

“Chirps” everywhere

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*thanks to

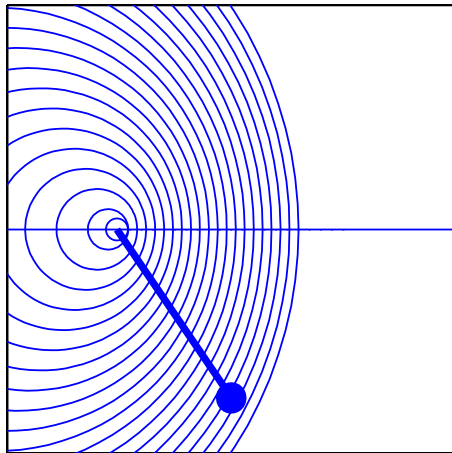
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observation

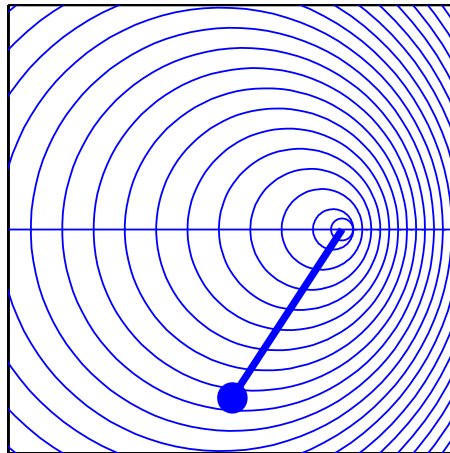
Doppler effect

Motion of a monochromatic source \Rightarrow *differential* perception of the emitted frequency \Rightarrow "chirp".

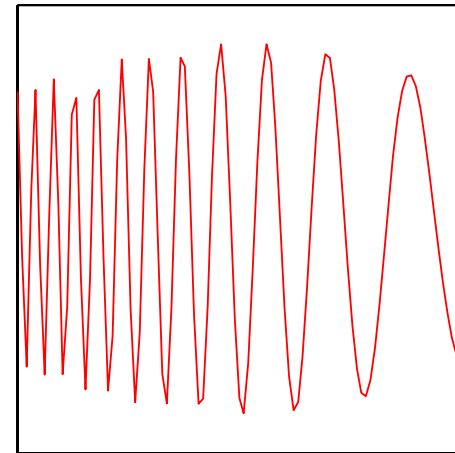
$f + \Delta f$



$f - \Delta f$



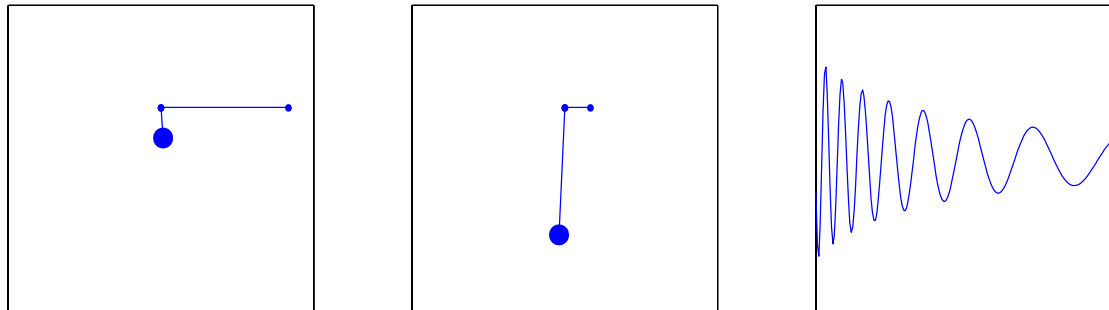
"chirp"





Pendulum

$$\ddot{\theta}(t) + (g/L) \theta(t) = 0$$



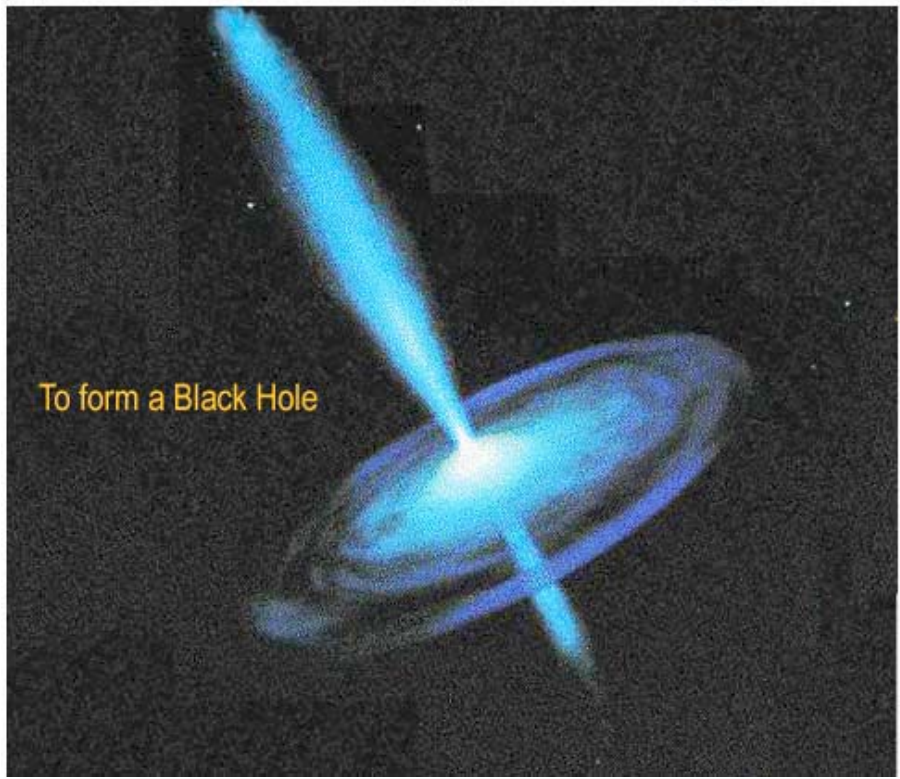
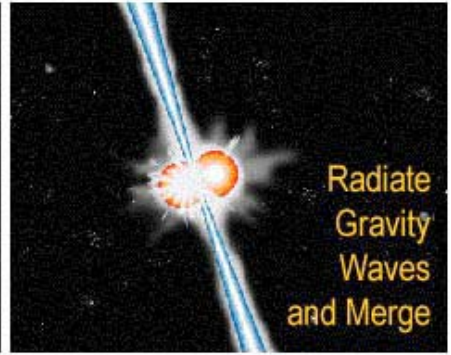
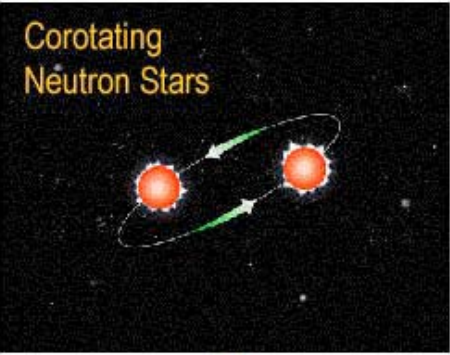
Fixed length $L = L_0$ — Small oscillations are sinusoidal, with fixed period $T_0 = 2\pi\sqrt{L_0/g}$.

“Slowly” varying length $L = L(t)$ — Small oscillations are quasi-sinusoidal, with *time-varying* pseudo-period $T(t) \sim 2\pi\sqrt{L(t)/g}$.

