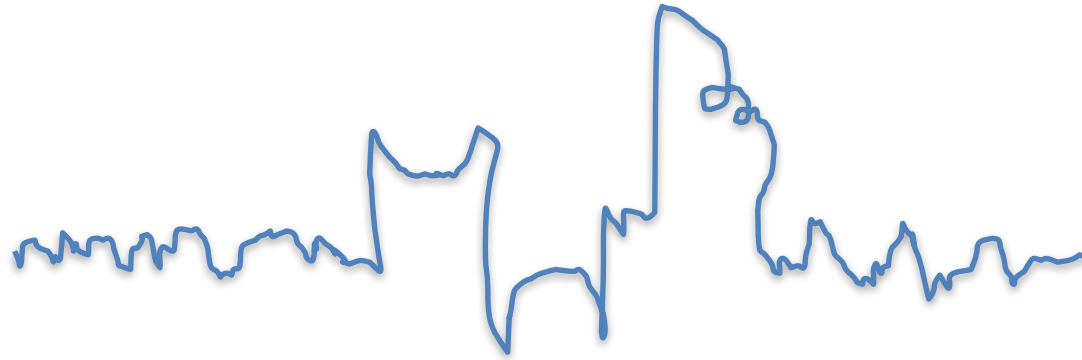


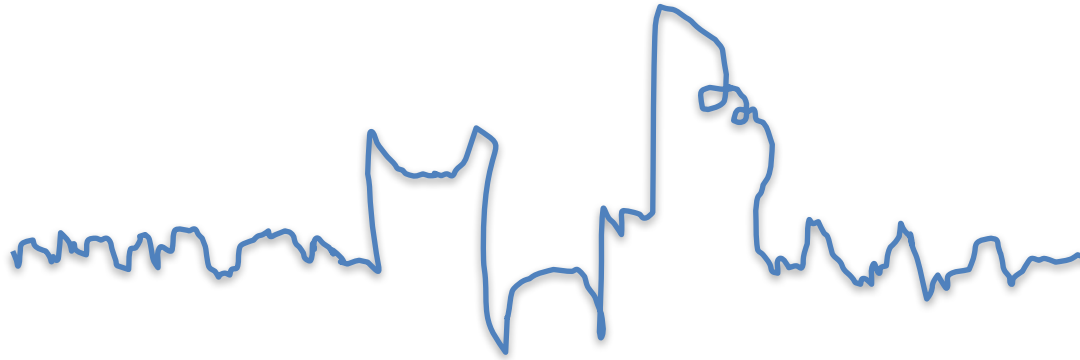
TF methods

- Hilbert transform ✓ oat
- Morlet wavelets ✓ oat
- Hanning taper ✓ oat
- Multitaper (Slepian tapers) ✗ - but
workaround for source space gamma

TF transform in OAT



TF transform in OAT



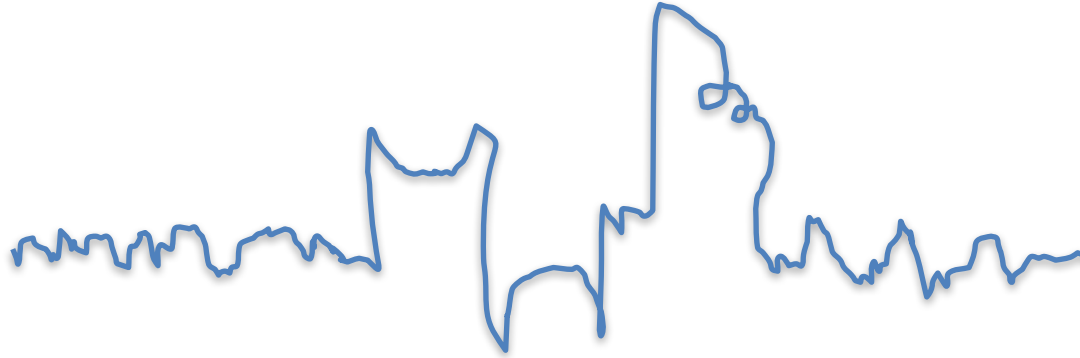
- Source recon stage: band pass filters sensor-space data
 - `oat.source_recon.freq_range`

