

# LECTURE 8

EXTENSION AND

INTERPOLATION

PROBLEMS IN

SOBOLEV SPACES

RECALL THE DEFINITION &  
SIMPLEST PROPERTIES  
OF  
SOBOLEV SPACES.

$L^{m,p}(\mathbb{R}^n)$  CONSISTS OF ALL

$$f \in L^p_{loc}(\mathbb{R}^n)$$

whose  $m^{\text{th}}$  order distribution deriv's.

$$\partial^\alpha f \quad (|\alpha|=m)$$

belong to  $L^p(\mathbb{R}^n)$ .

# The $L^{m,p}$ SEMINORM

IS GIVEN BY

$$\|f\| = \sum_{|\alpha|=m} \|\partial^\alpha f\|_{L^p(\mathbb{R}^n)}.$$

NOTE:  $\|P\| = 0$  for polys  $P$   
of degree  $< m$ .

$W^{m,p}(\mathbb{R}^n)$  CONSISTS OF ALL

$$f \in L^p(\mathbb{R}^n)$$

whose distribution deriv's

UP TO order  $m$

belong to  $L^p(\mathbb{R}^n)$ .

The  $W^{m,p}$  NORM is given by

$$\|f\| = \sum_{|\alpha| \leq m} \|\partial^\alpha f\|_{L^p(\mathbb{R}^n)}.$$

RECALL THE

SOBOLEV THM.

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If  $p > n$ , then

$$L^{m,p}(\mathbb{R}^n) \subset C_{loc}^{m-1}(\mathbb{R}^n)$$

and

$$W^{m,p}(\mathbb{R}^n) \subset C^{m-1}(\mathbb{R}^n).$$

If  $p > \frac{n}{m}$ , then

$$L^{m,p}(\mathbb{R}^n) \subset C_{loc}^0(\mathbb{R}^n)$$

and

$$W^{m,p}(\mathbb{R}^n) \subset C^0(\mathbb{R}^n).$$



NOTE :

STRICTLY SPEAKING,

FUNCTIONS IN

$L^{m,p}$  or  $W^{m,p}$

ARE DEFINED ONLY

UP TO A SET OF

MEASURE ZERO.

For  $p > \frac{n}{m}$ ,

SOBOLEV  $\Rightarrow$

MAY REDEFINE any  $f \in L^{m,p}(\mathbb{R}^n)$

ON A SET OF MEASURE 0

to MAKE IT CONTINUOUS.



SET

$$X = L^{m,p}(\mathbb{R}^n) \text{ or } W^{m,p}(\mathbb{R}^n).$$

Let  $\| \cdot \|_X$  DENOTE THE

CORRESPONDING

SEMINORM

or

NORM.

GIVEN  $E \subset \mathbb{R}^n$ , LET

$$X(E) = \{ F|_E : F \in X \},$$

WITH ( SEMINORM or )  
NORM

$$\|f\|_{X(E)} = \inf \{ \|F\|_X : F \in X, F = f \text{ on } E \}.$$

For  $p > n/m$ , this makes sense,

thanks to Sobolev thm.

For  $p \leq n/m$ ,

$X(E)$  NEEDN'T MAKE SENSE,

because  $F \in X$  needn't be

continuous.

(Try  $E = \{\text{single pt}\}$ .)

NOTE:

IF  $E$  IS FINITE, THEN

$$X(E) = \{ \text{all } f: E \rightarrow \mathbb{R} \},$$

but we STILL WANT TO

UNDERSTAND

$$\|f\|_{X(E)}.$$

We write  $[X(E)]^*$

to denote the space

of linear functionals on  $X(E)$ .

(Use this when  $E$  is finite.)



WE WILL ALWAYS

ASSUME HERE THAT

$$p > n,$$

BUT OUR QUESTIONS

MAKE SENSE FOR

$$p > \frac{n}{m}$$



WHITNEY'S PROBLEMS

FOR

SOBOLEV SPACES

DECIDE WHETHER A GIVEN

$$f: E \rightarrow \mathbb{R}$$

belongs to  $X(E)$ .

Given  $f \in X(E)$ ,

Compute the order of magnitude

of

$$\|f\|_{X(E)}.$$

DOES THERE EXIST A

BOUNDED LINEAR MAP

$$T: X(E) \rightarrow X$$

SUCH THAT

$$Tf = f \text{ on } E$$

for all  $f \in X(E)$  ?

