

# Wavelet approximation theory in higher dimensions

Hartmut Führ

fuehr@matha.rwth-aachen.de

CIRM, Nov. 2016

Lehrstuhl A für Mathematik, 

# Outline

- 1 Introduction: Nice wavelets and sparse signals in dimension one

# Outline

- 1 Introduction: Nice wavelets and sparse signals in dimension one
- 2 Continuous wavelet transforms over general dilation groups

# Outline

- 1 Introduction: Nice wavelets and sparse signals in dimension one
- 2 Continuous wavelet transforms over general dilation groups
- 3 Coorbit theory: A consistent wavelet approximation theory

# Outline

- 1 Introduction: Nice wavelets and sparse signals in dimension one
- 2 Continuous wavelet transforms over general dilation groups
- 3 Coorbit theory: A consistent wavelet approximation theory
- 4 Wavelet coorbit spaces over general dilation groups

# Outline

- 1 Introduction: Nice wavelets and sparse signals in dimension one
- 2 Continuous wavelet transforms over general dilation groups
- 3 Coorbit theory: A consistent wavelet approximation theory
- 4 Wavelet coorbit spaces over general dilation groups
- 5 Constructing compactly supported nice wavelets

# Outline

- 1 Introduction: Nice wavelets and sparse signals in dimension one
- 2 Continuous wavelet transforms over general dilation groups
- 3 Coorbit theory: A consistent wavelet approximation theory
- 4 Wavelet coorbit spaces over general dilation groups
- 5 Constructing compactly supported nice wavelets
- 6 Towards an understanding of coorbit spaces

# Overview

- 1 Introduction: Nice wavelets and sparse signals in dimension one
- 2 Continuous wavelet transforms over general dilation groups
- 3 Coorbit theory: A consistent wavelet approximation theory
- 4 Wavelet coorbit spaces over general dilation groups
- 5 Constructing compactly supported nice wavelets
- 6 Towards an understanding of coorbit spaces



# Wavelet orthonormal bases

## Definition

A wavelet ONB  $(\psi_{j,k})_{j,k \in \mathbb{Z}} \subset L^2(\mathbb{R})$  is an ONB of the form

$$(\psi_{j,k})_{j,k \in \mathbb{Z}} \subset L^2(\mathbb{R}), \psi_{j,k} = 2^{j/2} \psi(2^j x - k), \psi \text{ fixed}$$

# Wavelet orthonormal bases

## Definition

A wavelet ONB  $(\psi_{j,k})_{j,k \in \mathbb{Z}} \subset L^2(\mathbb{R})$  is an ONB of the form

$$(\psi_{j,k})_{j,k \in \mathbb{Z}} \subset L^2(\mathbb{R}), \psi_{j,k} = 2^{j/2} \psi(2^j x - k), \psi \text{ fixed}$$

## Simultaneous wavelet bases of smoothness spaces

# Wavelet orthonormal bases

## Definition

A wavelet ONB  $(\psi_{j,k})_{j,k \in \mathbb{Z}} \subset L^2(\mathbb{R})$  is an ONB of the form

$$(\psi_{j,k})_{j,k \in \mathbb{Z}} \subset L^2(\mathbb{R}), \psi_{j,k} = 2^{j/2} \psi(2^j x - k), \psi \text{ fixed}$$

## Simultaneous wavelet bases of smoothness spaces

- For sufficiently nice wavelets  $\psi$ , the wavelet expansion

$$f = \sum_{j,k \in \mathbb{Z}} \langle f, \psi_{j,k} \rangle \psi_{j,k}$$

converges in the norm of a homogeneous Besov space  $\dot{B}_{p,q}^\alpha$ , as soon as  $f \in \dot{B}_{p,q}^\alpha$ .

# Wavelet orthonormal bases

## Definition

A wavelet ONB  $(\psi_{j,k})_{j,k \in \mathbb{Z}} \subset L^2(\mathbb{R})$  is an ONB of the form

$$(\psi_{j,k})_{j,k \in \mathbb{Z}} \subset L^2(\mathbb{R}), \psi_{j,k} = 2^{j/2} \psi(2^j x - k), \psi \text{ fixed}$$

## Simultaneous wavelet bases of smoothness spaces

- For sufficiently nice wavelets  $\psi$ , the wavelet expansion

$$f = \sum_{j,k \in \mathbb{Z}} \langle f, \psi_{j,k} \rangle \psi_{j,k}$$

converges in the norm of a homogeneous Besov space  $\dot{B}_{p,q}^\alpha$ , as soon as  $f \in \dot{B}_{p,q}^\alpha$ . Furthermore, the property  $f \in \dot{B}_{p,q}^\alpha$  is equivalent to weighted summability of the coefficients. (Frazier/Jawerth)

# Wavelet orthonormal bases

## Definition

A wavelet ONB  $(\psi_{j,k})_{j,k \in \mathbb{Z}} \subset L^2(\mathbb{R})$  is an ONB of the form

$$(\psi_{j,k})_{j,k \in \mathbb{Z}} \subset L^2(\mathbb{R}), \psi_{j,k} = 2^{j/2} \psi(2^j x - k), \psi \text{ fixed}$$

## Simultaneous wavelet bases of smoothness spaces

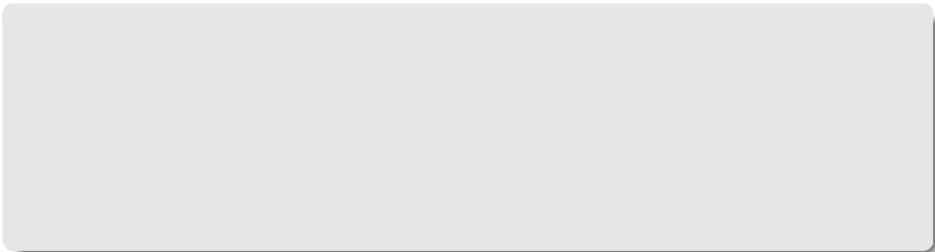
- For sufficiently nice wavelets  $\psi$ , the wavelet expansion

$$f = \sum_{j,k \in \mathbb{Z}} \langle f, \psi_{j,k} \rangle \psi_{j,k}$$

converges in the norm of a homogeneous Besov space  $\dot{B}_{p,q}^\alpha$ , as soon as  $f \in \dot{B}_{p,q}^\alpha$ . Furthermore, the property  $f \in \dot{B}_{p,q}^\alpha$  is equivalent to weighted summability of the coefficients. (Frazier/Jawerth)

- There exist arbitrarily nice compactly supported wavelets. (Daubechies)

# Significance of wavelet characterization



# Significance of wavelet characterization

- Reinterprets smoothness spaces as **spaces of sparse signals** with respect to wavelet ONB.

# Significance of wavelet characterization

- Reinterprets smoothness spaces as **spaces of sparse signals** with respect to wavelet ONB.
- Important byproduct: **Consistency**.



# Significance of wavelet characterization

- Reinterprets smoothness spaces as **spaces of sparse signals** with respect to wavelet ONB.
- Important byproduct: **Consistency**.  
All sufficiently nice wavelets have the same spaces of sparse signals!

# Significance of wavelet characterization

- Reinterprets smoothness spaces as **spaces of sparse signals** with respect to wavelet ONB.
- Important byproduct: **Consistency**.  
All sufficiently nice wavelets have the same spaces of sparse signals!
- Yields **mathematically rigorous justification** for many wavelet-based methods and algorithms, such as denoising, compression etc.

# What are nice wavelets?

Desirable properties of wavelets

# What are nice wavelets?

## Desirable properties of wavelets

A nice wavelet  $\psi \in L^2(\mathbb{R})$  typically has three properties

# What are nice wavelets?

## Desirable properties of wavelets

A nice wavelet  $\psi \in L^2(\mathbb{R})$  typically has three properties

(a) Fast decay, e.g.  $|\psi(x)| \leq C(1 + |x|)^{-n}$ ;

# What are nice wavelets?

## Desirable properties of wavelets

A nice wavelet  $\psi \in L^2(\mathbb{R})$  typically has three properties

- (a) Fast decay, e.g.  $|\psi(x)| \leq C(1 + |x|)^{-n}$ ;
- (b) Smoothness, e.g.  $\psi^{(j)} \in L^1(\mathbb{R})$ , for all  $1 \leq j \leq m$ ;

# What are nice wavelets?

## Desirable properties of wavelets

A nice wavelet  $\psi \in L^2(\mathbb{R})$  typically has three properties

- (a) Fast decay, e.g.  $|\psi(x)| \leq C(1 + |x|)^{-n}$ ;
- (b) Smoothness, e.g.  $\psi^{(j)} \in L^1(\mathbb{R})$ , for all  $1 \leq j \leq m$ ;
- (c) Vanishing moments, e.g.

$$\forall 0 \leq j < k : \int_{\mathbb{R}} x^j \psi(x) dx = 0$$

with absolute convergence of the integral

# What are nice wavelets?

## Desirable properties of wavelets

A nice wavelet  $\psi \in L^2(\mathbb{R})$  typically has three properties

- (a) Fast decay, e.g.  $|\psi(x)| \leq C(1 + |x|)^{-n}$ ;
- (b) Smoothness, e.g.  $\psi^{(j)} \in L^1(\mathbb{R})$ , for all  $1 \leq j \leq m$ ;
- (c) Vanishing moments, e.g.

$$\forall 0 \leq j < k : \int_{\mathbb{R}} x^j \psi(x) dx = 0$$

with absolute convergence of the integral

Shortly: Nice wavelets have good time-frequency localization.



# What are nice wavelets?

## Desirable properties of wavelets

A nice wavelet  $\psi \in L^2(\mathbb{R})$  typically has three properties

- (a) Fast decay, e.g.  $|\psi(x)| \leq C(1 + |x|)^{-n}$ ;
- (b) Smoothness, e.g.  $\psi^{(j)} \in L^1(\mathbb{R})$ , for all  $1 \leq j \leq m$ ;
- (c) Vanishing moments, e.g.

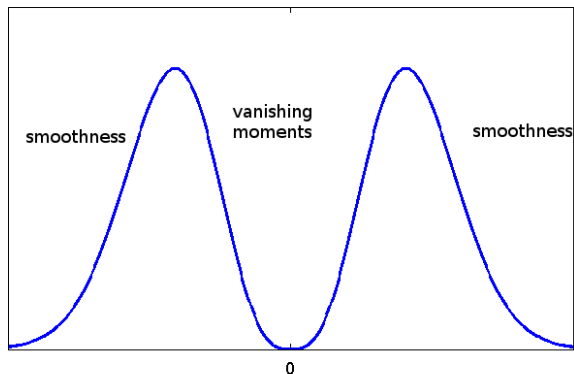
$$\forall 0 \leq j < k : \int_{\mathbb{R}} x^j \psi(x) dx = 0$$

with absolute convergence of the integral

Shortly: Nice wavelets have good time-frequency localization.

(Note: Frequency-side localization is understood **away from zero**.)

# Cartoon: Fourier side decay of wavelets



Plot of  $|\hat{\psi}|$ .

# Aims of this talk

## Main objective

Establish notion of nice wavelets for higher-dimensional wavelet transforms, with dilations coming from a suitable matrix group, the **dilation group**.

