ON THE REPRESENTATION OF OPERATORS IN BASES OF COMPACTLY SUPPORTED WAVELETS*

G. BEYLKIN[†]

A str ct This paper describes exact and explicit representations of the di erential operators, $n = 1 \ 2 \cdots$, in orthonormal bases of compactly supported wavelets as well as the representations of the Hilbert transform and fractional derivatives. The method of computing these representations is directly applicable to multidimensional convolution operators.

Also, sparse representations of shift operators in orthonormal bases of compactly supported wavelets are discussed and a fast algorithm requiring (\log) operations for computing the wavelet coe cients of all circulant shifts of a vector of the length = 2^n is constructed. As an example of an application of this algorithm, it is shown that the storage requirements of the fast algorithm for applying the standard form of a pseudodi erential operator to a vector (see [G. Beylkin, R. R. Coifman, and V. Rokhlin, Comm. Pure. Appl. Math., 44 (1991), pp. 141{183]) may be reduced from () to (\log^2) signi cant entries.

 ${f ey}$ ords wavelets, di erential operators, Hilbert transform, fractional derivatives, pseudodi erential operators, shift operators, numerical algorithms

AMS_MOS s ect c ssi c tions 65D99, 35S99, 65R10, 44A15

1. Introduction. n Decenological pcypo edee ecopo edee ecopo edee en on of eecopo edee en on of eecopo edee en on of eecopo edee en ope en of ecopo edee en ope en n O N o' N o' o' o' fo co' p n' e eecopo en of N c c n for ecopo en n O N o' N o' o' ppe eony co' pe en on nd dfo' of ope o nce o' pe' eoo n nd dfo' fo' en on nd dfo' of ope o' nce o' pe' eoo n nd dfo' fo' en on nd dfo' of ope o' nce o' pe' eoo n' fo' ecopo n' fo' ecopo

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o O o N n c n en e

2. Compactly supported wavelets n compact of each of the con of

2. Compactly supported wavelets. n ec on e e y e e e o ono q e of col p c y ppo ed e e nd e o no on o e de e efe o

e o ono $^{\uparrow}$ of co $^{\downarrow}$ p c y ppo ed e e of L^2 R fo $^{\uparrow}$ ed y e d on nd n on of n e f nc on x

$$\mathbf{I}$$
 $_{j,k}$ \mathbf{x} $^{-j/2}$ $^{-j}\mathbf{x}$ \mathbf{k} ;

e e \mathbf{j} ; \mathbf{k} $\mathbf{2}$ \mathbf{Z} e f nc on \mathbf{x} colp p n on e c n f nc on \mathbf{x} nd e e f nc on fy e fo o n e on

$$\mathbf{p}_{\mathbf{k}=0}$$
 \mathbf{h}_{k} \mathbf{x} \mathbf{k} ;

$$\mathbf{x}$$
 $\mathbf{p}_{\underline{k}=0}$ \mathbf{g}_{k} \mathbf{x} \mathbf{k}

e e

$$\mathsf{g}_k$$
 $\mathsf{I}^k \mathsf{h}_{L-k-1};$ k ; ; L I ;

nd

$$\mathbf{Z}_{+\infty}$$
 $\mathbf{x} \, d\mathbf{x} \, \mathbf{I}$:

n dd on efnc on **M** n n h h en

$$\mathbf{Z}_{+\infty}$$
 $\mathbf{x} \ \mathbf{x}^m \mathbf{dx} \ ; \ \mathbf{m} \ ; \ \mathbf{M} \ \mathbf{J} : \mathbf{M}$

where

Py
$$k=0$$
 $k=0$ $k=0$ $k=0$ $k=0$

and R is an odd polynomial such that

$$P y y^M R_{\frac{1}{2}} y \text{ fo } y I$$

and

3. The operator d=dx in wavelet bases. n ec on e con c e non nd d fo u of e ope o d=dx e non nd d fo u, ep e en on of n ope o T c n of p e

$$\label{eq:total_state} \mathsf{T} \quad \mathsf{fA}_j; \mathsf{B}_j; \ _j \mathsf{g}_{j \in \mathbf{Z}}$$
 c not on e p ce V_j not W_j

$$\mathbf{A}_{j}$$
 \mathbf{W}_{j} ! \mathbf{W}_{j} ;

$$\mathbf{B}_{j}$$
 \mathbf{V}_{j} ! \mathbf{W}_{j} ;