Suppose  $E \subset \mathbb{R}^n$  is

FINITE.

Given  $f: E \rightarrow \mathbb{R}$ ,

compute a fn.  $F \in X$

such that

$$F = f \text{ on } E$$

and

$$\|F\|_X \leq C \|f\|_{X(E)}.$$

PREVIOUS WORK

ON

WHITNEY'S PROBLEM

for

SOBOLEV SPACES

GREAT CREDIT GOES TO:

PAVEL SHVARTSMAN,

WHO UNDERSTOOD

WHITNEY'S PROBLEMS

FOR

$L^{1,p}(\mathbb{R}^n)$ ,  $p > n$ .



ARIE ISRAEL,

WHO UNDERSTOOD

THE CASE OF

$L^{2,p}(\mathbb{R}^2)$  ( $p > 2$ )

AND INTRODUCED THE

KEY IDEA OF

"KEYSTONE CUBES" <sup>(\*)</sup>

(\*) (SEE BELOW)

KEVIN LULI

and

PAVEL SHVARTSMAN,

who UNDERSTOOD

$L^{m,p}(\mathbb{R}^1)$ .



TODAY'S LECTURE

STATES THE RESULTS

OF JOINT WORK OF

ARIE ISRAEL,

KEVIN LULI,

&

cf.

The next lecture  
will sketch the proofs  
of some of the results  
stated today.

# NOTATION:

CONSTANTS DENOTED BY

$c, C, C', \dots$

ALWAYS DEPEND ONLY

on

$m, n, p.$

(RECALL:  $X = L^{m,p}(\mathbb{R}^n)$  or  $W^{m,p}(\mathbb{R}^n)$ )

THE SIMPLEST VERSION  
OF OUR RESULTS  
IS AS FOLLOWS.

RECALL :

WE ALWAYS ASSUME  
THAT

$$p > n.$$

Thm 1: Given  $E \subset \mathbb{R}^n$ ,

there exists a linear map

$$T: X(E) \rightarrow X$$

such that for all  $f \in X(E)$

we have

$$Tf = f \text{ on } E$$

and

$$\|Tf\|_X \leq C \|f\|_{X(E)}.$$

## THM 2 (COMPUTATION of the NORM):

Suppose  $E \subset \mathbb{R}^n$  is FINITE,

$$N = \#(E).$$

Then there exist linear functionals

$$\xi_1, \xi_2, \dots, \xi_N : X(E) \rightarrow \mathbb{R}$$

SUCH THAT :



## PROPERTIES OF $\xi_1, \dots, \xi_L$

$$L \leq CN$$

For any  $f \in X(E)$ , the number

$$\|f\| = \left( \sum_{l=1}^L |\xi_l(f)|^p \right)^{1/p}$$

satisfies

$$c \|f\| \leq \|f\|_{X(E)} \leq C \|f\|$$



For FINITE  $E \subset \mathbb{R}^n$ ,

THE LINEAR MAP

IN THM 1,

and the FUNCTIONALS

IN THM 2

HAVE **ADDITIONAL STRUCTURE**

THAT WILL HELP US TO

**COMPUTE EFFICIENTLY.**

We prepare to introduce  
the notion of

ASSISTED

BOUNDED

DEPTH

("ABD")

# MOTIVATION

GIVEN  $N$  REAL NUMBERS

$x_1, \dots, x_N,$

LET'S COMPUTE THEIR

VARIANCE,  $\sigma^2$ .

## Two STANDARD FORMULAS

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$$\sigma^2 = \frac{1}{2N^2} \sum_{i,j=1}^N (x_i - x_j)^2$$

(NEEDS  $\sim N^2$  COMPUTER OPS.)

$$\sigma^2 = \frac{1}{N} \sum_{i=1}^N (x_i - \bar{x})^2$$

where

$$\bar{x} = \frac{1}{N} \sum_{i=1}^N x_i$$

(NEEDS  $\sim N$  COMPUTER OPS.)

MORAL :

IT PAYS TO

PRECOMPUTE.

LET'S SEE WHAT WE WILL

PRECOMPUTE

for Whitney's Problems

in Sobolev Spaces.



Let  $E \subset \mathbb{R}^n$  be finite,  
 $\#(E) = N$ .

