

# Banach Gelfand Triples motivated by Time-Frequency Analysis

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# OVERVIEW over this lecture 40 MINUTES

- This is a talk about **Banach Gelfand Triples**
- explaining some background in time-frequency analysis
- showing some applications in **Fourier Analysis**
- indicating its relevance for numerical applications
- and for teaching purposes
- OVERALL:
- perhaps changing your view on **Fourier Analysis**



# Calculating with all kind of numbers

The most beautiful equation

$$e^{2\pi i} = 1.$$

It uses the exponential function, with a (purely) imaginary exponent to get a nice result, more appealing than (the equivalent)

$$\cos(2\pi) + i * \sin(2\pi) = 1 \quad \text{in } \mathbb{C}.$$

But actual computation are done for rational numbers only!! Recall

$$\mathbb{Q} \subset \mathbb{R} \subset \mathbb{C}$$



# The finite Fourier transform (and FFT)

For practical applications the discrete (finite) Fourier transform is of utmost importance, because of its **algebraic properties** [joint diagonalization of circulant matrices, hence fast multiplication of polynomials, etc.] and its **computational efficiency** (FFT algorithms of signals of length  $N$  run in  $N\log(N)$  time, for  $N = 2^k$ , due to recursive arguments).

It maps a vector of length  $n$  onto the values of the polynomial generated by this set of coefficients, over the unit roots of order  $n$  on the unit circle (hence it is a Vandermonde matrix). It is a **unitary matrix** (up to the factor  $1/\sqrt{n}$ ) and maps **pure frequencies onto unit vectors** (engineers talk of *energy preservation*).



# The Fourier Integral and Inversion

If we define the Fourier transform for functions on  $\mathbb{R}^d$  using an integral transform, then it is useful to assume that  $f \in \mathbf{L}^1(\mathbb{R}^d)$ , i.e. that  $f$  belongs to the space of Lebesgues integrable functions.

$$\hat{f}(\omega) = \int_{\mathbb{R}^d} f(t) \cdot e^{-2\pi i \omega \cdot t} dt \quad (1)$$

The inverse Fourier transform then has the form

$$f(t) = \int_{\mathbb{R}^d} \hat{f}(\omega) \cdot e^{2\pi i t \cdot \omega} d\omega, \quad (2)$$

Strictly speaking this inversion formula only makes sense under the additional hypothesis that  $\hat{f} \in \mathbf{L}^1(\mathbb{R}^d)$ .

One often speaks of **Fourier analysis** being the first step, and the Fourier inversion as a method to build  $f$  from the pure frequencies (we talk of **Fourier synthesis**).



# The classical situation with Fourier

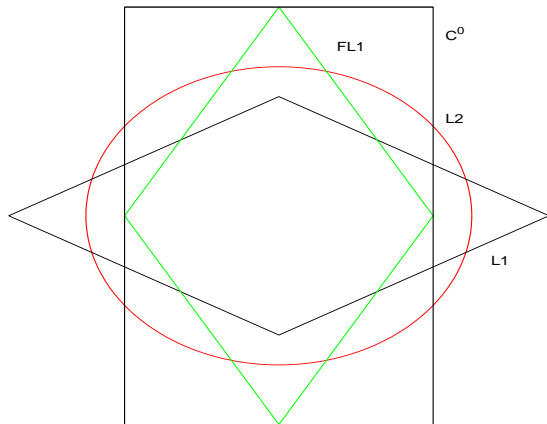
Unfortunately the Fourier transform does not behave well with respect to  $\mathbf{L}^1$ , and a lot of functional analysis went into fighting the problems (or should we say symptoms?)

- 1 For  $f \in \mathbf{L}^1(\mathbb{R}^d)$  we have  $\hat{f} \in \mathbf{C}_0(\mathbb{R}^d)$  (but not conversely, nor can we guarantee  $\hat{f} \in \mathbf{L}^1(\mathbb{R}^d)$ );
- 2 The Fourier transform  $f$  on  $\mathbf{L}^1(\mathbb{R}^d) \cap \mathbf{L}^2(\mathbb{R}^d)$  is isometric in the  $\mathbf{L}^2$ -sense, but the Fourier integral cannot be written anymore;
- 3 Convolution and pointwise multiplication correspond to each other, but sometimes the convolution may have to be taken as improper integral, or using summability methods;
- 4  $\mathbf{L}^p$ -spaces have traditionally a high reputation among function spaces, but tell us little about  $\hat{f}$ .

