

# Multiscale analysis of Eta forecasts: Preliminary analysis

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Summary

Motivation of  
this work

Wavelet  
analysis

Atmospheric  
applications

CWT

Morlet wavelet

Analysis

Preliminary  
Results

# Motivation of this work

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

Summary

Motivation of  
this work

Wavelet  
analysis

Atmospheric  
applications

CWT

Morlet wavelet

Analysis

Preliminary  
Results

# 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)] .

Summary

Motivation of  
this work

Wavelet  
analysis

Atmospheric  
applications

CWT

Morlet wavelet

Analysis

Preliminary  
Results

# 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)] .

Summary

Motivation of  
this work

Wavelet  
analysis

Atmospheric  
applications

CWT

Morlet wavelet

Analysis

Preliminary  
Results

# 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.

Summary

Motivation of  
this work

Wavelet  
analysis

Atmospheric  
applications

CWT

Morlet wavelet

Analysis

Preliminary  
Results

- 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.

Summary

Motivation of  
this work

Wavelet  
analysis

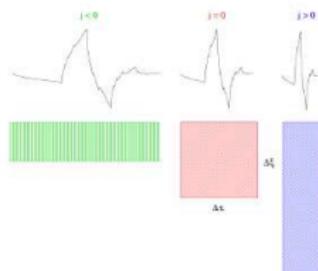
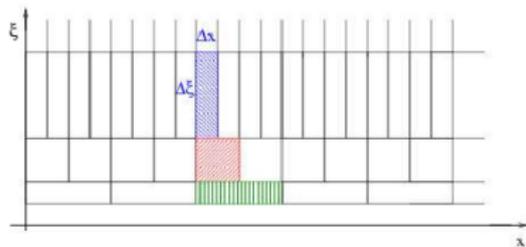
Atmospheric  
applications

**CWT**

Morlet wavelet

Analysis

Preliminary  
Results



Summary

Motivation of  
this work

Wavelet  
analysis

Atmospheric  
applications

**CWT**

Morlet wavelet

Analysis

Preliminary  
Results

- 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  $\psi$ , **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.