$$_{j}$$
 \mathbf{W}_{j} ! \mathbf{V}_{j} :

e ope o $\mathbf{f}\mathbf{A}_j; \mathbf{B}_j; \ _j\mathbf{g}_{j\in\mathbf{Z}}$ e de ned \mathbf{A}_j $\mathbf{Q}_j\mathbf{T}\mathbf{Q}_j \ \mathbf{B}_j$ $\mathbf{Q}_j\mathbf{T}\mathbf{P}_j$ nd $_j$ $\mathbf{P}_j\mathbf{T}\mathbf{Q}_j$ e e \mathbf{P}_j e p o ec on ope o on e p ce \mathbf{W}_j e p o ec on ope o on e p ce \mathbf{W}_j e e e e en $_{il}^{j}$ $_{il}^{j}$ $_{il}^{j}$ of \mathbf{A}_j \mathbf{B}_j $_{j}$ nd \mathbf{r}_{il}^{j} of \mathbf{T}_j $\mathbf{P}_j\mathbf{T}\mathbf{P}_j$ i; l; j 2 Z fo e ope o \mathbf{d} de

opoe e on eco pe
$$\mathbf{jm}_0$$
 \mathbf{j}^2 \mathbf{m}' Indo n

$$\mathbf{jm}_0$$
 \mathbf{j}^2 \mathbf{m}' \mathbf{m}_0 \mathbf{m}

■ If the integr

e n n ; ; ; e o n r r nd ; ; ; ; e n q ene of e o on of ; nd ; fo o f δn e n q ene of e ep e en on of d=dx en e o on r_l of ; nd ;

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OPERATORS IN

P OPO ON

$$\mathbf{r}_{l}^{(n)}$$
 $r_{2l}^{(n)}$ \mathbf{Ar}_{2l} $\mathbf{x}_{k=1}^{(n)}$ \mathbf{a}_{2k-1} $\mathbf{r}_{2l-2k+1}^{(n)}$ $\mathbf{r}_{2l+2k-1}^{(n)}$ $\mathbf{5}$;

and

$$\mathbf{X}$$
 $\mathbf{I}^n \mathbf{r}_l^{(n)}$
 $\mathbf{I}^n \mathbf{n}$;

where \mathbf{a}_{2k-1} are given in \mathbf{a}_{2k-1} .

Let \mathbf{M} \mathbf{n} \mathbf{l} = ; where \mathbf{M} is the number of vanishing moments in \mathbf{l} . If the integrals in \mathbf{l} or exist; then the equations \mathbf{r} and have a unique solution with a finite number of nonzero coefficients $\mathbf{r}_l^{(n)}$; namely, $\mathbf{r}_l^{(n)}$ 6 for \mathbf{l} \mathbf{l} \mathbf{l} ; such that for even \mathbf{n}

$$\mathbf{r}_{l}^{(n)}$$
 $\mathbf{r}_{-l}^{(n)};$ \mathbf{x} $\mathbf{l}^{2\tilde{n}}\mathbf{r}_{l}^{(n)}$; \mathbf{n} $\mathbf{I};$; \mathbf{n} = $\mathbf{I};$

and

$$\mathbf{x}$$
 $\mathbf{r}_{l}^{(n)}$;

and for odd **n**

$$\mathbf{r}_{l}^{(n)}$$
 $\mathbf{r}_{-l}^{(n)}$; $\mathbf{r}_{l}^{(n)}$; $\mathbf{r}_{l}^{(n)$

$$\mathbf{a}_1$$
 -; \mathbf{a}_3 $\stackrel{\blacksquare}{-}$;

 nd

$$\mathbf{r}_{-2}$$
 $\stackrel{\parallel}{-}$; \mathbf{r}_{-1} $\stackrel{\parallel}{-}$; \mathbf{r}_0 ; \mathbf{r}_1 $\stackrel{\parallel}{-}$; \mathbf{r}_2 $\stackrel{\parallel}{-}$:

$$\mathbf{r}_l^{(n)}$$
 $\mathbf{z}_{2\pi} \mathbf{X} \mathbf{j}$ $\mathbf{k} \mathbf{j}^2$ $\mathbf{k}^n \mathrm{e}^{-\mathrm{i} l \xi} \mathbf{d}:$

e efo e

$$\mathbf{x}$$
 \mathbf{y} \mathbf{x} \mathbf{y} \mathbf{y}

ее

$$\mathbf{r}$$
 $\mathbf{r}^{(n)}_l\mathrm{e}^{\mathrm{i}l\xi}$:

n e e on

$$\mathbf{m}_0 = \mathbf{m}_0 = \mathbf{m}_0$$

no e nd de of nd hh nd ep e y o e e en nd odd nd ce

$$\mathbf{I}$$
 \mathbf{r} $\mathbf{m}_0 = \mathbf{j}^2 \mathbf{r} = \mathbf{j} \mathbf{m}_0 = \mathbf{j}^2 \mathbf{r} = \mathbf{j}$:

