

# Hilbert-Huang Transform

PEF5737 - Non-linear dynamics and stability

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- ① Objetivos
- ② Introduction
  - Fourier Transform
- ③ Examples of application in FIV problems
  - Flow around a cylinder
  - AM/FM - Vortex-induced vibrations data
  - Concomitant VIV and top-motion excitation
  - Response transitions - flexible cylinder VIV
- ④ Final remarks

- To provide a brief presentation of the Hilbert-Huang Transform (HHT), its motivation and possible gains associated with its application;
- To show some case studies.

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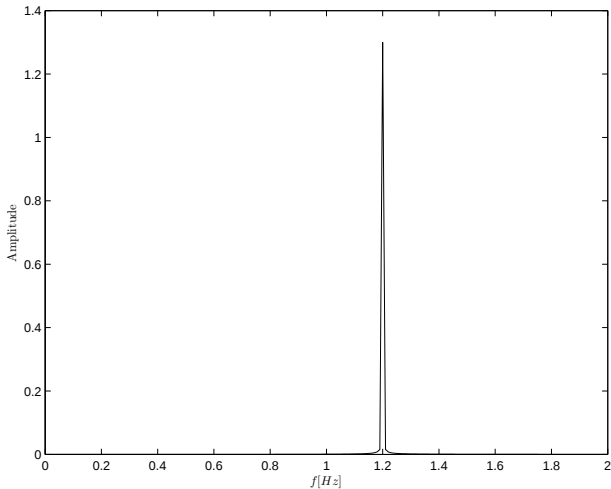
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- Proper for stationary data arisen from linear systems;
- Represents a time-domain signal  $x(t)$  by means of a set of amplitudes (or energy) that depends of discrete frequencies.

Let  $x(t)$  being a signal of length (sample size)  $N$ . Such a signal is sampled with a constant sampling frequency  $f_s$ . The amplitude spectrum can be calculated using the following MATLAB<sup>®</sup> script:

- $X_s = \text{fft}(x);$
- $\text{freq} = [0 : N - 1] f_s / N;$
- $\text{freq} = \text{freq}(1 : \text{fix}(N/2));$
- $X_s = X_s(1 : \text{fix}(N/2));$
- $\text{Amp} = 2 * \text{abs}(X_s) / N;$
- $\text{plot}(\text{freq}, \text{Amp})$

$$x(t) = 1.3 \sin(2\pi 1.2t)$$



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- The signal must be free of time-dependent effects such as, for examples, jumps and frequency/amplitude modulations;
- Other hypothesis (see, for example, the book by Bendat & Pierson).

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- The seek for an alternative time-frequency domain analysis proper for non-stationary signals arisen from non-linear systems is justified: **Hilbert-Huang Transform.**

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*Empirical mode decomposition - EMD*

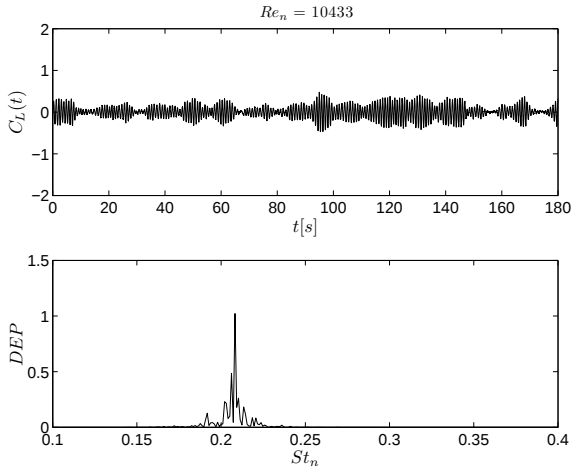
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- EMD scheme results in a number of Intrinsic Mode Functions (IMFs) → Each IMF has null averaged value and a particular time-scale;