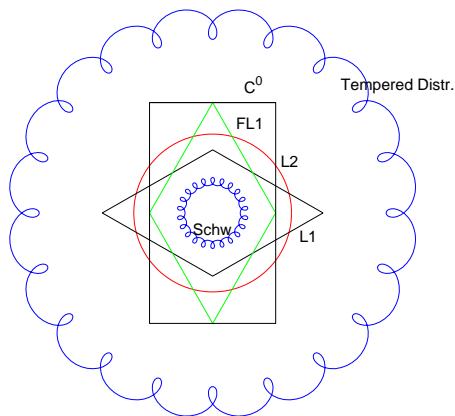


# A schematic description of the situation

the classical Fourier situation

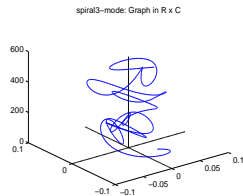
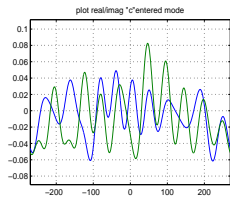
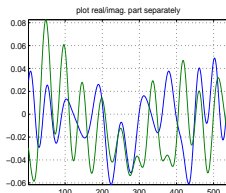
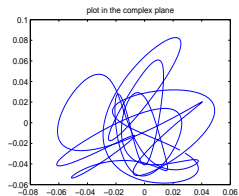


# The situation using Schwartz spaces





# Complex-valued Functions on the Torus

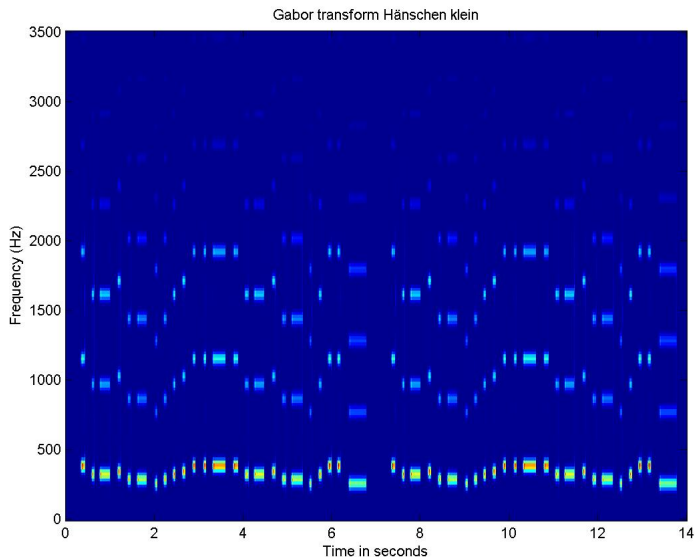


## Time-Frequency Analysis and Music

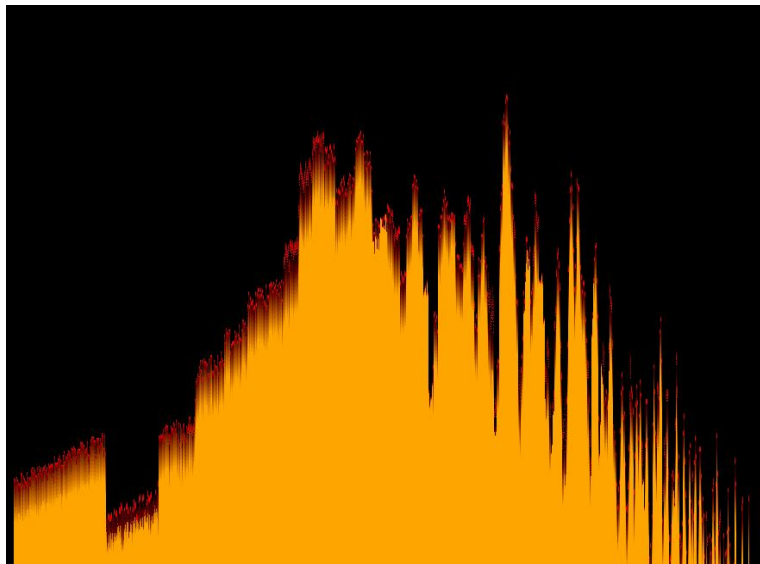
1. Häns-chen klein ging al - lein in die wei - te  
Welt hin - ein. Stock und Hut stehn ihm gut,  
wan - dert wohl - ge - mut. Doch die Mut - ter  
weint so sehr, hat ja gar kein Häns-chen mehr.  
Da be - sinnt sich das Kind, läuft nach Haus ge - schwind.

The image shows a musical score for the song "Hänschen klein". It consists of five staves of music in 2/4 time, with a key signature of one flat (B-flat). The melody is written on a treble clef. Chord symbols (F and C7) are placed above the notes. The lyrics are written below the notes. The score ends with a double bar line.