TF transform in OAT



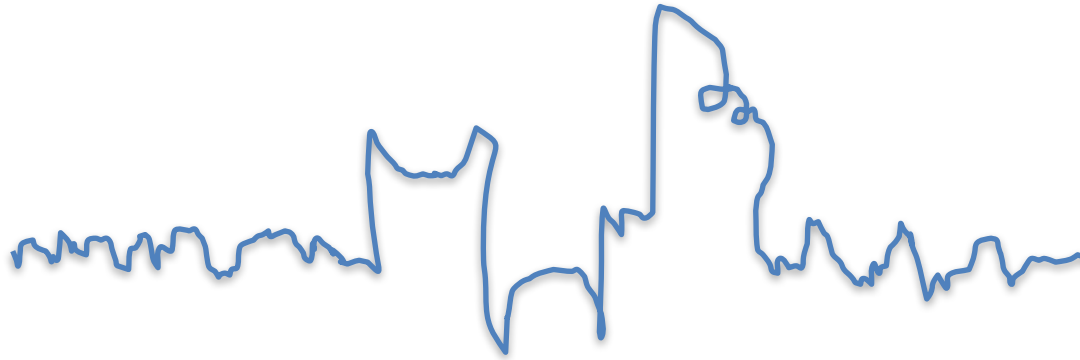
- Source recon stage: band pass filters sensor-space data
 - `oat.source_recon.freq_range`
- First level: time-frequency transform, beamforming, and GLM
 - *`osl_run_first_level_epoched_state`*

TF transform in OAT



- Source recon stage: band pass filters sensor-space data
 - `oat.source_recon.freq_range`
- First level: time-frequency transform, beamforming, and GLM
 - *osl_run_first_level_epoched_state*
 - Start with sensor-space data:
 - ...do the `tf_transform`: either (none), hilbert, morlet, hanning, + downsample...
 - *osl_tf_transform*