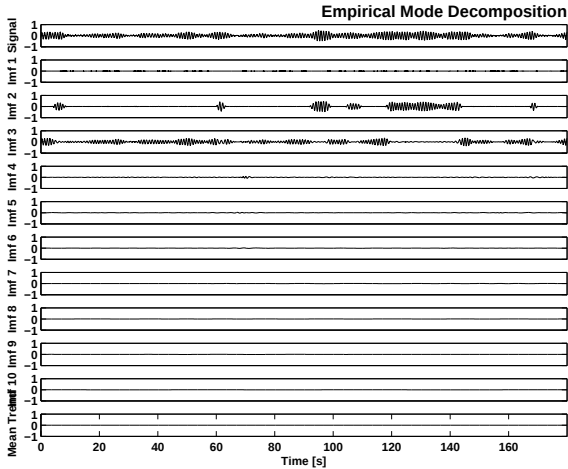
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- EMD scheme results in a number of Intrinsic Mode Functions (IMFs) → Each IMF has null averaged value and a particular time-scale;
- Hilbert-Huang's spectrum: Application of the Hilbert Transform to each IMF.

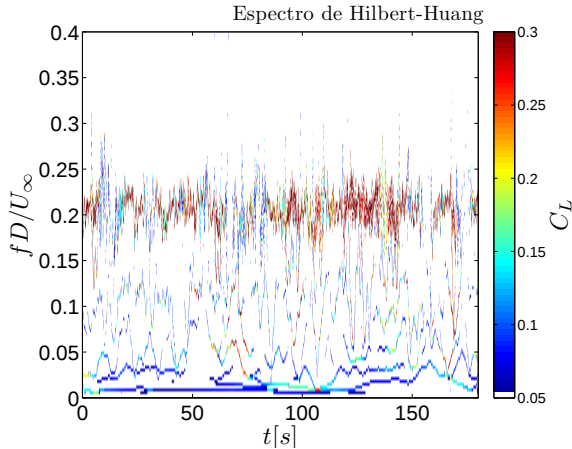
- Difference between the number of *extrema* and zero-crossing must be, at most, 1;
- For each instant, the average between the local maximum and minimum must be null.

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# Flow around a cylinder







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## 3 Examples of application in FIV problems

Flow around a cylinder

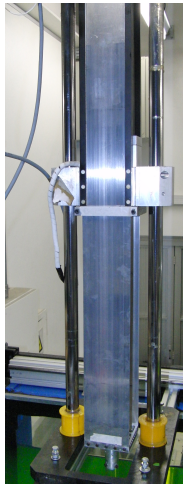
AM/FM - Vortex-induced vibrations data

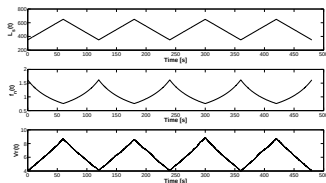
Concomitant VIV and top-motion excitation

Response transitions - flexible cylinder VIV

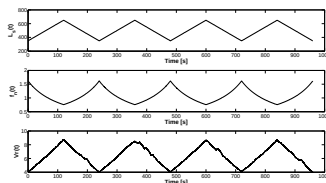
## 4 Final remarks

- Vortex-induced vibrations (VIV): Resonant phenomenon that can be modeled by using a non-linear oscillator coupled to an elastic one;
- Large structural responses within the interval  $3 < U_r = U/f_n D < 12$ ;
- Classical experimental investigations: The reduced velocity  $U_r$  is varied by increasing the free-stream velocity  $U_\infty$ ;
- Non-usual experiment (Franzini et al (2008,2010):  $U_\infty$  is kept constant and  $U_r$  is varied by changing the natural frequency.