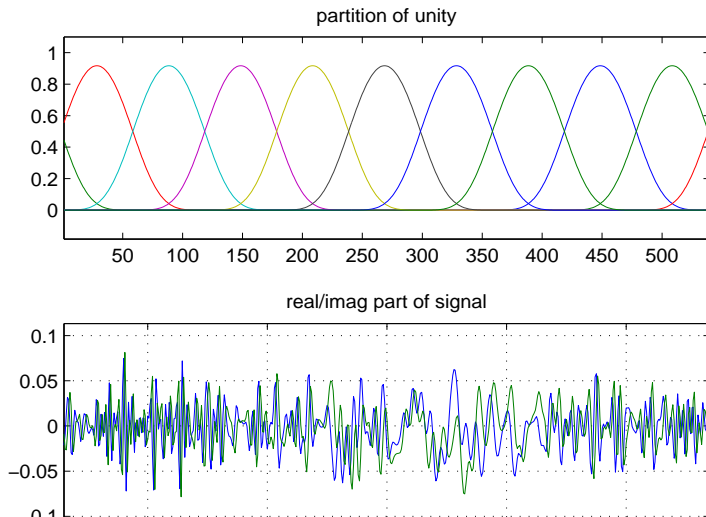
# The Short-Time Fourier Transform of this Song



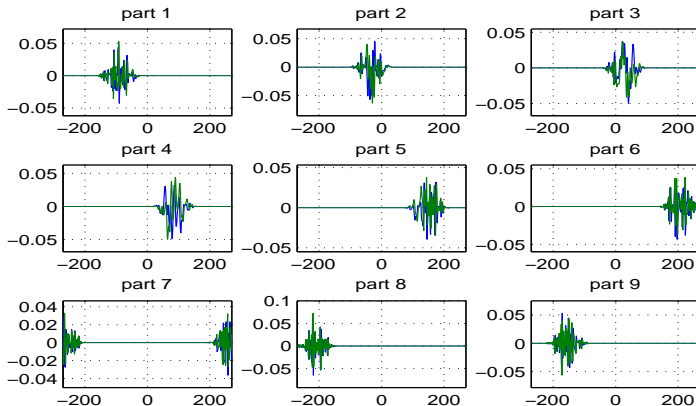
# Another (Standard) representation of a Musical STFT



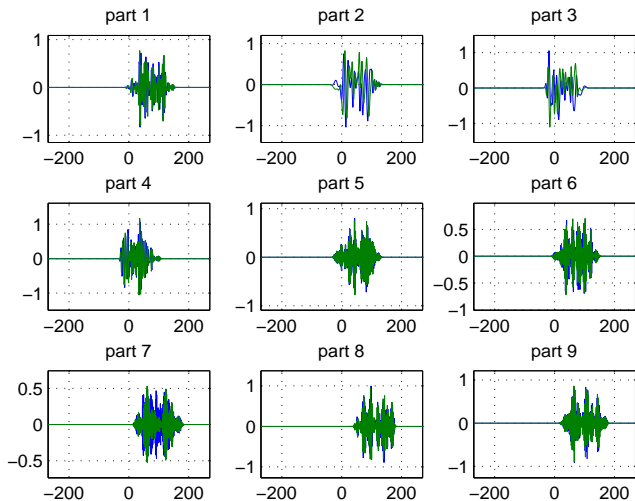
# The idea of a “localized Fourier Spectrum”



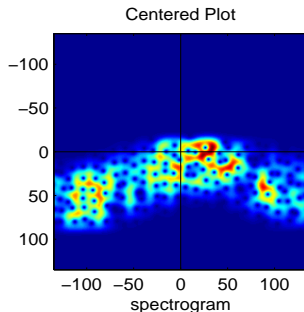
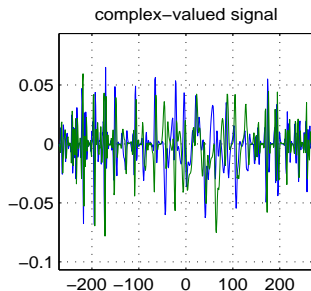
# The localized Fourier transform (spectrogram)



# Spectral decomposition: variable bandwidth



# STFT of a function of “variable band-width”





# The key-players for time-frequency analysis

## Time-shifts and Frequency shifts

$$T_x f(t) = f(t - x)$$

and  $x, \omega, t \in \mathbb{R}^d$

$$M_\omega f(t) = e^{2\pi i \omega \cdot t} f(t).$$

Behavior under Fourier transform

$$(T_x f)^\wedge = M_{-x} \hat{f} \quad (M_\omega f)^\wedge = T_\omega \hat{f}$$

## The Short-Time Fourier Transform

$$V_g f(\lambda) = \langle f, M_\omega T_t g \rangle = \langle f, \pi(\lambda) g \rangle = \langle f, g_\lambda \rangle, \quad \lambda = (t, \omega);$$



