

# Nonlinear wave interactions and higher order spectra



where  $A$  is defined by:

$$A(\omega_1, \omega_2, \omega) = -2 \frac{\Gamma_1(\omega_1, \omega_2) \Gamma_1(\omega - \omega_1, \omega_2)}{\Gamma_1(\omega - \omega_1)} + 3 \Gamma_2(\omega_1, \omega_2, \omega) \quad (18)$$

Differentiating equation with respect to  $x$  we get:

$$\frac{\partial^2 A(x, \omega - \omega_1)}{\partial x^2} = [\Gamma_1(\omega) - ik_x]^2 \hat{A}(x, \omega - \omega_1) + \sum_{\substack{\omega_1 + \omega_2 = \omega \\ \omega_1, \omega_2 > 0}} \hat{A}(x, \omega_1 - \omega_2) \hat{A}(x, \omega_2 - \omega_1) \hat{A}^*(x, -\omega_1 - \omega_2) M(\omega_1, \omega_2, \omega) + [\Gamma_1(\omega) - ik_x] + [\Gamma_1(\omega_1) - ik_x] + [\Gamma_1(\omega_2) - ik_x] + [\Gamma_1(\omega_1 + \omega_2)] \quad (19)$$

Again, we keep only terms proportional to  $A^n$  with  $n \leq 3$ . We will now replace the expressions (17) and (19) for  $\frac{\partial A(x, \omega)}{\partial x}$  and  $\frac{\partial^2 A(x, \omega)}{\partial x^2}$  in the CGLE:

$$0 = i \hat{A}(x, \omega - \omega_1) \left\{ (\omega - \omega_1) + i \frac{\partial \omega}{\partial k} \left[ \Gamma_1(\omega) - ik_x \right] - \frac{\partial \omega}{\partial Re} \left[ (Re - Re_c) + \frac{1}{2} \frac{\partial^2 \omega}{\partial k^2} \left[ \Gamma_1(\omega) - ik_x \right]^2 \right] \right\} + \sum_{\substack{\omega_1 + \omega_2 = \omega \\ \omega_1, \omega_2 > 0}} \hat{A}(x, \omega_1 - \omega_2) \hat{A}(x, \omega_2 - \omega_1) \hat{A}^*(x, -\omega_1 - \omega_2) \left\{ - \frac{\partial \omega}{\partial k} \left[ A(\omega_1, \omega_2, \omega) \right] \right\} + \frac{i}{2} \frac{\partial^2 \omega}{\partial k^2} \left[ A(\omega_1, \omega_2, \omega) [\Gamma_1(\omega) + \Gamma_1(\omega_1) + \Gamma_1(\omega_2) + \Gamma_1(\omega_1 + \omega_2) - 2ik_x] - \eta \right] \quad (20)$$

And identifying the terms, it comes:

$$V_0 = i \left[ \frac{\partial \Gamma_1}{\partial k} \right]^{-1} \quad (21)$$

## Outline

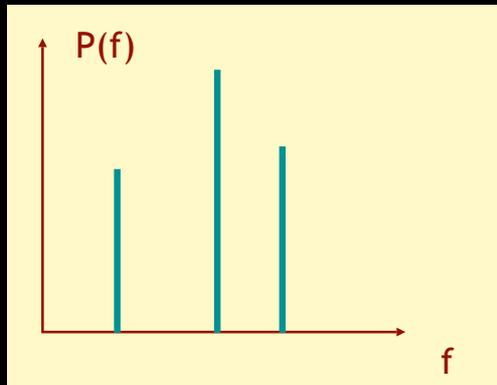
- ▶ Higher Order Spectra (HOS)
  - Their properties
  - Application to wave-wave interactions
  - Spectral energy transfers

- ▶ Why is the Fourier transform ubiquitous ?
- ▶ Because Fourier modes are the eigenmodes of linear differential systems, which occur so frequently

$$a_0 y(t) + a_1 \frac{dy(t)}{dt} + a_2 \frac{d^2 y(t)}{dt^2} + \dots = x(t) + b_1 \frac{dx(t)}{dt} + b_2 \frac{d^2 x(t)}{dt^2} + \dots$$

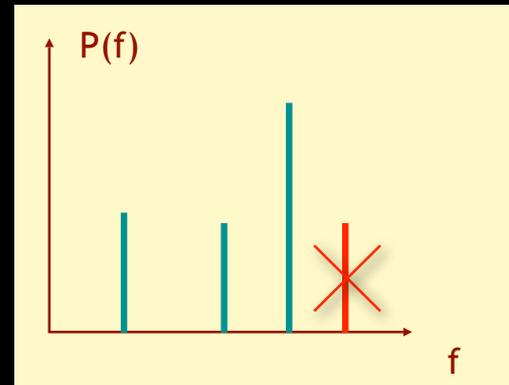
## Why Fourier spectra ?

- ▶ Frequencies are therefore natural *invariants* of linear stationary differential systems



