

Multiscale analysis of Eta forecasts: Preliminary analysis

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Summary

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Wavelet
analysis

Atmospheric
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Morlet wavelet

Analysis

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Motivation of this work

Are the short and long range Eta model runs seeing the same time scales?

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Wavelet analysis

- Tool to understand the **multiscale** aspects of functions or signals.
- **Synthesis and synergy** of:
 - **robust mathematic results**
 - **efficient computational algorithms**
 - under the interest of a broad community
- The use of wavelet techniques has exponentially grown, since late 80's

[Jaffard,Meyer, Ryan (2001), Meneveau(91), Chen(83), Morlet(83)] .

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Atmospheric applications

- The more popular characteristic of the wavelet techniques are the introduction of the time-scale decomposition.
- Musical structure => events localized in time.
- A piece of music can be understood as a set of musical notes characterized by four parameters:
 - frequency, time of occurrence, duration and intensity

[Domingues(2005), Daubechies(92), Lau&Weng(95), Farge(92)] .

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Continuous wavelet transform (CWT)

CWT of a time series f is defined by

$$\mathfrak{W}_f^\psi(a, b) = \int_{-\infty}^{\infty} f(u) \bar{\psi}_{a,b}(u) du \quad a > 0,$$

where

$$\psi_{a,b}(u) = \frac{1}{\sqrt{a}} \psi\left(\frac{u-b}{a}\right)$$

represents a chosen wavelet function family, named mother-wavelet.

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- Can be used in the analysis of **non-stationary** signals to obtain:
 - Information on the **pseudo-frequency** or scale variations
 - The detection of structures localization in time and/or in space.

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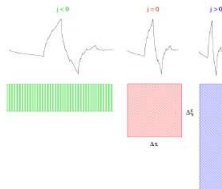
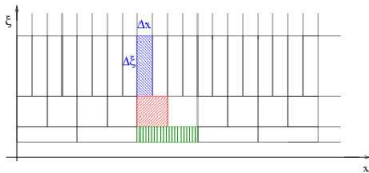
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- CWT - when scale and localization parameters assume continuous values.

A wavelet function must satisfy the following conditions.

- 1) The **integral** of the wavelet function, usually denoted by ψ , **must be zero**. This assures that the wavelet function has a wave shape and it is known as the admissibility condition.
- 2) The wavelet function must have **unitary energy**. This assures that the wavelet function has compact support or has a fast amplitude decay (in a physical vocabulary *e-folding time*), warranting a physical domain localization.

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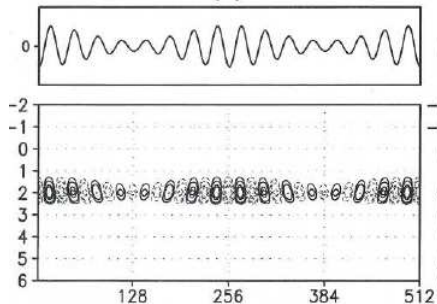
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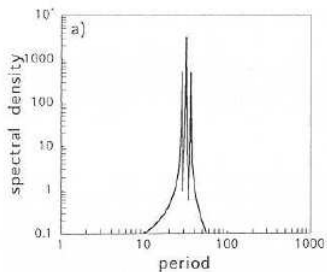
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Examples: CWT



Amplitude modulation



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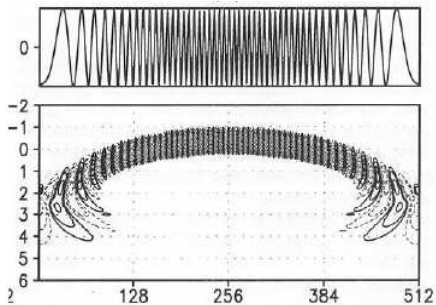
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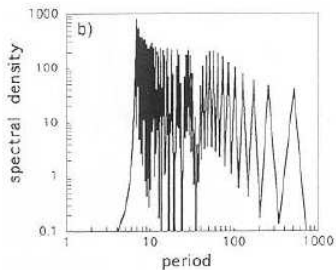
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Frequency modulation



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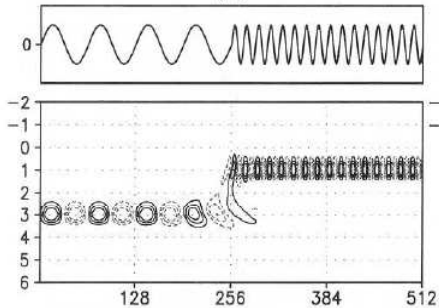
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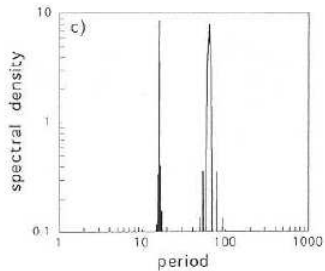
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Abrupt changes in time



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Morlet wavelet

It is formed by a plane wave modulated by a gaussian function and it is given by

$$\psi(x) = \pi^{-\frac{1}{4}} \left(e^{i\xi x} - e^{-\frac{\xi^2}{2}} \right) e^{-\frac{x^2}{2}},$$

where ξ is a non dimensional value.