A LINEAR FUNCTIONAL

$$\omega: X(E) \rightarrow \mathbb{R}$$

can be expressed as

$$\omega(f) = \sum_{x \in E} \mu(x) \cdot f(x)$$

with coefficients  $\mu(x)$   
independent of  $f$ .

WE DEFINE THE DEPTH OF  $\omega$ ,

DENOTED BY  $dp(\omega)$ ,

TO BE THE NUMBER OF

NONZERO COEFFICIENTS  $\mu(x)$ .



Given  $f \in X(E)$ , it takes

$\sim dp(\omega)$  COMPUTER OPS.

to CALCULATE  $\omega(f)$ .

A FINITE SET  $\Omega$  OF  
LINEAR FUNCTIONALS ON  $X(E)$

WILL BE CALLED A

SET OF ASSISTANTS FOR  $X(E)$

IF IT SATISFIES

$$\sum_{\omega \in \Omega} d_{\omega} \leq CN.$$

Let  $\Omega$  be a set of assists for  $X(E)$ .

Given  $f \in X(E)$ , the work  
required to evaluate ALL  
the functionals  $w \in \Omega$  on  $f$   
is comparable to the work  
required MERELY TO READ  
THE DATA  $f$ .

THE ASSISTS  $\omega \in \Omega$

will play the rôle of

the MEAN  $\bar{x}$

in the computation of the

variance of  $N$  given

real numbers.

WE NOW GIVE THE  
DEFINITION OF  
ASSISTED BOUNDED  
DEPTH.



Let  $E \subset \mathbb{R}^n$ ,  $\#(E) = N < \infty$ .

Let  $\Omega \subset [X(E)]^*$  be

A SET OF ASSISTS.

A LINEAR FUNCTIONAL

$\xi \in [X(E)]^*$  has

$\Omega$ -ASSISTED BOUNDED DEPTH

if it can be written

as follows ...

$$\xi(f) = \sum_{x \in E} \mu(x) f(x) + \sum_{\omega \in \Omega} \lambda(\omega) \cdot \omega(f)$$

where

$\mu(x)$  ( $x \in E$ ) and  $\lambda(\omega)$  ( $\omega \in \Omega$ )  
are INDEPENDENT of  $f$

and

AT MOST  $C$  OF THE COEFFICIENTS  
 $\mu(x)$ ,  $\lambda(\omega)$  are NONZERO.



SUPPOSE WE ARE GIVEN :

- $E \subset \mathbb{R}^n$  finite
- $\Omega \subset [X(E)]^*$  a SET OF ASSISTS
- $\xi \in [X(E)]^*$  of  $\Omega$ -assisted  
BOUNDED DEPTH
- $f \in X(E)$ .

ONCE WE HAVE PRECOMPUTED  
 $\omega(f)$  for all the  $w \in \Omega$ , WE  
CAN CALCULATE  $\xi(f)$   
USING ONLY  $\subset$  COMPUTER OPS.

NEXT WE DEFINE

OPERATORS OF

$\Omega$ -ASSISTED

BOUNDED DEPTH.

Let  $E \subset \mathbb{R}^n$  (FINITE),  
and let  $\Omega \subset [X(E)]^*$   
be a set of ASSISTS for  $X(E)$ .

A linear map  $T: X(E) \rightarrow X$

has  $\Omega$ -ASSISTED BDD. DEPTH

if it can be expressed  
as follows.

$Tf(x) =$

$$\sum_{y \in E} \mu(x, y) f(y) + \sum_{\omega \in \Omega} \lambda(x, \omega) \cdot \omega(f)$$

for all  $f \in X(E)$  and  $x \in \mathbb{R}^n$ ,

where

$\mu(x, y)$  and  $\lambda(x, \omega)$  are  
INDEPENDENT of  $f$ ,

and

For each fixed  $x \in \mathbb{R}^n$ , at most  $C$   
of the coefficients  $\mu(x, y)$ ,  $\lambda(x, \omega)$   
are NONZERO.



## SUPPOSE WE ARE GIVEN

- $E \subset \mathbb{R}^n$  FINITE
- $\Omega \subset [X(E)]^*$ , A SET OF ASSISTS
- $T: X(E) \rightarrow X$ ,  
A LINEAR MAP OF  $\Omega$ -ASSISTED BDD DEPTH
- $f \in X(E)$ .