before

Linear  
transform  
⇒

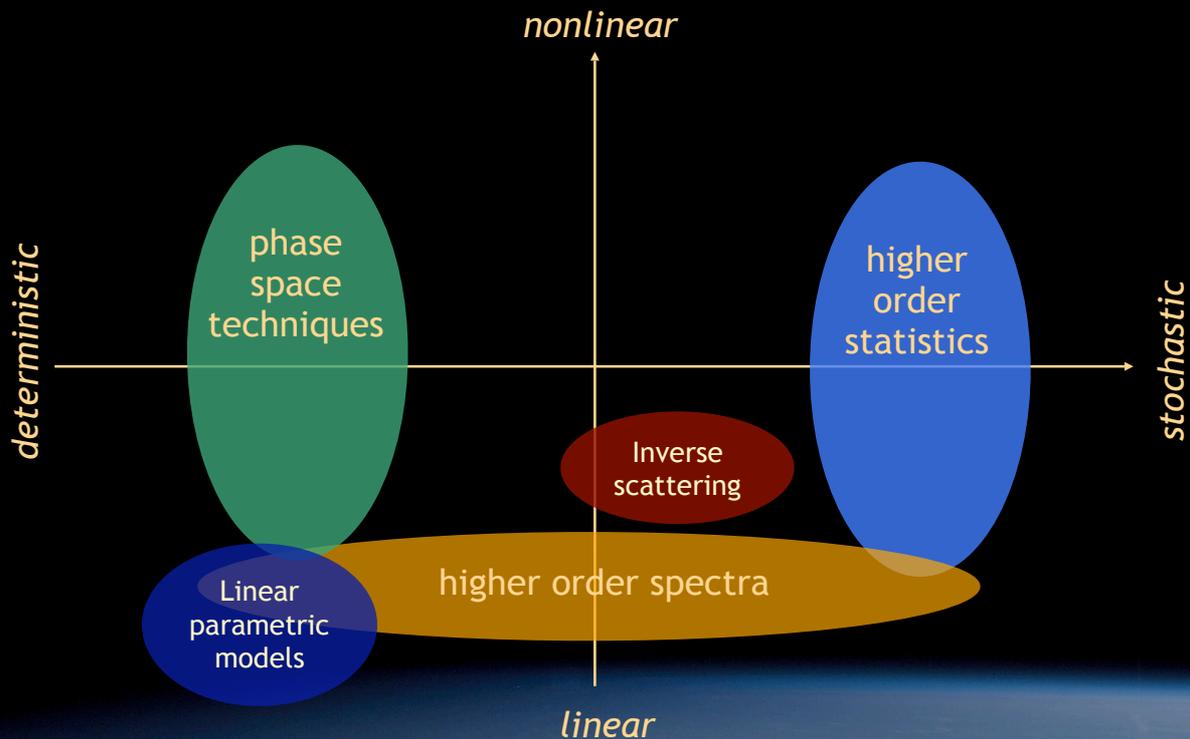


after

## Linear vs nonlinear

- ▶ In linear systems, all the pertinent information is contained in the power spectral density
- ▶ In nonlinear systems, Fourier modes may get coupled  
→ their phases also contain pertinent information
- ▶ *higher order spectral analysis* precisely exploits this phase information

## Techniques for nonlinear systems



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## Definition of HOS

- ▶ Take a nonlinear system that is described by

$$\frac{\partial u(x, t)}{\partial x} = f(u(x, t))$$

$f(u)$  : a continuous, nonlinear and time-independent function

$u(x, t)$  : plasma density, magnetic field, ...

- ▶ With mild assumptions, one may decompose  $f$  into a series (Wiener, 1958)

$$\begin{aligned} \frac{\partial u(x, t)}{\partial x} &= \int g(\tau_1) u(x, t - \tau_1) d\tau_1 \\ &+ \int \int g(\tau_1, \tau_2) u(x, t - \tau_1) u(x, t - \tau_2) d\tau_1 d\tau_2 \\ &+ \int \int \int g(\tau_1, \tau_2, \tau_3) u(x, t - \tau_1) u(x, t - \tau_2) u(x, t - \tau_3) d\tau_1 d\tau_2 d\tau_3 \\ &+ \dots \end{aligned}$$

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## Definition of HOS

- ▶ Taking the discrete Fourier transform, we get a Volterra series

$$\frac{\partial u_p}{\partial x} = \Gamma_p u_p + \sum_{k,l} \Gamma_{kl} u_k u_l \delta_{k+l,p} + \sum_{k,l,m} \Gamma_{klm} u_k u_l u_m \delta_{k+l+m,p} + \dots$$

with

$$u_p = u(x, \omega_p)$$

- ▶ The **kernels**  $\Gamma$  embody the physical information of the process. In a Hamiltonian framework, they are directly connected to known physical processes (Zakharov, 1970)
- ▶ In plasmas, only low order kernels are expected to be significant (Galeev, 1980)

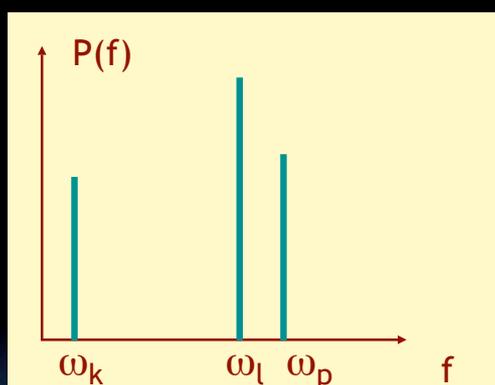
## Three-wave couplings

- ▶ A Fourier mode can only couple to other ones in a specific way
- ▶ For quadratic nonlinearities, the resonance condition reads

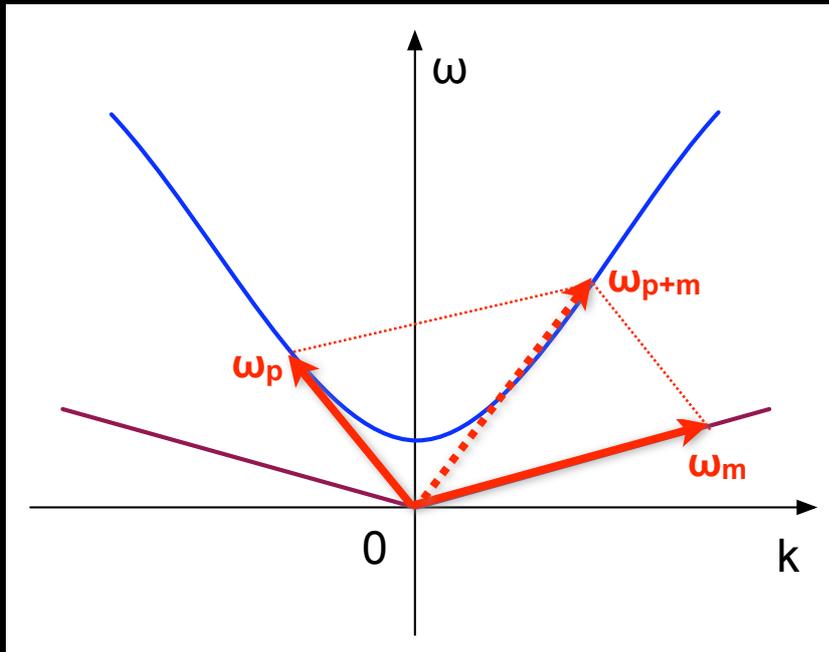
$$\omega_k + \omega_l = \omega_p$$

This describes three-wave interactions

*Examples* : harmonic generation, decay instability (L→S+L')



## Three-wave couplings



energy conservation

$$\omega_p + \omega_m = \omega_{p+m}$$

momentum conservation

$$\vec{k}_p + \vec{k}_m = \vec{k}_{p+m}$$

## Four-wave couplings

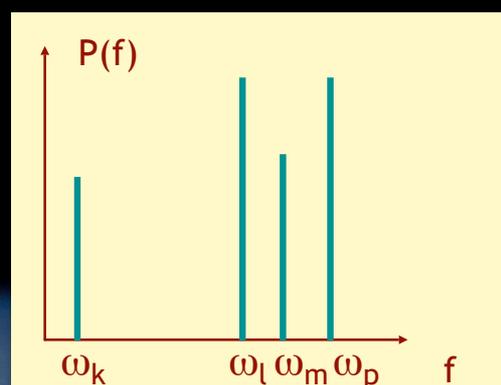
$$\frac{\partial u_p}{\partial x} = \Gamma_p u_p + \sum_{k,l} \Gamma_{kl} u_k u_l \delta_{k+l,p} + \sum_{k,l,m} \Gamma_{klm} u_k u_l u_m \delta_{k+l+m,p} + \dots$$