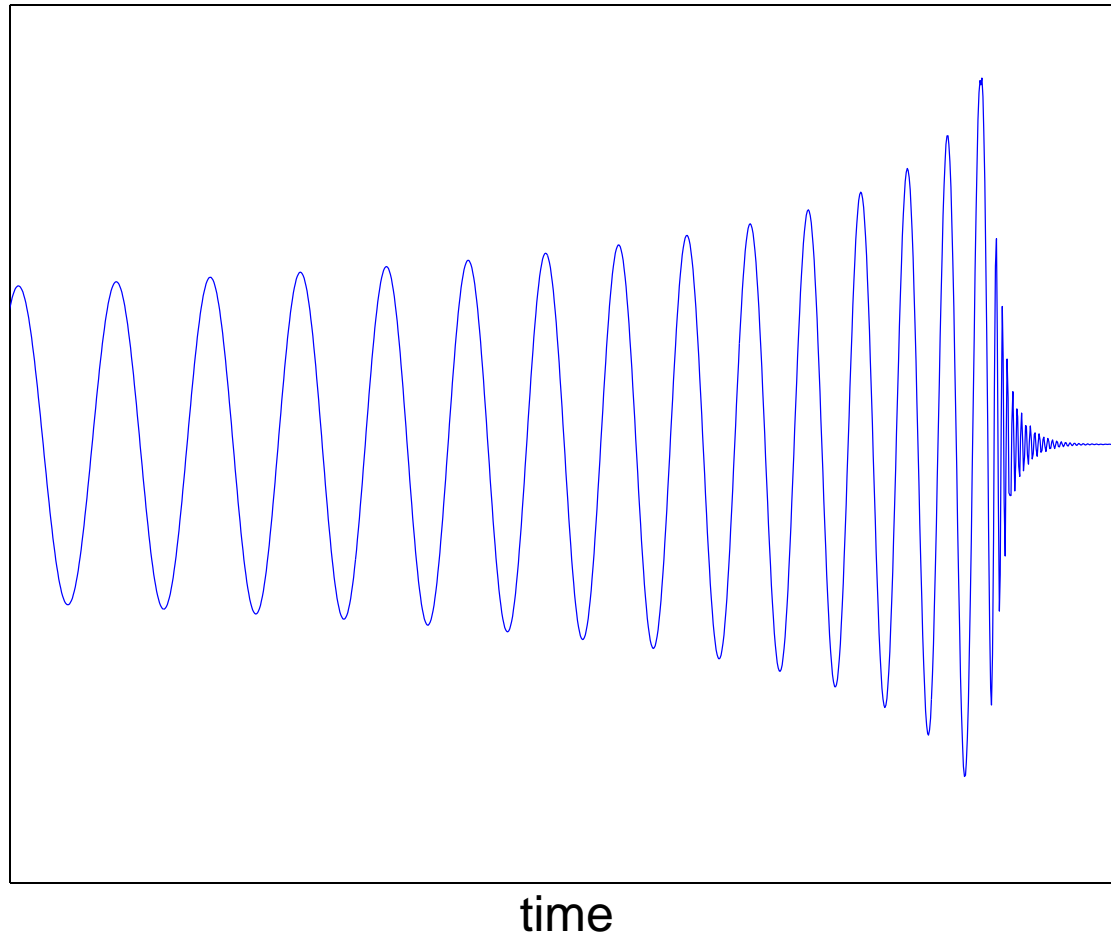
Gravitational waves

Theory — Though predicted by general relativity, *gravitational waves* have never been observed directly. They are “space-time vibrations,” resulting from the acceleration of moving masses ⇒ most promising sources in *astrophysics* (e.g., coalescence of binary neutrons stars).

Experiments — Several large instruments (VIRGO project for France and Italy, LIGO project for the USA) are currently under construction for a direct *terrestrial* evidence via *laser interferometry*.



gravitational wave



VIRGO



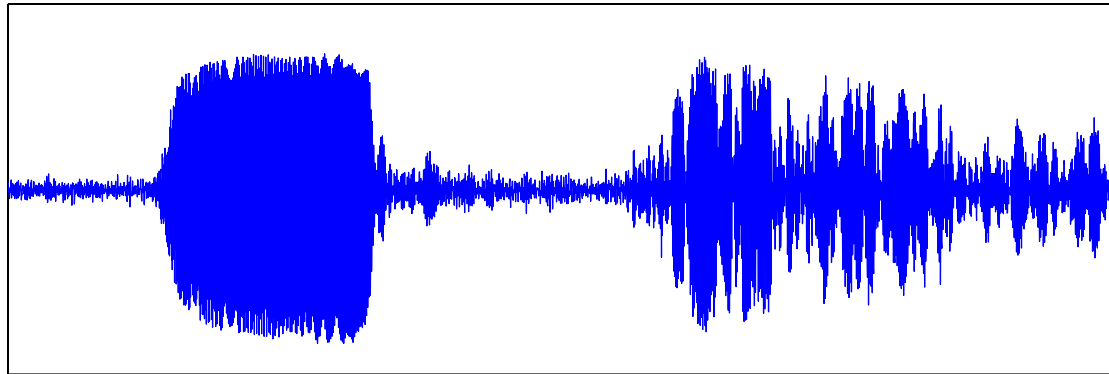
Bat echolocation

System — Active system for navigation, “natural sonar” .

Signals — Ultrasonic acoustic waves, transient (some ms) and “wide band” (some tens of kHz between 40 and 100kHz).

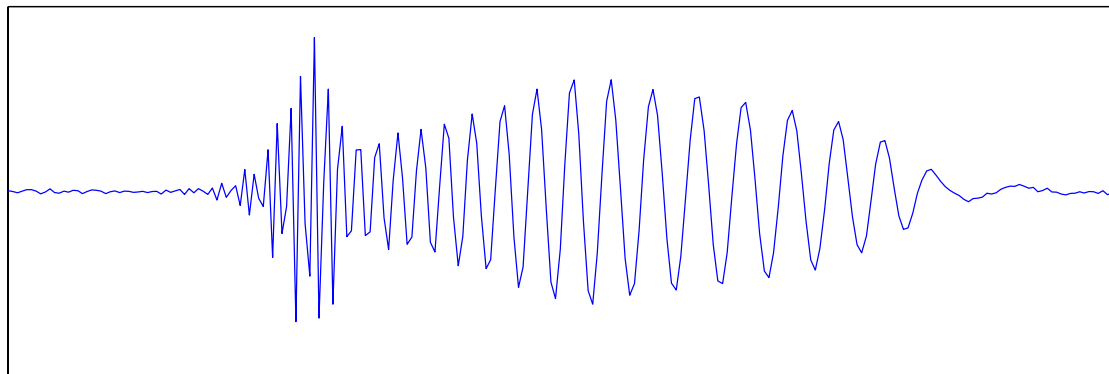
Performance — Nearly optimal, with *adaptation* of emitted waveforms to multiple tasks (detection, estimation, classification, interference rejection, . . .).

bat echolocation call + echo



time

bat echolocation call (heterodyned)



time

More examples

Waves and vibrations — Bird songs, music (“glissando”), speech, geophysics (“whistling atmospherics”, vibroseis), wide band pulses propagating in a [dispersive medium](#), radar, sonar, . . .

Biology and medicine — EEG (seizure), uterine EMG (contractions), . . .

Disorder and critical phenomena — Coherent structures in turbulence, accumulation of precursors in earthquakes, “speculative bubbles” prior a financial krach, . . .

Mathematics — [Riemann](#) and [Weierstrass](#) functions, . . .

description

Chirps

Definition — We will call “chirp” any complex signal of the form $x(t) = a(t) \exp\{i\varphi(t)\}$, where $a(t) \geq 0$ is a low-pass amplitude whose evolution is slow as compared to the oscillations of the phase $\varphi(t)$.

Slow evolution? — Usual heuristic conditions assume that:

1. $|\dot{a}(t)/a(t)| \ll |\dot{\varphi}(t)|$: the amplitude is *quasi-constant* at the scale of one pseudo-period $T(t) = 2\pi/|\dot{\varphi}(t)|$.
2. $|\ddot{\varphi}(t)|/\dot{\varphi}^2(t) \ll 1$: the pseudo-period $T(t)$ is itself *slowly varying* from one oscillation to the next.

Chirp spectrum

Stationary phase — In the case where the phase derivative $\dot{\varphi}(t)$ is monotonic, one can approximate the chirp spectrum

$$X(f) = \int_{-\infty}^{+\infty} a(t) e^{i(\varphi(t) - 2\pi ft)} dt$$

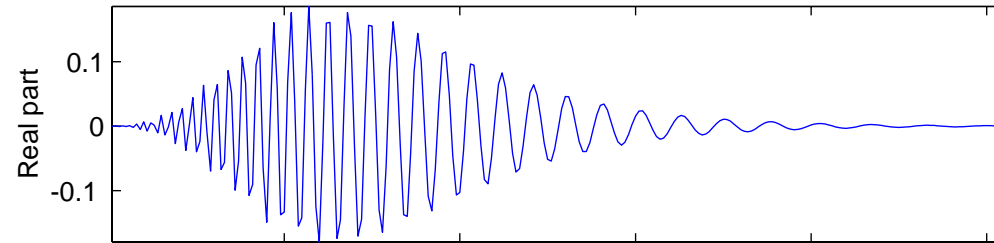
by its *stationary phase approximation* $\tilde{X}(f)$. We get this way:

$$|\tilde{X}(f)|^2 \propto \frac{a^2(t_s)}{|\ddot{\varphi}(t_s)|},$$

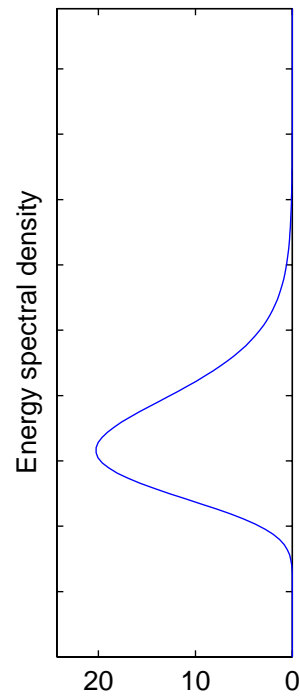
with t_s such that $\dot{\varphi}(t_s) = 2\pi f$.

Interpretation — The “instantaneous frequency” curve $\dot{\varphi}(t)$ defines a one-to-one correspondence between one time and one frequency. The chirp spectrum follows by weighting the *visited frequencies* by the corresponding *times of occupancy*.