Summary

Motivation of  
this work

Wavelet  
analysis

Atmospheric  
applications

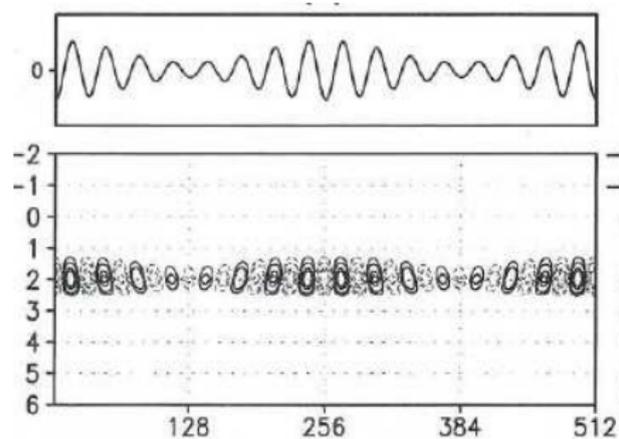
CWT

Morlet wavelet

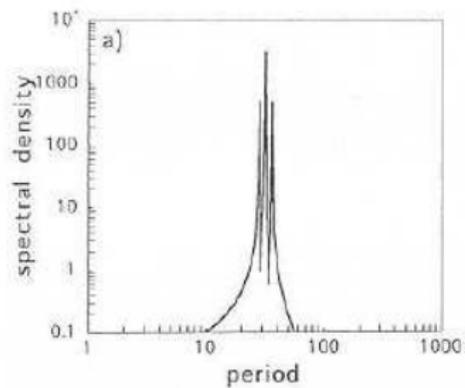
Analysis

Preliminary  
Results

# Examples: CWT



## Amplitude modulation



Summary

Motivation of  
this work

Wavelet  
analysis

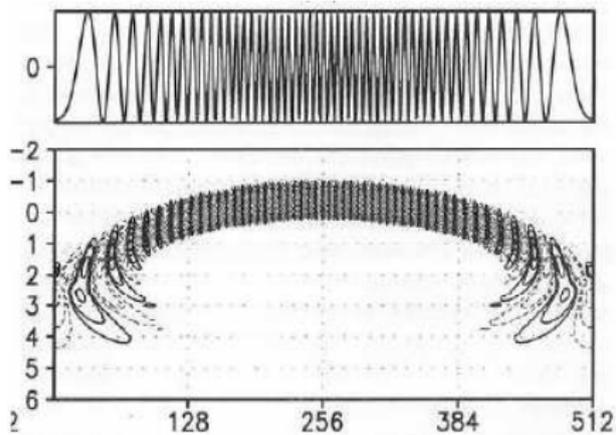
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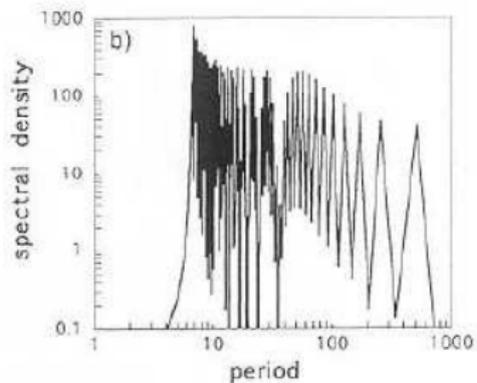
Morlet wavelet

Analysis

Preliminary  
Results



## Frequency modulation



Summary

Motivation of  
this work

Wavelet  
analysis

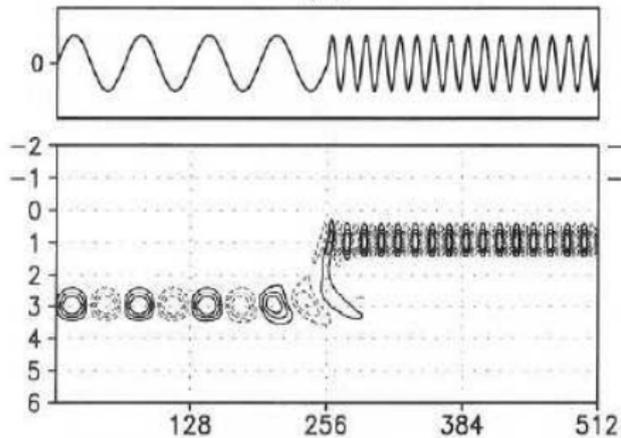
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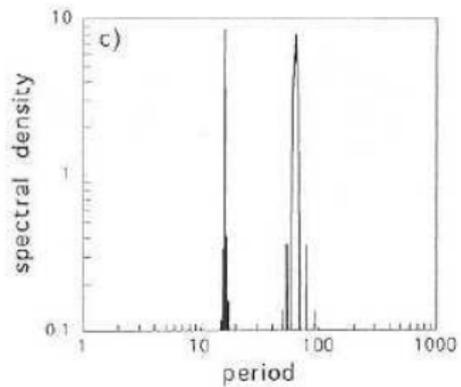
Morlet wavelet

Analysis

Preliminary  
Results



## Abrupt changes in time



Summary

Motivation of  
this work

Wavelet  
analysis

Atmospheric  
applications

**CWT**

Morlet wavelet

Analysis

Preliminary  
Results

# Morlet wavelet

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

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

where  $\xi$  is a non dimensional value.