- For cubic nonlinearities, the resonance condition is

$$\omega_k + \omega_l + \omega_m = \omega_p$$

This describes four-wave interactions

Example : modulational instability  
( $L+S = L'+L''$ )



## Definition of HOS

- ▶ Rearranging the Volterra series and taking the expectation for a homogeneous plasma ( $\partial/\partial x = 0$ ), we have

$$\Gamma_p \langle u_p^* u_p \rangle + \sum_{k+l=p} \Gamma_{kl} \langle u_k u_l u_{k+l}^* \rangle + \sum_{k+l+m=p} \Gamma_{klm} \langle u_k u_l u_m u_{k+l+m}^* \rangle + \dots = 0$$

power spectrum

bispectrum

trispectrum

$$P(\omega_p) = \langle u_p u_p^* \rangle$$

$$B(\omega_k, \omega_l) = \langle u_k u_l u_{k+l}^* \rangle$$

$$T(\omega_k, \omega_l, \omega_m) = \langle u_k u_l u_m u_{k+l+m}^* \rangle$$

The power spectrum  $P(\omega_p)$  is not an invariant quantity anymore !

## The bicoherence

- ▶ The normalised bispectrum gives the **bicoherence**

$$B(\omega_k, \omega_l) = \langle u_k u_l u_{k+l}^* \rangle \quad \rightarrow \quad b^2(\omega_k, \omega_l) = \frac{|\langle u_k u_l u_{k+l}^* \rangle|^2}{\langle |u_k u_l|^2 \rangle \langle |u_{k+l}|^2 \rangle}$$

- ▶ The bicoherence is bounded :  $0 < b^2 < 1$
- ▶ It measures the amount of signal energy at bifrequency  $(\omega_k, \omega_l)$  that is quadratically phase coupled to  $\omega_{k+l}$
- ▶ bicoherence = 0  $\Leftrightarrow$  no phase coupling

## The tricoherence

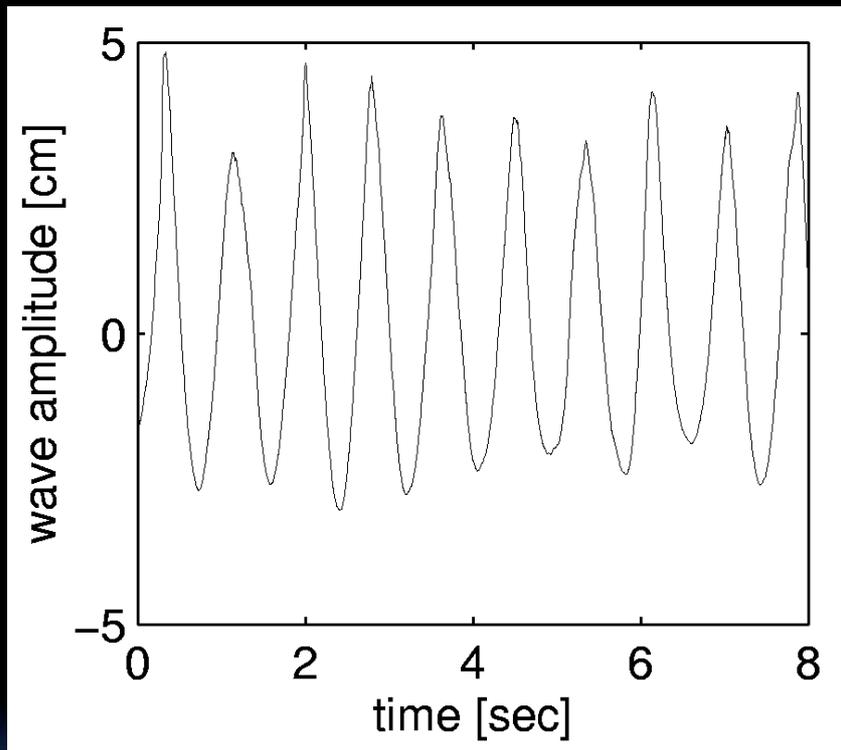
- ▶ Similarly define the *tricoherence*

$$t^2(\omega_k, \omega_l, \omega_m) = \frac{|\langle u_k u_l u_m u_{k+l+m}^* \rangle|^2}{\langle |u_k u_l u_m|^2 \rangle \langle |u_{k+l+m}|^2 \rangle}$$

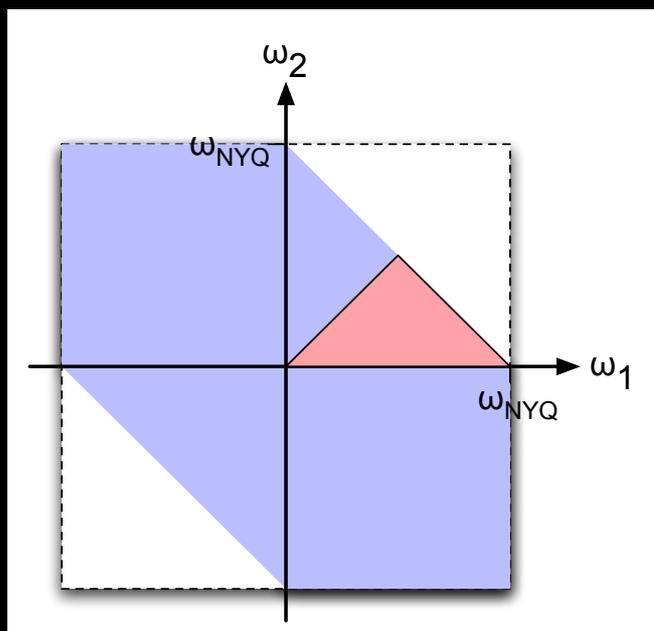
- ▶ It measures the amount of signal energy at trifrequency  $(\omega_k, \omega_l, \omega_m)$  that is quadratically phase coupled to  $\omega_{k+l+m}$