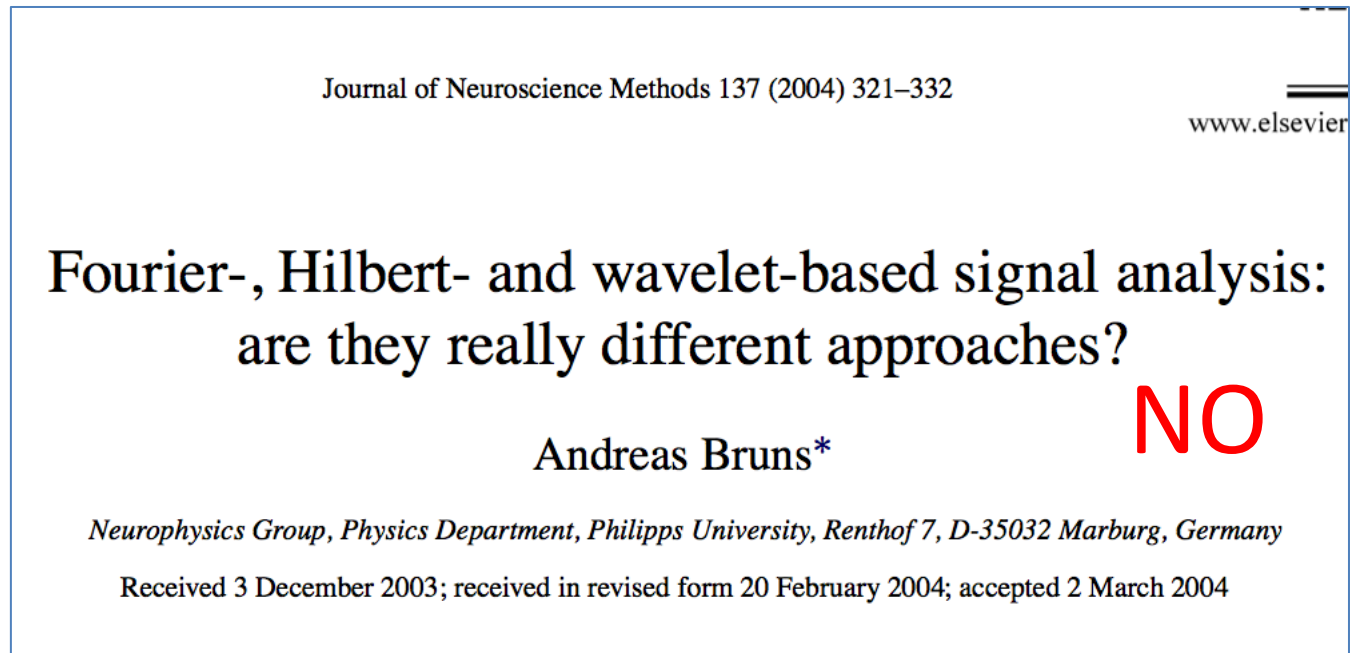
TF transform in OAT



- Source recon stage: band pass filters sensor-space data
 - `oat.source_recon.freq_range`
- First level: time-frequency transform, beamforming, and GLM
 - *osl_run_first_level_epoched_state*
 - Start with sensor-space data:
 - ...do the `tf_transform`: either (none), hilbert, morlet, hanning, + downsample...
 - *osl_tf_transform*
 - ...multiply the complex tfr by the beamformer weights and get the absolute values...
 - ...and do the GLM to average across trials and get the COPEs.

Low frequency TF analyses: Hilbert, morlet, hanning... does it matter??

- No



- No

- They all give you amplitude and phase over time for each frequency of interest, and induced response analyses look at changes in the amplitude

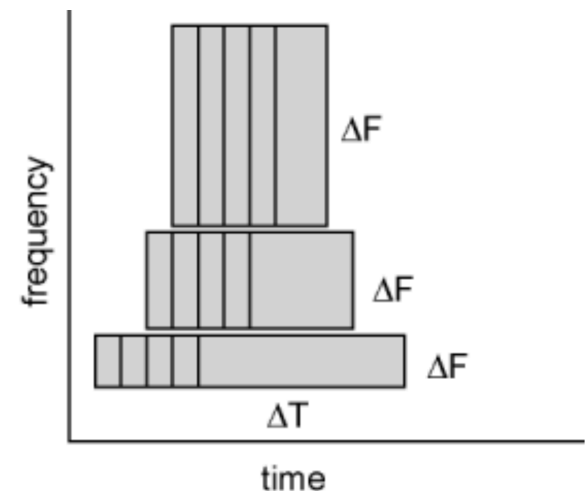
Does it matter??

- Yes
 - The implementations are quite different
 - Critical factor is the control over the time/frequency tradeoff: the better the frequency resolution, the worse the time resolution...