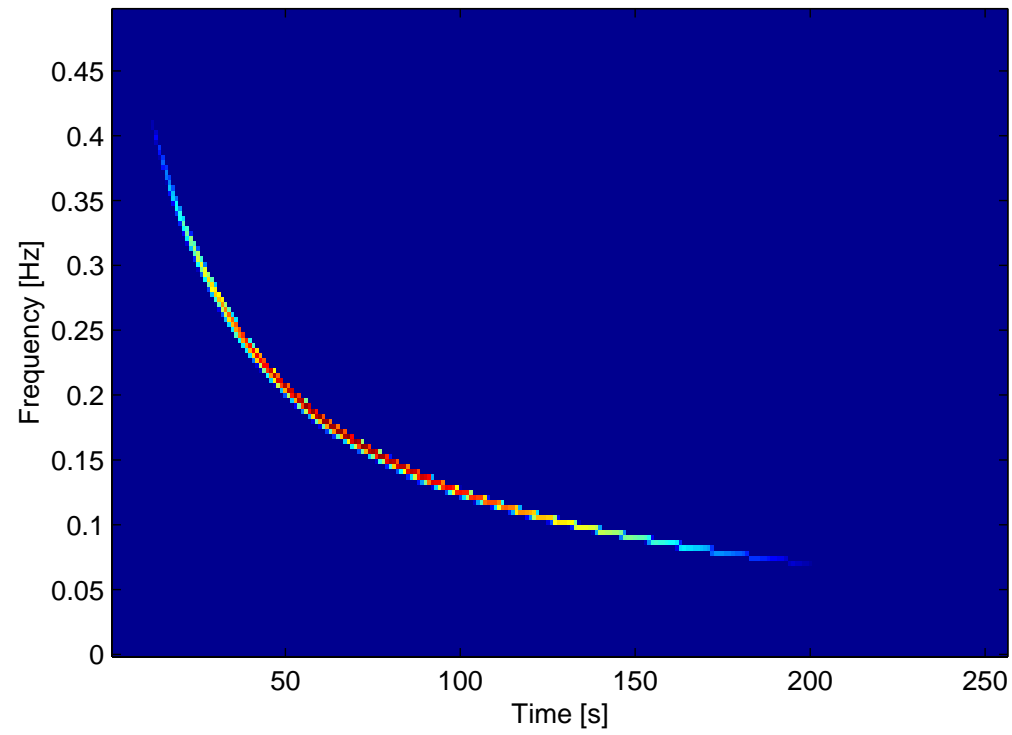
Signal in time



Linear scale

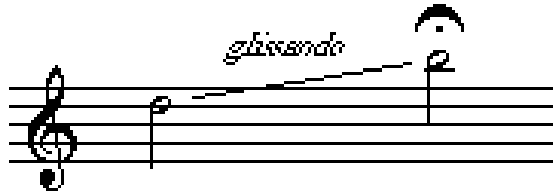


RSP, Lh=15, Nf=128, log. scale, Threshold=0.05%



representation

Time-frequency



Idea — Give a mathematical formulation to musical notation

Objective — Write the “musical score” of a signal

Constraint — Get a *localized* representation in chirp cases:

$$\rho(t, f) \sim a^2(t) \delta(f - \dot{\varphi}(t)/2\pi).$$

Local methods and localization

The example of the short-time Fourier transform — One defines the *local* quantity:

$$F_x^{(h)}(t, f) = \int_{-\infty}^{\infty} x(s) \overline{h(s-t)} e^{-i2\pi f s} ds.$$

Measure — Such a representation results from an interaction between the analyzed signal and some *apparatus* (the window $h(t)$).

Adaptation — Analysis adapted to *impulses* if $h(t) \rightarrow \delta(t)$ and to *spectral lines* if $h(t) \rightarrow 1 \Rightarrow$ adapting analysis to *chirps* requires $h(t)$ to be (*locally*) *dependent on the signal*.

Self-adaptation of local methods

Matched filtering — If the window $h(t)$ is the *time-reversed* signal $x_{-}(t) := x(-t)$, one gets $F_x^{(x_{-})}(t, f) = W_x(t/2, f/2)/2$, where

$$W_x(t, f) := \int_{-\infty}^{+\infty} x(t + \tau/2) \overline{x(t - \tau/2)} e^{-i2\pi f\tau} d\tau,$$

is the so-called *Wigner-Ville Distribution* (Wigner, '32; Ville, '48).

Linear chirps — The WVD localizes *perfectly* on *straight lines* in the TF plane:

$$x(t) = \exp\{i2\pi(f_0 t + \alpha t^2/2)\} \Rightarrow W_x(t, f) = \delta(f - (f_0 + \alpha t)).$$

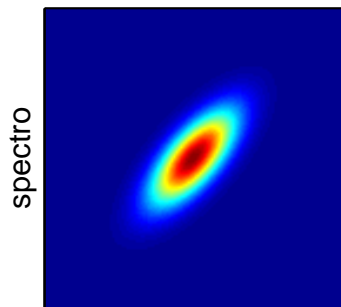
Remark — Localization via self-adaptation ends up in a *quadratic* transformation (energy distribution).

Beyond linear chirps

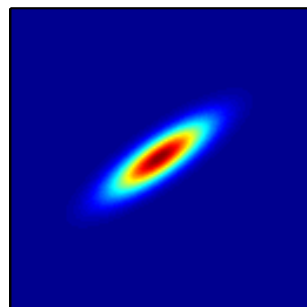
Global approach — The principle of self-adaptation via *phase compensation* can be extended to *non linear* chirps (Bertrand & Bertrand, '84 ; Gonçalves et F., '94).

Limitations — Specific models and heavy computational burden.

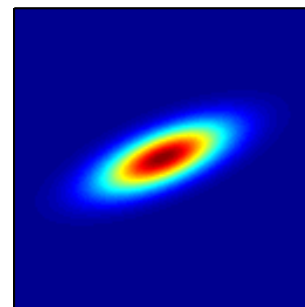
Local approach — Spectrogram/scalogram = *smoothed* WVD
⇒ localized distributions via *reassignment* towards *local* centroids (Kodera et al., '76 ; Auger & F., '94).



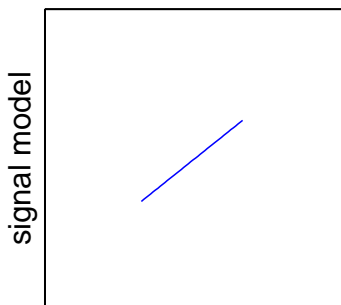
window = 21



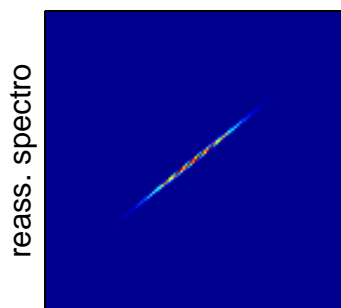
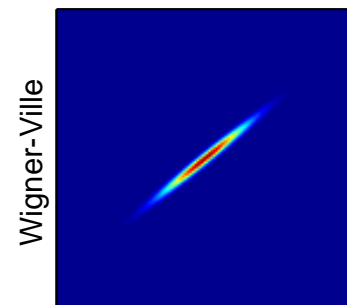
63