**Example :**  
**swell in a water basin**

## Example : water waves

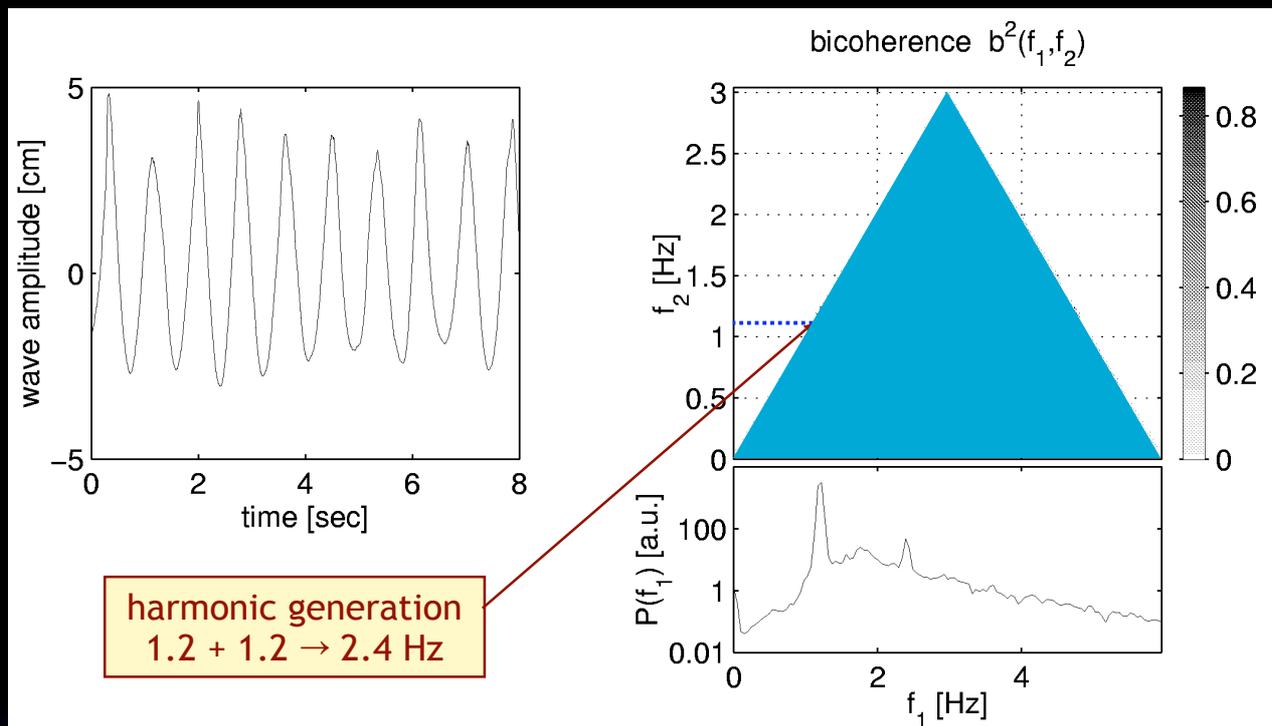


## Principal domain of bicoherence



Because of symmetries,  
the principal domain  
reduces to a triangle

## Example : water waves



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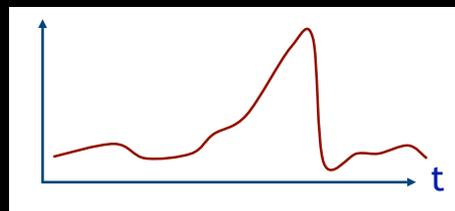
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## Bicoherence : interesting properties

- ▶ Signals that are asymmetric vs time reversal ( $u(t) \leftrightarrow u(-t)$ ) give rise to imaginary bispectra

$$\langle u_k u_l u_{k+l}^* \rangle \text{ imaginary}$$

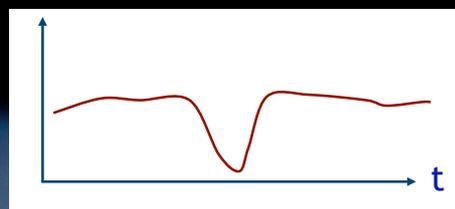
$\rightarrow$  typically occurs with wave steepening



- ▶ Signals that are up-down asymmetric ( $u(t) \leftrightarrow -u(t)$ ) give rise to real bispectra

$$\langle u_k u_l u_{k+l}^* \rangle \text{ real}$$

$\rightarrow$  typically occurs with cavitons



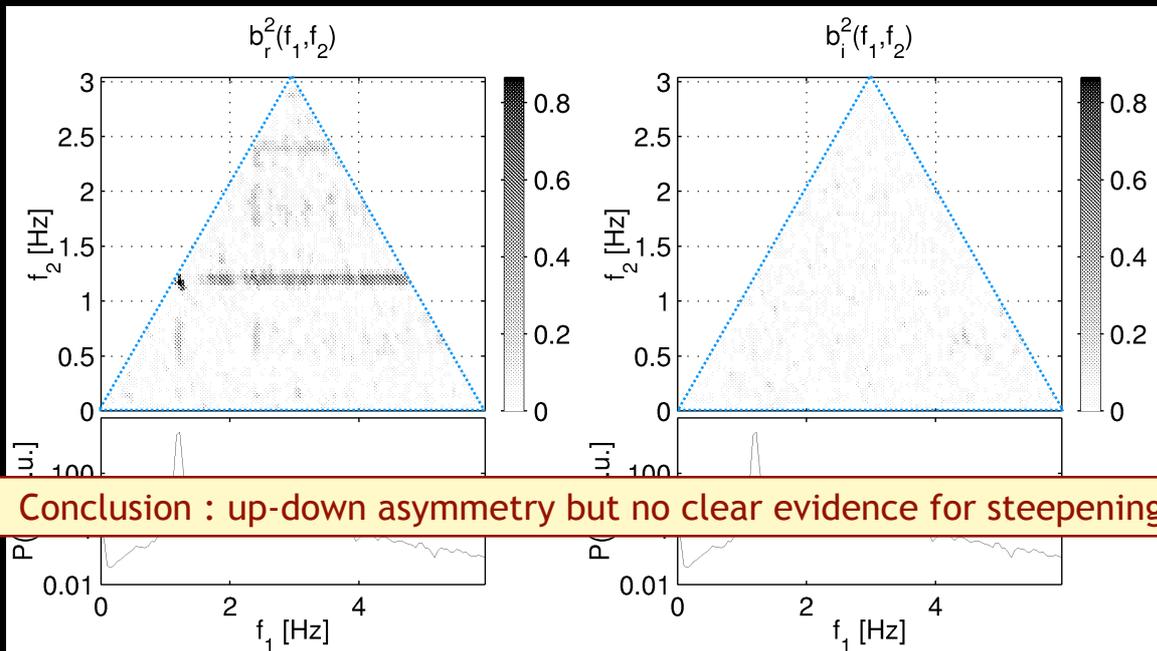
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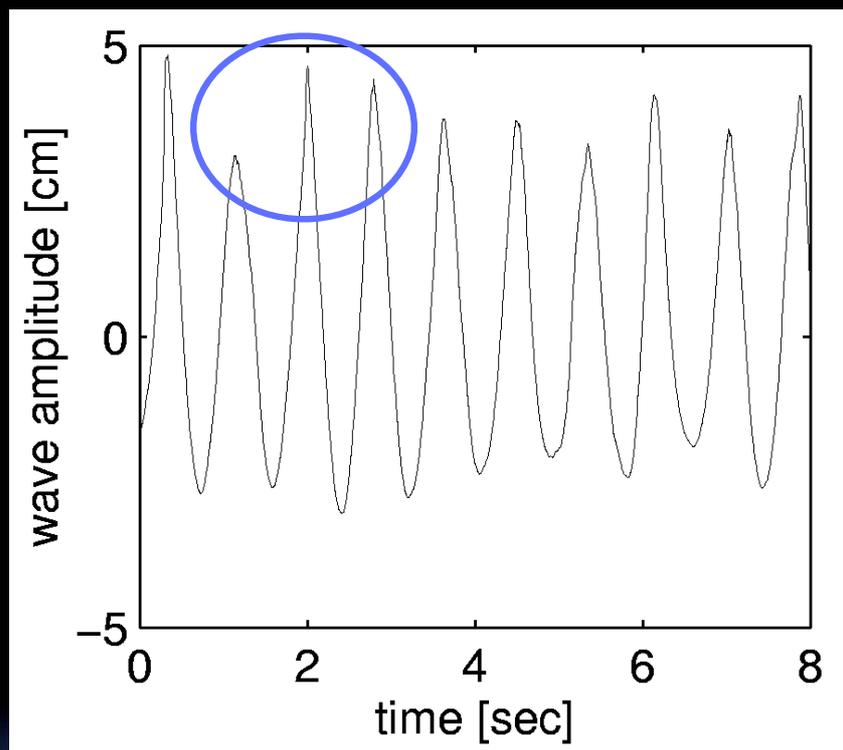
# Asymmetry : ocean waves example