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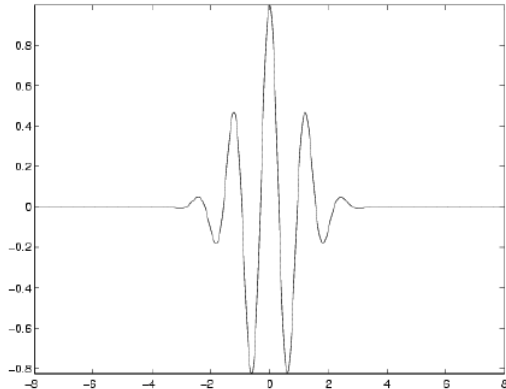
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Morlet wavelet - real part



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Methodology:

- short and long range Eta model runs
- an observation station data sets
- during part of a summer/fall season
- analysis of variance wavelet:scalogram
- using the continuous **wavelet** transform with Morlet mother-wavelet, family 6.

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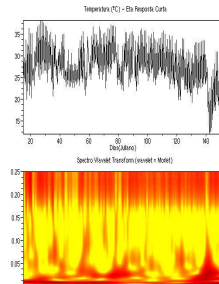
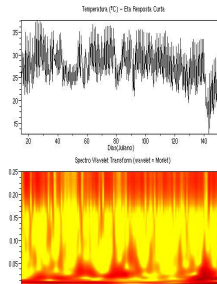
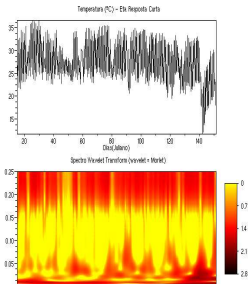
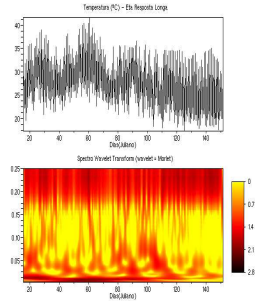
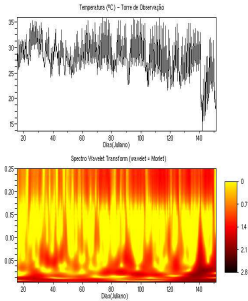
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Air Temperature (2 meters)



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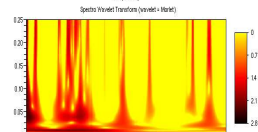
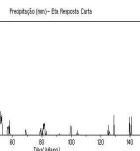
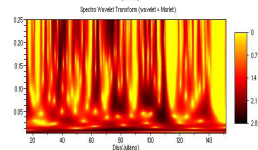
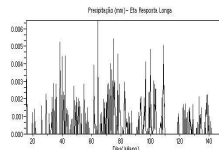
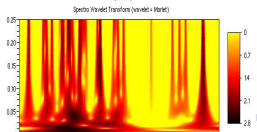
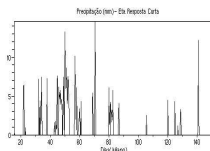
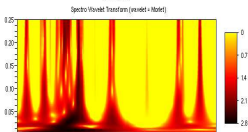
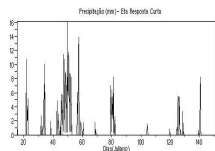
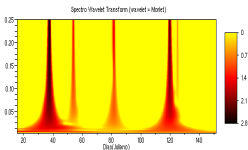
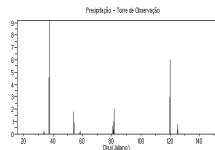
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Precipitation (mm/day)



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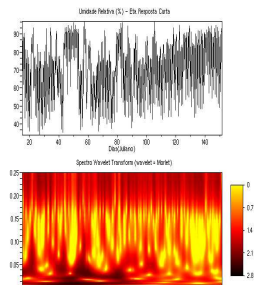
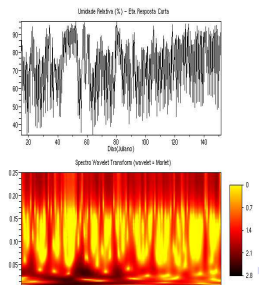
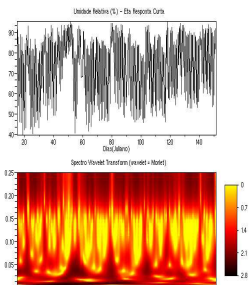
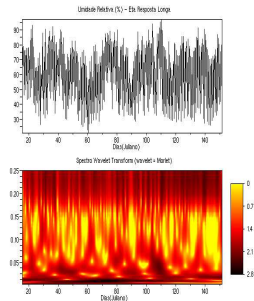
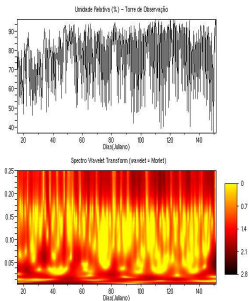
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Relative Humidity (%)