ONCE WE HAVE PRECOMPUTED

$w(f)$  (all  $w \in \Omega$ ),

WE CAN CALCULATE  $Tf(x)$

FOR ANY GIVEN QUERY PT.  $x$

USING AT MOST  $C$  COMPUTER OPS. ,

ASSUMING SOMEONE TELLS US

THE COEFFICIENTS

$\mu(x, y)$  and  $\lambda(x, \omega)$ .

NOTE :

$$\Omega = \phi \text{ (EMPTY SET)}$$

$\Rightarrow$

$\Omega$ -ASSISTED BDD. DEPTH

REDUCES TO OUR EARLIER

NOTION OF

BOUNDED DEPTH.



WE CAN NOW STATE

TODAY'S MAIN RESULTS

IN A MORE

PRECISE FORM.

THM 3: Let  $E \subset \mathbb{R}^n$ , FINITE.

Then there exist a SET OF ASSISTERS

$$\Omega \subset [X(E)]^*$$

and a LINEAR MAP

$$T: X(E) \rightarrow X$$

OF  $\Omega$ -ASSISTED BOUNDED DEPTH,

such that for all  $f \in X(E)$

we have

$$Tf = f \text{ on } E$$

and

$$\|Tf\|_X \leq C \|f\|_{X(E)}$$

Thm 4: Let  $E \subset \mathbb{R}^n$ ,  $\#(E) = N < \infty$ .

Then there exist

$$\Omega \subset [X(E)]^*$$

and

$$\xi_1, \dots, \xi_L \in [X(E)]^*$$

with the following properties:

- $\Omega$  is a SET OF ASSISTS

- Each  $\xi_\ell$  has  $\Omega$ -ASSISTED BDD. DEPTH

- $L \leq CN$

Moreover, for each  $f \in X(E)$ ,

the number

$$\|f\| = \left( \sum_{\ell=1}^L |\xi_\ell(f)|^p \right)^{1/p}$$

satisfies

$$c \|f\| \leq \|f\|_{X(E)} \leq C \|f\|$$

# QUESTION :

Can we replace

ASSISTED BDD DEPTH

by

BDD. DEPTH

in

Thms 3 & 4 ?



ANSWER :

FOR THM 3 ON

LINEAR EXTENSION OPERATORS

THE ANSWER IS

**NO!**

(WE HAVE A COUNTEREXAMPLE.)

For Thm 4

(on the computation of  $\|f\|_{X(\epsilon)}$ ),

the ANSWER IS

**MAYBE.**

WE DON'T KNOW.

THERE'S AN INTERESTING

POSSIBLE CONNECTION

To ...



# SPARSIFICATION

BATSON-SPIELMAN-SRIVASTAVA

PROVED THE FOLLOWING RESULT.

Thm of BSS :

Let  $\xi_1, \dots, \xi_N$  be linear functionals on  $\mathbb{R}^D$ .

Then there exist coefficients

$\lambda_1, \dots, \lambda_N \geq 0$  such that

At most  $\uparrow$  CD of the  $\lambda_n$  are Non zero,  
ABSOLUTE CONSTANT

yet

$$\sum_n \lambda_n \cdot (\xi_n(v))^2 \leq \sum_n (\xi_n(v))^2 = 2 \sum_n \lambda_n (\xi_n(v))^2$$

for all  $v \in \mathbb{R}^D$ .

In particular, we can  
calculate the variance

of  $x_1, \dots, x_N \in \mathbb{R}$

up to a factor of 2,

using  $O(N)$  COMPUTER OP'S

WITHOUT PRECOMPUTING.

## REMARKS :

- The results of  
BATSON-SPIELMAN-SRIVASTAVA  
are MORE PRECISE  
than the version stated here.

- The  $O(N)$  computation of  
a variance without precomputing  
follows from the existence of  
EXPANDER GRAPHS.

Thanks to  
Bo'az KLARTAG  
&  
ASSAF NAOR  
for discussions of  
Sparsification.



QUESTION, POSSIBLY

RELEVANT TO WHITNEY'S

PROBLEMS IN SOBOLEV SPACES:

IS THERE A VERSION OF  
THE BSS THM, WITH

$\sum_n |\xi_n(v)|^2$  replaced by

$\sum_n |\xi_n(v)|^p$  ?

NO ONE KNOWS

SEE ALSO THE WORK OF

PAVEL SHVARTSMAN

on

SPARSIFICATION

for  $L^{m,p}(\mathbb{R}^n)$

when  $m=1, 2$ .