Summary

Motivation of  
this work

Wavelet  
analysis

Atmospheric  
applications

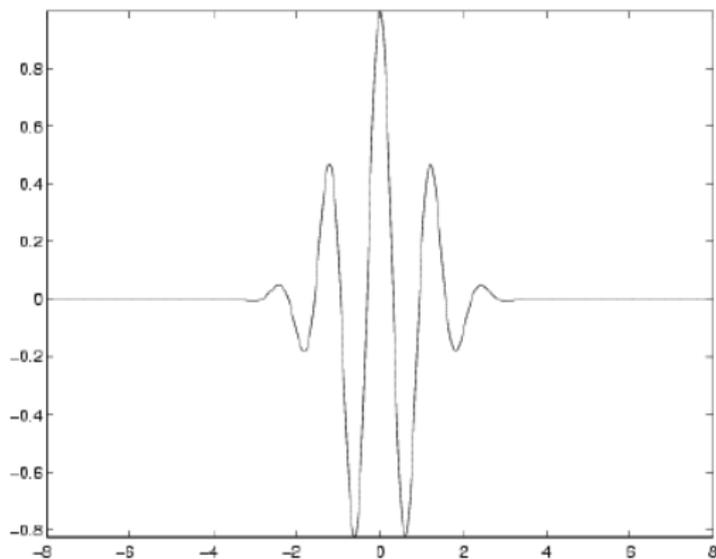
CWT

**Morlet wavelet**

Analysis

Preliminary  
Results

# Morlet wavelet - real part



Summary

Motivation of  
this work

Wavelet  
analysis

Atmospheric  
applications

CWT

**Morlet wavelet**

Analysis

Preliminary  
Results

# 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.

Summary

Motivation of  
this work

Wavelet  
analysis

Atmospheric  
applications

CWT

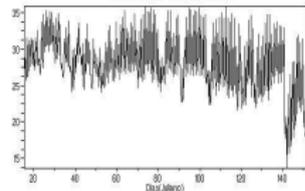
Morlet wavelet

Analysis

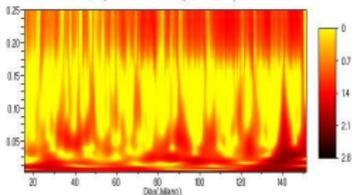
Preliminary  
Results

# Air Temperature (2 meters)

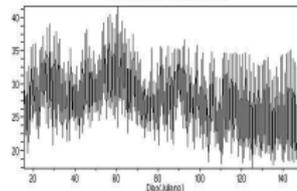
Temperatura (°C) - Torre de Observação



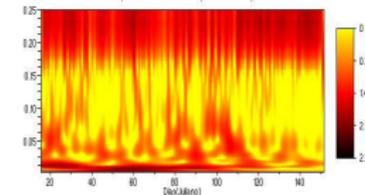
Spectro Wavelet Transform (swtvel = Morlet)



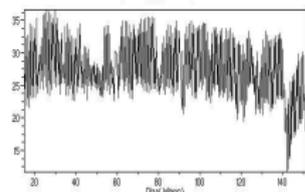
Temperatura (°C) - Est. Resposta Longa



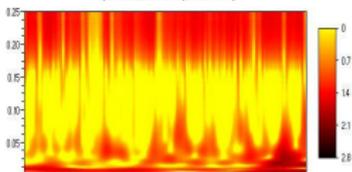
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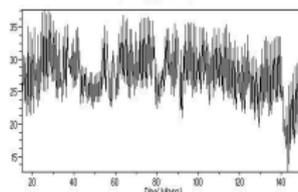
Temperatura (°C) - Est. Resposta Curta



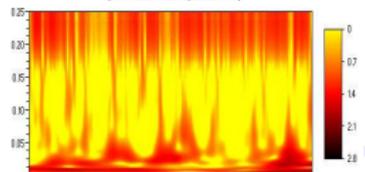
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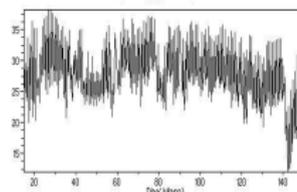
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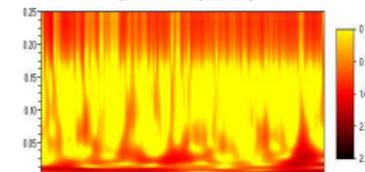
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Spectro Wavelet Transform (swtvel = Morlet)