By con de \mathbf{n}' e ope o \mathbf{M}_0 de ned on pe od c f nc on

$$M_0f$$
 $jm_0 = j^2 f = jm_0 = j^2 f = ;$

e e e Ⅰ

$$\mathbf{M}_{0}\mathbf{r}$$
 $\mathbf{M}_{0}\mathbf{r}$ $^{-n}\mathbf{r}$:

r ne en eco of e ope o M_0 co e pond no e e en e $^{-n}$ nd e efo e nd no e ep e en on of e de e n e e e eq en o nd no e ope yno o on of n and ce e e ope o n on od ced no nd ced no nd e e e e p o e n and n e e e e p o e n and n e e en e n con de ed

$D_2^p P D_2 P$

e e \mathbf{P}_{il} il j \mathbf{n} nd e e \mathbf{j} c o en depend \mathbf{n}' on \mathbf{i} ; \mathbf{l} o \mathbf{N} $\mathbf{N} = j-1$ \mathbf{i} \mathbf{i} ; \mathbf{l} \mathbf{N} $\mathbf{N} = j$ nd \mathbf{P}_{NN} n e nd n cond on n e





Table 3

Condition numbers of the matrix of periodized second derivative (with and without preconditioning

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 \mathbf{n}' and \mathbf{e} den \mathbf{y}' \mathbf{e} $\mathbf{m}_0 = \mathbf{e}$ \mathbf{e} \mathbf{e} \mathbf{e}

 $\begin{bmatrix} \mathbf{I} & \mathbf{m} \\ -\mathbf{e}_{\xi} & \mathbf{jm}_0 & \mathbf{j}^2 \\ & & \xi=0 \end{bmatrix}$ fo $\mathbf{I} \quad \mathbf{m} \quad \mathbf{M} \quad \mathbf{I};$

o deo 🛘

 \mathbf{J} \mathbf{J} \mathbf{J} \mathbf{m} \mathbf{j} \mathbf{m} \mathbf{M} \mathbf{J} :

B for for for eep c ep e en on n Remark [S Eq on nd ?] of py e en n den of e coe c en \mathbf{a}_{2k-1} for ?] n n n ey

nd

$$m{\chi}^1 \ m{\chi}^1$$
 $h_k \ m{g}_k \ m{r}_{2i+k-k}$:

e coe c en \mathbf{r}_l **| 2 Z** n \mathbf{r}_{l} ? fy e fo o n y en of ne e eq on

$$\mathbf{r}_l$$
 \mathbf{r}_{2l} \mathbf{r}_{2l} \mathbf{a}_{2k-1} $\mathbf{r}_{2l-2k+1}$ $\mathbf{r}_{2l+2k-1}$;

e e e coe c en \mathbf{a}_{2k-1} e en n \mathfrak{p} n e \mathfrak{p} p o c of \mathbf{r}_l fo e

$$\mathbf{r}_l = \frac{\mathbf{I}}{\mathbf{I}} \quad \mathbf{O} \quad \frac{\mathbf{I}}{\mathbf{I}^{2M}} :$$

By e n
$$r_l$$
 r_l r_l

Examp

Table 5

The coe cients $\{_{\mu}I\}_I$, $=-7\cdots$ 14 of the fractional derivative =0.5 for Daubechies' wavelet with six vanishing moments.