## A Banach Space of Test Functions (Fei 1979)

A function in  $f \in \mathbf{L}^2(\mathbb{R}^d)$  is in the subspace  $\mathbf{S}_0(\mathbb{R}^d)$  if for some non-zero  $g$  (called the “window”) in the Schwartz space  $\mathcal{S}(\mathbb{R}^d)$

$$\|f\|_{\mathbf{S}_0} := \|V_g f\|_{\mathbf{L}^1} = \iint_{\mathbb{R}^d \times \widehat{\mathbb{R}}^d} |V_g f(x, \omega)| dx d\omega < \infty.$$

The space  $(\mathbf{S}_0(\mathbb{R}^d), \|\cdot\|_{\mathbf{S}_0})$  is a Banach space, for any fixed, non-zero  $g \in \mathcal{S}(\mathbb{R}^d)$ , and different windows  $g$  define the same space and equivalent norms. Since  $\mathbf{S}_0(\mathbb{R}^d)$  contains the Schwartz space  $\mathcal{S}(\mathbb{R}^d)$ , any Schwartz function is suitable, but also compactly supported functions having an integrable Fourier transform (such as a trapezoidal or triangular function) are suitable. It is convenient to use the Gaussian as a window.



## Lemma

Let  $f \in \mathbf{S}_0(\mathbb{R}^d)$ , then the following holds:

- (1)  $\pi(u, \eta)f \in \mathbf{S}_0(\mathbb{R}^d)$  for  $(u, \eta) \in \mathbb{R}^d \times \widehat{\mathbb{R}}^d$ , and  $\|\pi(u, \eta)f\|_{\mathbf{S}_0} = \|f\|_{\mathbf{S}_0}$ .
- (2)  $\hat{f} \in \mathbf{S}_0(\mathbb{R}^d)$ , and  $\|\hat{f}\|_{\mathbf{S}_0} = \|f\|_{\mathbf{S}_0}$ .

In fact,  $(\mathbf{S}_0(\mathbb{R}^d), \|\cdot\|_{\mathbf{S}_0})$  is the smallest non-trivial Banach space with this property, and therefore contained in any of the  $\mathbf{L}^p$ -spaces (and their Fourier images).



# BANACH GELFAND TRIPLES: a new category

## Definition

A triple, consisting of a Banach space  $\mathbf{B}$ , which is dense in some Hilbert space  $\mathcal{H}$ , which in turn is contained in  $\mathbf{B}'$  is called a **Banach Gelfand triple**.

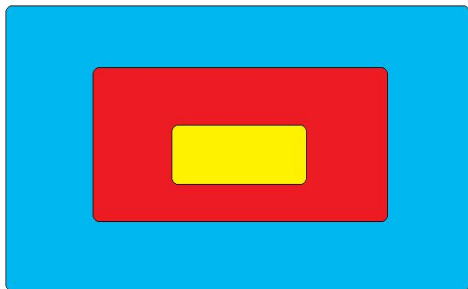
## Definition

If  $(\mathbf{B}_1, \mathcal{H}_1, \mathbf{B}'_1)$  and  $(\mathbf{B}_2, \mathcal{H}_2, \mathbf{B}'_2)$  are Gelfand triples then a linear operator  $T$  is called a **[unitary] Gelfand triple isomorphism** if

- 1  $A$  is an isomorphism between  $\mathbf{B}_1$  and  $\mathbf{B}_2$ .
- 2  $A$  is [a unitary operator resp.] an isomorphism between  $\mathcal{H}_1$  and  $\mathcal{H}_2$ .
- 3  $A$  extends to a weak\* isomorphism as well as a norm-to-norm continuous isomorphism between  $\mathbf{B}'_1$  and  $\mathbf{B}'_2$ .

# The SO-Banach Gelfand Triple (Rigged Hilbert Space)

TEST FUNCTIONS - Hilbert space  $L^2$  - generalized functions = DISTRIBUTIONS



# Banach Gelfand Triples, etc.

In principle every CONB (= *complete orthonormal basis*)  $\Psi = (\psi_i)_{i \in I}$  for a given Hilbert space  $\mathcal{H}$  can be used to establish such a unitary isomorphism, by choosing as  $\mathbf{B}$  the space of elements within  $\mathcal{H}$  which have an absolutely convergent expansion, i.e. satisfy  $\sum_{i \in I} |\langle x, \psi_i \rangle| < \infty$ .