Summary

Motivation of this work

Wavelet analysis

Atmospheric applications

CWT

Morlet wavelet

Analysis

Preliminary Results

# Precipitation (mm/day)

Summary

Motivation of  
this work

Wavelet  
analysis

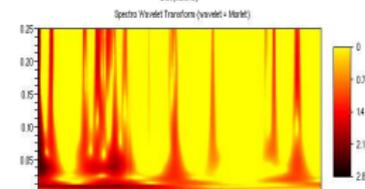
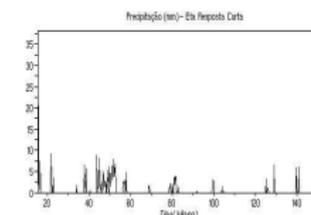
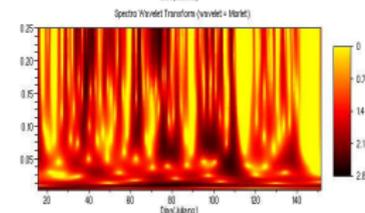
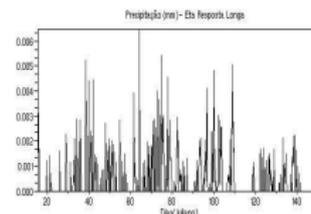
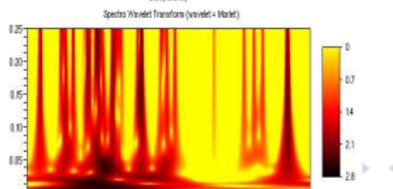
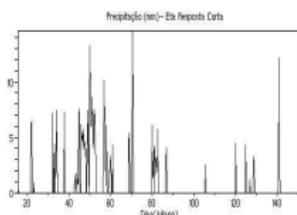
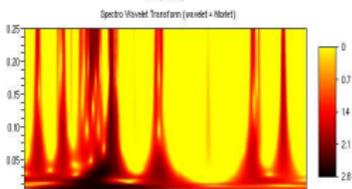
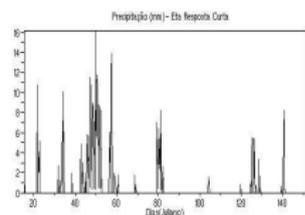
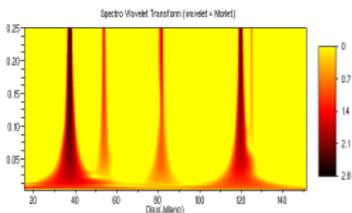
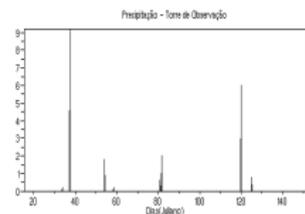
Atmospheric  
applications

CWT

Morlet wavelet

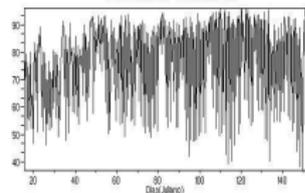
Analysis

Preliminary  
Results

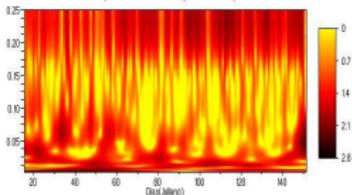


# Relative Humidity (%)

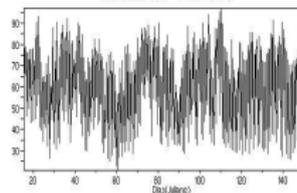
Umidade Relativa (%) - Torre de Observação



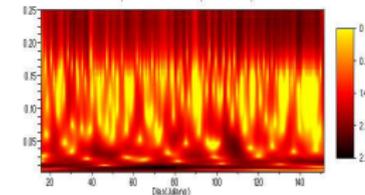
Spectro Wavelet Transform (wavelet + Morlet)