bicoherence from real part only

bicoherence from imaginary part only



## Physical picture

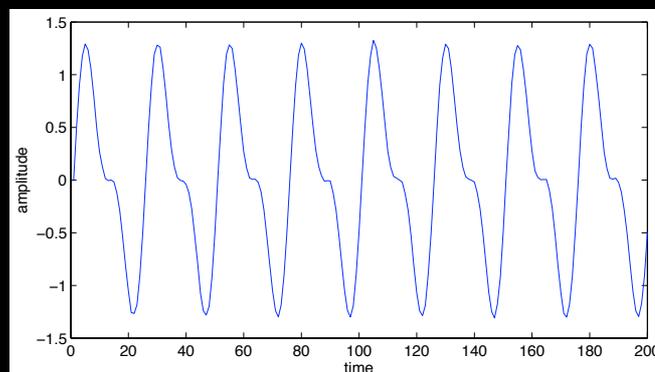




## High bicoherence $\neq$ Nonlinear interactions

### *Example : sine wave + first harmonic*

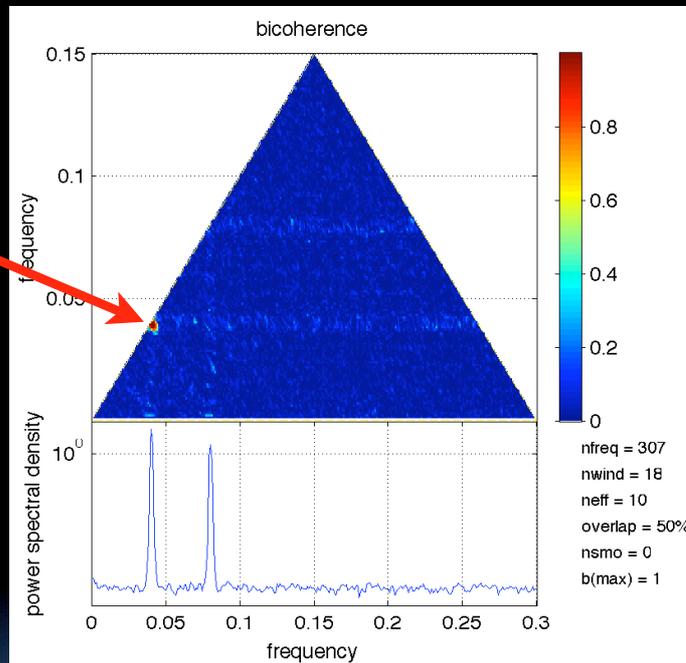
We generate a sine wave + its first harmonic + some noise



There is no nonlinear coupling here !

## Example : sine wave + first harmonic

- ▶ Even though there is no nonlinear coupling at work, the bicoherence is huge, simply because the phases are coupled

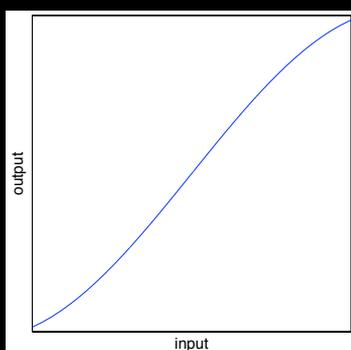


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- ▶ Sometimes, a nonlinear instrumental gain may explain the phase coupling

## example



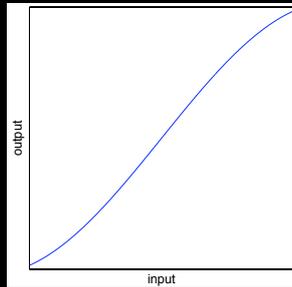
es, we forget that we need a large statistics to significant level of bicoherence (at least 30 wave

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These two examples both reveal the existence of significant phase couplings between specific Fourier modes. We must stress, however, that a phase coupling does not necessarily imply the existence of nonlinear wave interactions per se. In the first example the ridge could be interpreted both as a decay ( $0.6 \rightarrow f_1 + f_2$ ) or as an inverse decay ( $f_1 + f_2 \rightarrow 0.6$ ) process. At this stage we cannot tell whether the observed phase coupling is accompanied by an energy transfer between Fourier modes (i.e. the wavefield is dynamically evolving) or whether it is just the remnant of some nonlinear effect that took place in the past or maybe

## Example

- ▶ Sometimes, a nonlinear instrumental gain may explain the phase coupling



- ▶ But in most cases, we forget that we need a large statistics to determine a significant level of bicoherence (at least 30 wave periods)

$$\text{Bias } \hat{b}^2 \approx \frac{4\sqrt{3}}{M}$$

$$\text{Var } \hat{b}^2 \approx \frac{4\hat{b}^2}{M} (1 - \hat{b}^2)$$

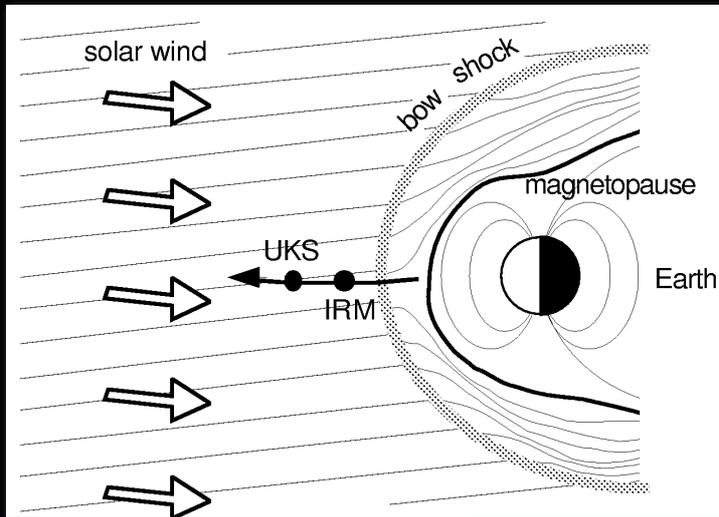
$$B(\omega_k, \omega_l) = \frac{1}{M} \sum_{i=1}^M u_k^{(i)} u_l^{(i)} u_{k+l}^{(i)}, \quad (13)$$