For the case of the Fourier system as CONB for  $\mathcal{H} = \mathbf{L}^2([0, 1])$ , i.e. the corresponding definition is already around since the times of N. Wiener:  $\mathbf{A}(\mathbb{T})$ , the space of absolutely continuous Fourier series. It is also not surprising in retrospect to see that the dual space  $\mathbf{PM}(\mathbb{T}) = \mathbf{A}(\mathbb{T})'$  is space of *pseudo-measures*. One can extend the classical Fourier transform to this space, and in fact interpret this extended mapping, in conjunction with the classical Plancherel theorem as the first unitary Banach Gelfand triple isomorphism, between  $(\mathbf{A}, \mathbf{L}^2, \mathbf{PM})(\mathbb{T})$  and  $(\ell^1, \ell^2, \ell^\infty)(\mathbb{Z})$ .



# The Fourier transform as BGT automorphism

The **Fourier transform**  $\mathcal{F}$  on  $\mathbb{R}^d$  has the following properties:

- 1  $\mathcal{F}$  is an isomorphism from  $\mathbf{S}_0(\mathbb{R}^d)$  to  $\mathbf{S}_0(\widehat{\mathbb{R}}^d)$ ,
- 2  $\mathcal{F}$  is a unitary map between  $\mathbf{L}^2(\mathbb{R}^d)$  and  $\mathbf{L}^2(\widehat{\mathbb{R}}^d)$ ,
- 3  $\mathcal{F}$  is a weak\* (and norm-to-norm) continuous bijection from  $\mathbf{S}'_0(\mathbb{R}^d)$  onto  $\mathbf{S}'_0(\widehat{\mathbb{R}}^d)$ .

Furthermore, we have that Parseval's formula

$$\langle f, g \rangle = \langle \widehat{f}, \widehat{g} \rangle \quad (3)$$

is valid for  $(f, g) \in \mathbf{S}_0(\mathbb{R}^d) \times \mathbf{S}'_0(\mathbb{R}^d)$ , and therefore on each level of the Gelfand triple  $(\mathbf{S}_0, \mathbf{L}^2, \mathbf{S}'_0)(\mathbb{R}^d)$ .



# The $w^*$ – topology: a natural alternative

It is not difficult to show, that the norms of  $(\mathbf{S}_0, \mathbf{L}^2, \mathbf{S}'_0)(\mathbb{R}^d)$  correspond to norm convergence in  $(\mathbf{L}^1, \mathbf{L}^2, \mathbf{L}^\infty)(\mathbb{R}^{2d})$ .

Therefore it is interesting to check what the  $w^*$ -convergence looks like:

## Lemma

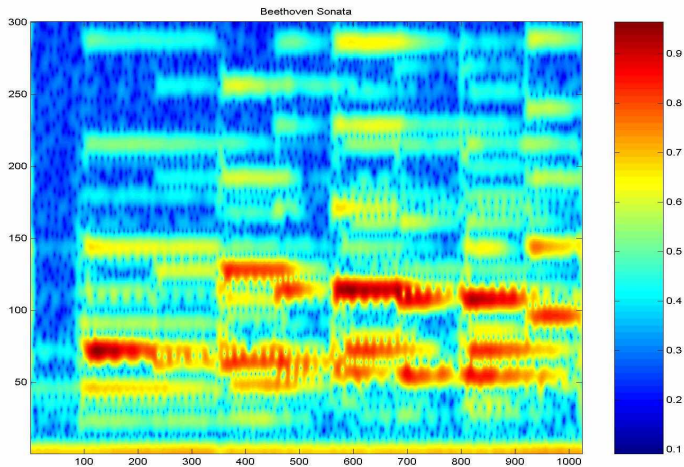
*For any  $g \in \mathbf{S}_0(\mathbb{R}^d)$  a sequence  $\sigma_n$  is  $w^*$ -convergent to  $\sigma_0$  if and only the spectrograms  $V_g(\sigma_n)$  converge uniformly over compact sets to the spectrogram  $V_g(\sigma_0)$ .*

The **FOURIER transform**, viewed as a BGT-automorphism is **uniquely determined** by the fact that it maps **pure frequencies** onto the corresponding **point measures**  $\delta_\omega$ .





# A Typical Musical STFT



# The $w^*$ – topology: dense subfamilies

From the practical point of view this means, that one has to **look at the spectrograms** of the sequence  $\sigma_n$  and verify whether they look closer and closer the spectrogram of the limit distribution  $V_g(\sigma_0)$  over compact sets.

The approximation of elements from  $\mathbf{S}_0'(\mathbb{R}^d)$  takes place by a bounded sequence.

Since any Banach-Gelfand triple homomorphism preserves this property (by definition) one can reduce many problems to  $w^*$ -dense subsets of  $(\mathbf{S}_0(\mathbb{R}^d), \|\cdot\|_{\mathbf{S}_0})$ .