# Aims of this talk

## Main objective

Establish notion of nice wavelets for higher-dimensional wavelet transforms, with dilations coming from a suitable matrix group, the **dilation group**.  
Previously studied for: Similitude groups ( $\rightsquigarrow$  isotropic Besov spaces), shearlet dilation groups (Kutyniok, Dahlke, Steidl, Teschke; Dahlke, Häuser, Teschke)

# Aims of this talk

## Main objective

Establish notion of nice wavelets for higher-dimensional wavelet transforms, with dilations coming from a suitable matrix group, the **dilation group**.  
Previously studied for: Similitude groups ( $\rightsquigarrow$  isotropic Besov spaces), shearlet dilation groups (Kutyniok, Dahlke, Steidl, Teschke; Dahlke, Häuser, Teschke)

## Strategy

# Aims of this talk

## Main objective

Establish notion of nice wavelets for higher-dimensional wavelet transforms, with dilations coming from a suitable matrix group, the **dilation group**.  
Previously studied for: Similitude groups ( $\rightsquigarrow$  isotropic Besov spaces), shearlet dilation groups (Kutyniok, Dahlke, Steidl, Teschke; Dahlke, Häuser, Teschke)

## Strategy

- Verify prerequisites for **coorbit theory** (Feichtinger/Gröchenig).  
This provides access to:

# Aims of this talk

## Main objective

Establish notion of nice wavelets for higher-dimensional wavelet transforms, with dilations coming from a suitable matrix group, the **dilation group**.  
Previously studied for: Similitude groups ( $\rightsquigarrow$  isotropic Besov spaces), shearlet dilation groups (Kutyniok, Dahlke, Steidl, Teschke; Dahlke, Häuser, Teschke)

## Strategy

- Verify prerequisites for **coorbit theory** (Feichtinger/Gröchenig).  
This provides access to:
  - ▶ Consistent notion of sparse signals, via associated function spaces

# Aims of this talk

## Main objective

Establish notion of nice wavelets for higher-dimensional wavelet transforms, with dilations coming from a suitable matrix group, the **dilation group**.  
Previously studied for: Similitude groups ( $\rightsquigarrow$  isotropic Besov spaces), shearlet dilation groups (Kutyniok, Dahlke, Steidl, Teschke; Dahlke, Häuser, Teschke)

## Strategy

- Verify prerequisites for **coorbit theory** (Feichtinger/Gröchenig).  
This provides access to:
  - ▶ Consistent notion of sparse signals, via associated function spaces
  - ▶ A related definition of **nice wavelets**



# Aims of this talk

## Main objective

Establish notion of nice wavelets for higher-dimensional wavelet transforms, with dilations coming from a suitable matrix group, the **dilation group**.  
Previously studied for: Similitude groups ( $\rightsquigarrow$  isotropic Besov spaces), shearlet dilation groups (Kutyniok, Dahlke, Steidl, Teschke; Dahlke, Häuser, Teschke)

## Strategy

- Verify prerequisites for **coorbit theory** (Feichtinger/Gröchenig).  
This provides access to:
  - ▶ Consistent notion of sparse signals, via associated function spaces
  - ▶ A related definition of **nice wavelets**
- Need to show: Nice wavelets exist!

# Aims of this talk

## Main objective

Establish notion of nice wavelets for higher-dimensional wavelet transforms, with dilations coming from a suitable matrix group, the **dilation group**.  
Previously studied for: Similitude groups ( $\rightsquigarrow$  isotropic Besov spaces), shearlet dilation groups (Kutyniok, Dahlke, Steidl, Teschke; Dahlke, Häuser, Teschke)

## Strategy

- Verify prerequisites for **coorbit theory** (Feichtinger/Gröchenig).  
This provides access to:
  - ▶ Consistent notion of sparse signals, via associated function spaces
  - ▶ A related definition of **nice wavelets**
- Need to show: Nice wavelets exist!
- Better yet: Identify easily accessible classes of nice wavelets

# Aims of this talk

## Main objective

Establish notion of nice wavelets for higher-dimensional wavelet transforms, with dilations coming from a suitable matrix group, the **dilation group**.  
Previously studied for: Similitude groups ( $\rightsquigarrow$  isotropic Besov spaces), shearlet dilation groups (Kutyniok, Dahlke, Steidl, Teschke; Dahlke, Häuser, Teschke)

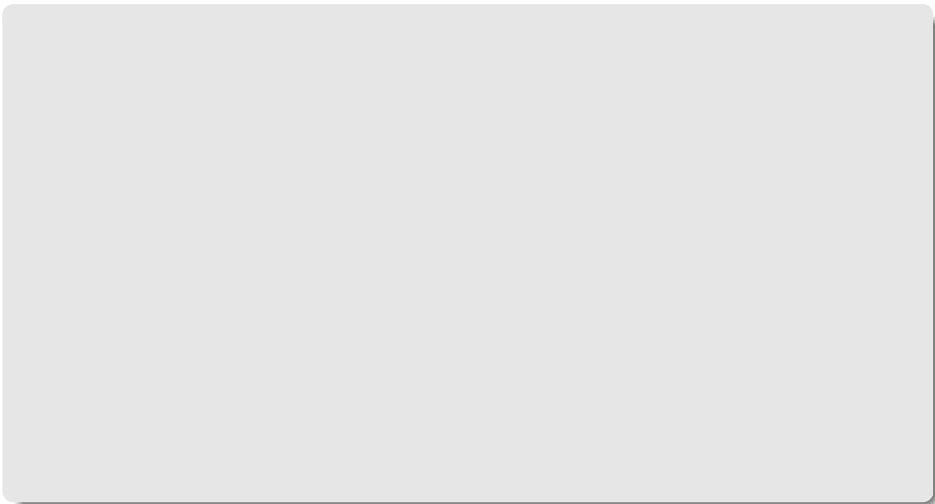
## Strategy

- Verify prerequisites for **coorbit theory** (Feichtinger/Gröchenig).  
This provides access to:
  - ▶ Consistent notion of sparse signals, via associated function spaces
  - ▶ A related definition of **nice wavelets**
- Need to show: Nice wavelets exist!
- Better yet: Identify easily accessible classes of nice wavelets ( $\rightsquigarrow$  bandlimited Schwartz functions, vanishing moment criteria)

# Overview

- 1 Introduction: Nice wavelets and sparse signals in dimension one
- 2 Continuous wavelet transforms over general dilation groups**
- 3 Coorbit theory: A consistent wavelet approximation theory
- 4 Wavelet coorbit spaces over general dilation groups
- 5 Constructing compactly supported nice wavelets
- 6 Towards an understanding of coorbit spaces

# Higher-dimensional CWT



# Higher-dimensional CWT

- $H < GL(d, \mathbb{R})$  a closed matrix group

# Higher-dimensional CWT

- $H < GL(d, \mathbb{R})$  a closed matrix group
- $G = \mathbb{R}^d \rtimes H$ , the affine group generated by  $H$  and translations. As a set,  $G = \mathbb{R}^n \times H$ , with group law

$$(x, h)(y, g) = (x + hy, hg) .$$

# Higher-dimensional CWT

- $H < GL(d, \mathbb{R})$  a closed matrix group
- $G = \mathbb{R}^d \rtimes H$ , the affine group generated by  $H$  and translations. As a set,  $G = \mathbb{R}^n \times H$ , with group law

$$(x, h)(y, g) = (x + hy, hg) .$$

- **Quasi-regular representation** of  $G$  on  $L^2(\mathbb{R}^d)$ , acting via

$$(\pi(x, h)f)(y) = |\det(h)|^{-1/2} f(h^{-1}(y - x)) .$$



# Higher-dimensional CWT

- $H < GL(d, \mathbb{R})$  a closed matrix group
- $G = \mathbb{R}^d \rtimes H$ , the affine group generated by  $H$  and translations. As a set,  $G = \mathbb{R}^n \times H$ , with group law

$$(x, h)(y, g) = (x + hy, hg) .$$

- **Quasi-regular representation** of  $G$  on  $L^2(\mathbb{R}^d)$ , acting via

$$(\pi(x, h)f)(y) = |\det(h)|^{-1/2} f(h^{-1}(y - x)) .$$

- **Continuous wavelet transform**: Given suitable  $\psi \in L^2(\mathbb{R}^d)$  and  $f \in L^2(\mathbb{R}^d)$ , let

$$\mathcal{W}_\psi f : G \rightarrow \mathbb{C} , \quad \mathcal{W}_\psi f(x, h) = \langle f, \pi(x, h)\psi \rangle$$

# Admissible vectors and wavelet inversion

# Admissible vectors and wavelet inversion

## Definition

# Admissible vectors and wavelet inversion

## Definition

- $\psi \in L^2(\mathbb{R}^d)$  is called **admissible** if  $\mathcal{W}_\psi : L^2(\mathbb{R}^d) \hookrightarrow L^2(G)$  isometrically.

# Admissible vectors and wavelet inversion

## Definition

- $\psi \in L^2(\mathbb{R}^d)$  is called **admissible** if  $\mathcal{W}_\psi : L^2(\mathbb{R}^d) \hookrightarrow L^2(G)$  isometrically.
- $\pi$  is called **square-integrable** if  $\pi$  is irreducible and has an admissible vector.

# Admissible vectors and wavelet inversion

## Definition

- $\psi \in L^2(\mathbb{R}^d)$  is called **admissible** if  $\mathcal{W}_\psi : L^2(\mathbb{R}^d) \hookrightarrow L^2(G)$  isometrically.
- $\pi$  is called **square-integrable** if  $\pi$  is irreducible and has an admissible vector. If  $\pi$  is square-integrable, we call  $H$  **irreducibly admissible**.

# Admissible vectors and wavelet inversion

## Definition

- $\psi \in L^2(\mathbb{R}^d)$  is called **admissible** if  $\mathcal{W}_\psi : L^2(\mathbb{R}^d) \hookrightarrow L^2(G)$  isometrically.
- $\pi$  is called **square-integrable** if  $\pi$  is irreducible and has an admissible vector. If  $\pi$  is square-integrable, we call  $H$  **irreducibly admissible**.

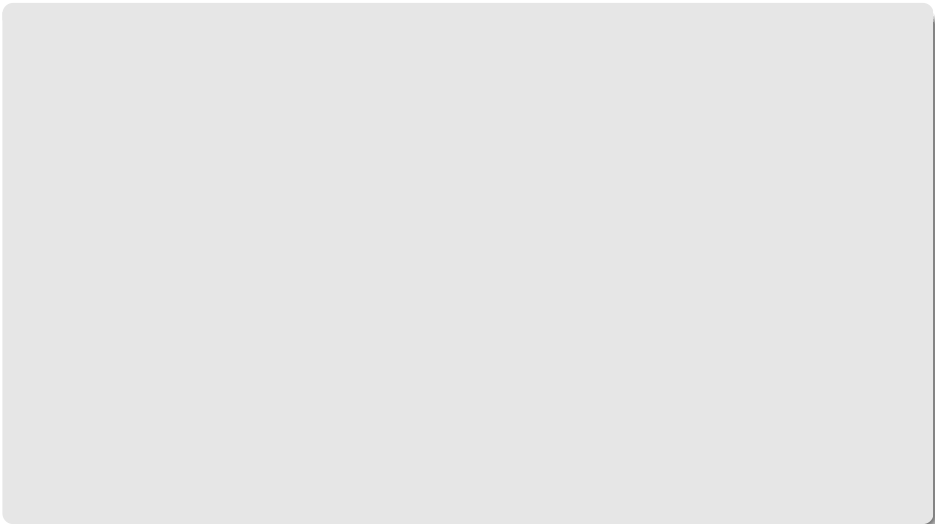
## Wavelet inversion

If  $\psi$  is admissible, we obtain the **wavelet inversion formula**

$$f = \int_G \mathcal{W}_\psi f(x, h) \pi(x, h) \psi \, d(x, h) .$$

with weak-sense convergence.