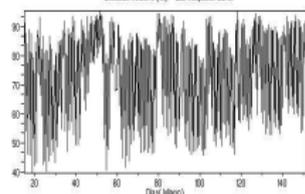
Umidade Relativa (%) - Eta Resposta Longa



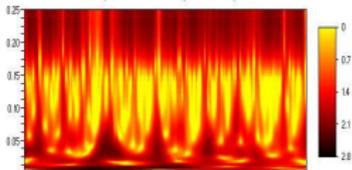
Spectro Wavelet Transform (wavelet + Morlet)



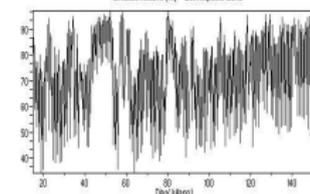
Umidade Relativa (%) - Eta Resposta Curta



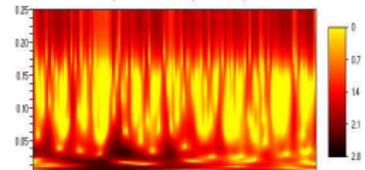
Spectro Wavelet Transform (wavelet + Morlet)



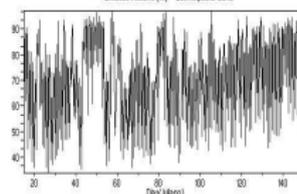
Umidade Relativa (%) - Eta Resposta Curta



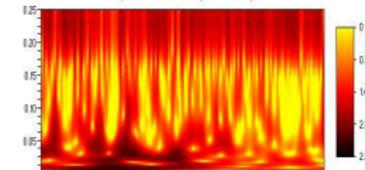
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Umidade Relativa (%) - Eta Resposta Curta



Spectro Wavelet Transform (wavelet + Morlet)



Summary

Motivation of this work

Wavelet analysis

Atmospheric applications

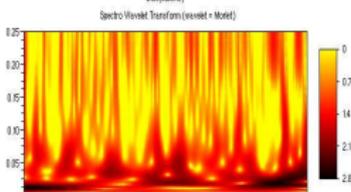
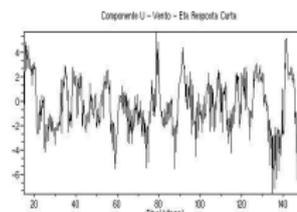
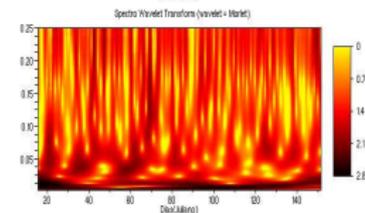
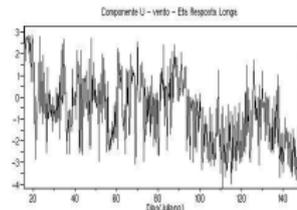
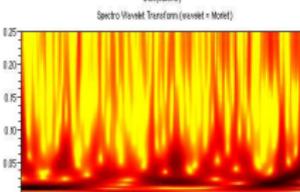
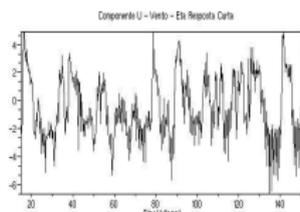
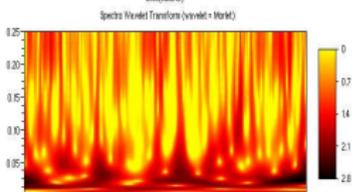
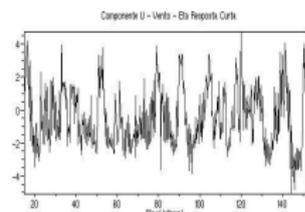
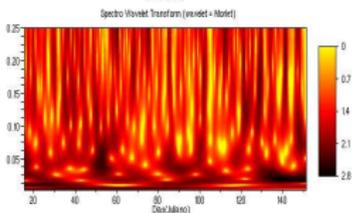
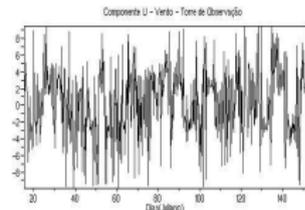
CWT