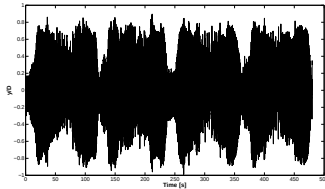




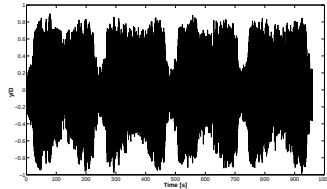
(a) Clamp speed  $5\text{ mm/s}$



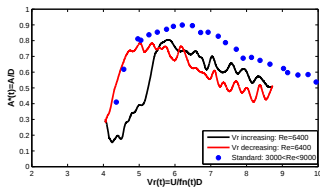
(b) Clamp speed  $25\text{ mm/s}$



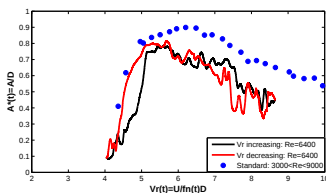
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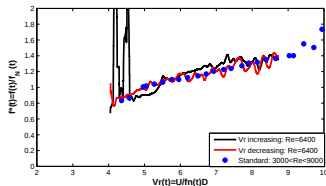
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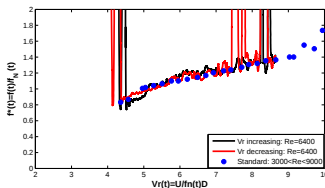
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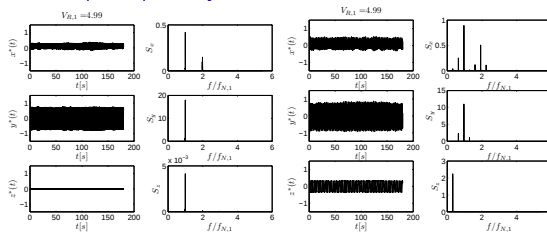
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Franzini et al (2015). Concomitant flexible cylinder VIV and top-motion excitation.

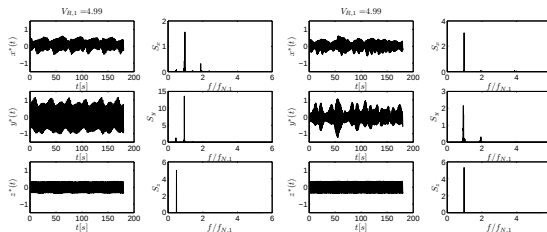
$$U_{r,1} = 4.99$$

## Fourier Transform (PSD) analysis



(a) No top motion

(b) 1 : 3

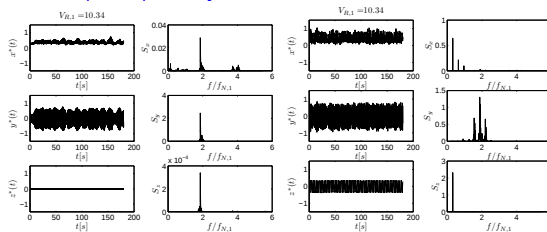


(c) 1 : 2

(d) 1 : 1

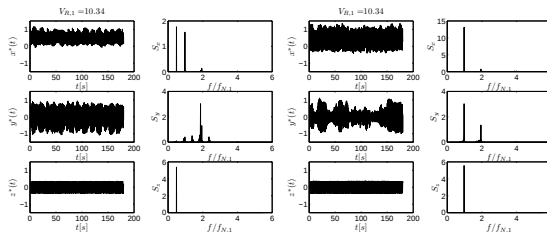
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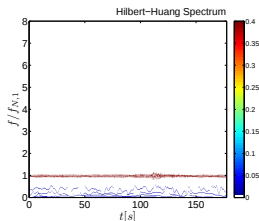
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- Top motion cases: Marked presence of subharmonic components → Richer spectral distribution;
- Presence of sum and difference frequencies: Can be explained under the linear dynamics scope;

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- $k_q(t) = \bar{k} + \Delta k_q \cos \Omega_t t$  (time dependent stiffness),  
 $q = Q \cos \Omega_{N,1} t$  (modal displacement),  $F_q$  (forcing term);