# Wavelet inversion and dual action





# Wavelet inversion and dual action

- Wavelet transform of  $f \in L^2(\mathbb{R}^d)$  is a **family of convolution products**,

$$\mathcal{W}_\psi f(x, h) = (f * \pi(0, h)\psi^*)(x) .$$

# Wavelet inversion and dual action

- Wavelet transform of  $f \in L^2(\mathbb{R}^d)$  is a **family of convolution products**,

$$\mathcal{W}_\psi f(x, h) = (f * \pi(0, h)\psi^*)(x) .$$

- Dual action** of  $H$  on  $\mathbb{R}^d$  is defined by

$$H \times \mathbb{R}^d \ni (h, \xi) \mapsto h^T \xi .$$

# Wavelet inversion and dual action

- Wavelet transform of  $f \in L^2(\mathbb{R}^d)$  is a **family of convolution products**,

$$\mathcal{W}_\psi f(x, h) = (f * \pi(0, h)\psi^*)(x) .$$

- Dual action** of  $H$  on  $\mathbb{R}^d$  is defined by

$$H \times \mathbb{R}^d \ni (h, \xi) \mapsto h^T \xi .$$

It describes influence of dilation on frequency content:

$$\mathcal{F}(\pi(0, h)\psi^*)(\xi) = |\det(h)|^{1/2} \overline{\mathcal{F}(\psi)(h^T \xi)}$$

# Wavelet inversion and dual action

- Wavelet transform of  $f \in L^2(\mathbb{R}^d)$  is a **family of convolution products**,

$$\mathcal{W}_\psi f(x, h) = (f * \pi(0, h)\psi^*)(x) .$$

- Dual action** of  $H$  on  $\mathbb{R}^d$  is defined by

$$H \times \mathbb{R}^d \ni (h, \xi) \mapsto h^T \xi .$$

It describes influence of dilation on frequency content:

$$\mathcal{F}(\pi(0, h)\psi^*)(\xi) = |\det(h)|^{1/2} \overline{\mathcal{F}(\psi)(h^T \xi)}$$

- Informal interpretation of  $\mathcal{W}_\psi$ : The transform acts as a **filter bank** labelled by elements of  $h$ , the frequencies associated to the “channel”  $\psi_h$  are contained in  $h^{-T} \text{supp}(\widehat{\psi})$ .

# Square-integrable representations and open dual orbits

# Square-integrable representations and open dual orbits

Theorem (Bernier/Taylor, 1996; HF, 2010)

$H$  is irreducibly admissible iff there exists a single open orbit

$$\mathcal{O} = H^T \xi_0 = \{h^T \xi_0 : h \in H\}$$

under the dual action, with the additional property that the associated stabilizer

$$H_{\xi_0} = \{h \in H ; h^T \xi_0 = \xi_0\} \subset H$$

is compact.

# Square-integrable representations and open dual orbits

Theorem (Bernier/Taylor, 1996; HF, 2010)

$H$  is irreducibly admissible iff there exists a single open orbit

$$\mathcal{O} = H^T \xi_0 = \{h^T \xi_0 : h \in H\}$$

under the dual action, with the additional property that the associated stabilizer

$$H_{\xi_0} = \{h \in H ; h^T \xi_0 = \xi_0\} \subset H$$

is compact.

Standing assumption

From now on:  $H$  is assumed irreducibly admissible.

# A gallery of irreducibly admissible groups, part I

## Two-dimensional examples



# A gallery of irreducibly admissible groups, part I

## Two-dimensional examples

① **Diagonal group:**

$$H = \left\{ \begin{pmatrix} a & 0 \\ 0 & b \end{pmatrix} : ab \neq 0 \right\}$$

# A gallery of irreducibly admissible groups, part I

## Two-dimensional examples

① **Diagonal group:**

$$H = \left\{ \begin{pmatrix} a & 0 \\ 0 & b \end{pmatrix} : ab \neq 0 \right\}$$

② **Similitude group:**

$$H = \left\{ \begin{pmatrix} a & b \\ -b & a \end{pmatrix} : a^2 + b^2 \neq 0 \right\}$$

# A gallery of irreducibly admissible groups, part I

## Two-dimensional examples

① **Diagonal group:**

$$H = \left\{ \begin{pmatrix} a & 0 \\ 0 & b \end{pmatrix} : ab \neq 0 \right\}$$

② **Similitude group:**

$$H = \left\{ \begin{pmatrix} a & b \\ -b & a \end{pmatrix} : a^2 + b^2 \neq 0 \right\}$$

③ **Shearlet group(s):**

$$H_c = \left\{ \pm \begin{pmatrix} a & b \\ 0 & a^c \end{pmatrix} : a \neq 0 \right\} \quad (c \in \mathbb{R})$$

( $c = 1/2$ : Kutyniok/Labate/Dahlke/Steidl/Teschke ...)

# A gallery of irreducibly admissible groups, part I

## Two-dimensional examples

① **Diagonal group:**

$$H = \left\{ \begin{pmatrix} a & 0 \\ 0 & b \end{pmatrix} : ab \neq 0 \right\}$$

② **Similitude group:**

$$H = \left\{ \begin{pmatrix} a & b \\ -b & a \end{pmatrix} : a^2 + b^2 \neq 0 \right\}$$

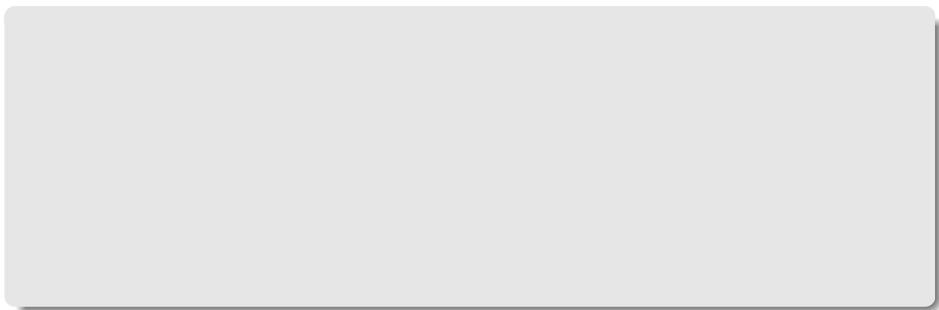
③ **Shearlet group(s):**

$$H_c = \left\{ \pm \begin{pmatrix} a & b \\ 0 & a^c \end{pmatrix} : a \neq 0 \right\} \quad (c \in \mathbb{R})$$

( $c = 1/2$ : Kutyniok/Labate/Dahlke/Steidl/Teschke ...)

Complete list in dimension two, up to conjugacy.

# A gallery of irreducibly admissible groups, part II



# A gallery of irreducibly admissible groups, part II

- (B. Currey, HF, V. Oussa:) A complete list of irreducibly admissible matrix groups in dimension three, up to conjugation, consists of

# A gallery of irreducibly admissible groups, part II

- (B. Currey, HF, V. Oussa:) A complete list of irreducibly admissible matrix groups in dimension three, up to conjugation, consists of
  - ▶ seven isolated cases,

# A gallery of irreducibly admissible groups, part II

- (B. Currey, HF, V. Oussa:) A complete list of irreducibly admissible matrix groups in dimension three, up to conjugation, consists of
  - ▶ seven isolated cases,
  - ▶ seven one-parameter families of groups,



# A gallery of irreducibly admissible groups, part II

- (B. Currey, HF, V. Oussa:) A complete list of irreducibly admissible matrix groups in dimension three, up to conjugation, consists of
  - ▶ seven isolated cases,
  - ▶ seven one-parameter families of groups,
  - ▶ six two-parameter families of groups.

# A gallery of irreducibly admissible groups, part II

- (B. Currey, HF, V. Oussa:) A complete list of irreducibly admissible matrix groups in dimension three, up to conjugation, consists of
  - ▶ seven isolated cases,
  - ▶ seven one-parameter families of groups,
  - ▶ six two-parameter families of groups.
- Well-understood classes in arbitrary dimensions, each contributing infinitely many new cases, are

# A gallery of irreducibly admissible groups, part II

- (B. Currey, HF, V. Oussa:) A complete list of irreducibly admissible matrix groups in dimension three, up to conjugation, consists of
  - ▶ seven isolated cases,
  - ▶ seven one-parameter families of groups,
  - ▶ six two-parameter families of groups.
- Well-understood classes in arbitrary dimensions, each contributing infinitely many new cases, are abelian dilation groups,

# A gallery of irreducibly admissible groups, part II

- (B. Currey, HF, V. Oussa:) A complete list of irreducibly admissible matrix groups in dimension three, up to conjugation, consists of
  - ▶ seven isolated cases,
  - ▶ seven one-parameter families of groups,
  - ▶ six two-parameter families of groups.
- Well-understood classes in arbitrary dimensions, each contributing infinitely many new cases, are abelian dilation groups, generalized shearlet dilation groups.

# Overview

- 1 Introduction: Nice wavelets and sparse signals in dimension one
- 2 Continuous wavelet transforms over general dilation groups
- 3 Coorbit theory: A consistent wavelet approximation theory**
- 4 Wavelet coorbit spaces over general dilation groups
- 5 Constructing compactly supported nice wavelets
- 6 Towards an understanding of coorbit spaces

# A sketch of coorbit theory

## Elements of coorbit theory

# A sketch of coorbit theory

## Elements of coorbit theory

- Blueprint: Wavelet characterization of homogeneous Besov spaces

# A sketch of coorbit theory

## Elements of coorbit theory

- Blueprint: Wavelet characterization of homogeneous Besov spaces
- Fix a Banach space  $Y$  of functions on  $G$  (solid, two-sided invariant).



# A sketch of coorbit theory

## Elements of coorbit theory

- Blueprint: Wavelet characterization of homogeneous Besov spaces
- Fix a Banach space  $Y$  of functions on  $G$  (solid, two-sided invariant).  
E.g.,  $Y = L^p(G)$ ,  $p < 2$ .

# A sketch of coorbit theory

## Elements of coorbit theory

- Blueprint: Wavelet characterization of homogeneous Besov spaces
- Fix a Banach space  $Y$  of functions on  $G$  (solid, two-sided invariant).  
E.g.,  $Y = L^p(G)$ ,  $p < 2$ .
- Pick a suitable **analyzing vector**  $\psi \in L^2(\mathbb{R}^d)$

# A sketch of coorbit theory

## Elements of coorbit theory

- Blueprint: Wavelet characterization of homogeneous Besov spaces
- Fix a Banach space  $Y$  of functions on  $G$  (solid, two-sided invariant).  
E.g.,  $Y = L^p(G)$ ,  $p < 2$ .
- Pick a suitable **analyzing vector**  $\psi \in L^2(\mathbb{R}^d)$
- **Coorbit space norm** on  $L^2(\mathbb{R}^d)$ :

$$\|f\|_{CoY} = \|\mathcal{W}_\psi f\|_Y .$$

# A sketch of coorbit theory

## Elements of coorbit theory

- Blueprint: Wavelet characterization of homogeneous Besov spaces
- Fix a Banach space  $Y$  of functions on  $G$  (solid, two-sided invariant).  
E.g.,  $Y = L^p(G)$ ,  $p < 2$ .
- Pick a suitable **analyzing vector**  $\psi \in L^2(\mathbb{R}^d)$
- **Coorbit space norm** on  $L^2(\mathbb{R}^d)$ :

$$\|f\|_{CoY} = \|\mathcal{W}_\psi f\|_Y .$$

- Define  $CoY$  as (completion of)  $\{g \in L^2(\mathbb{R}^d) : \|g\|_{CoY} < \infty\}$ .