M : number of independent ensembles

**Another example :**  
**magnetic field measurements**  
**by two satellites**

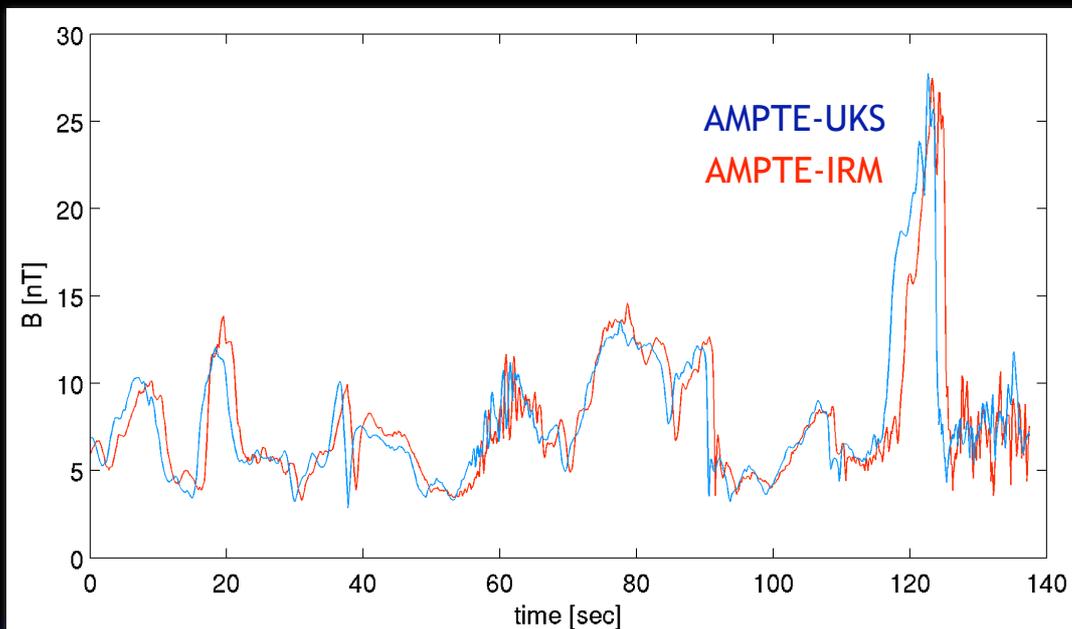
## Example : magnetic field data

- ▶ The dual AMPTE-UKS and AMPTE-IRM satellites measure  $B$  just upstream the Earth's quasiparallel bow shock



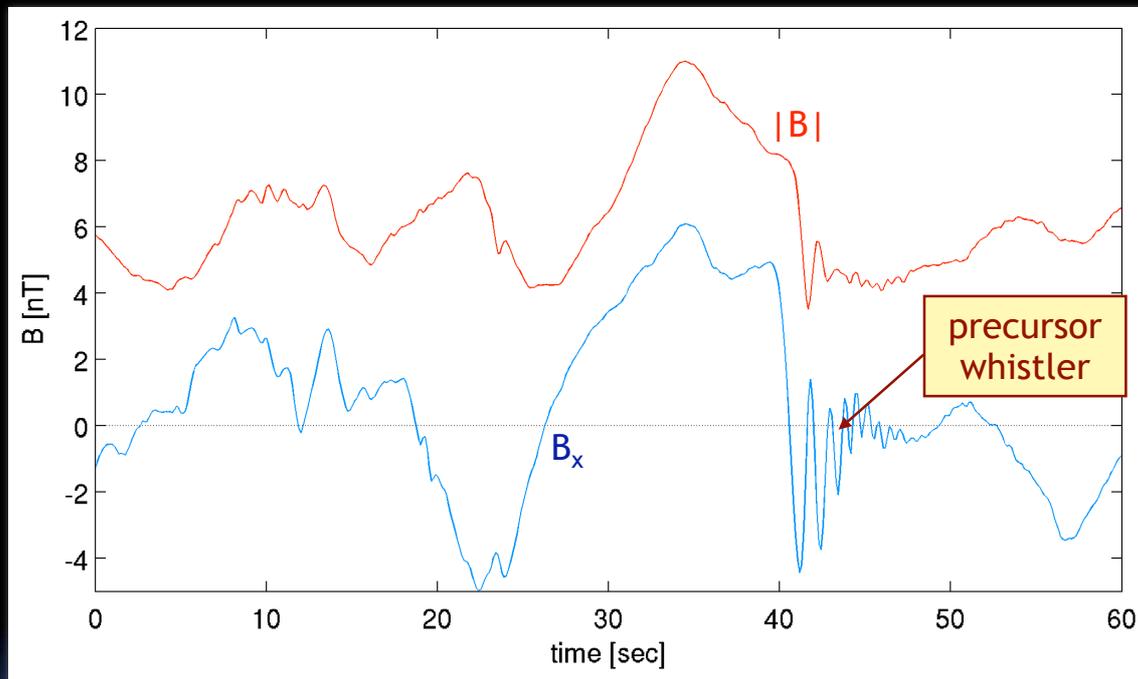
## Excerpt of magnetic field

- ▶ Structures seen by UKS are observed about 1 sec later by IRM



## Excerpt of magnetic field

- Some structures show clear evidence for steepening (SLAMS)

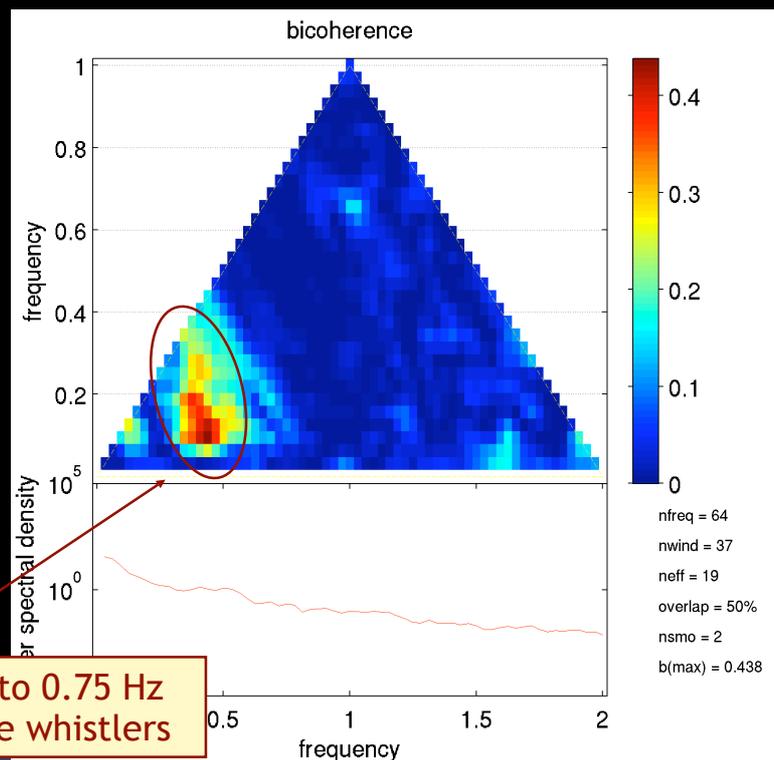


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## Bicoherence of AMPTE data