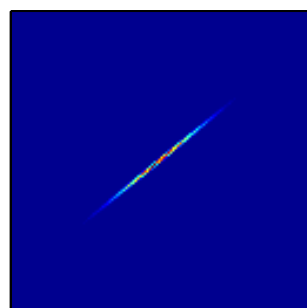
127 points



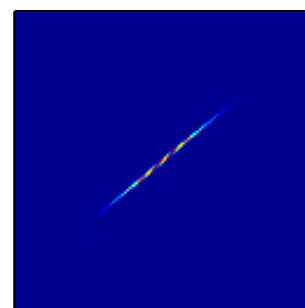
128 points



window = 21



63



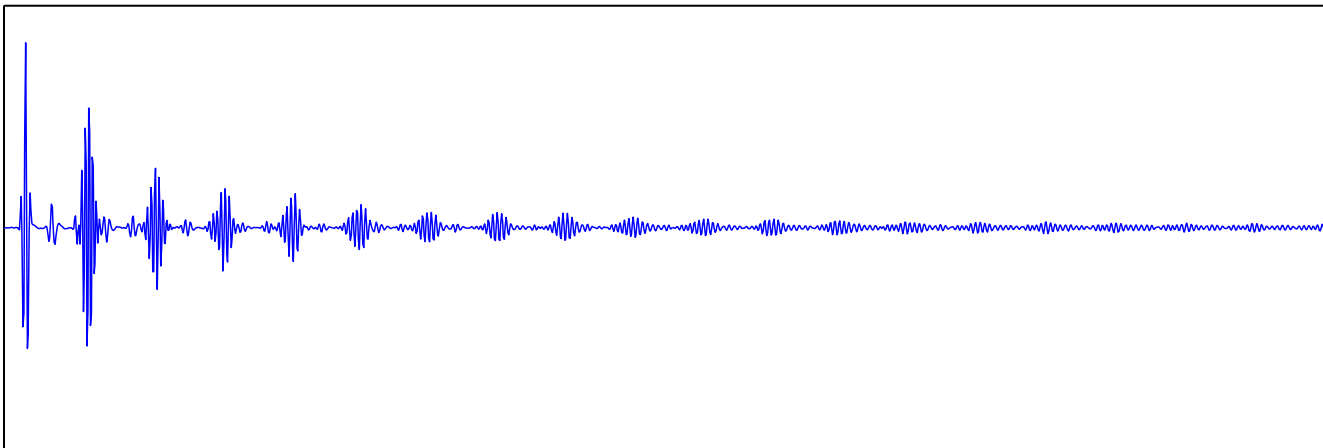
127 points

manipulation

Chirps and dispersion

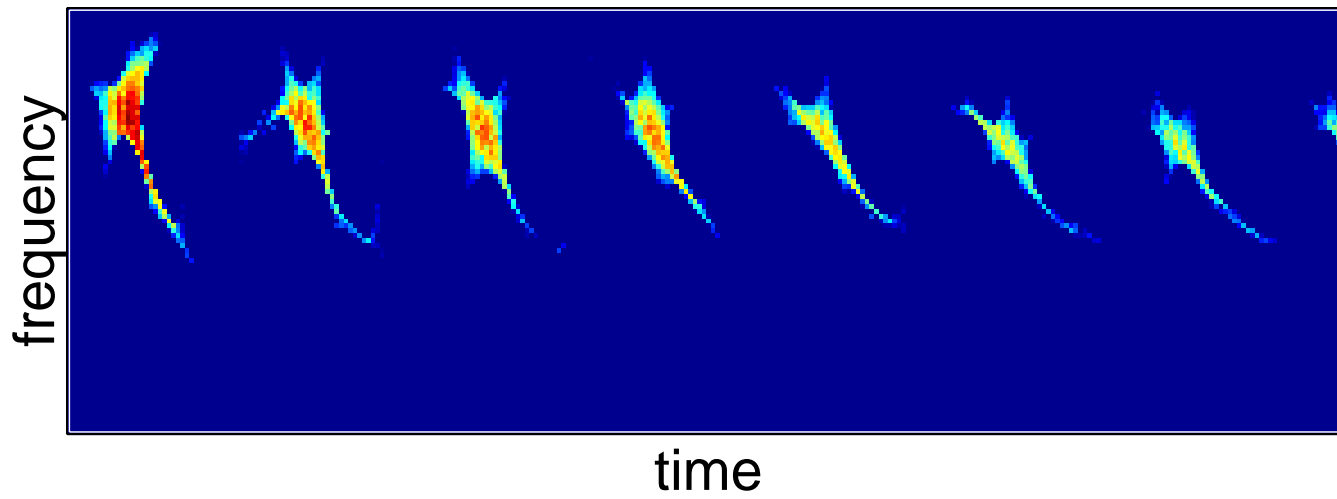
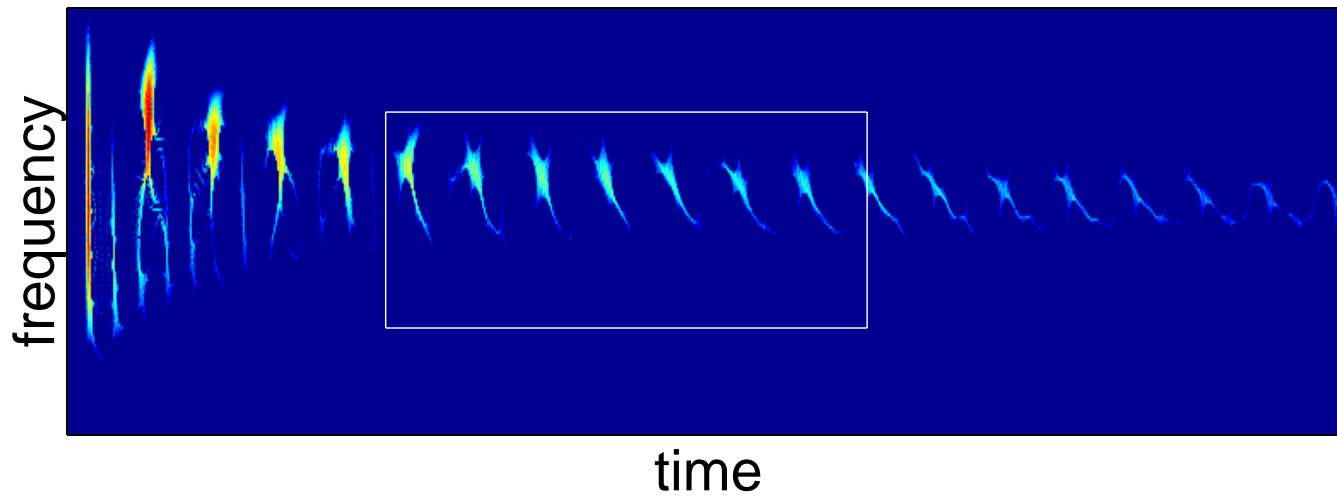
Example — Acoustic backscattering of an ultrasonic wave on a thin spherical shell \Rightarrow frequency dispersion of elastic surface waves.

acoustic backscattering

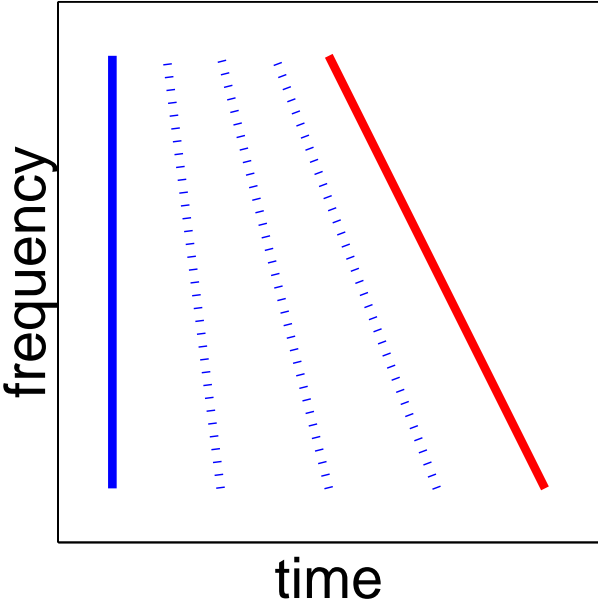


time

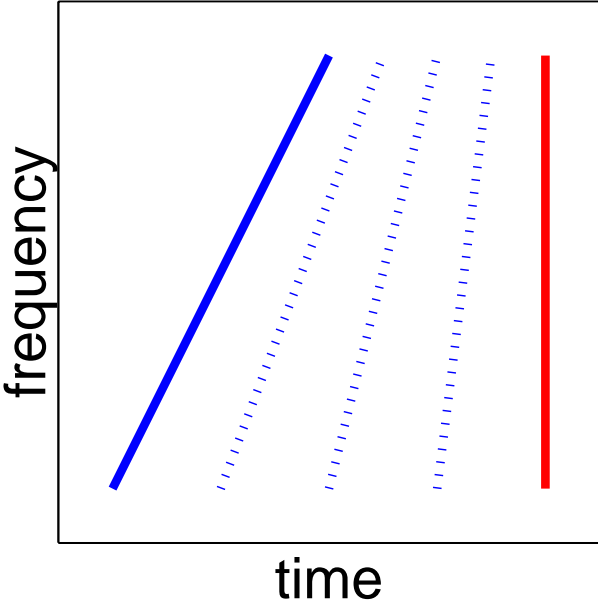
acoustic backscattering



dispersion



compression



Pulse compression

Limitation — Correlation radius $\sim 1/\text{spectral bandwidth}$, \forall signal duration.

“Reception” — Post-processing by *matched filtering* (radar, sonar, vibroseismics, non destructive evaluation).

“Emission” — Pre-processing by *dispersive grating* (production of ultra-short laser pulses).

Chirps and detection/estimation

Optimality — Matched filtering, maximum likelihood, contrast, . . . :
basic ingredient = *correlation* “observation — template”.

Time-frequency interpretation — *Unitarity* of a time-frequency
distribution $\rho_x(t, f)$ guarantees the equivalence:

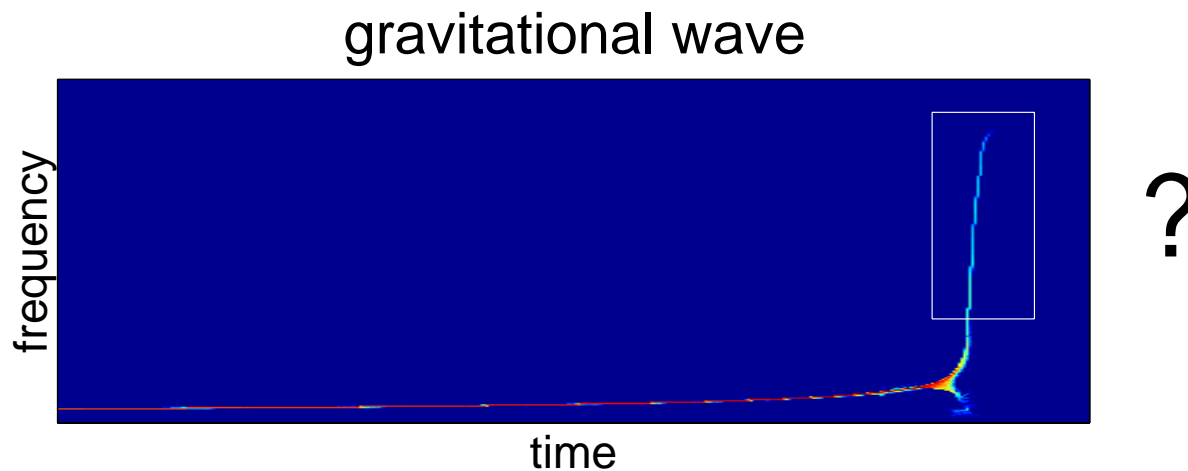
$$|\langle x, y \rangle|^2 = \langle \langle \rho_x, \rho_y \rangle \rangle.$$

Chirps — Unitarity + localization \Rightarrow detection/estimation via
path integration in the plane.