# A sketch of coorbit theory

## Elements of coorbit theory

- Blueprint: Wavelet characterization of homogeneous Besov spaces
- Fix a Banach space  $Y$  of functions on  $G$  (solid, two-sided invariant).  
E.g.,  $Y = L^p(G)$ ,  $p < 2$ .
- Pick a suitable **analyzing vector**  $\psi \in L^2(\mathbb{R}^d)$
- **Coorbit space norm** on  $L^2(\mathbb{R}^d)$ :

$$\|f\|_{CoY} = \|\mathcal{W}_\psi f\|_Y .$$

- Define  $CoY$  as (completion of)  $\{g \in L^2(\mathbb{R}^d) : \|g\|_{CoY} < \infty\}$ .
- Main issues addressed by coorbit theory:

# A sketch of coorbit theory

## Elements of coorbit theory

- Blueprint: Wavelet characterization of homogeneous Besov spaces
- Fix a Banach space  $Y$  of functions on  $G$  (solid, two-sided invariant).  
E.g.,  $Y = L^p(G)$ ,  $p < 2$ .
- Pick a suitable **analyzing vector**  $\psi \in L^2(\mathbb{R}^d)$
- **Coorbit space norm** on  $L^2(\mathbb{R}^d)$ :

$$\|f\|_{CoY} = \|\mathcal{W}_\psi f\|_Y .$$

- Define  $CoY$  as (completion of)  $\{g \in L^2(\mathbb{R}^d) : \|g\|_{CoY} < \infty\}$ .
- Main issues addressed by coorbit theory:
  - ▶ **Consistency**: When is the norm **independent** of  $\psi$ ?

# A sketch of coorbit theory

## Elements of coorbit theory

- Blueprint: Wavelet characterization of homogeneous Besov spaces
- Fix a Banach space  $Y$  of functions on  $G$  (solid, two-sided invariant).  
E.g.,  $Y = L^p(G)$ ,  $p < 2$ .
- Pick a suitable **analyzing vector**  $\psi \in L^2(\mathbb{R}^d)$
- **Coorbit space norm** on  $L^2(\mathbb{R}^d)$ :

$$\|f\|_{CoY} = \|\mathcal{W}_\psi f\|_Y .$$

- Define  $CoY$  as (completion of)  $\{g \in L^2(\mathbb{R}^d) : \|g\|_{CoY} < \infty\}$ .
- Main issues addressed by coorbit theory:
  - ▶ **Consistency**: When is the norm **independent** of  $\psi$ ?  
(I.e., is there a notion of nice wavelets?)

# A sketch of coorbit theory

## Elements of coorbit theory

- Blueprint: Wavelet characterization of homogeneous Besov spaces
- Fix a Banach space  $Y$  of functions on  $G$  (solid, two-sided invariant).  
E.g.,  $Y = L^p(G)$ ,  $p < 2$ .
- Pick a suitable **analyzing vector**  $\psi \in L^2(\mathbb{R}^d)$
- **Coorbit space norm** on  $L^2(\mathbb{R}^d)$ :

$$\|f\|_{CoY} = \|\mathcal{W}_\psi f\|_Y .$$

- Define  $CoY$  as (completion of)  $\{g \in L^2(\mathbb{R}^d) : \|g\|_{CoY} < \infty\}$ .
- Main issues addressed by coorbit theory:
  - ▶ **Consistency**: When is the norm **independent** of  $\psi$ ?  
(I.e., is there a notion of nice wavelets?)
  - ▶ **Discretization**: When can the norm be expressed in terms of a discrete set of sampled wavelet coefficients?



# Nice wavelets according to coorbit theory

## Definition

Let  $v$  denote the **control weight for  $L^p(G)$** , given by

$$v(x, h) = \max(1, \Delta_G(h)).$$

# Nice wavelets according to coorbit theory

## Definition

Let  $v$  denote the **control weight for  $L^p(G)$** , given by

$$v(x, h) = \max(1, \Delta_G(h)).$$

$\psi \in L^2(\mathbb{R}^d)$  is a **nice wavelet with respect to  $L^p(G)$**  if  
 $\mathcal{W}_\psi \psi \in W^R(L^\infty, L^1_v)$ ,

# Nice wavelets according to coorbit theory

## Definition

Let  $v$  denote the **control weight for  $L^p(G)$** , given by

$$v(x, h) = \max(1, \Delta_G(h)).$$

$\psi \in L^2(\mathbb{R}^d)$  is a **nice wavelet with respect to  $L^p(G)$**  if  $\mathcal{W}_\psi \psi \in W^R(L^\infty, L^1_v)$ , i.e., the function

$$G \ni (x, h) \mapsto \sup_{(y, g) \in U} |\mathcal{W}_\psi \psi((x, h)(y, g))| \in \mathbb{R}^+$$

is in  $L^1_v(G)$ , for some compact neighborhood  $U \subset G$  of the identity.

# Nice wavelets according to coorbit theory

## Definition

Let  $\nu$  denote the **control weight for  $L^p(G)$** , given by

$$\nu(x, h) = \max(1, \Delta_G(h)).$$

$\psi \in L^2(\mathbb{R}^d)$  is a **nice wavelet with respect to  $L^p(G)$**  if  $\mathcal{W}_\psi \psi \in W^R(L^\infty, L^1_\nu)$ , i.e., the function

$$G \ni (x, h) \mapsto \sup_{(y, g) \in U} |\mathcal{W}_\psi \psi((x, h)(y, g))| \in \mathbb{R}^+$$

is in  $L^1_\nu(G)$ , for some compact neighborhood  $U \subset G$  of the identity. The set of nice wavelets is denoted by  $\mathcal{B}_\nu$ .

# Nice wavelets according to coorbit theory

## Definition

Let  $\nu$  denote the **control weight for  $L^p(G)$** , given by

$$\nu(x, h) = \max(1, \Delta_G(h)).$$

$\psi \in L^2(\mathbb{R}^d)$  is a **nice wavelet with respect to  $L^p(G)$**  if  $\mathcal{W}_\psi \psi \in W^R(L^\infty, L^1_\nu)$ , i.e., the function

$$G \ni (x, h) \mapsto \sup_{(y, g) \in U} |\mathcal{W}_\psi \psi((x, h)(y, g))| \in \mathbb{R}^+$$

is in  $L^1_\nu(G)$ , for some compact neighborhood  $U \subset G$  of the identity. The set of nice wavelets is denoted by  $\mathcal{B}_\nu$ .

## Recall main challenge

Coorbit theory is applicable whenever there exist nice wavelets.

# Nice wavelets according to coorbit theory

## Definition

Let  $\nu$  denote the **control weight for  $L^p(G)$** , given by

$$\nu(x, h) = \max(1, \Delta_G(h)).$$

$\psi \in L^2(\mathbb{R}^d)$  is a **nice wavelet with respect to  $L^p(G)$**  if  $\mathcal{W}_\psi \psi \in W^R(L^\infty, L^1_\nu)$ , i.e., the function

$$G \ni (x, h) \mapsto \sup_{(y, g) \in U} |\mathcal{W}_\psi \psi((x, h)(y, g))| \in \mathbb{R}^+$$

is in  $L^1_\nu(G)$ , for some compact neighborhood  $U \subset G$  of the identity. The set of nice wavelets is denoted by  $\mathcal{B}_\nu$ .

## Recall main challenge

Coorbit theory is applicable whenever there exist nice wavelets.

Desirable: Explicit criteria for nice wavelets.

# Central theorem of coorbit theory

## Theorem (Feichtinger/Gröchenig)

*Let  $1 \leq p \leq 2$ . The following are equivalent, for any  $f \in L^2(\mathbb{R}^d)$ :*

# Central theorem of coorbit theory

## Theorem (Feichtinger/Gröchenig)

Let  $1 \leq p \leq 2$ . The following are equivalent, for any  $f \in L^2(\mathbb{R}^d)$ :

(a)  $\mathcal{W}_\psi f \in L^p(G)$ , for some (equivalently: any)  $0 \neq \psi \in \mathcal{B}_v$ .



# Central theorem of coorbit theory

## Theorem (Feichtinger/Gröchenig)

Let  $1 \leq p \leq 2$ . The following are equivalent, for any  $f \in L^2(\mathbb{R}^d)$ :

- (a)  $\mathcal{W}_\psi f \in L^p(G)$ , for some (equivalently: any)  $0 \neq \psi \in \mathcal{B}_v$ .
- (b)  $(\langle f, \pi(z)\psi \rangle)_{z \in Z} \in \ell^p(Z)$ , for some (equivalently: any)  $0 \neq \psi \in \mathcal{B}_v$  and all (right) uniformly discrete, sufficiently dense subsets  $Z \subset G$ .

# Central theorem of coorbit theory

## Theorem (Feichtinger/Gröchenig)

Let  $1 \leq p \leq 2$ . The following are equivalent, for any  $f \in L^2(\mathbb{R}^d)$ :

- (a)  $\mathcal{W}_\psi f \in L^p(G)$ , for some (equivalently: any)  $0 \neq \psi \in \mathcal{B}_v$ .
- (b)  $(\langle f, \pi(z)\psi \rangle)_{z \in Z} \in \ell^p(Z)$ , for some (equivalently: any)  $0 \neq \psi \in \mathcal{B}_v$  and all (right) uniformly discrete, sufficiently dense subsets  $Z \subset G$ .
- (c) For some (equivalently: any)  $0 \neq \psi \in \mathcal{B}_v$  and all (right) uniformly discrete, sufficiently dense subsets  $Z \subset G$ :

$$f = \sum_{z \in Z} c_z \pi(z)\psi \quad ,$$

with coefficients  $(c_z)_{z \in Z} \in \ell^p(Z)$  linearly depending on  $f$ .

# Central theorem of coorbit theory

## Theorem (Feichtinger/Gröchenig)

Let  $1 \leq p \leq 2$ . The following are equivalent, for any  $f \in L^2(\mathbb{R}^d)$ :

- (a)  $\mathcal{W}_\psi f \in L^p(G)$ , for some (equivalently: any)  $0 \neq \psi \in \mathcal{B}_V$ .
- (b)  $(\langle f, \pi(z)\psi \rangle)_{z \in Z} \in \ell^p(Z)$ , for some (equivalently: any)  $0 \neq \psi \in \mathcal{B}_V$  and all (right) uniformly discrete, sufficiently dense subsets  $Z \subset G$ .
- (c) For some (equivalently: any)  $0 \neq \psi \in \mathcal{B}_V$  and all (right) uniformly discrete, sufficiently dense subsets  $Z \subset G$ :

$$f = \sum_{z \in Z} c_z \pi(z)\psi \quad ,$$

with coefficients  $(c_z)_{z \in Z} \in \ell^p(Z)$  linearly depending on  $f$ .  
Here the series converges both in  $\|\cdot\|_2$  and  $\|\cdot\|_{C_0(L^p)}$ .

# Central theorem of coorbit theory

## Theorem (Feichtinger/Gröchenig)

Let  $1 \leq p \leq 2$ . The following are equivalent, for any  $f \in L^2(\mathbb{R}^d)$ :

- (a)  $\mathcal{W}_\psi f \in L^p(G)$ , for some (equivalently: any)  $0 \neq \psi \in \mathcal{B}_V$ .
- (b)  $(\langle f, \pi(z)\psi \rangle)_{z \in Z} \in \ell^p(Z)$ , for some (equivalently: any)  $0 \neq \psi \in \mathcal{B}_V$  and all (right) uniformly discrete, sufficiently dense subsets  $Z \subset G$ .
- (c) For some (equivalently: any)  $0 \neq \psi \in \mathcal{B}_V$  and all (right) uniformly discrete, sufficiently dense subsets  $Z \subset G$ :

$$f = \sum_{z \in Z} c_z \pi(z)\psi \quad ,$$

with coefficients  $(c_z)_{z \in Z} \in \ell^p(Z)$  linearly depending on  $f$ .