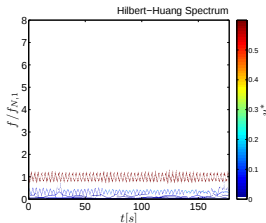
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 $q = Q \cos \Omega_{N,1} t$  (modal displacement),  $F_q$  (forcing term);
- Equation of motion  
$$m_q \ddot{q} + c \dot{q} + \bar{k} q = F_q(t) - \frac{\Delta k Q}{2} [\cos(\Omega_{N,1} + \Omega_t)t + \cos(\Omega_{N,1} - \Omega_t)t]$$

$$U_{r,1} = 4.99$$

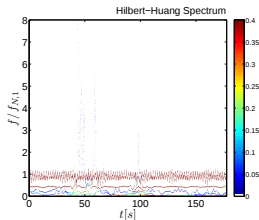
## HHT Analysis



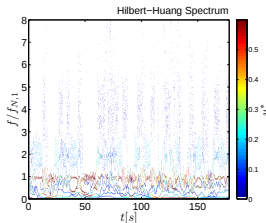
(a) No top motion



(b) 1 : 3



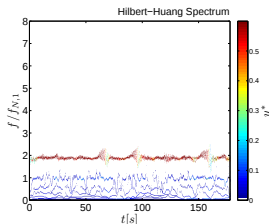
(c) 1 : 2



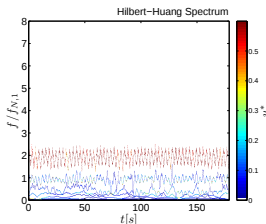
(d) 1 : 1

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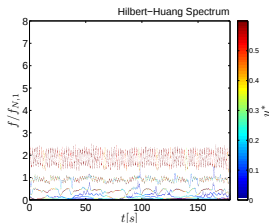
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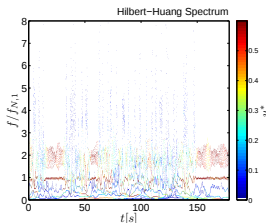
(e) No top motion



(f) 1 : 3



(g) 1 : 2

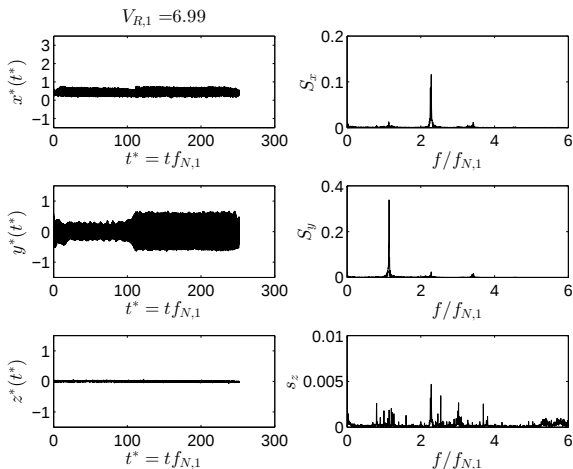


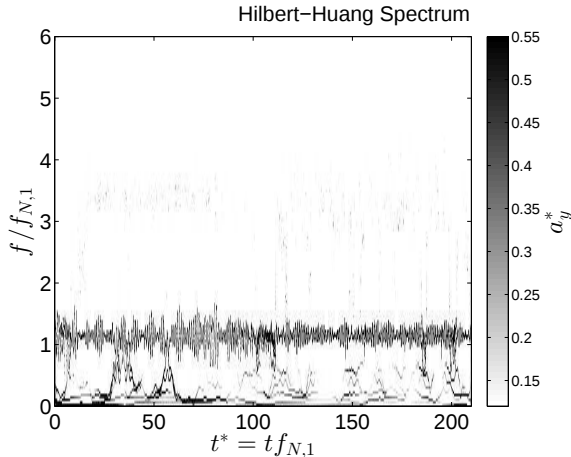
(h) 1 : 1

- HHT → Time-frequency domain spectral analysis, introduced by Huang et al (1998);
- HHT → Can be used aiming at identifying events in the time series;
- HHT → **Sum and difference components are replaced by a continuous trace of frequency, which varies with  $f_t$ ; ⇒ Information not given by the PSD.**