Time-frequency detection?

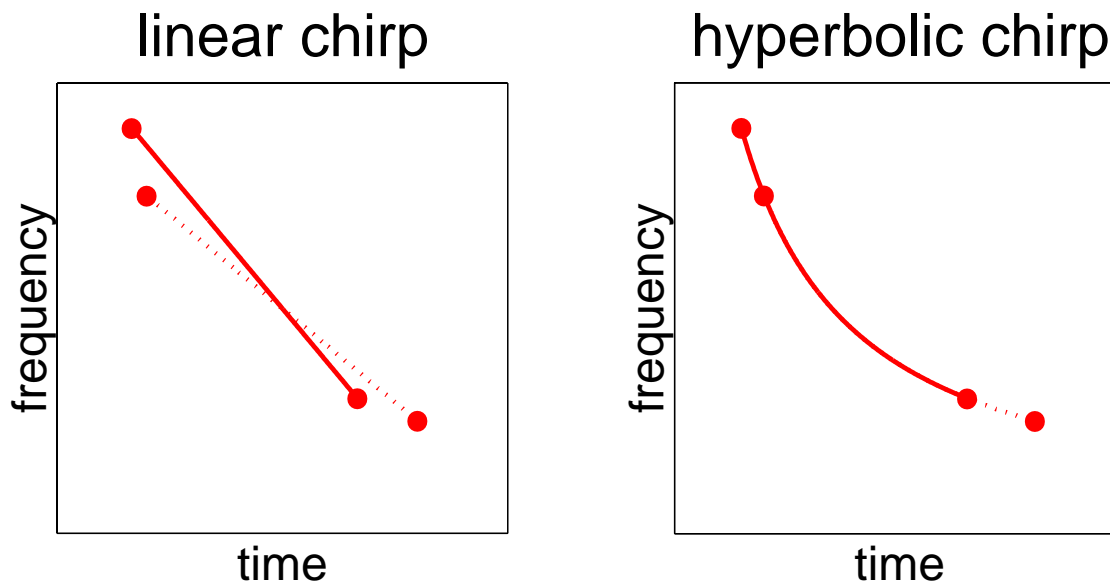
Language — Time-frequency offers a natural *language* for dealing with detection/estimation problems *beyond* nominal situations.

Robustness — *Uncertainties* in a chirp model can be incorporated by replacing the integration *curve* by a *domain* (example of post-newtonian approximations in the case of gravitational waves).

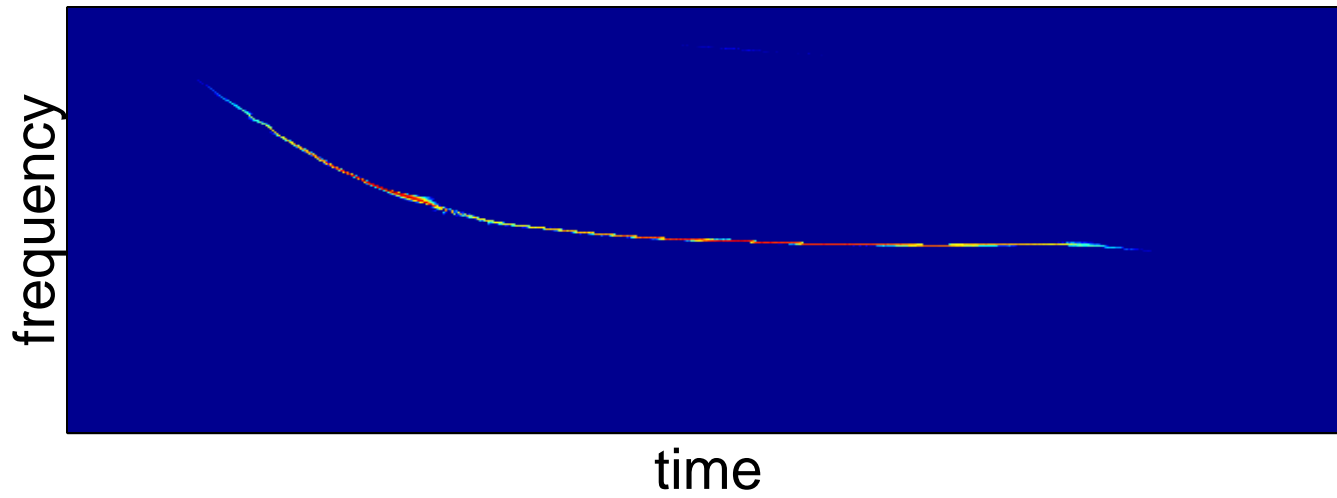
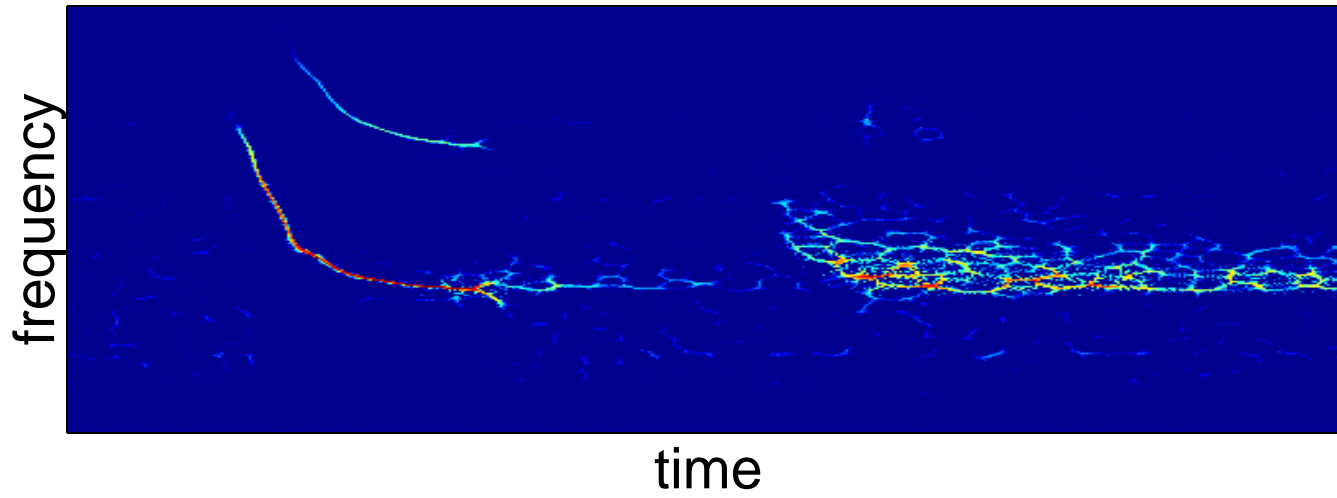


Doppler tolerance

Signal design — Specification of performance by a *geometrical* interpretation of the time-frequency structure of a chirp.



bat echolocation calls (+ echo)



modeling

Chirps and “atomic” decompositions

Fourier — The usual Fourier Transform (FT) can be formally written as $(\mathcal{F}x)(f) := \langle x, e_f \rangle$, with $e_f(t) := \exp\{i2\pi ft\}$, so that:

$$x(t) = \int_{-\infty}^{+\infty} \langle x, e_f \rangle e_f(t) df.$$

Extensions — Replace complex exponentials by chirps, considered as *warped* versions of monochromatic waves, or by “chirplets” (chirps of short duration) \Rightarrow *modified short-time FTs or wavelet transforms modifiées*.

Modified TFs — Example

Mellin Transform — A Mellin Transform (MT) of a signal $x(t) \in L^2(\mathbb{R}^+, t^{-2\alpha+1} dt)$ can be defined as the projection:

$$(\mathcal{M}x)(s) := \int_0^{+\infty} x(t) t^{-i2\pi s - \alpha} dt = \langle x, c \rangle.$$

- Analysis on *hyperbolic* chirps $c(t) := t^{-\alpha} \exp\{i2\pi s \log t\}$.
- $\dot{\varphi}_c(t)/2\pi = s/t \Rightarrow$, the Mellin parameter s can be interpreted as a *hyperbolic chirp rate*.
- The MT can also be seen as a form of *warped* FT, since $\tilde{x}(t) := e^{(1-\alpha)t} x(e^t) \Rightarrow (\mathcal{M}x)(s) = (\mathcal{F}\tilde{x})(s)$.