Here the series converges both in  $\|\cdot\|_2$  and  $\|\cdot\|_{Co(L^p)}$ .

Also:  $Co(L^p)$ -norm is equivalent to norm on discrete coefficients!

# Central theorem of coorbit theory

## Theorem (Feichtinger/Gröchenig)

Let  $1 \leq p \leq 2$ . The following are equivalent, for any  $f \in L^2(\mathbb{R}^d)$ :

- (a)  $\mathcal{W}_\psi f \in L^p(G)$ , for some (equivalently: any)  $0 \neq \psi \in \mathcal{B}_V$ .
- (b)  $(\langle f, \pi(z)\psi \rangle)_{z \in Z} \in \ell^p(Z)$ , for some (equivalently: any)  $0 \neq \psi \in \mathcal{B}_V$  and all (right) uniformly discrete, sufficiently dense subsets  $Z \subset G$ .
- (c) For some (equivalently: any)  $0 \neq \psi \in \mathcal{B}_V$  and all (right) uniformly discrete, sufficiently dense subsets  $Z \subset G$ :

$$f = \sum_{z \in Z} c_z \pi(z)\psi \quad ,$$

with coefficients  $(c_z)_{z \in Z} \in \ell^p(Z)$  linearly depending on  $f$ .

Here the series converges both in  $\|\cdot\|_2$  and  $\|\cdot\|_{Co(L^p)}$ .

Also:  $Co(L^p)$ -norm is equivalent to norm on discrete coefficients!

*I.e.,  $Co(L^p)$  is a consistently defined space of sparse signals.*

# Overview

- 1 Introduction: Nice wavelets and sparse signals in dimension one
- 2 Continuous wavelet transforms over general dilation groups
- 3 Coorbit theory: A consistent wavelet approximation theory
- 4 Wavelet coorbit spaces over general dilation groups**
- 5 Constructing compactly supported nice wavelets
- 6 Towards an understanding of coorbit spaces

# Is coorbit theory applicable?

Recall setup (for the remainder)

# Is coorbit theory applicable?

Recall setup (for the remainder)

- $H$  is irreducibly admissible.



# Is coorbit theory applicable?

## Recall setup (for the remainder)

- $H$  is irreducibly admissible.
- The associated open dual orbit is denoted  $\mathcal{O} = H^T \xi$ .  
Its complement is denoted  $\mathcal{O}^c$ , it is the **blind spot** of the wavelet transform.

# Is coorbit theory applicable?

## Recall setup (for the remainder)

- $H$  is irreducibly admissible.
- The associated open dual orbit is denoted  $\mathcal{O} = H^T \xi$ .  
Its complement is denoted  $\mathcal{O}^c$ , it is the **blind spot** of the wavelet transform.
- Looking for nice wavelets w.r.t.  $L^p$ .

# Is coorbit theory applicable?

## Recall setup (for the remainder)

- $H$  is irreducibly admissible.
- The associated open dual orbit is denoted  $\mathcal{O} = H^T \xi$ .  
Its complement is denoted  $\mathcal{O}^c$ , it is the **blind spot** of the wavelet transform.
- Looking for nice wavelets w.r.t.  $L^p$ .

## Theorem (HF, '12)

*Under the standing assumptions,  $\text{Co}(L^p)$  is well-defined.*

# Is coorbit theory applicable?

## Recall setup (for the remainder)

- $H$  is irreducibly admissible.
- The associated open dual orbit is denoted  $\mathcal{O} = H^T \xi$ .  
Its complement is denoted  $\mathcal{O}^c$ , it is the **blind spot** of the wavelet transform.
- Looking for nice wavelets w.r.t.  $L^p$ .

## Theorem (HF, '12)

*Under the standing assumptions,  $\text{Co}(L^p)$  is well-defined.*

*Let  $\mathcal{F}^{-1}C_c^\infty(\mathcal{O})$  denote the set of bandlimited Schwartz functions with Fourier support contained in  $\mathcal{O}$ .*

# Is coorbit theory applicable?

## Recall setup (for the remainder)

- $H$  is irreducibly admissible.
- The associated open dual orbit is denoted  $\mathcal{O} = H^T \xi$ .  
Its complement is denoted  $\mathcal{O}^c$ , it is the **blind spot** of the wavelet transform.
- Looking for nice wavelets w.r.t.  $L^p$ .

## Theorem (HF, '12)

*Under the standing assumptions,  $\text{Co}(L^p)$  is well-defined.*

*Let  $\mathcal{F}^{-1}C_c^\infty(\mathcal{O})$  denote the set of bandlimited Schwartz functions with Fourier support contained in  $\mathcal{O}$ . Then*

$$\mathcal{F}^{-1}C_c^\infty(\mathcal{O}) \subset \mathcal{B}_v .$$

# Overview

- 1 Introduction: Nice wavelets and sparse signals in dimension one
- 2 Continuous wavelet transforms over general dilation groups
- 3 Coorbit theory: A consistent wavelet approximation theory
- 4 Wavelet coorbit spaces over general dilation groups
- 5 Constructing compactly supported nice wavelets**
- 6 Towards an understanding of coorbit spaces

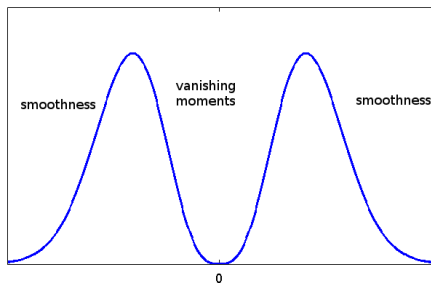
# Reminder: Nice wavelets in dimension one

## Desirable properties of wavelets

A nice wavelet  $\psi \in L^2(\mathbb{R})$  typically has three properties: Fast decay, smoothness, vanishing moments.

Concisely: Nice wavelets have good time-frequency localization.

(Note: Frequency-side localization is understood **away from zero**.)



# Vanishing moments and wavelet coefficient decay

Assumptions on nice wavelet  $\psi$  guarantee fast decay of  $\mathcal{W}_\psi \psi$ :

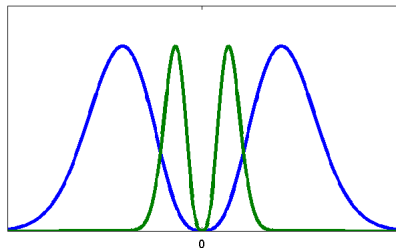
$$|\mathcal{W}_\psi \psi(x, s)| \leq \sum_{j < \ell} \left\| \partial^j \left( \widehat{\psi} \cdot \overline{\widehat{\psi}(s \cdot)} \right) \right\|_1 |s|^{-1/2} (1 + |x|)^{-\ell}$$



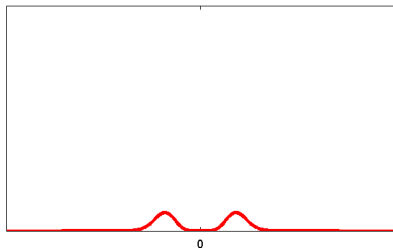
# Vanishing moments and wavelet coefficient decay

Assumptions on nice wavelet  $\psi$  guarantee fast decay of  $\mathcal{W}_\psi\psi$ :

$$|\mathcal{W}_\psi\psi(x, s)| \leq \sum_{j < \ell} \left\| \partial^j \left( \widehat{\psi} \cdot \overline{\widehat{\psi}(s \cdot)} \right) \right\|_1 |s|^{-1/2} (1 + |x|)^{-\ell}$$



Plot of  $\widehat{\psi}$  and  $\widehat{\psi}(3 \cdot)$

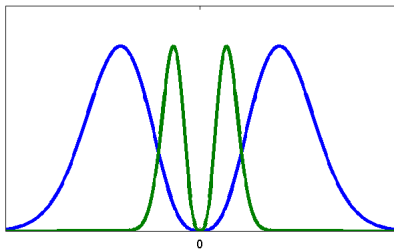


Overlap  $\widehat{\psi} \cdot \overline{\widehat{\psi}(3 \cdot)}$

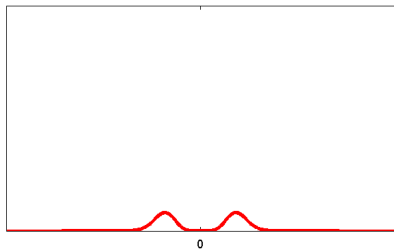
# Vanishing moments and wavelet coefficient decay

Assumptions on nice wavelet  $\psi$  guarantee fast decay of  $\mathcal{W}_\psi\psi$ :

$$|\mathcal{W}_\psi\psi(x, s)| \leq \sum_{j < \ell} \left\| \partial^j \left( \widehat{\psi} \cdot \overline{\widehat{\psi}(s \cdot)} \right) \right\|_1 |s|^{-1/2} (1 + |x|)^{-\ell}$$



Plot of  $\widehat{\psi}$  and  $\widehat{\psi}(3 \cdot)$



Overlap  $\widehat{\psi} \cdot \overline{\widehat{\psi}(3 \cdot)}$

$\Rightarrow$  vanishing moments, smoothness govern **decay of overlap**, as  $|s| \rightarrow 0, \infty$

# Generalizing this to higher dimensions

Central idea

# Generalizing this to higher dimensions

## Central idea

- Characterize nice wavelets in terms of smoothness,

# Generalizing this to higher dimensions

## Central idea

- Characterize nice wavelets in terms of smoothness, fast decay,

# Generalizing this to higher dimensions

## Central idea

- Characterize nice wavelets in terms of smoothness, fast decay, **vanishing moments**.

# Generalizing this to higher dimensions

## Central idea

- Characterize nice wavelets in terms of smoothness, fast decay, **vanishing moments**. The last property has to reflect the choice of dilation group.

# Generalizing this to higher dimensions

## Central idea

- Characterize nice wavelets in terms of smoothness, fast decay, **vanishing moments**. The last property has to reflect the choice of dilation group.
- Right notion of vanishing moments turns out to be: Speed of decay  $\widehat{\psi}(\xi) \rightarrow 0$ , as  $\xi \rightarrow \mathcal{O}^c$ , the blind spot.



# Generalizing this to higher dimensions

## Central idea

- Characterize nice wavelets in terms of smoothness, fast decay, **vanishing moments**. The last property has to reflect the choice of dilation group.
- Right notion of vanishing moments turns out to be: Speed of decay  $\hat{\psi}(\xi) \rightarrow 0$ , as  $\xi \rightarrow \mathcal{O}^c$ , the blind spot.
- A first indicator that this works:

# Generalizing this to higher dimensions

## Central idea

- Characterize nice wavelets in terms of smoothness, fast decay, **vanishing moments**. The last property has to reflect the choice of dilation group.
- Right notion of vanishing moments turns out to be: Speed of decay  $\widehat{\psi}(\xi) \rightarrow 0$ , as  $\xi \rightarrow \mathcal{O}^c$ , the blind spot.
- A first indicator that this works:

$$\mathcal{F}^{-1}C_c^\infty(\mathcal{O}) \subset \mathcal{B}_v .$$

# Generalizing this to higher dimensions

## Central idea

- Characterize nice wavelets in terms of smoothness, fast decay, **vanishing moments**. The last property has to reflect the choice of dilation group.
- Right notion of vanishing moments turns out to be: Speed of decay  $\widehat{\psi}(\xi) \rightarrow 0$ , as  $\xi \rightarrow \mathcal{O}^c$ , the blind spot.
- A first indicator that this works:

$$\mathcal{F}^{-1}C_c^\infty(\mathcal{O}) \subset \mathcal{B}_v .$$

## Definition

Let  $r \in \mathbb{N}$  be given.  $f \in L^1(\mathbb{R}^d)$  **has vanishing moments in  $\mathcal{O}^c$  of order  $r$**  if all distributional derivatives  $\partial^\alpha \widehat{f}$  with  $|\alpha| < r$  are continuous functions, identically vanishing on  $\mathcal{O}^c$ .

