \varphi(y)dy$$

(Homework!)

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$$u = \dots$$

in terms of  $D^{-i}\varphi$  and  $c_i$ ?

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Initial values become from  
part of right-hand side  
(many eqn's  $\rightarrow$  one!)

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Result is even second-  
kind. (Why?)

## Volterra: first kind

$$\int_a^x K(x, y)\varphi(y)dy = f(x) \quad (1)$$

Take derivative of both sides of (1). What happens?

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# Complex analysis

Complex analysis is *full* of integral operators:

- Cauchy's integral formula:

$$f(a) = \frac{1}{2\pi i} \oint_{\gamma} \frac{1}{z-a} f(z) dz$$

- Cauchy's differentiation formula:

$$f^{(n)}(a) = \frac{n!}{2\pi i} \oint_{\gamma} \frac{1}{(z-a)^{n+1}} f(z) dz$$

# Basic Marketing Message

You may not have noticed them, ...  
but integral operators/equations are *everywhere!*



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;) )

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Integral equations: an introduction, cont'd.

Second-kind equations, Attempt 1: Neumann

Compactness

# Integral operators: continuity

## Theorem (Continuous kernel $\Rightarrow$ bounded)

$G \subset \mathbb{R}^n$  closed, bounded ("compact"),  $K \in C(G^2)$ . Let

$$(A\varphi)(x) := \int_G K(x, y)\varphi(y)dy.$$

Then

$$\|A\|_\infty = \max_{x \in G} \int_G |K(x, y)|dy.$$

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Show “ $\leq$ ”.

# Making a connection

Want to solve

$$\varphi - A\varphi = (I - A)\varphi = f.$$

Formally:

$$\varphi = (I - A)^{-1}f.$$

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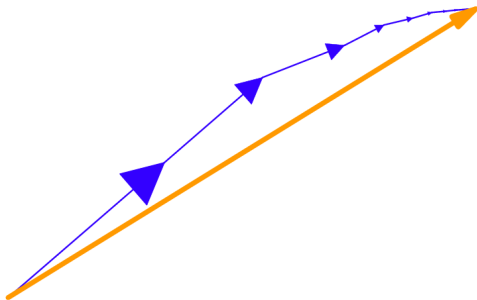
Formally:

$$\varphi = (I - A)^{-1}f.$$

$$\sum_{k=0}^{\infty} \alpha^k = ?$$

if...?

## Recap: completeness



**Completeness** means that

if a particle moves along the broken path (in blue) travelling a finite total distance, then the particle has a well-defined net displacement (in orange).

[Wikipedia]



# Neumann series

## Theorem

$A : X \rightarrow X, \|A\| < 1$

$$(I - A)^{-1} = \sum_{k=0}^{\infty} A^k$$

*with*  $\|(I - A)^{-1}\| \leq 1/(1 - \|A\|)$ .

# Neumann series

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- Show bound.
- Partial sums form Cauchy sequence.
- Limit exists. Is it the inverse? Use

$$(I - A) \sum_{k=0}^n A^k = (I - A^{n+1})$$

# Neumann series, applied

Let partial sums (of Neumann series) be

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Translate back into integral equation language.

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Translate back into integral equation language.

Lame because... (at least 2 reasons)?

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# Compactness

$X$  Banach space

## Definition (Precompact/Relatively compact)

$M \subseteq X$  precompact:  $\Leftrightarrow$  all sequences  $(x_k) \subset M$  contain a subsequence converging in  $X$

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Counterexample?

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Precompactness 'replaces' boundedness in  $\infty$  dim

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# Compact operators

$X, Y$ : Banach spaces

Definition (Compact operator)

$T : X \rightarrow Y$  is *compact*  $:\Leftrightarrow T(\bar{B}_1(0))$  is precompact.

# Compact operators

Define  $\bar{B}_1(0)$ .

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- *One of*  $T, S$  compact  $\Rightarrow S \circ T$  compact
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Let  $\dim T(X) < \infty$ . Is  $T$  compact?

Is the identity operator compact?

Questions?

?