		Coe cients	Coe cients	
		p .l	V ·l	
M = 6	-7	-2.82831017E-06	4	-2.77955293E-02
	-6	-1.68623867E-06	5	-2.61324170E-02
	-5	4.45847796E-04	6	-1.91718816E-02
	-4	-4.34633415E-03	7	-1.52272841E-02
	-3	2.28821728E-02	8	-1.24667403E-02
	-2	-8.49883759E-02	9	-1.04479500E-02
	-1	0.27799963	10	-8.92061945E-03
	0	0.84681966	11	-7.73225246E-03
	1	-0.69847577	12	-6.78614593E-03
	2	2.36400139E-02	13	-6.01838599E-03
	3	-8.97463780E-02	14	-5.38521459E-03

6. Shift operator on V_0 and fast wavelet decomposition of all circulant shifts of a vector. Le $\operatorname{con} \operatorname{de} \operatorname{f} \operatorname{y} \operatorname{one} \operatorname{on} \operatorname{e} \operatorname{p} \operatorname{ce} V_0 \operatorname{ep} \operatorname{e} \operatorname{en} \operatorname{ed} \operatorname{y} \operatorname{ep}$

$$\mathbf{t}_{i-j}^{(0)} \qquad \qquad \mathbf{t}_{i-j}^{(0)} \qquad \qquad i-j,1;$$
e e e $\mathbf{t}_l^{(0)}$ o n e \mathbf{a}_n of $\mathbf{t}_l^{(0)}$ e e
$$\mathbf{t}_l^{(0)} \qquad \qquad l,1; \qquad \mathbf{t}_l^{(1)} \qquad \frac{1}{2}\mathbf{a}_{|2l-1|}; \qquad \vdots$$

e on y nonze o coe c en $\mathbf{t}_l^{(j)}$ on e c c e \mathbf{j} e o e nd ce \mathbf{L} \mathbf{l} \mathbf{L} \mathbf{A} o $\mathbf{t}_l^{(j)}$! \mathbf{l} , \mathbf{l} , \mathbf{j} ! \mathbf{l} \mathbf{A} n e \mathbf{l} pe e fo o n e [con n] e coe c en $\mathbf{t}_l^{(j)}$ i \mathbf{l} ;; ; fo e f ope o n D ec e e e e e e n n \mathbf{l} 0 en e no e e f y n n e e o e n one e ed \mathbf{l} y o e e f e o e e nonze o coe c en $\mathbf{t}_l^{(j)}$ l o de e n e \mathbf{j} \mathbf{l} \mathbf{l}

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Table 6 The coe cients $\{{j \choose l}\}_{l=-L+2}^{l=L-2}$ for Daubechies' wavelet with three vanishing moments, where L= 6 and $\vec{\vee}=$ 1 \cdots 8.

		Coe cients			Coe cients
		(j) l			(<i>j</i>)
√ = 1	-4	0.	√ = 5	-4	-8.3516169979703E-06
	-3	0.		-3	-4.0407157939626E-04
	-2	1.171875E-02		-2	4.1333660119562E-03
	-1	-9.765625E-02		-1	-2.1698923046642E-02
	0	0.5859375		0	0.99752855458064
	1	0.5859375		1	2.4860978555807E-02
	2	-9.765625E-02		2	-4.9328931709169E-03
	3	1.171875E-02		3	5.0836550508393E-04
	4	0.		4	1.2974760466022E-05
			;		4 70504000404005 07
√ = 2	-4	0.	√ = 6	-4	-4.7352138210499E-06
	-3	-1.1444091796875E-03		-3	-2.1482413927743E-04
	-2	1.6403198242188E-02		-2	2.1652627381741E-03
	-1	-1.0258483886719E-01		-1	-1.1239479930566E-02
	0	0.87089538574219		0	0.99937113652686
	1	0.26206970214844		1	1.2046257104714E-02
	2	-5.1498413085938E-02		2	-2.3712690179423E-03
	3	5.7220458984375E-03		3	2.4169452359502E-04
	4	1.3732910156250E-04		4	5.9574082627023E-06
<i>√</i> = 3	-4	-1.3411045074463E-05	√ = 7	-4	-2.5174703821573E-06
	-3	-1.0904073715210E-03		-3	-1.1073373558501E-04
	-2	1.2418627738953E-02		-2	1.1081638044863E-03
	-1	-6.9901347160339E-02		-1	-5.7198034904338E-03
	0	0.96389651298523		0	0.99984123346637
	1	0.11541545391083		1	5.9237906308573E-03
	2	-2.3304820060730E-02		2	-1.1605296576369E-03
	3	2.5123357772827E-03		3	1.1756409462604E-04