# Fourier envelope

# Fourier envelope

## Definition

Let  $\mathcal{O} \subset \mathbb{R}^d$  denote the dual orbit. Given  $\xi \in \mathcal{O}$ , let  $\text{dist}(\xi, \mathcal{O}^c)$  denote the euclidean distance of  $\xi$  to  $\mathcal{O}^c$ . Let

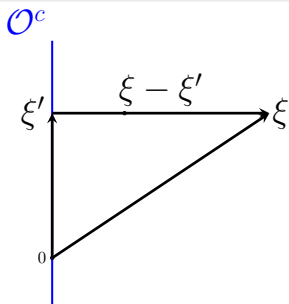
$$A(\xi) = \min \left( \frac{\text{dist}(\xi, \mathcal{O}^c)}{1 + \sqrt{|\xi|^2 - \text{dist}(\xi, \mathcal{O}^c)^2}}, \frac{1}{1 + |\xi|} \right).$$

# Fourier envelope

## Definition

Let  $\mathcal{O} \subset \mathbb{R}^d$  denote the dual orbit. Given  $\xi \in \mathcal{O}$ , let  $\text{dist}(\xi, \mathcal{O}^c)$  denote the euclidean distance of  $\xi$  to  $\mathcal{O}^c$ . Let

$$A(\xi) = \min \left( \frac{\text{dist}(\xi, \mathcal{O}^c)}{1 + \sqrt{|\xi|^2 - \text{dist}(\xi, \mathcal{O}^c)^2}}, \frac{1}{1 + |\xi|} \right).$$



$$A(\xi) = \min \left( \frac{|\xi - \xi'|}{1 + |\xi'|}, \frac{1}{1 + |\xi|} \right)$$

with  $\xi' =$  point in  $\mathcal{O}^c$  closest to  $\xi$

# A general vanishing moment criterion

# A general vanishing moment criterion

Theorem (HF, '13; HF, R. Raisi Tousi, '14)

Fix  $\xi_0 \in \mathcal{O}$ , and define

$$A_H : H \rightarrow \mathbb{R}^+ , A_H(h) = A(h^T \xi_0) .$$



# A general vanishing moment criterion

Theorem (HF, '13; HF, R. Raisi Tousi, '14)

Fix  $\xi_0 \in \mathcal{O}$ , and define

$$A_H : H \rightarrow \mathbb{R}^+ , A_H(h) = A(h^T \xi_0) .$$

Assume that for suitable  $e_1, e_2, e_3 \geq 0$  the following hold:

$$\|h^{\pm 1}\| A_H(h)^{e_1} \preceq 1 \quad (1)$$

$$|\det(h^{\pm 1})| A_H(h)^{e_2} \preceq 1 \quad (2)$$

$$\Delta_H(h^{\pm 1}) A_H(h)^{e_3} \preceq 1 . \quad (3)$$

# A general vanishing moment criterion

Theorem (HF, '13; HF, R. Raisi Tousi, '14)

Fix  $\xi_0 \in \mathcal{O}$ , and define

$$A_H : H \rightarrow \mathbb{R}^+ , A_H(h) = A(h^T \xi_0) .$$

Assume that for suitable  $e_1, e_2, e_3 \geq 0$  the following hold:

$$\|h^{\pm 1}\| A_H(h)^{e_1} \preceq 1 \quad (1)$$

$$|\det(h^{\pm 1})| A_H(h)^{e_2} \preceq 1 \quad (2)$$

$$\Delta_H(h^{\pm 1}) A_H(h)^{e_3} \preceq 1 . \quad (3)$$

Define  $r := \lfloor e_1(2s + 2d + 2) + \frac{5}{2}e_2 + 2e_3 \rfloor + 2d + 2$ .

# A general vanishing moment criterion

Theorem (HF, '13; HF, R. Raisi Tousi, '14)

Fix  $\xi_0 \in \mathcal{O}$ , and define

$$A_H : H \rightarrow \mathbb{R}^+, A_H(h) = A(h^T \xi_0).$$

Assume that for suitable  $e_1, e_2, e_3 \geq 0$  the following hold:

$$\|h^{\pm 1}\| A_H(h)^{e_1} \preceq 1 \quad (1)$$

$$|\det(h^{\pm 1})| A_H(h)^{e_2} \preceq 1 \quad (2)$$

$$\Delta_H(h^{\pm 1}) A_H(h)^{e_3} \preceq 1. \quad (3)$$

Define  $r := \lfloor e_1(2s + 2d + 2) + \frac{5}{2}e_2 + 2e_3 \rfloor + 2d + 2$ .

Then any function  $\psi$  with  $|\widehat{\psi}|_{r,r} < \infty$  and vanishing moments in  $\mathcal{O}^c$  of order  $r$  is in  $\mathcal{B}_v$ .

# A general vanishing moment criterion

Theorem (HF, '13; HF, R. Raisi Tousi, '14)

Fix  $\xi_0 \in \mathcal{O}$ , and define

$$A_H : H \rightarrow \mathbb{R}^+ , A_H(h) = A(h^T \xi_0) .$$

Assume that for suitable  $e_1, e_2, e_3 \geq 0$  the following hold:

$$\|h^{\pm 1}\| A_H(h)^{e_1} \preceq 1 \quad (1)$$

$$|\det(h^{\pm 1})| A_H(h)^{e_2} \preceq 1 \quad (2)$$

$$\Delta_H(h^{\pm 1}) A_H(h)^{e_3} \preceq 1 . \quad (3)$$

Define  $r := \lfloor e_1(2s + 2d + 2) + \frac{5}{2}e_2 + 2e_3 \rfloor + 2d + 2$ .

Then any function  $\psi$  with  $|\widehat{\psi}|_{r,r} < \infty$  and vanishing moments in  $\mathcal{O}^c$  of order  $r$  is in  $\mathcal{B}_V$ . Here  $|\cdot|_{r,r}$  denotes a Schwartz norm.

# Constructing compactly supported atoms

# Constructing compactly supported atoms

Lemma (HF, '98)

*There exists a polynomial  $P \in \mathbb{R}[X_1, \dots, X_d]$  such that*

$$\mathcal{O}^c = \{\xi \in \mathbb{R}^d : P(\xi) = 0\} .$$

# Constructing compactly supported atoms

Lemma (HF, '98)

*There exists a polynomial  $P \in \mathbb{R}[X_1, \dots, X_d]$  such that*

$$\mathcal{O}^c = \{\xi \in \mathbb{R}^d : P(\xi) = 0\} .$$

Construction procedure

# Constructing compactly supported atoms

Lemma (HF, '98)

*There exists a polynomial  $P \in \mathbb{R}[X_1, \dots, X_d]$  such that*

$$\mathcal{O}^c = \{\xi \in \mathbb{R}^d : P(\xi) = 0\} .$$

Construction procedure

- Define the partial differential operator  $D_{\mathcal{O}} = P(-iD)$ , where  $P$  is the polynomial from the previous lemma, and  $D$  stands for partial differentiation.



# Constructing compactly supported atoms

Lemma (HF, '98)

*There exists a polynomial  $P \in \mathbb{R}[X_1, \dots, X_d]$  such that*

$$\mathcal{O}^c = \{\xi \in \mathbb{R}^d : P(\xi) = 0\} .$$

## Construction procedure

- Define the partial differential operator  $D_{\mathcal{O}} = P(-iD)$ , where  $P$  is the polynomial from the previous lemma, and  $D$  stands for partial differentiation.
- Let  $r$  be the required number of vanishing moments from the previous Theorem. Pick  $f \in C_c^\infty(\mathbb{R}^d) \setminus \{0\}$ , and define

$$\psi = D_{\mathcal{O}}^r(f) .$$

# Constructing compactly supported atoms

Lemma (HF, '98)

*There exists a polynomial  $P \in \mathbb{R}[X_1, \dots, X_d]$  such that*

$$\mathcal{O}^c = \{\xi \in \mathbb{R}^d : P(\xi) = 0\} .$$

## Construction procedure

- Define the partial differential operator  $D_{\mathcal{O}} = P(-iD)$ , where  $P$  is the polynomial from the previous lemma, and  $D$  stands for partial differentiation.
- Let  $r$  be the required number of vanishing moments from the previous Theorem. Pick  $f \in C_c^\infty(\mathbb{R}^d) \setminus \{0\}$ , and define

$$\psi = D_{\mathcal{O}}^r(f) .$$

- Then  $\psi \in C_c^\infty(\mathbb{R}^d)$  has vanishing moments of order  $r$  in  $\mathcal{O}^c$ .

# Constructing compactly supported atoms

Lemma (HF, '98)

*There exists a polynomial  $P \in \mathbb{R}[X_1, \dots, X_d]$  such that*

$$\mathcal{O}^c = \{\xi \in \mathbb{R}^d : P(\xi) = 0\} .$$

## Construction procedure

- Define the partial differential operator  $D_{\mathcal{O}} = P(-iD)$ , where  $P$  is the polynomial from the previous lemma, and  $D$  stands for partial differentiation.
- Let  $r$  be the required number of vanishing moments from the previous Theorem. Pick  $f \in C_c^\infty(\mathbb{R}^d) \setminus \{0\}$ , and define

$$\psi = D_{\mathcal{O}}^r(f) .$$

- Then  $\psi \in C_c^\infty(\mathbb{R}^d)$  has vanishing moments of order  $r$  in  $\mathcal{O}^c$ .
- Clearly, picking  $f \in C_c^k(\mathbb{R}^d)$ , for  $k$  sufficiently large, is enough.

# Overview

- 1 Introduction: Nice wavelets and sparse signals in dimension one
- 2 Continuous wavelet transforms over general dilation groups
- 3 Coorbit theory: A consistent wavelet approximation theory
- 4 Wavelet coorbit spaces over general dilation groups
- 5 Constructing compactly supported nice wavelets
- 6 Towards an understanding of coorbit spaces

# Making sense of wavelet coorbit spaces

Conclusions so far

# Making sense of wavelet coorbit spaces

## Conclusions so far

- Coorbit theory is applicable in a wide variety of cases.

# Making sense of wavelet coorbit spaces

## Conclusions so far

- Coorbit theory is applicable in a wide variety of cases.  
Explicit criteria for nice wavelets.

# Making sense of wavelet coorbit spaces

## Conclusions so far

- Coorbit theory is applicable in a wide variety of cases.  
Explicit criteria for nice wavelets.
- Important consequence of consistency: Coorbit spaces depend (only) on the way the dilation group determines the wavelet system.



# Making sense of wavelet coorbit spaces

## Conclusions so far

- Coorbit theory is applicable in a wide variety of cases.  
Explicit criteria for nice wavelets.
- Important consequence of consistency: Coorbit spaces depend (only) on the way the dilation group determines the wavelet system.

## Questions

# Making sense of wavelet coorbit spaces

## Conclusions so far

- Coorbit theory is applicable in a wide variety of cases.  
Explicit criteria for nice wavelets.
- Important consequence of consistency: Coorbit spaces depend (only) on the way the dilation group determines the wavelet system.

## Questions

- Are coorbit spaces necessarily smoothness spaces?