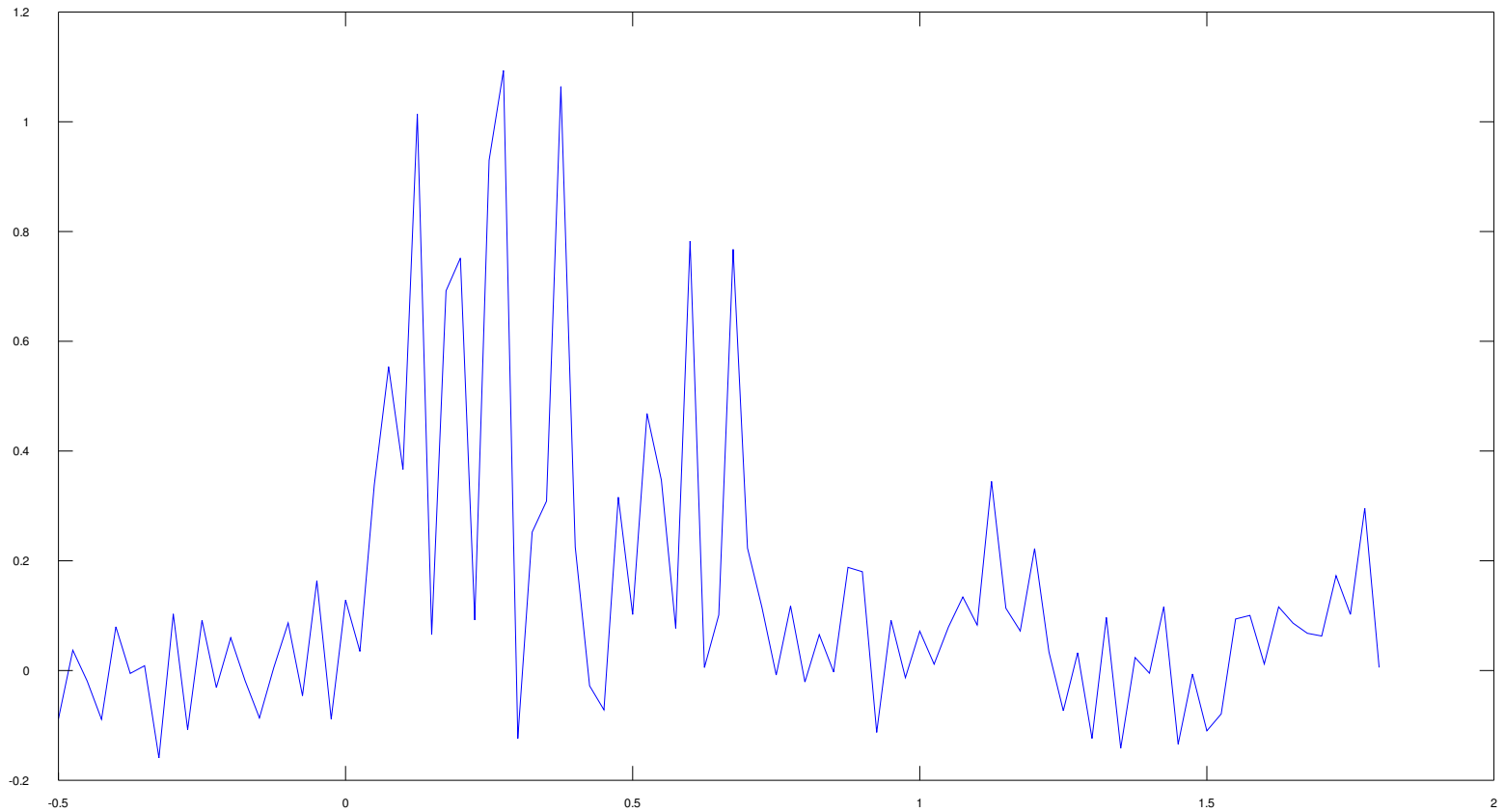
Hanning taper

```
oat.first_level.tf_method           = 'hanning';  
oat.first_level.tf_freq_range      = [5 30];  
oat.first_level.tf_hanning_ncycles = 4;  
oat.first_level.tf_time_step       = 0.025;  
oat.first_level.tf_num_freqs       = 28;
```