- Existence of quadratic wave interactions is attested by bicoherence analysis
- The tricoherence is weak, suggesting that four-wave interactions are not at play

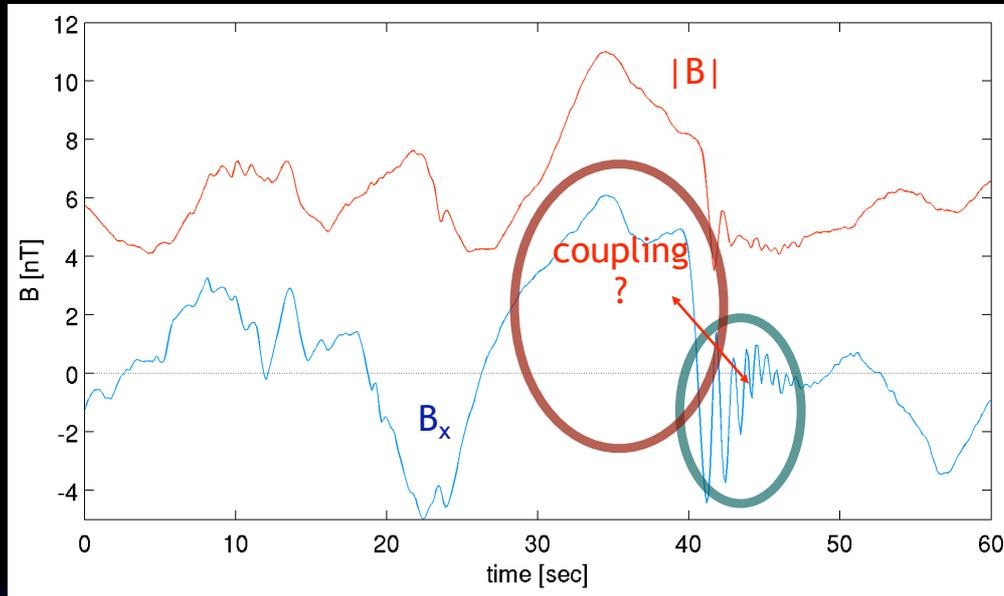


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## Physical picture

- ▶ There is a phase coupling between the precursor whistlers and the SLAMS



## Physical picture

HOS tell us there is a phase coupling

But they don't say what caused this coupling

- are the whistlers instabilities triggered by the SLAMS ?
- were the whistlers generated farther upstream and are they now frozen into the wavefield ?
- are the whistlers inherently part of the SLAMS (= solitary waves) ?
- is all of this an instrumental effect ?

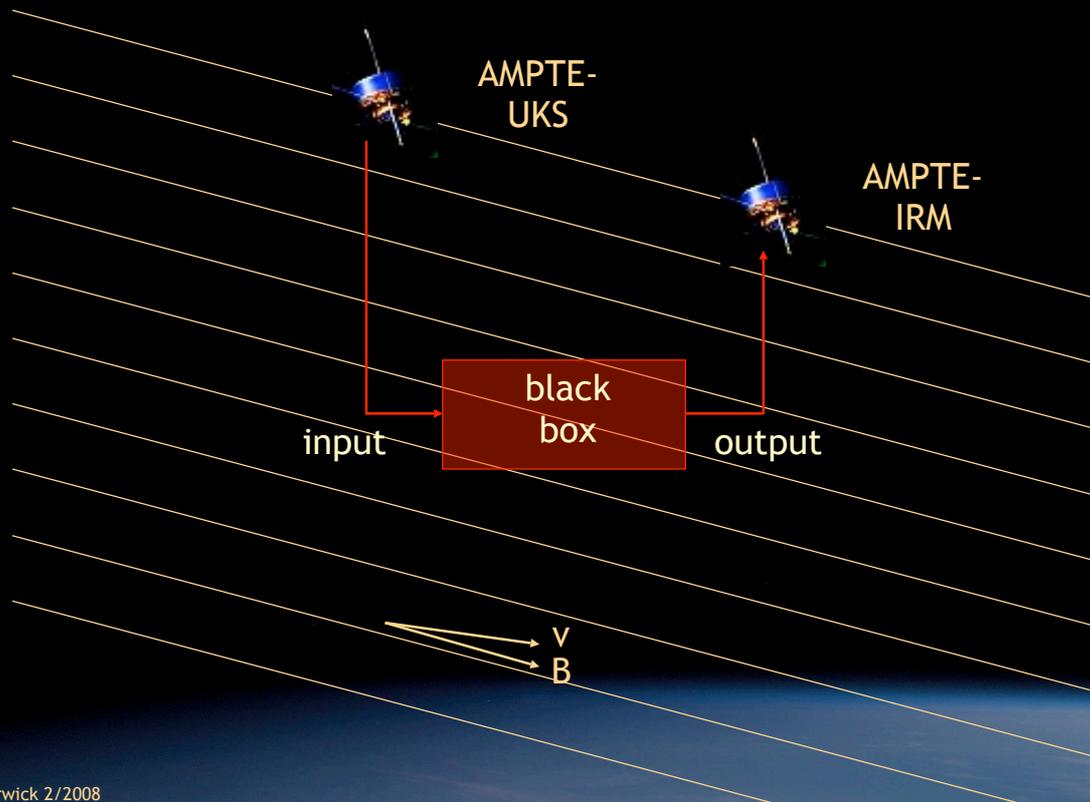
## *Physical picture*

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To answer this question unambiguously,  
we need spatial resolution,  
i.e. multipoint measurements

**A transfer function approach**

## Nonlinear Transfer Function



## Model of the black box

- ▶ First approximate the spatial derivative (Ritz & Powers, 1980)

$$\frac{\partial u}{\partial x} \leftrightarrow \frac{u_{output} - u_{input}}{\Delta x}$$