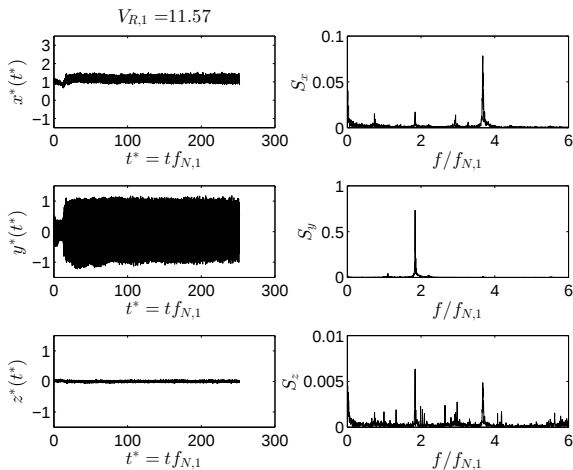
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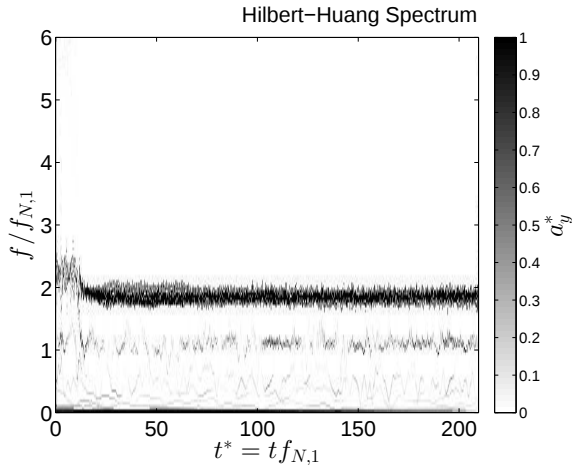
# Jumps in the response

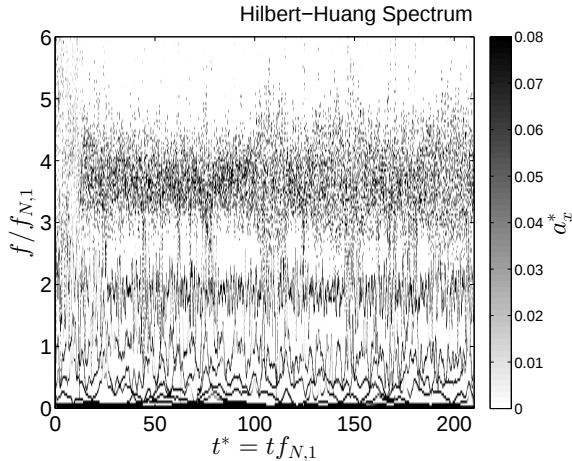




# Jumps in the response







- Fourier Transform (FT): Proper for stationary data arisen from linear systems;
- Hilbert-Huang Transform: Also proper for non-stationary signals arisen from non-linear systems;
- : HHT: Applies the empirical mode decomposition for generating a set of intrinsic mode functions;
- HHT: Applies the Hilbert Transform on each IMF.

- Joint use of FT and HHT  $\rightarrow$  Complimentary results on the same problem.

G. R. Franzini, R. T. Gonçalves, C. P. Pesce, A. L. C. Fugarra, C. E. N. Mazzilli, J. R. Meneghini, and P. Mendes. Vortex-induced vibration experiments with a long semi-immersed flexible cylinder under tension modulation: Fourier transform and hilbert-huang spectral analyses. Journal of the Brazilian Society of Mechanical Sciences and Engineering, Online, 2014.

G. R. Franzini, A. A. P. Pereira, A. L. C. Fugarra, and C. P. Pesce. Experiments on VIV under frequency modulation and at constant Reynolds number. In Proceedings of OMAE 08 , 27th Int. Conference on Offshore Mechanics and Arctic Engineering, 2008.

G. R. Franzini, C. P. Pesce, R. T. Gonçalves, A. L. C. Fugarra, and J. R. Meneghini. An experimental investigation on frequency modulated VIV in a water channel. In Proceedings of the 7th Bluff-Bodies Wakes and Vortex-Induced Vibrations Conference, 2010.

Huang, N. E., Shen, Z., Long, S. R., Wu, M. C., Shih, H. H., Zheng, Q., Yen, N., Tung, C. C., Liu, H. H. The empirical mode decomposition and the Hilbert spectrum for nonlinear and non-stationary time series analysis. Royal Society London, 1998.