Let us look at some concrete examples: **Test-functions, finite discrete measures  $\mu = \sum_i c_i \delta_{t_i}$ , trigonometric polynomials  $q(t) = \sum_i a_i e^{2\pi i \omega_i t}$ , or discrete AND periodic measures** (this class is invariant under the generalized Fourier transform and can be realized computationally using the FFT).

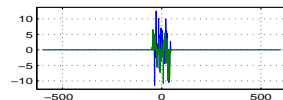
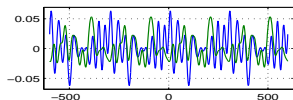
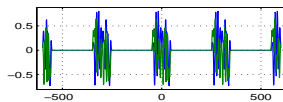
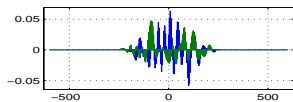
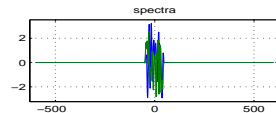
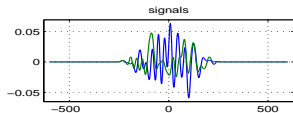


# The $w^*$ – topology: approximation strategies

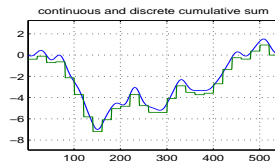
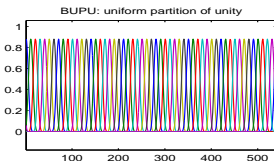
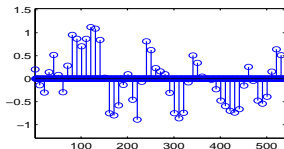
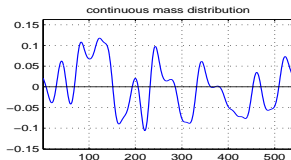
- How to approximate general distributions by test functions: Regularization procedures via product convolution operators,  $h_\alpha(g_\beta * \sigma) \rightarrow \sigma$  or TF-localization operators: multiply the STFT with a 2D-summability kernel before resynthesis (e.g. partial sums for Hermite expansion);
- how to approximate an  $\mathbf{L}^1$ -Fourier transform by test functions: and classical summability
- how to approximate a test function by a finite discrete sequence using quasi-interpolation (N. Kaiblinger):  
$$Q_\Psi f(x) = \sum_i f(x_i)\psi_i(x).$$



# Sampling and Periodization



# Adjoint Action on Distributions: Discretization of Mass



# Interesting Consequence for Operators: Kernel Theorem

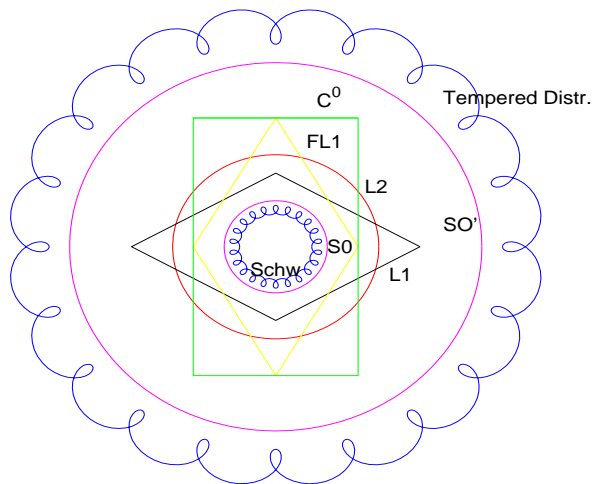
The Banach Gelfand Triple also appears to be appropriate for a natural generalization of things we are used to have in the context of finite dimensional vector spaces.

For example: the analogue of the matrix representation of a linear mapping from  $\mathbb{R}^n$  to  $\mathbb{R}^m$  using a uniquely determined (once the bases are fixed)  $m \times n$ -matrix  $A$ : Every linear operator from  $(\mathbf{S}_0(\mathbb{R}^d), \|\cdot\|_{\mathbf{S}_0})$  into  $(\mathbf{S}'_0(\mathbb{R}^d), \|\cdot\|_{\mathbf{S}'_0})$  has a (distributional) **kernel**  $\sigma \in \mathbf{S}'_0(\mathbb{R}^{2d})$ .