“Chirplets”

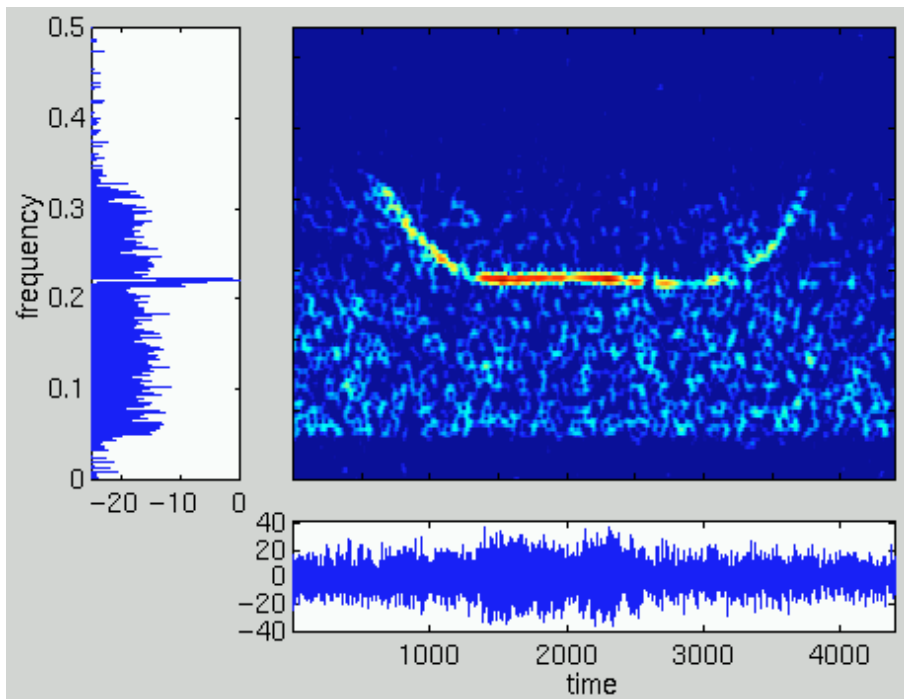
From “gaborets” and “wavelets” to “chirplets” — Localization + modulation lead to 4-parameter representations such as, e.g., $\langle x, x_{t,f,\alpha,\gamma} \rangle$ with

$$x_{t,f,\alpha,\gamma}(s) \propto \exp\{-\pi(\gamma + i\alpha)(s - t)^2 + i2\pi f(s - t)\}.$$

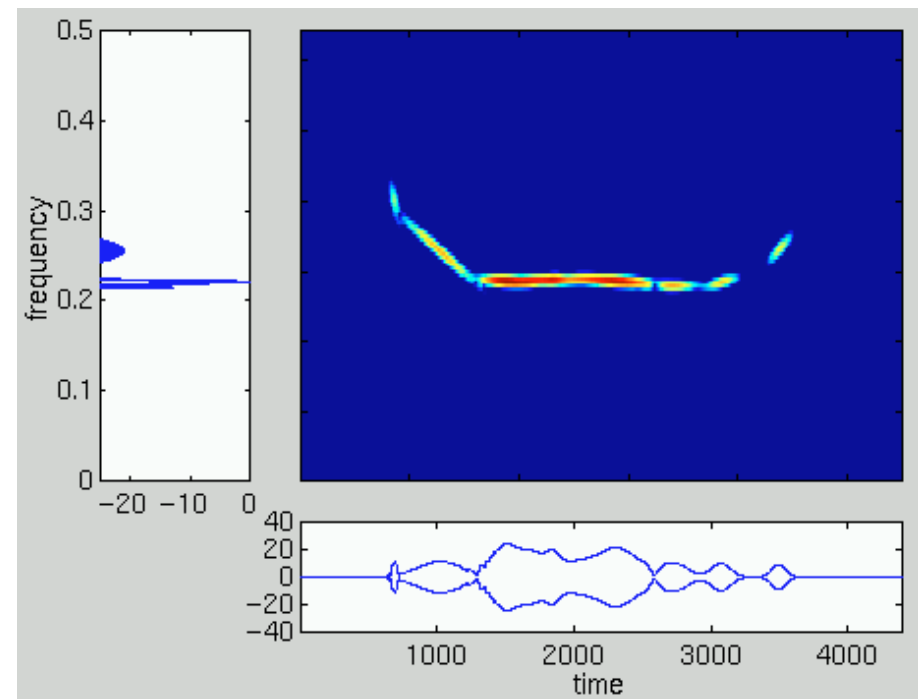
Decomposition as estimation — Constitutive chirplets can be sequentially *identified* by “matching (or basis) pursuit” techniques (Mallat & Zhang, '93; Chen & Donoho, '99; Bultan, '99; Gribonval, '99). They can also be *estimated* in the maximum likelihood sense (O'Neill & F., '98–'00).

“Parametric” limitation — Necessary trade-off between *dictionary size* and *algorithmic complexity*.

“Chirplet” decomposition — An example



signal + noise



8 atoms

Chirps and self-similarity

Dilation — Given $H, \lambda > 0$, let $\mathcal{D}_{H,\lambda}$ be the operator acting on processes $\{X(t), t > 0\}$ as $(\mathcal{D}_{H,\lambda}X)(t) := \lambda^{-H} X(\lambda t)$.

Self-similarity — A process $\{X(t), t > 0\}$ is said to be *self-similar* of parameter H (or “ H -ss”) if, for any $\lambda > 0$,

$$\{(\mathcal{D}_{H,\lambda}X)(t), t > 0\} \stackrel{d}{=} \{X(t), t > 0\}.$$

Self-similarity and stationarity — Self-similar processes and stationary processes can be put in a one-to-one correspondence (Lamperti, '62).

Lamperti

Definition — Given $H > 0$, the *Lamperti transformation* \mathcal{L}_H acts on $\{Y(t), t \in \mathbb{R}\}$ as:

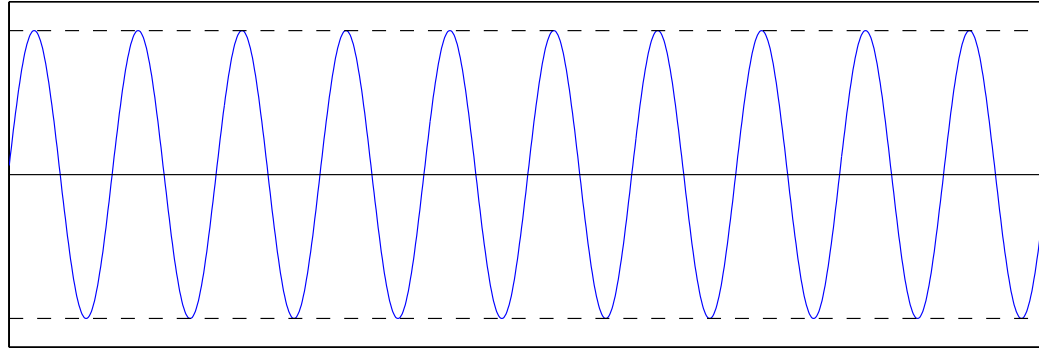
$$(\mathcal{L}_H Y)(t) := t^H Y(\log t), t > 0,$$

and its inverse \mathcal{L}_H^{-1} acts on $\{X(t), t > 0\}$ as :

$$(\mathcal{L}_H^{-1} X)(t) := e^{-Ht} X(e^t), t \in \mathbb{R}.$$

Theorem — If $\{Y(t), t \in \mathbb{R}\}$ is stationary, its Lamperti transform $\{(\mathcal{L}_H Y)(t), t > 0\}$ is H -ss. Conversely, if $\{X(t), t > 0\}$ is H -ss, its (inverse) Lamperti transform $\{(\mathcal{L}_H^{-1} X)(t), t \in \mathbb{R}\}$ is stationary.

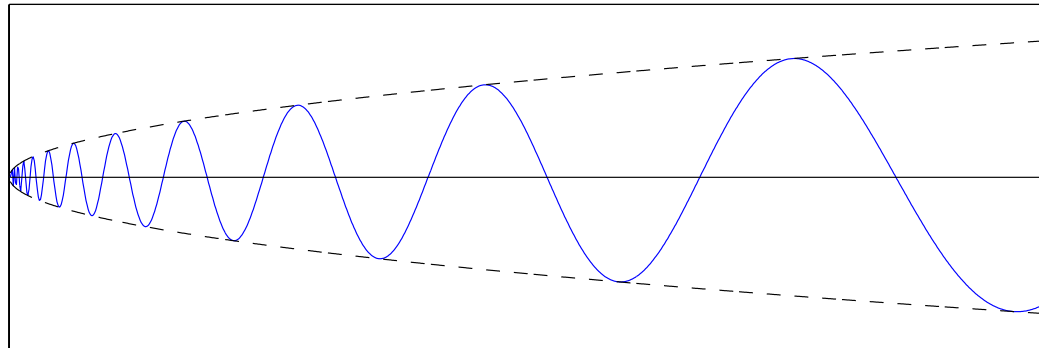
tone



Lamperti



chirp



“Spectral” representations

Fourier — (Harmonisable) *stationary* processes admit a spectral representation based on Fourier modes (monochromatic waves):

$$Y(t) = \int_{-\infty}^{+\infty} e^{i2\pi ft} d\xi(f).$$

Mellin — (Multiplicatively harmonisable) *self-similar* processes admit a corresponding representation based on Mellin modes (hyperbolic chirps):