- ▶ Then assume the random phase approximation (mostly valid for broadband spectra)

$$\langle u_p u_q^* \rangle = \delta_{pq} P_p$$

- ▶ The Volterra model then naturally leads to a kinetic equation

## The kinetic equation

- ▶ The kinetic equation tells us how the spatial variation of the spectral energy at a given frequency varies according to linear / nonlinear processes (Monin & Yaglom, 1976)

$$\frac{\partial P_p}{\partial x} = \gamma_p P_p + \sum_{m+n=p} T_{m,n} + \sum_{m+n+k=p} T_{m,n,k} + \dots$$

The spectral energy transfers  $T$  tell us how much energy is exchanged between Fourier modes : they are the key to the dynamical evolution of the wavefield

$P_p$  : power spectral density at frequency  $\omega_p$

linear growth or damping

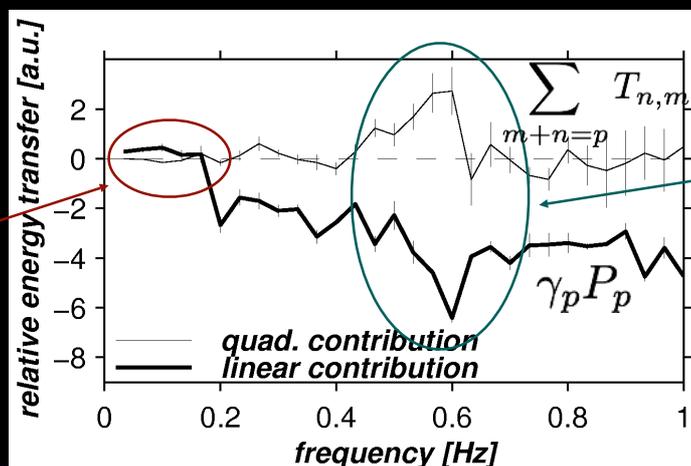
losses/gains due to quadratic effects

losses/gains due to cubic effects

## The linear term

- ▶ We first consider the energy balance
- ▶ How much of the spatial variation of the spectral energy is due to linear / nonlinear effects ?

SLAMS are linearly unstable (growth)

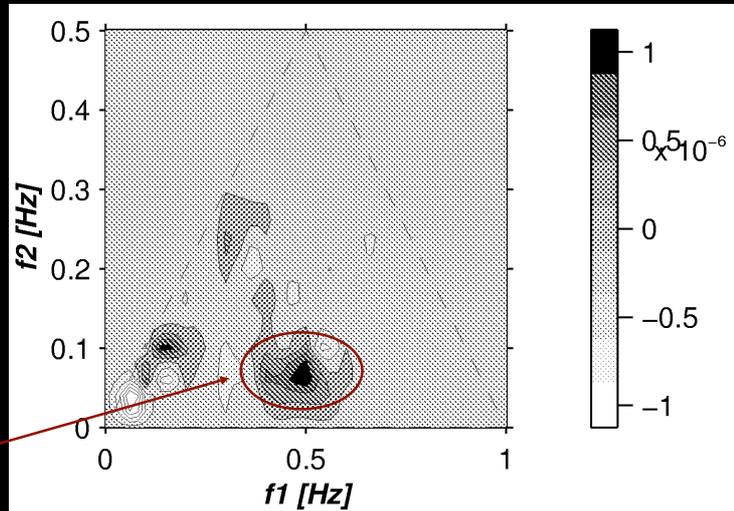


whistlers are linearly damped but receive energy through nonlinear couplings

## The spectral energy transfers

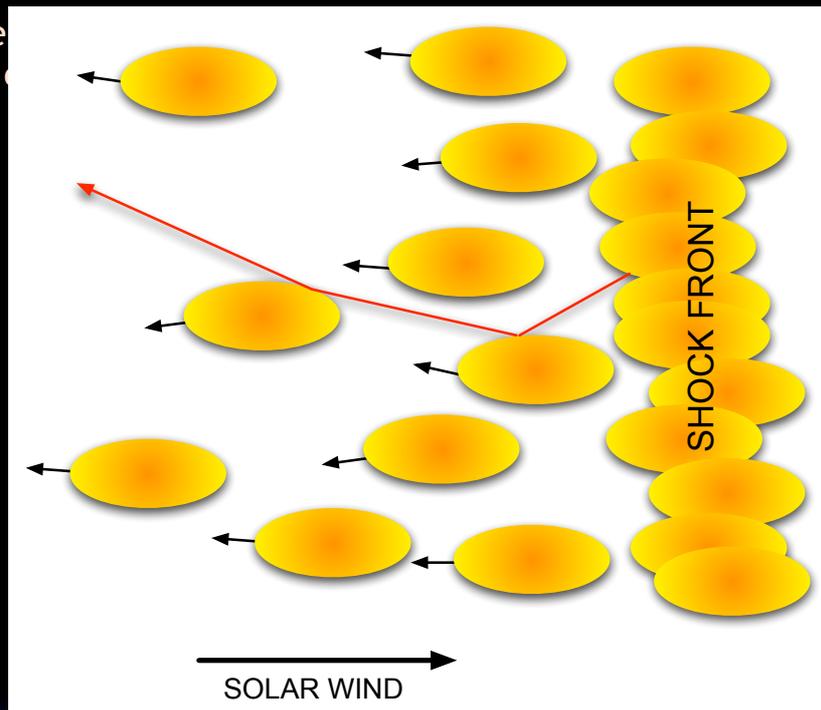
- ▶ The quadratic energy transfer  $T_{m,n}$  quantifies the amount of spectral energy that flows from  $\omega_m + \omega_p \rightarrow \omega_{m+p}$

waves at ~0.65 Hz receive energy through nonlinear coupling between 0.15 Hz and 0.5 Hz



## Physical picture

- ▶ Whistle from a



result

## Miscellaneous

- ▶ Volterra kernels, like HOS are sensitive to noise and finite sample effects. Careful **validation** is crucial.
- ▶ Nonlinear transfer function models have traditionally been estimated in the Fourier domain (Ritz & Powers, 1980)
- ▶ Kernels estimation by nonlinear **parametric models** (NARMAX = Nonlinear AutoRegressive Moving Average with eXogeneous inputs) today is a powerful alternative (Aguirre & Billings, 1995)

$$\begin{aligned}y_i = & -0.7610 u_{i-8} + 0.0032 u_{i-8}u_{i-1}^2 \\ & -0.0105 u_{i-24}^2 u_{i-3} + 0.1022 u_i \\ & +0.0017 u_{i-23}u_{i-20}u_{i-8} \\ & -0.0115 u_{i-14}u_{i-3}u_{i-1} \\ & +0.0103 u_{i-23}u_{i-11}u_i + \epsilon_i\end{aligned}$$

## Conclusions

- ▶ HOS have been there for a long time - but they're are still as relevant
- ▶ They are the right tools for describing weakly nonlinear wave interactions (weak turbulence, ...)
- ▶ But as for all higher order techniques, careful validation is compulsory to avoid pitfalls