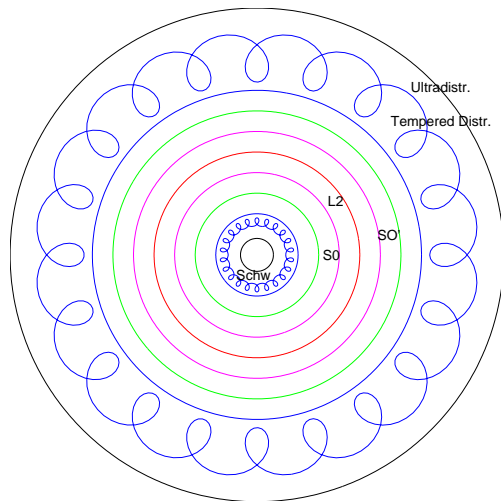
This is very much in the spirit of **Dirac's calculus!**



# The new view on the Fourier Transform



# Ultradistributions and the Fourier Transform





# OUTLOOK on further application areas

- teaching of Fourier Analysis to engineers;
- treatment of generalized stochastic processes: they are interpreted as bounded linear mappings from  $\mathbf{S}_0(\mathbb{R}^d)$  to some abstract Hilbert space (of random variables, with expectation zero);
- replacing  $\mathcal{S}(G)$  over LCA groups (Schwartz-Bruhat), in a convenient way;
- description of pseudo-differential operators (Kohn-Nirenberg, Weyl calculus, spreading representation);
- numerical approximation of all that, ...



more information are found ...

at the NuHAG Web-Page

[www.nuhag.eu](http://www.nuhag.eu)

see DB+tools >> Talks (for example)



What is the future of Harmonic Analysis?

Is there a place for Abstract Harmonic Analysis?

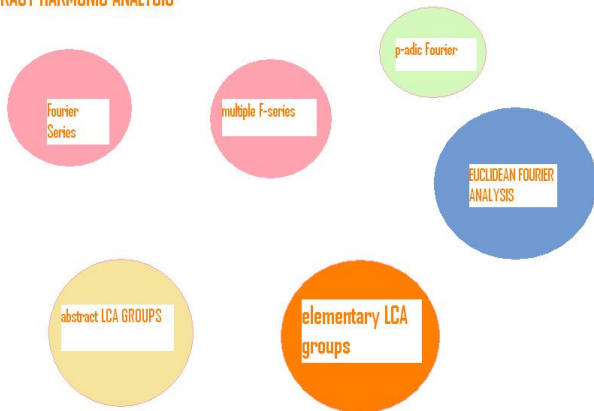
What is the role of Computational Harmonic Analysis?

Constructive versus *realizable* methods!



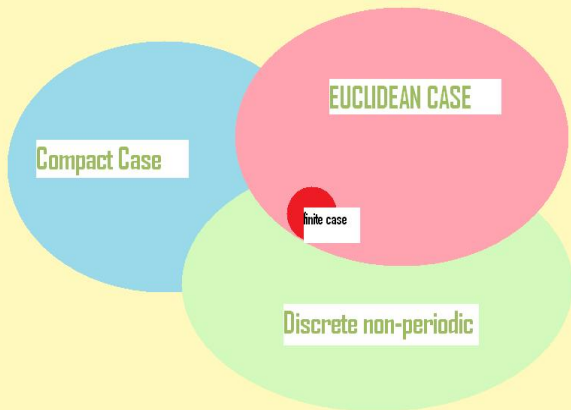
# The classical view of Abstract Harmonic Analysis

## ABSTRACT HARMONIC ANALYSIS



# A more INTEGRATED viewpoint

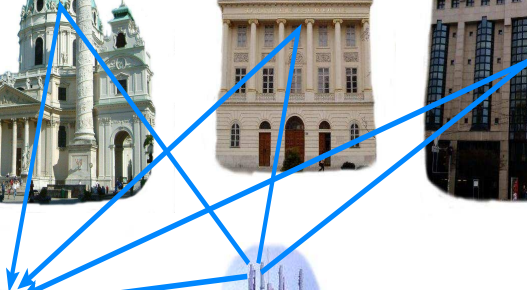
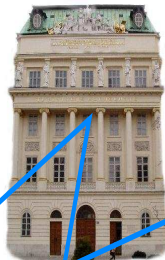
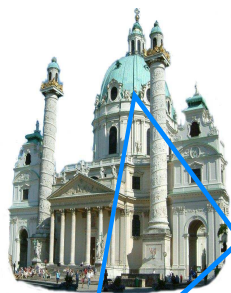
## HARMONIC ANALYSIS