$$X(t) = \int_{-\infty}^{+\infty} t^{H+i2\pi f} d\xi(f).$$

Weierstrass functions as an example

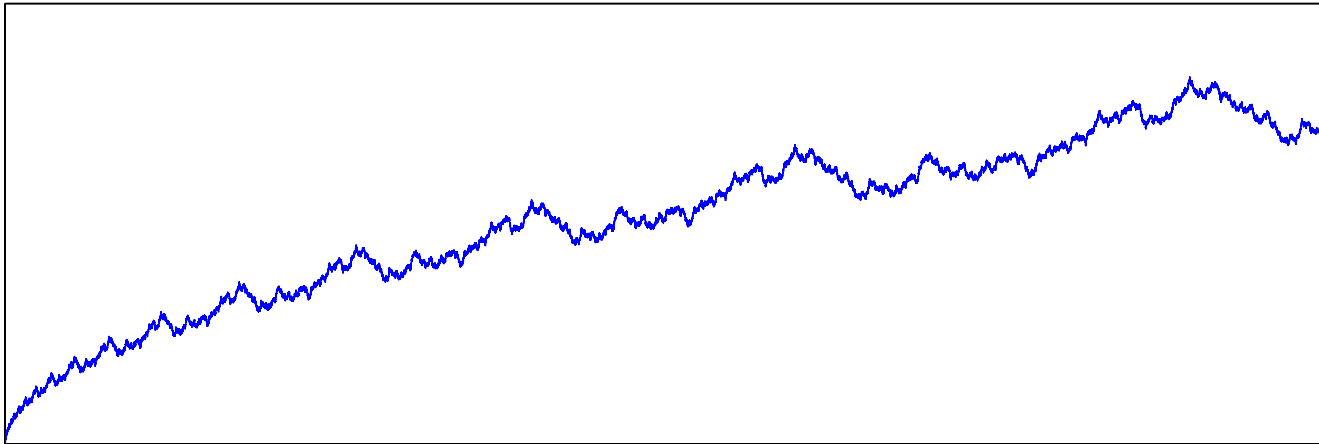
Discrete invariance — For any i.i.d. phases $\varphi_n \in \mathcal{U}(0, 2\pi)$ and any 2π -periodic g , functions of the form

$$W_{H,\lambda}(t) = \sum_{n=-\infty}^{\infty} \lambda^{-Hn} g(\lambda^n t) e^{i\varphi_n},$$

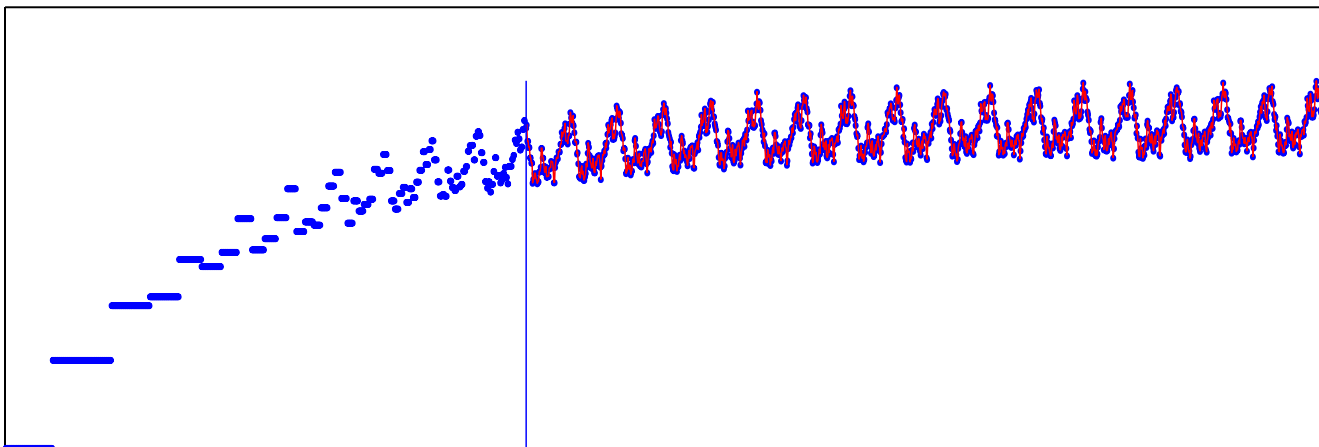
have a *discrete scale invariance* for any fixed λ , i.e., they are H -ss only for $\mu = \lambda^k, k \in \mathbb{Z}$.

Consequence — Such “ (H, λ) -DSI” processes have *cyclostationary* Lamperti images and they can be represented on a *discrete* basis of Mellin chirps (Borgnat et al., '01).

Weierstrass function ($H = 0.5$)



"delampertized" Weierstrass function

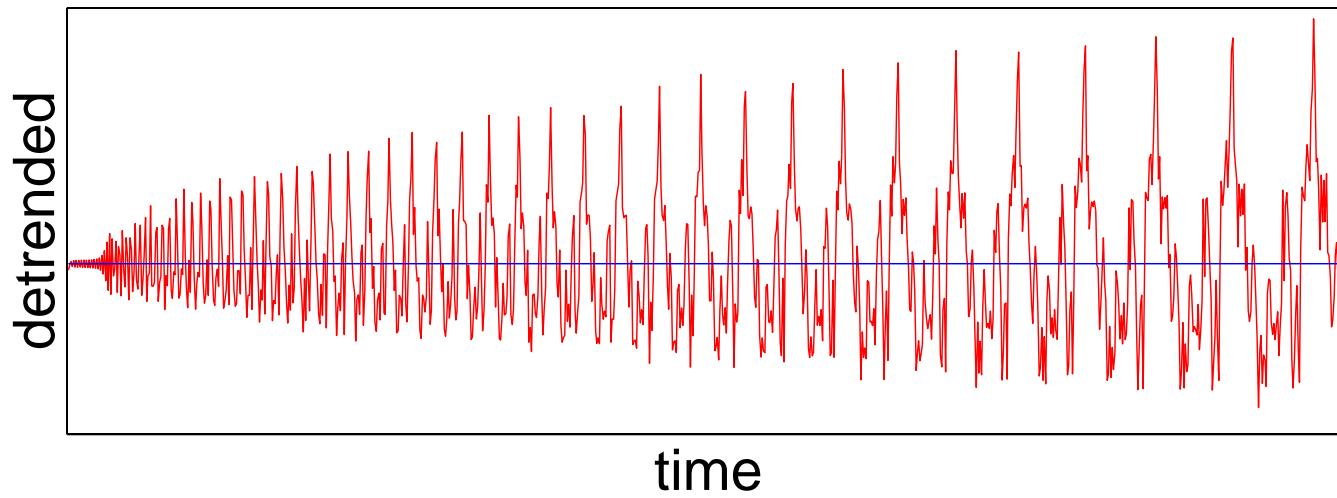
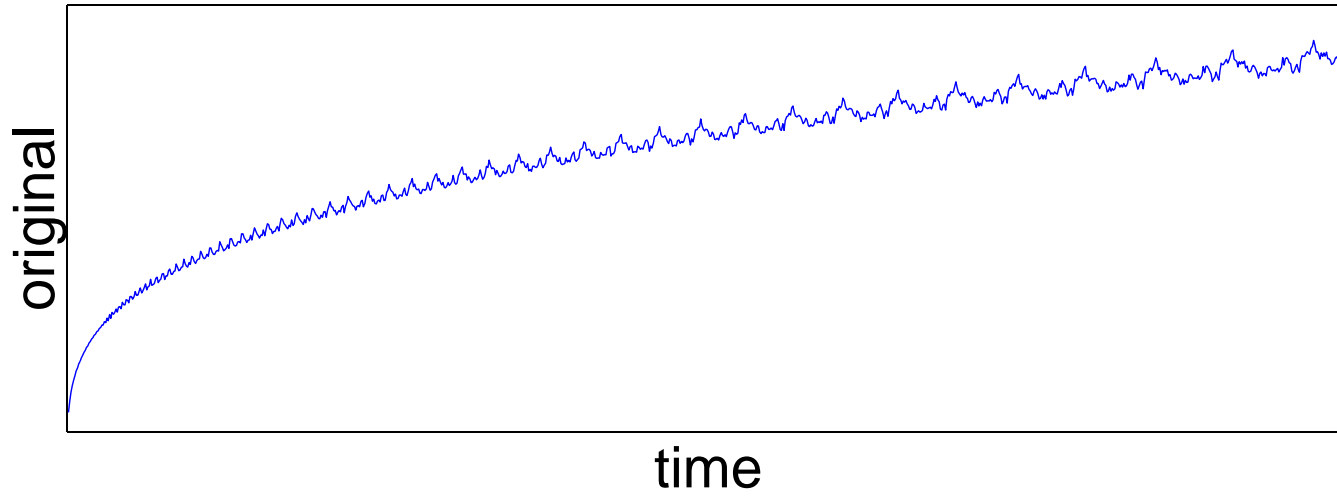