# Making sense of wavelet coorbit spaces

## Conclusions so far

- Coorbit theory is applicable in a wide variety of cases. Explicit criteria for nice wavelets.
- Important consequence of consistency: Coorbit spaces depend (only) on the way the dilation group determines the wavelet system.

## Questions

- Are coorbit spaces necessarily smoothness spaces?
- Given different dilation groups  $H_1$  and  $H_2$ , how are their coorbit spaces related? Are they necessarily different?

# Making sense of wavelet coorbit spaces

## Conclusions so far

- Coorbit theory is applicable in a wide variety of cases.  
Explicit criteria for nice wavelets.
- Important consequence of consistency: Coorbit spaces depend (only) on the way the dilation group determines the wavelet system.

## Questions

- Are coorbit spaces necessarily smoothness spaces?
- Given different dilation groups  $H_1$  and  $H_2$ , how are their coorbit spaces related? Are they necessarily different?
- Is there a way of comparing coorbit spaces over different groups? (i.e., determine equality, embeddings)

# Making sense of wavelet coorbit spaces

## Conclusions so far

- Coorbit theory is applicable in a wide variety of cases.  
Explicit criteria for nice wavelets.
- Important consequence of consistency: Coorbit spaces depend (only) on the way the dilation group determines the wavelet system.

## Questions

- Are coorbit spaces necessarily smoothness spaces?
- Given different dilation groups  $H_1$  and  $H_2$ , how are their coorbit spaces related? Are they necessarily different?
- Is there a way of comparing coorbit spaces over different groups? (i.e., determine equality, embeddings)

## Answer

Decomposition space description!

# Decomposition spaces

## Decomposition spaces (Feichtinger/Gröbner)

Informal description: Cover the frequencies by a family of open relatively compact sets.

# Decomposition spaces

## Decomposition spaces (Feichtinger/Gröbner)

Informal description: Cover the frequencies by a family of open relatively compact sets. Decompose functions using a subordinate partition of unity.

# Decomposition spaces

## Decomposition spaces (Feichtinger/Gröbner)

Informal description: Cover the frequencies by a family of open relatively compact sets. Decompose functions using a subordinate partition of unity. Take the  $L^p$ -norm of each frequency-localized piece,



# Decomposition spaces

## Decomposition spaces (Feichtinger/Gröbner)

Informal description: Cover the frequencies by a family of open relatively compact sets. Decompose functions using a subordinate partition of unity. Take the  $L^p$ -norm of each frequency-localized piece, and then combine using weighted  $\ell^q$  norm.

# Decomposition spaces

## Decomposition spaces (Feichtinger/Gröbner)

Informal description: Cover the frequencies by a family of open relatively compact sets. Decompose functions using a subordinate partition of unity. Take the  $L^p$ -norm of each frequency-localized piece, and then combine using weighted  $\ell^q$  norm.

## Definition

Let  $\mathcal{Q} = (Q_i)_{i \in I}$  denote a covering of an open set  $\mathcal{O} \subset \mathbb{R}^d$ . Let  $(\varphi_i)_{i \in I} \subset C_c^\infty(\mathcal{O})$  denote a partition of unity subordinate to  $\mathcal{Q}$ .

# Decomposition spaces

## Decomposition spaces (Feichtinger/Gröbner)

Informal description: Cover the frequencies by a family of open relatively compact sets. Decompose functions using a subordinate partition of unity. Take the  $L^p$ -norm of each frequency-localized piece, and then combine using weighted  $\ell^q$  norm.

## Definition

Let  $\mathcal{Q} = (Q_i)_{i \in I}$  denote a covering of an open set  $\mathcal{O} \subset \mathbb{R}^d$ . Let  $(\varphi_i)_{i \in I} \subset C_c^\infty(\mathcal{O})$  denote a partition of unity subordinate to  $Q_i$ . Both  $\mathcal{Q}$  and the partition fulfill certain admissibility conditions.

# Decomposition spaces

## Decomposition spaces (Feichtinger/Gröbner)

Informal description: Cover the frequencies by a family of open relatively compact sets. Decompose functions using a subordinate partition of unity. Take the  $L^p$ -norm of each frequency-localized piece, and then combine using weighted  $\ell^q$  norm.

### Definition

Let  $\mathcal{Q} = (Q_i)_{i \in I}$  denote a covering of an open set  $\mathcal{O} \subset \mathbb{R}^d$ . Let  $(\varphi_i)_{i \in I} \subset C_c^\infty(\mathcal{O})$  denote a partition of unity subordinate to  $Q_i$ . Both  $\mathcal{Q}$  and the partition fulfill certain admissibility conditions. Given  $1 \leq p, q \leq \infty$  and a weight  $v$  on  $I$ , define the **decomposition space norm** of  $u \in \mathcal{S}'(\mathbb{R}^d)$  as

$$\|u\|_{\mathcal{D}(\mathcal{Q}, L^p, \ell_v^q)} = \left\| \left( \|u * \varphi_i^\vee\|_p \right)_{i \in I} \right\|_{\ell_v^q},$$

# Decomposition spaces

## Decomposition spaces (Feichtinger/Gröbner)

Informal description: Cover the frequencies by a family of open relatively compact sets. Decompose functions using a subordinate partition of unity. Take the  $L^p$ -norm of each frequency-localized piece, and then combine using weighted  $\ell^q$  norm.

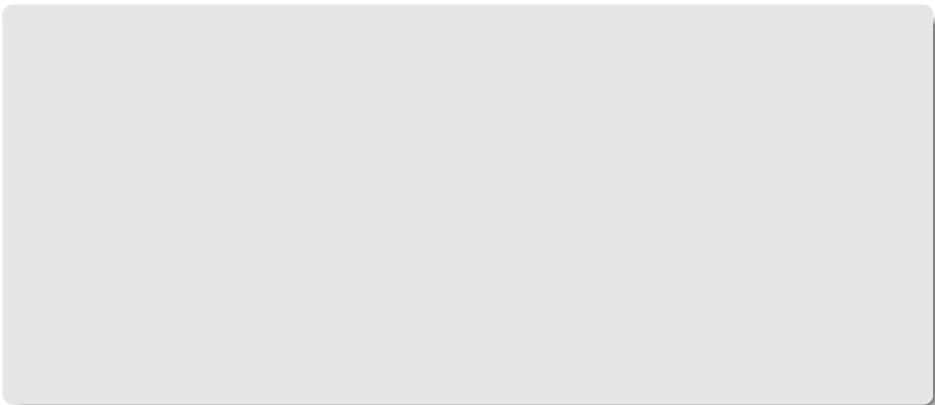
### Definition

Let  $\mathcal{Q} = (Q_i)_{i \in I}$  denote a covering of an open set  $\mathcal{O} \subset \mathbb{R}^d$ . Let  $(\varphi_i)_{i \in I} \subset C_c^\infty(\mathcal{O})$  denote a partition of unity subordinate to  $Q_i$ . Both  $\mathcal{Q}$  and the partition fulfill certain admissibility conditions. Given  $1 \leq p, q \leq \infty$  and a weight  $v$  on  $I$ , define the **decomposition space norm** of  $u \in \mathcal{S}'(\mathbb{R}^d)$  as

$$\|u\|_{\mathcal{D}(\mathcal{Q}, L^p, \ell_v^q)} = \left\| \left( \|u * \varphi_i^\vee\|_p \right)_{i \in I} \right\|_{\ell_v^q},$$

and the **decomposition space**  $\mathcal{D}(\mathcal{Q}, L^p, \ell_v^q)$  as the space of all  $u$  for which this norm is finite.

# Interpretation



# Interpretation

- Decomposition space norms measure decay in Fourier domain.

# Interpretation

- Decomposition space norms measure decay in Fourier domain.  
This suggests an interpretation as smoothness spaces.



# Interpretation

- Decomposition space norms measure decay in Fourier domain. This suggests an interpretation as smoothness spaces.
- **Consistency:** The definition is independent of the choice of partition of unity.

# Interpretation

- Decomposition space norms measure decay in Fourier domain. This suggests an interpretation as smoothness spaces.
- **Consistency:** The definition is independent of the choice of partition of unity. I.e., the frequency covering is the decisive feature.

# Interpretation

- Decomposition space norms measure decay in Fourier domain. This suggests an interpretation as smoothness spaces.
- **Consistency:** The definition is independent of the choice of partition of unity. I.e., the frequency covering is the decisive feature.
- Large variety of admissible decompositions allows diverse ways of measuring the decay.

# Interpretation

- Decomposition space norms measure decay in Fourier domain. This suggests an interpretation as smoothness spaces.
- **Consistency:** The definition is independent of the choice of partition of unity. I.e., the frequency covering is the decisive feature.
- Large variety of admissible decompositions allows diverse ways of measuring the decay.
- Very flexible scheme: Describes (homogeneous and inhomogeneous) Besov spaces,  $\alpha$ -modulation spaces, shearlet and curvelet approximation spaces, and

# Interpretation

- Decomposition space norms measure decay in Fourier domain. This suggests an interpretation as smoothness spaces.
- **Consistency:** The definition is independent of the choice of partition of unity. I.e., the frequency covering is the decisive feature.
- Large variety of admissible decompositions allows diverse ways of measuring the decay.
- Very flexible scheme: Describes (homogeneous and inhomogeneous) Besov spaces,  $\alpha$ -modulation spaces, shearlet and curvelet approximation spaces, and **wavelet coorbit spaces!**

# Interpretation

- Decomposition space norms measure decay in Fourier domain. This suggests an interpretation as smoothness spaces.
- **Consistency:** The definition is independent of the choice of partition of unity. I.e., the frequency covering is the decisive feature.
- Large variety of admissible decompositions allows diverse ways of measuring the decay.
- Very flexible scheme: Describes (homogeneous and inhomogeneous) Besov spaces,  $\alpha$ -modulation spaces, shearlet and curvelet approximation spaces, and **wavelet coorbit spaces!**

Theorem (HF, F. Voigtlaender, 2015)

*For any admissible matrix group  $H$  and weight  $u$  on  $H$  there exists an admissible covering  $\mathcal{Q} = (Q_j)_{j \in J}$  and a weight  $v$  on  $J$  such that*

$$\text{Co}(L_u^{p,q}) = \mathcal{D}(\mathcal{Q}, L^p, \ell_v^q)$$

# Applications to coorbit spaces

# Applications to coorbit spaces

- Relevant recent results from decomposition space theory: Rigidity theorems, embedding theorems. (F. Voigtlaender)



# Applications to coorbit spaces

- Relevant recent results from decomposition space theory: Rigidity theorems, embedding theorems. (F. Voigtlaender)
- Sample applications of rigidity: Different dilation groups may induce the same scale of coorbit spaces.