# Application Areas: Mobile Communication



# Mobile Communication 2



# Audio Processing and Gabor Multipliers 1



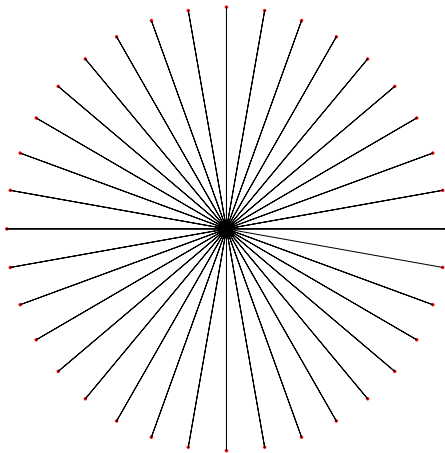


# Audio Processing and Gabor Multipliers 2



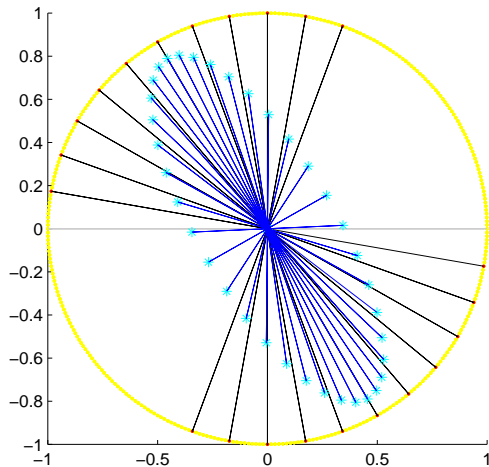
# A generic, high redundancy frame in the plane

a frame of redundancy 18 in the plane

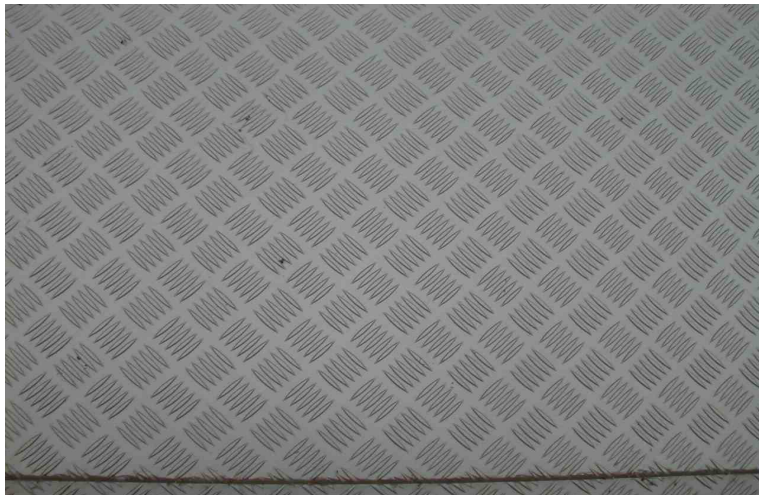


# The action of a corresponding frame multiplier

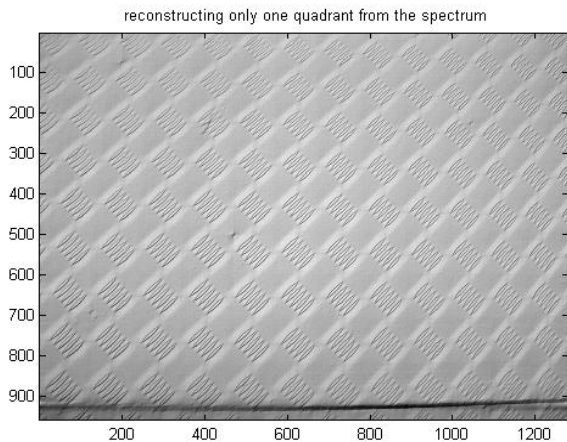
The effect of a frame multiplier in the plane:



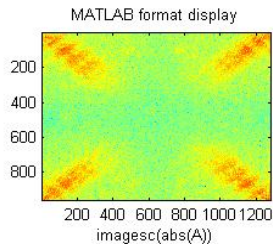
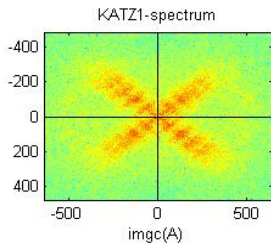
# 2D-Gabor Transform



## 2D-Gabor Analysis: Test Images

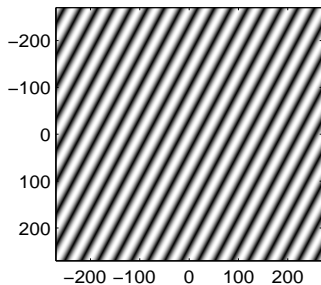


## 2D-Gabor Transform: Test-Images 2

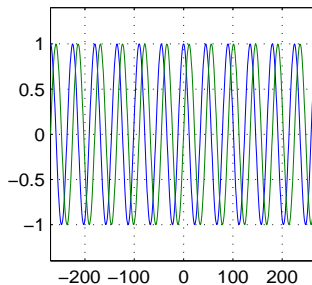


# 2D-Gabor Transform: Plane Waves

a plane wave



a pure frequency: real/imag



# Image Compression: a Test Image