Weierstrass-Mandelbrot

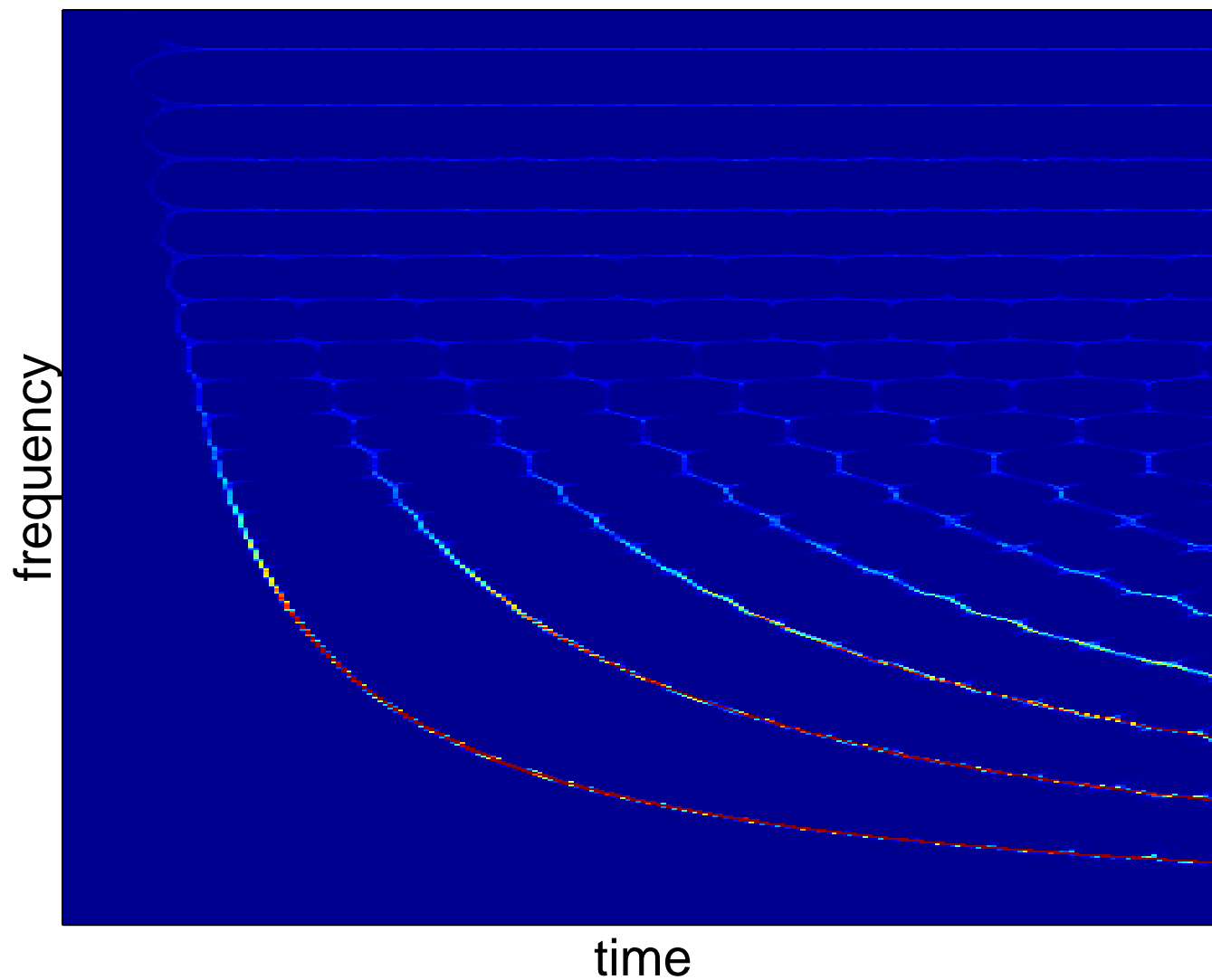
Fourier — In the case where $g(t) = 1 - \exp it$, one gets the so-called Weierstrass-Mandelbrot function, whose usual representation is given by a superposition of Fourier modes (in geometrical progression).

Mellin — An equivalent representation exists (Berry and Lewis, '80), as superposition of Mellin modes, i.e., of hyperbolic chirps.

Weierstrass function ($\lambda = 1.07$; $H = 0.3$; $t_{\max} = 1$; $N = 1000$; $\nu = 1$)



detrended Weierstrass function



Chirps and power laws

A general model — $C_{\alpha,\beta}(t) = a t^\alpha \exp\{i(bt^\beta + c)\}$.

Example — Newtonian approximation of the *inspiraling* part of gravitational waves $\rightarrow (\alpha, \beta) = (-1/4, 5/8)$.

Typology — At $t = 0$: divergence of *amplitude* if $\alpha < 0$, of “*instantaneous frequency*” if $\beta < 1$ and of *phase* if $\beta < 0$.

Oscillating singularities. The case $(\alpha > 0, \beta < 0)$ is beyond a simple Hölder characterization \Rightarrow development of specific tools (*2-microlocal analysis, wavelets*).

The Riemann function as an example

Definition — $\sigma(t) := \sum_{n=1}^{\infty} n^{-2} \sin \pi n^2 t$

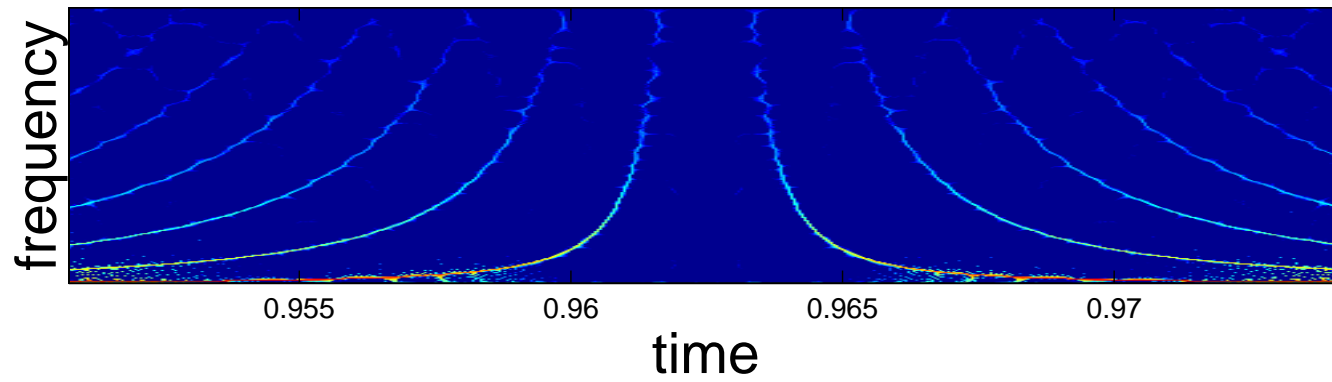
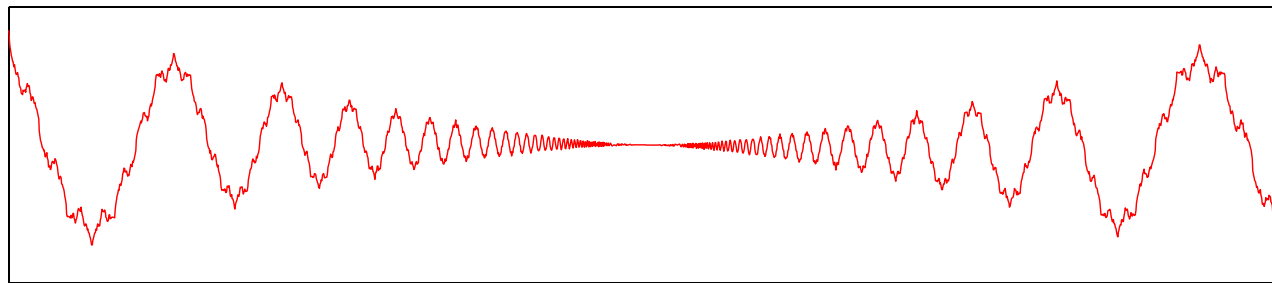
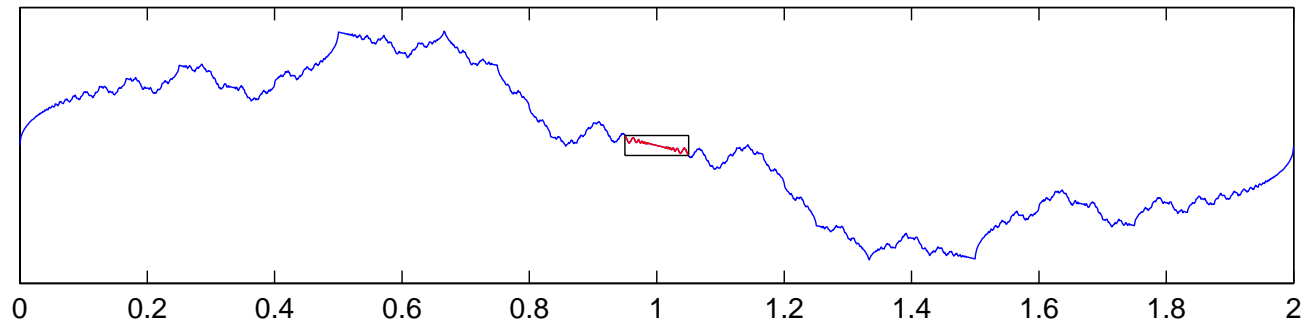
Differentiability — $\sigma(t)$ happens to be non-differentiable if $t \neq t_0 = (2p+1)/(2q+1)$, $p, q \in \mathbb{N}$ (Hardy, '16) *but* differentiable in $t = t_0$ (Gerver, '70).

Local chirps — One can show (Meyer, '96) that, in the vicinity of $z = 1$, the holomorphic version of Riemann function reads

$$\sigma(1+z) = \sigma(1) - \pi z/2 + \sum_{n=1}^{\infty} K_n(z) C_{3/2,-1}(z),$$

leading to $\sigma(1+t) = \sigma(1) - \pi t/2 + O(|t|^{3/2})$ when $t \rightarrow 0$.

Riemann function



conclusion

Chirps and time-frequency

Signals — Chirps “everywhere”

Representations — Natural description framework = the time-frequency plane

Models — “Chirps = time-frequency trajectories” \Rightarrow the notion of instantaneous frequency can be approached as a by-product of representations in the plane (e.g., “ridges”, or fixed points of reassignment operators)