# Applications to coorbit spaces

- Relevant recent results from decomposition space theory: Rigidity theorems, embedding theorems. (F. Voigtlaender)
- Sample applications of rigidity: Different dilation groups may induce the same scale of coorbit spaces.  
On the other hand: Different **shearlet groups** in dimensions 2 and 3 give rise to different scales of coorbit spaces (F. Voigtlaender, R. Koch).
- **Embedding results** for decomposition spaces give rise to

# Applications to coorbit spaces

- Relevant recent results from decomposition space theory: Rigidity theorems, embedding theorems. (F. Voigtlaender)
- Sample applications of rigidity: Different dilation groups may induce the same scale of coorbit spaces.  
On the other hand: Different **shearlet groups** in dimensions 2 and 3 give rise to different scales of coorbit spaces (F. Voigtlaender, R. Koch).
- **Embedding results** for decomposition spaces give rise to
  - ▶ embeddings of shearlet coorbit spaces into Besov spaces, modulation spaces,

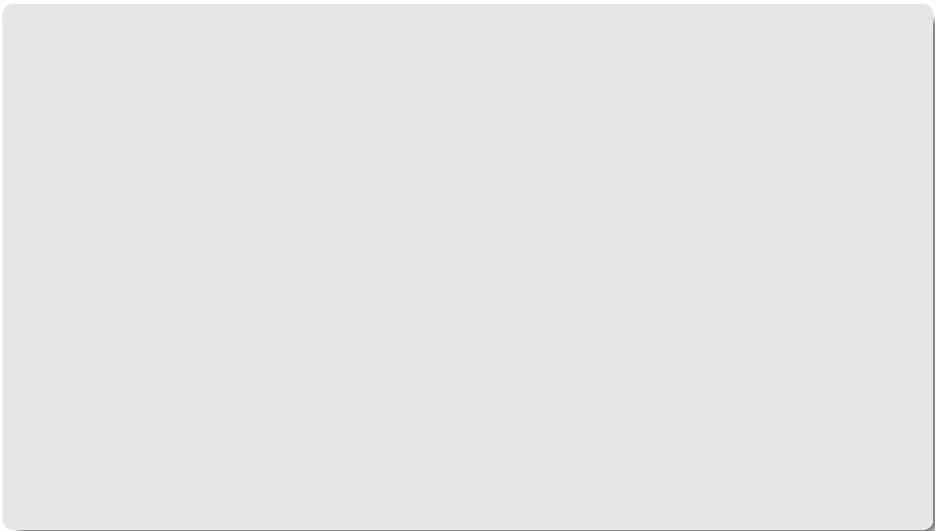
# Applications to coorbit spaces

- Relevant recent results from decomposition space theory: Rigidity theorems, embedding theorems. (F. Voigtlaender)
- Sample applications of rigidity: Different dilation groups may induce the same scale of coorbit spaces.  
On the other hand: Different **shearlet groups** in dimensions 2 and 3 give rise to different scales of coorbit spaces (F. Voigtlaender, R. Koch).
- **Embedding results** for decomposition spaces give rise to
  - ▶ embeddings of shearlet coorbit spaces into Besov spaces, modulation spaces,
  - ▶ embeddings of shearlet coorbit spaces into Sobolev spaces,

# Applications to coorbit spaces

- Relevant recent results from decomposition space theory: Rigidity theorems, embedding theorems. (F. Voigtlaender)
- Sample applications of rigidity: Different dilation groups may induce the same scale of coorbit spaces.  
On the other hand: Different **shearlet groups** in dimensions 2 and 3 give rise to different scales of coorbit spaces (F. Voigtlaender, R. Koch).
- **Embedding results** for decomposition spaces give rise to
  - ▶ embeddings of shearlet coorbit spaces into Besov spaces, modulation spaces,
  - ▶ embeddings of shearlet coorbit spaces into Sobolev spaces,
  - ▶ ...
- As a rule, the criteria for embeddings between or equality of decomposition spaces are based on explicit computations involving the induced coverings.

# Final remarks



# Final remarks

- Main purpose of the talk: Describe a unified and systematic approach for the simultaneous treatment of sparse signal spaces attached to wavelet systems over a large variety of dilation groups.

# Final remarks

- Main purpose of the talk: Describe a unified and systematic approach for the simultaneous treatment of sparse signal spaces attached to wavelet systems over a large variety of dilation groups.
- Results facilitate understanding of the role of the dilation group  $H$ .



# Final remarks

- Main purpose of the talk: Describe a unified and systematic approach for the simultaneous treatment of sparse signal spaces attached to wavelet systems over a large variety of dilation groups.
- Results facilitate understanding of the role of the dilation group  $H$ .
- The objects in the theorems (i.e., open orbit, envelope function, vanishing moment conditions etc.) are explicitly computable for concretely given dilation groups.

# Final remarks

- Main purpose of the talk: Describe a unified and systematic approach for the simultaneous treatment of sparse signal spaces attached to wavelet systems over a large variety of dilation groups.
- Results facilitate understanding of the role of the dilation group  $H$ .
- The objects in the theorems (i.e., open orbit, envelope function, vanishing moment conditions etc.) are explicitly computable for concretely given dilation groups.
- The prerequisites of the theorems in this talk have been verified for large classes of groups.

# Final remarks

- Main purpose of the talk: Describe a unified and systematic approach for the simultaneous treatment of sparse signal spaces attached to wavelet systems over a large variety of dilation groups.
- Results facilitate understanding of the role of the dilation group  $H$ .
- The objects in the theorems (i.e., open orbit, envelope function, vanishing moment conditions etc.) are explicitly computable for concretely given dilation groups.
- The prerequisites of the theorems in this talk have been verified for large classes of groups.
- Decomposition space approach also covers other types of smoothness spaces that are not associated to dilation groups, such as  $(\alpha)$ -modulation spaces, anisotropic Besov spaces, etc.

# Final remarks

- Main purpose of the talk: Describe a unified and systematic approach for the simultaneous treatment of sparse signal spaces attached to wavelet systems over a large variety of dilation groups.
- Results facilitate understanding of the role of the dilation group  $H$ .
- The objects in the theorems (i.e., open orbit, envelope function, vanishing moment conditions etc.) are explicitly computable for concretely given dilation groups.
- The prerequisites of the theorems in this talk have been verified for large classes of groups.
- Decomposition space approach also covers other types of smoothness spaces that are not associated to dilation groups, such as  $(\alpha)$ -modulation spaces, anisotropic Besov spaces, etc.
- The scheme extends to quasi-Banach setting (e.g.  $p < 1$ ).

# References: Wavelets and Besov spaces

## Influential papers

- R. De Vore, B. Jawerth, V. Popov, *Compression of wavelet decompositions*, Am. J. Math. 114, 737-785 (1992)
- R. De Vore, B. Jawerth, B. Lucier, *Image compression through wavelet transform coding*, IEEE Trans. Inform. Theory 38, 719–746 (1992)
- D. Donoho, I. Johnstone, *Adapting to unknown smoothness via wavelet shrinkage*, J. Amer. Statist. Assoc. 90, 1200-1224 (1995)
- M. Frazier, B. Jawerth, *Decomposition of Besov spaces*, Indiana Univ. Math. J. 34, 777-799 (1985).

## Books

- M. Frazier, B. Jawerth, G. Weiss. *Littlewood-Paley theory and the study of function spaces*. Am. Math. Soc. 1991.
- Y. Meyer: *Wavelets and operators*. Cambridge University Press, 1992.
- P. Wojtaszczyk: *A mathematical introduction to wavelets*. Cambridge University Press, 1997.

# References: Coorbit and decomposition spaces

## Foundational papers

- H. Feichtinger, P. Gröbner, *Banach spaces of distributions defined by decomposition methods. I.* Math. Nachr. 123, 97-120 (1985)
- H. Feichtinger, K. Gröchenig, *A unified approach to atomic decompositions via integrable group representations*, Lect. Notes Math. 1302, 52-73 (1988)
- H. Feichtinger, K. Gröchenig, *Banach spaces related to integrable group representations and their atomic decompositions. I.* J. Func. Anal. 86, 307-340 (1989)
- H. Feichtinger, K. Gröchenig, *Banach spaces related to integrable group representations and their atomic decompositions. II.* Monatsh. Math. 108, 129-148 (1989)
- K. Gröchenig, *Describing functions: Atomic decompositions vs. frames*, Monatsh. Math. 112 1-41 (1991)

## Extensions

- J.G. Christensen, G. Olafsson, *Coorbit spaces for dual pairs*, Appl. Comput. Harmon. Anal. 31, 303-324 (2011)
- S. Dahlke, M. Fornasier, Massimo, H. Rauhut, G. Steidl, G. Teschke, *Generalized coorbit theory, Banach frames, and the relation to  $\alpha$ -modulation spaces*, Proc. Lond. Math. Soc. 96, 464-506 (2008)
- H. Rauhut, *Coorbit space theory for quasi-Banach spaces*, Studia Math. 180, 237-253 (2007)
- H. Rauhut, T. Ullrich, *Generalized coorbit space theory and inhomogeneous function spaces of Besov-Lizorkin-Triebel type*, J. Funct. Anal. 260 3299-3362 (2011)

# References: Coorbit spaces and their relatives

## Examples beyond Besov and modulation spaces

- L. Borup, M. Nielsen, *Frame decomposition of decomposition spaces*, J. Fourier Anal. Appl. 13 39–70 (2007).
- S. Dahlke, G. Steidl, G. Teschke, *Weighted coorbit spaces and Banach frames on homogeneous spaces*, J. Fourier Anal. Appl. 10, 507–539 (2004)
- S. Dahlke, G. Kutyniok, G. Steidl, G. Teschke, *Shearlet coorbit spaces and associated Banach frames*, Appl. Comput. Harmon. Anal. 27 , 195–214 (2009)
- S. Dahlke, S. Häuser, G. Teschke, *Coorbit space theory for the Toeplitz shearlet transform*, Int. J. Wavelets Multiresolut. Inf. Process. 10 1250037, 13 pp. (2012)
- S. Dahlke, S. Häuser, G. Steidl, G. Teschke, *Shearlet coorbit spaces: traces and embeddings in higher dimensions*, Monatsh. Math. 169, 15–32 (2013)
- H.G. Feichtinger, M. Pap, *Coorbit theory and Bergman spaces*, pp. 231–259 in *Harmonic and complex analysis and its applications*, Birkhäuser/Springer, (2014)
- D. Labate, L. Mantovani, P. Negi, *Shearlet smoothness spaces*, J. Fourier Anal. Appl. 19 577–611 (2013)
- M. Nielsen, *Frames for decomposition spaces generated by a single function*, Collect. Math. 65, 183–201 (2014)
- M. Pap, *Properties of the voice transform of the Blaschke group and connections with atomic decomposition results in the weighted Bergman spaces*, J. Math. Anal. Appl. 389, 340–350 (2012) 43A32 (42C15 46E30)

# References directly related to this talk

- HF, *Generalized Calderón conditions and regular orbit spaces*, Colloq. Math. **120**, 103–126 (2010)
- HF, *Coorbit spaces and wavelet coefficient decay over general dilation groups*, Trans. AMS **367**, 7373–7401 (2015)
- HF, F. Voigtlaender, *Wavelet coorbit spaces viewed as decomposition spaces*, J. Funct. Anal. **269**, 80–154 (2015)
- HF, *Vanishing moment conditions for wavelet atoms in higher dimensions*, Adv. Comput. Math. **42**, 127–153 (2016)
- HF, R. Raisi Tousi, *Simplified vanishing moment criteria for wavelets over general dilation groups, with applications to abelian and shearlet dilation groups*, Appl. Comp. Harm. Anal., to appear.
- B. Currey, HF, V. Oussa, *A classification of continuous wavelet transforms in dimension three*. Preprint, available under <https://arxiv.org/abs/1610.07739>
- F. Voigtlaender: *Embedding Theorems for Decomposition Spaces with Applications to Wavelet Coorbit Spaces*. Ph.D. Thesis, RWTH Aachen, 2015
- F. Voigtlaender, *Embeddings of decomposition spaces*. Preprint, available under <http://arxiv.org/abs/1605.09705>
- F. Voigtlaender, *Embeddings of decomposition spaces into Sobolev and BV spaces*. Preprint, available under <http://arxiv.org/abs/1601.02201>
- H.G. Feichtinger, F. Voigtlaender *From Frazier-Jawerth characterizations of Besov spaces to wavelets and decomposition spaces*. Preprint, available under <http://arxiv.org/abs/1606.04924>