$\dot{\vee}$ = 4	-4	-1.2778211385012E-05	√ = 8	-4	-1.2976609638869E-06
	-3	-7.1267131716013E-04		-3	-5.6215105787797E-05
	-2	7.5265066698194E-03		-2	5.6059346249153E-04
	-1	-4.0419702418149E-02		-1	-2.8852840759448E-03
	0	0.99042607471347		0	0.99996009015421
	1	5.2607019431889E-02		1	2.9366035254748E-03
	2	-1.0551069863141E-02		2	-5.7380655655486E-04
	3	1.1071795597672E-03		3	5.7938552839535E-05
	4	2.9441434890032E-05		4	1.3777042338989E-06

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fo o e \mathbf{s}_k^{j-1} \mathbf{k} ; ; $^{n-j}$ e one of e eco of e e on epe o c e \mathbf{j} and con p e

$$\mathbf{s}_k^j$$
 $\mathbf{s}_{n=0}^{n-1} \mathbf{h}_n \mathbf{s}_{n+2k-1}^{j-1};$

$$\mathbf{s}_k^j$$
 i $\mathbf{h}_n\mathbf{s}_{n+2k}^{j-1}$;

 nd

$$\mathbf{d}_k^j$$
 \mathbf{d}_k^{j-1} $\mathbf{g}_n\mathbf{s}_{n+2k-1}^{j-1};$

$$\mathbf{d}_k^j \, \mathbf{I} \qquad \mathbf{d}_k^{j-1} \, \mathbf{g}_n \mathbf{s}_{n+2k}^{j-1} \mathbf{s}_n^{j-1} \mathbf{s}_n^{j-$$

[
$$\mathbf{v}_1$$
 \mathbf{d}_k^1 \mathbf{d}_k^1 \mathbf{d}_k^1

nd

$$\mathbf{u}_1 \quad \mathbf{s}_k^1 \quad ; \mathbf{s}_k^1 \mathbf{I} \quad ;$$

e e \mathbf{d}_k^1 \mathbf{d}_k^1 \mathbf{s}_k^1 and \mathbf{s}_k^1 e con p ed f on \mathbf{s}_k^0 cco d n o \mathbf{s}_k^0 for e econd c e \mathbf{j} e e

$$\mathbf{v}_2 = \mathbf{d}_k^2$$
 ; \mathbf{d}_{e} ge 8)

ne c e fo o \mathbf{s}_k^1 nd \mathbf{s}_k^1 e no n po e coe c en fo odd nd e en f c e co ec n \mathbf{v}_2 nd \mathbf{u}_2 e c

e e eco $\mathbf{V}_1; \mathbf{V}_2;$; \mathbf{V}_n con n e coe c'en e e coe c'en e no o'n zed eq en y no de o cce en e e en e e o e \mathbf{i}_{loc} $\mathbf{i}_s; \mathbf{j}$ no \mathbf{N} o' \mathbf{N} ope on fo o o e c f \mathbf{i}_s is \mathbf{N} of e eco $\mathbf{s}_k^0; \mathbf{k}$; ; \mathbf{N} e e e n y e p n on of \mathbf{i}_s

$$\mathbf{i}_s \qquad \qquad \begin{matrix} l = \mathbf{X}^{-1} \\ l \end{cases};$$

ee l ; lo ed cej lj neco^l pe

$$\mathbf{i}_{loc}\ \mathbf{i}_{s};\mathbf{j}$$
 \mathbf{x}^{-1} \mathbf{i}_{l} ;

nd

[a]
$$\mathbf{i}_b$$
 \mathbf{i}_s ; \mathbf{j} \mathbf{x}^j l ; $l=n-1$

o cej j n nd f i $_s$ i $_s$ N eco pe o e n nd f i $_s$ iverse o eco cen n eco $v_1; v_2; v_n$ fo con n co pe e e en

e no e y de c e one of e pp c on of e o o o fo e fo e fo e decorpo on of c c n f of eco n n e c n y f e o ope o T e ne K $\mathbf{x};\mathbf{y}$

$$z_{+\infty}$$
 g x $x;y$ f y dy

y con c n fo ny ed cc cy p e non nd do nd d fo nd e e y ed c n e co of pp y n o f nc on

Le e e [s]

f e no con c e nd d fo l of K x; x z n e x nd z fo p e dod e en ope o no nece y con o on eo n pe col p e on of e ope o ndeed f e e ope o e ep e en ed n e fo l e e e e e dependence of e e ne K x; on x l oo nd e n e of l n c n en e n e nd d fo l of O o' l l e pp en d c y n col p n e e e e e decol po on of f x z fo e e y x nd ppe o eq e O N o on e o l o l of O o' l l e o o l of ec on ccol p e n O N o'