We now turn from  
SPARSIFICATION

to discuss further

Thms 3 & 4 on

LINEAR EXTENSION OPS.

&

COMPUTATION of the NORM.

Thm 5: Using at most

$CN \log N$  computer ops

and at most  $CN$  storage,

we can compute a

set of ASSISTS  $\Omega$  for  $X(E)$

and a set of functionals

$\xi_1, \dots, \xi_L$  satisfying the

Conditions of Thm 4.

=

Recall the ASSERTIONS OF THM 4

$\Omega$  is a set of assists

Each  $\xi_\ell$  has  $\Omega$ -assisted bdd. depth.

$$L \leq CN$$

The quantity

$$\|f\| = \left( \sum_{\ell=1}^L |\xi_\ell(f)|^p \right)^{1/p}$$

differs from

$$\|f\|_{X(E)}$$

by at most a factor  $C$

(any  $f \in X(E)$ ).

## Corollary of Thm 5

Given  $E \subset \mathbb{R}^n$  with  $\#(E) = N < \infty$ ,  
we can do  $O(N \log N)$  work,  
AFTER WHICH, GIVEN ANY  $f \in X(E)$

WE CAN COMPUTE  $\|f\|_{X(E)}$

UP TO A FACTOR  $C$ ,

USING  $O(N)$  COMPUTER OPS.

(IT TAKES  $N$  OP'S JUST  
TO READ  $f$ .)



THM 6 : UNDER THE ASSUMPTIONS

OF THM. 3, WE CAN COMPUTE

A SET OF ASSISTS  $\Omega \subset [X(E)]^*$

AND A LINEAR MAP

$$T: X(E) \rightarrow X$$

SATISFYING THE CONCLUSIONS

OF THM. 3.

THE COMPUTATION IS

EFFICIENT.

MORE PRECISELY :

WE CAN COMPUTE  $\Omega$  USING

$\leq CN \log N$  COMPUTER OP'S, and

$\leq CN$  STORAGE.

FURTHERMORE,

AFTER ONE-TIME WORK  $\leq CN \log N$

USING STORAGE  $\leq CN$ ,

WE CAN ANSWER QUERIES



A QUERY CONSISTS OF

A POINT  $x \in \mathbb{R}^n$ .

The RESPONSE to a query  $x$   
is a formula

$Tf(x) =$

$$\sum_{y \in E} \mu(x, y) f(y) + \sum_{\omega \in \Omega} \lambda(x, \omega) \omega(f),$$

where we omit terms with  
 $\mu(x, y)$  or  $\lambda(x, \omega) = 0$ .

The WORK TO ANSWER  
A QUERY IS AT MOST  
 $C \log N$ .

Our linear map  $T$  satisfies

$$Tf = f \text{ on } E$$

and

$$\|Tf\|_X \leq C \|f\|_{X(E)}$$

for all  $f \in X(E)$ .

END OF THM. 6

Corollary :

Let  $E \subset \mathbb{R}^n$ ,  $\#(E) = N < \infty$ .

Given  $f: E \rightarrow \mathbb{R}$ ,

WE CAN PERFORM

$\leq CN \log N$  WORK, USING

$\leq CN$  STORAGE,

AFTER WHICH WE CAN

ANSWER QUERIES.

A QUERY CONSISTS OF A  
POINT  $x \in \mathbb{R}^n$ ,

and the RESPONSE to a query  $x$   
is  $F(x)$ , for a function

$F \in X$  such that

$F = f$  on  $E$

and

$$\|F\|_X \leq C \|f\|_{X(E)}.$$



Here,  $F$  is determined by  $f$ .

(It doesn't depend on our  
QUERIES.)

Proof of the Cor:

Take  $F = Tf$ ,

and apply Thm 6 to

Compute  $T$ .

The above results

bring our UNDERSTANDING

of WHITNEY'S PROBLEMS

for  $W^{m,p}(\mathbb{R}^n)$ ,  $L^{m,p}(\mathbb{R}^n)$

close to what was achieved

for  $C^m(\mathbb{R}^n)$ ,

PROVIDED  $p > n$ .



WHAT ABOUT

$$p \leq n ?$$

Of course we require

$$p > \frac{n}{m}, \quad p \geq 1.$$

THE NEXT LECTURE

WILL SKETCH THE PROOFS

OF SOME OF TODAY'S THMS.

THANK You!