Morlet wavelet

Analysis

Preliminary Results

# Zonal wind (m/s)



Summary

Motivation of this work

Wavelet analysis

Atmospheric applications

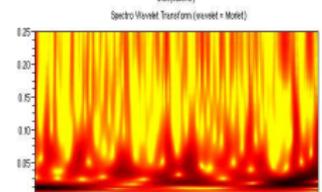
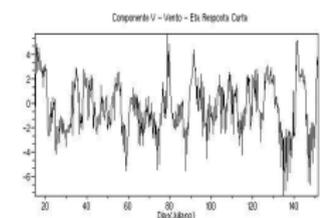
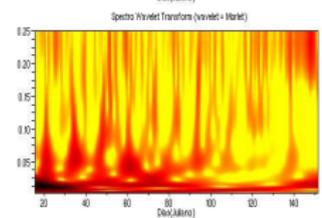
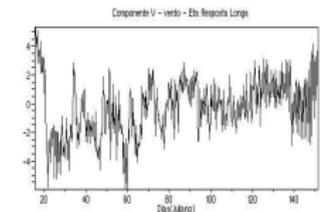
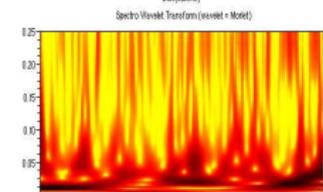
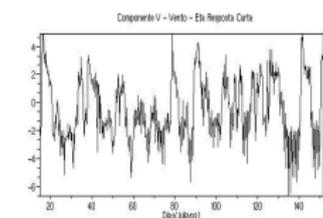
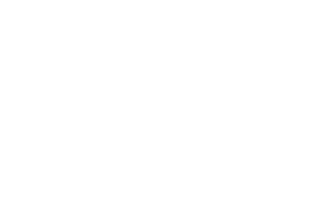
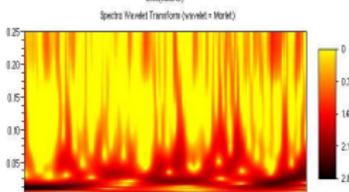
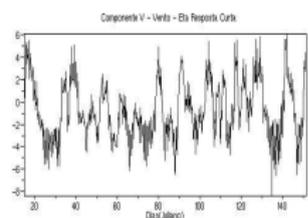
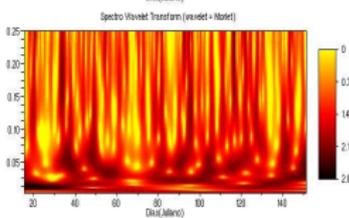
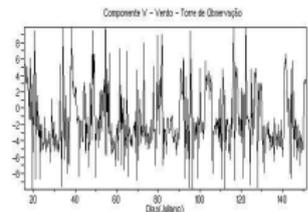
CWT