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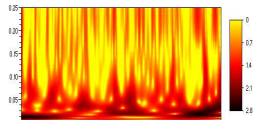
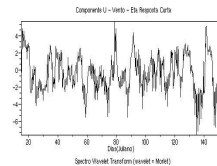
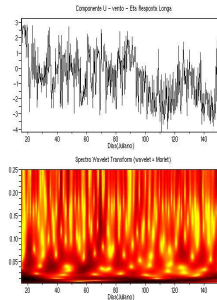
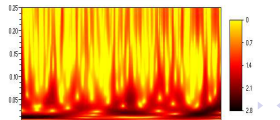
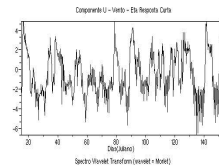
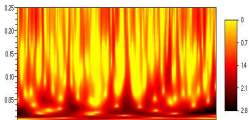
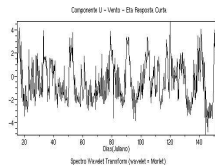
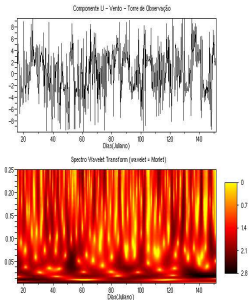
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Zonal wind (m/s)



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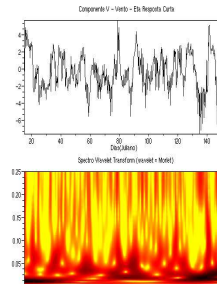
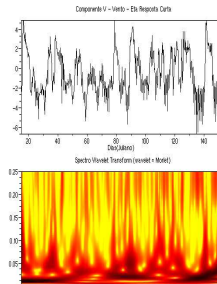
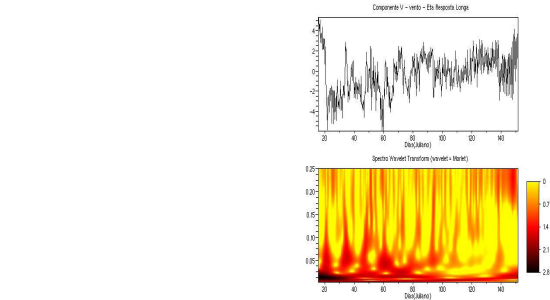
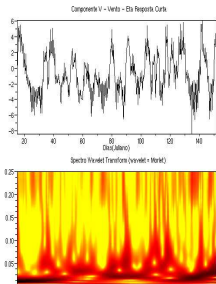
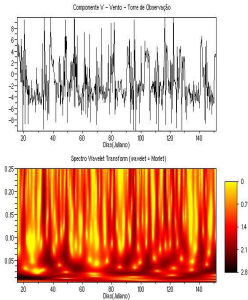
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Meridional wind (m/s)



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Next steps !

- To use more features of this wavelet, as the **phase** and the global wavelet aspects.
- To identify why could be the causes of these differences;
- To study if this behaviour is representative in space:
 - Using a two or three dimensional transform - time-space multiscale analysis.

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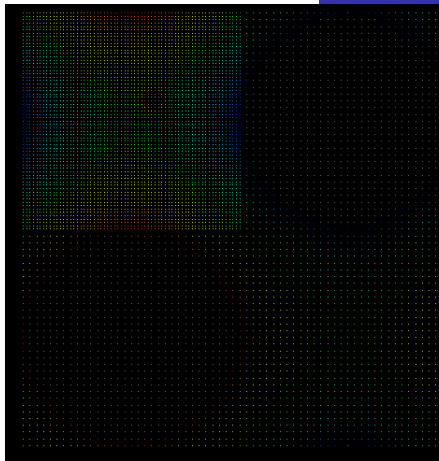
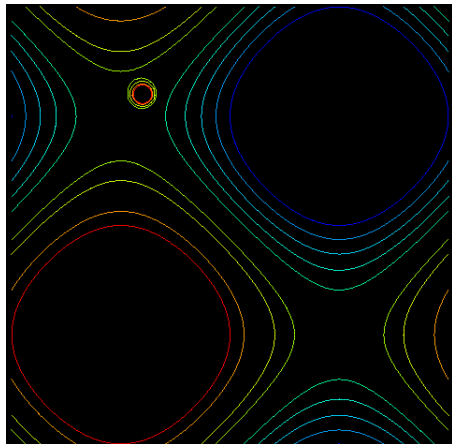
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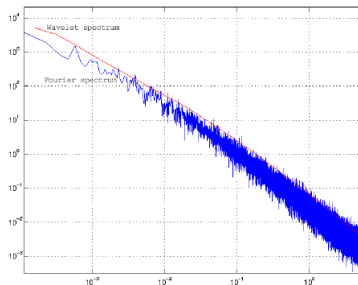
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Other examples: automatic mesh refinement



Other examples: turbulence analysis



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Obrigada! Thanks!

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