Morlet wavelet

Analysis

Preliminary Results

# Meridional wind (m/s)



Summary

Motivation of this work

Wavelet analysis

Atmospheric applications

CWT

Morlet wavelet

Analysis

Preliminary Results

# 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.

Summary

Motivation of  
this work

Wavelet  
analysis

Atmospheric  
applications

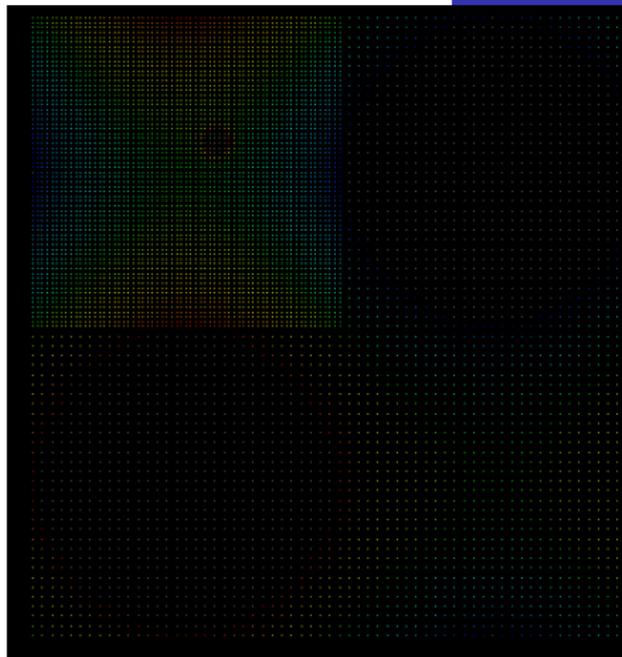
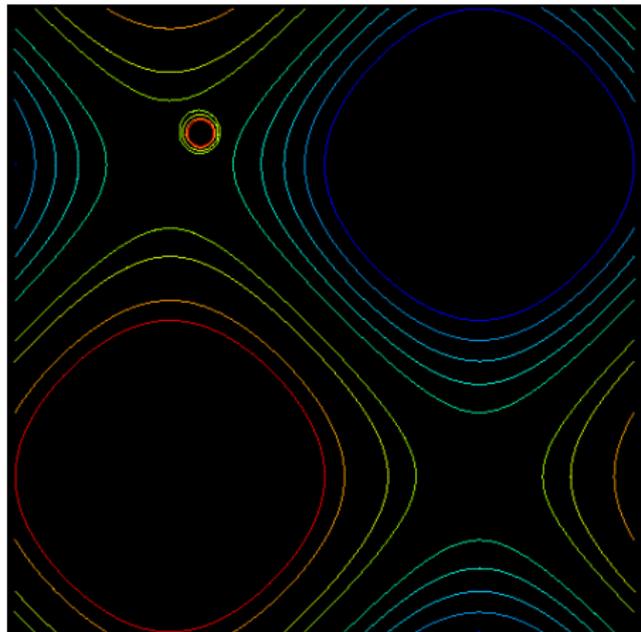
CWT

Morlet wavelet

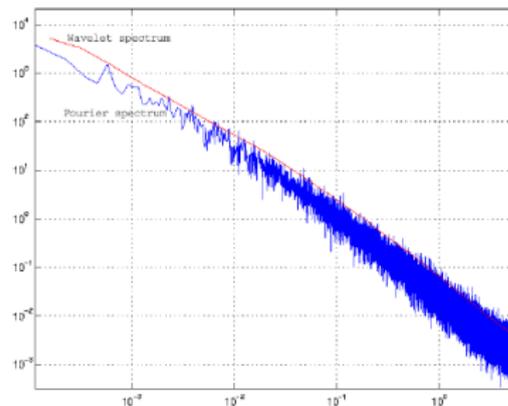
Analysis

Preliminary  
Results

## Other examples: automatic mesh refinement



# Other examples: turbulence analysis



Summary

Motivation of  
this work

Wavelet  
analysis

Atmospheric  
applications

CWT

Morlet wavelet

Analysis

Preliminary  
Results

Obrigada! Thanks!  
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Summary

Motivation of  
this work

Wavelet  
analysis

Atmospheric  
applications

CWT

Morlet wavelet

Analysis

Preliminary  
Results



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Summary

Motivation of  
this work

Wavelet  
analysis

Atmospheric  
applications

CWT

Morlet wavelet

Analysis

Preliminary  
Results



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*Sampling theory and wave propagation*, pages 233–261.  
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Summary

Motivation of  
this work

Wavelet  
analysis

Atmospheric  
applications

CWT

Morlet wavelet

Analysis

Preliminary  
Results