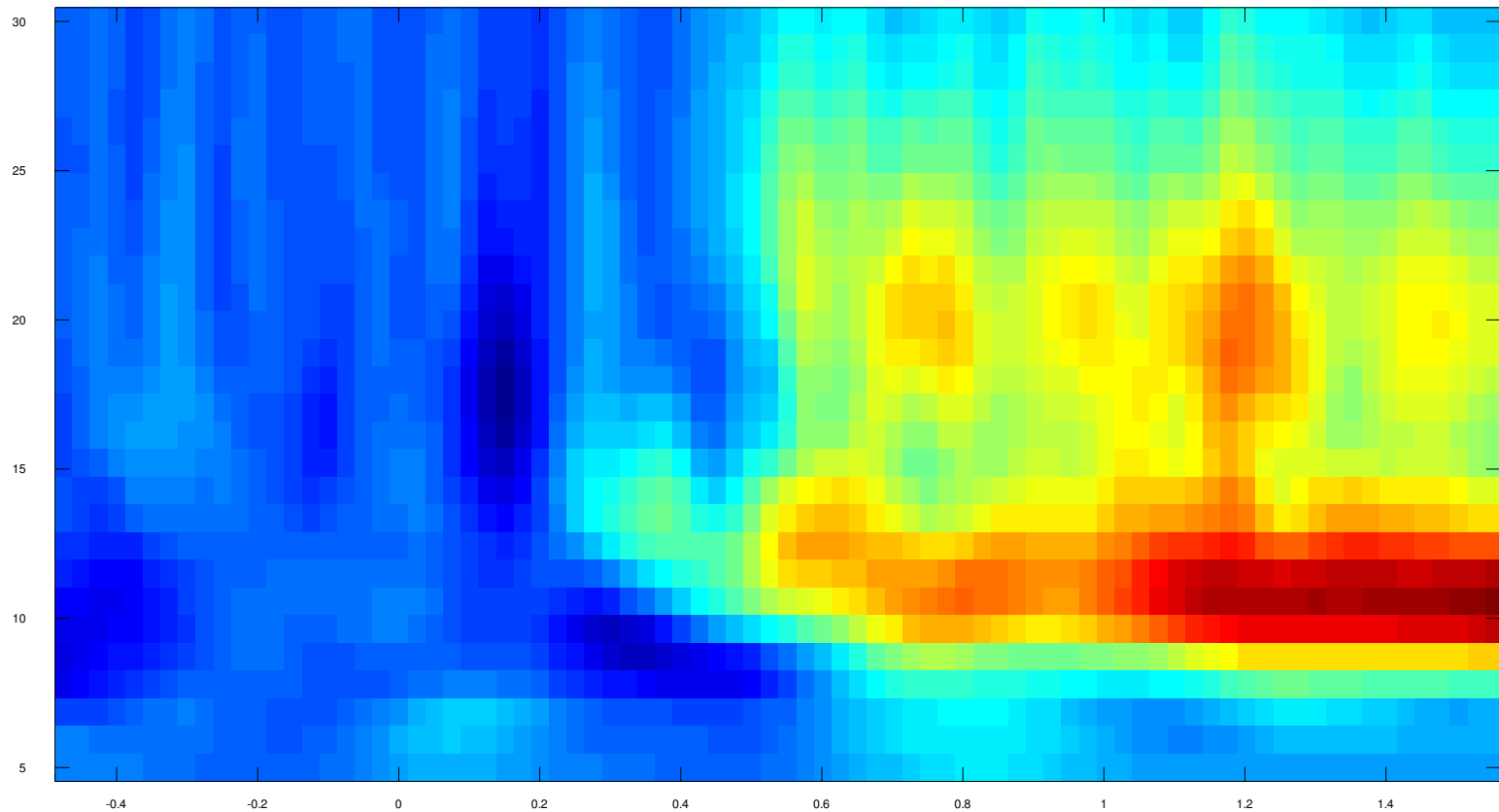
- Uses fieldtrip's *ft_freqanalysis*: <http://fieldtrip.fcdonders.nl/tutorial/timefrequencyanalysis>
- The time-smoothing is set by *tf_hanning_ncycles*
 - E.g. at 4Hz, if choose 4 cycles, then the time-window will be $4 \cdot (1/4) = 1$ s wide
 - The longer this time window, the better the frequency resolution
 - Time window decreases as frequency goes up
- *tf_time_step* is the interval over which the Hanning window is stepped – e.g. if 0.02s, tf data is sampled at 50Hz
- The full Hanning window needs to fit in the data, and you get a value for the centre of that range -> e.g. at 4Hz, the time window is 1s long, so you can't get any values for the first 0.5s of your time-domain data. OSL will only get the TF for the time-range compatible with the lowest frequency you ask for. E.g. your trial is between -1 and 2s, and you ask for 4 cycles at 4Hz. OSL will do the TF between -0.5 and 1.5s.



Single subject vis Cx response to compare the methods. ERF:



Hanning – 4 cycles, 5-30Hz



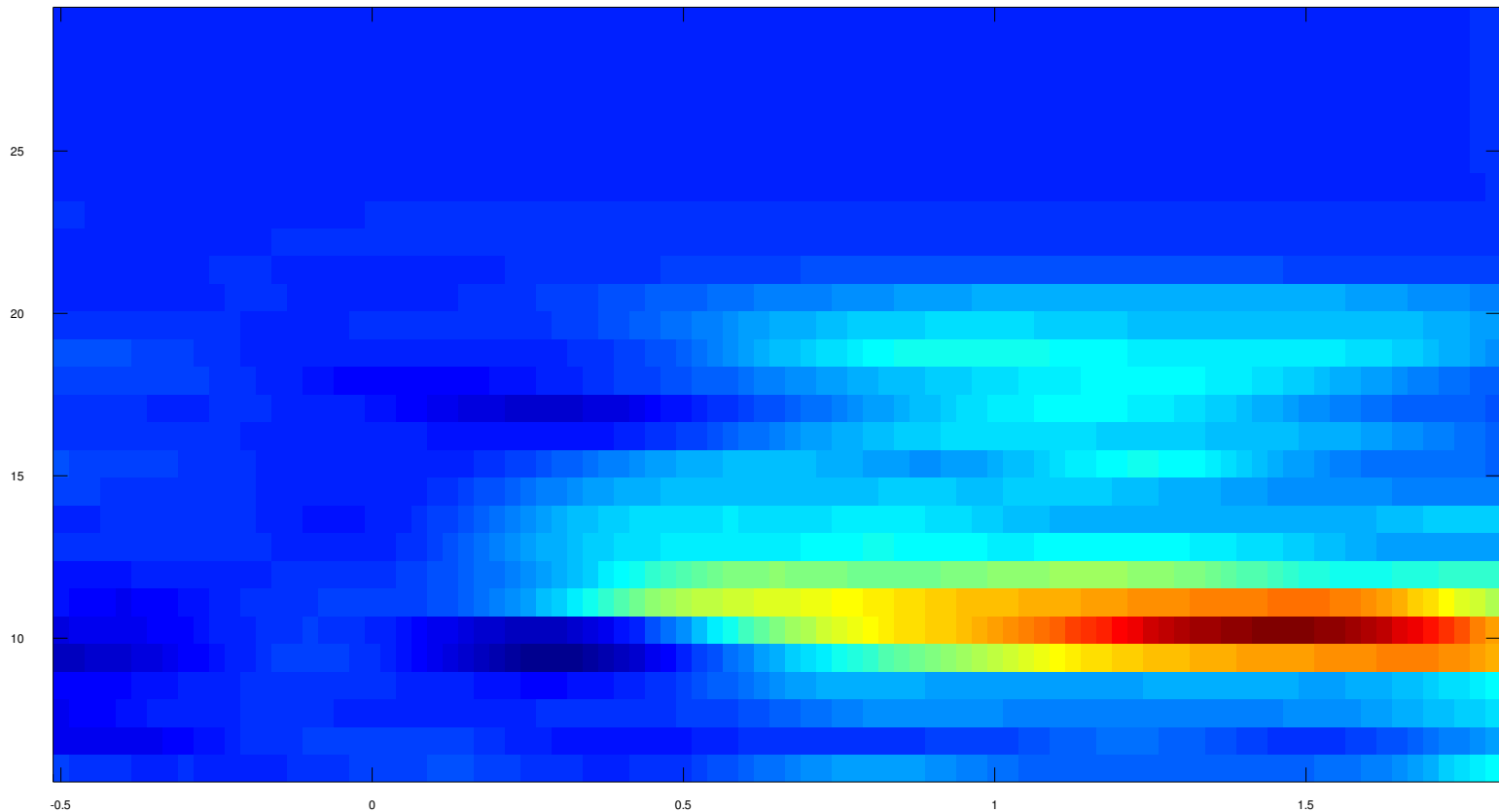
Hilbert transform

```
oat.first_level.tf_method          = 'hilbert';  
oat.first_level.tf_freq_range     = [5 30];  
oat.first_level.tf_num_freqs     = 28;  
oat.first_level.tf_hilbert_freq_res = 2;  
oat.first_level.tf_hilbert_do_bandpass_for_single_freq = 1;  
oat.first_level.tf_time_step      = 0.025;
```

Hilbert transform for power:

- 1) Bandpass filter at the freq of interest
- 2) Apply the hilbert transform to get the analytic signal
- 3) Take the squared amplitude of the analytic signal (power)

Hilbert transform – frequency resolution 2Hz (centre freq ± 1 Hz)



Morlet wavelets

```
oat.first_level.tf_method           = 'morlet';  
oat.first_level.tf_freq_range      = [5 30];  
oat.first_level.tf_time_step       = 0.025;  
oat.first_level.tf_num_freqs       = 28;  
oat.first_level.tf_morlet_factor    = 7;
```

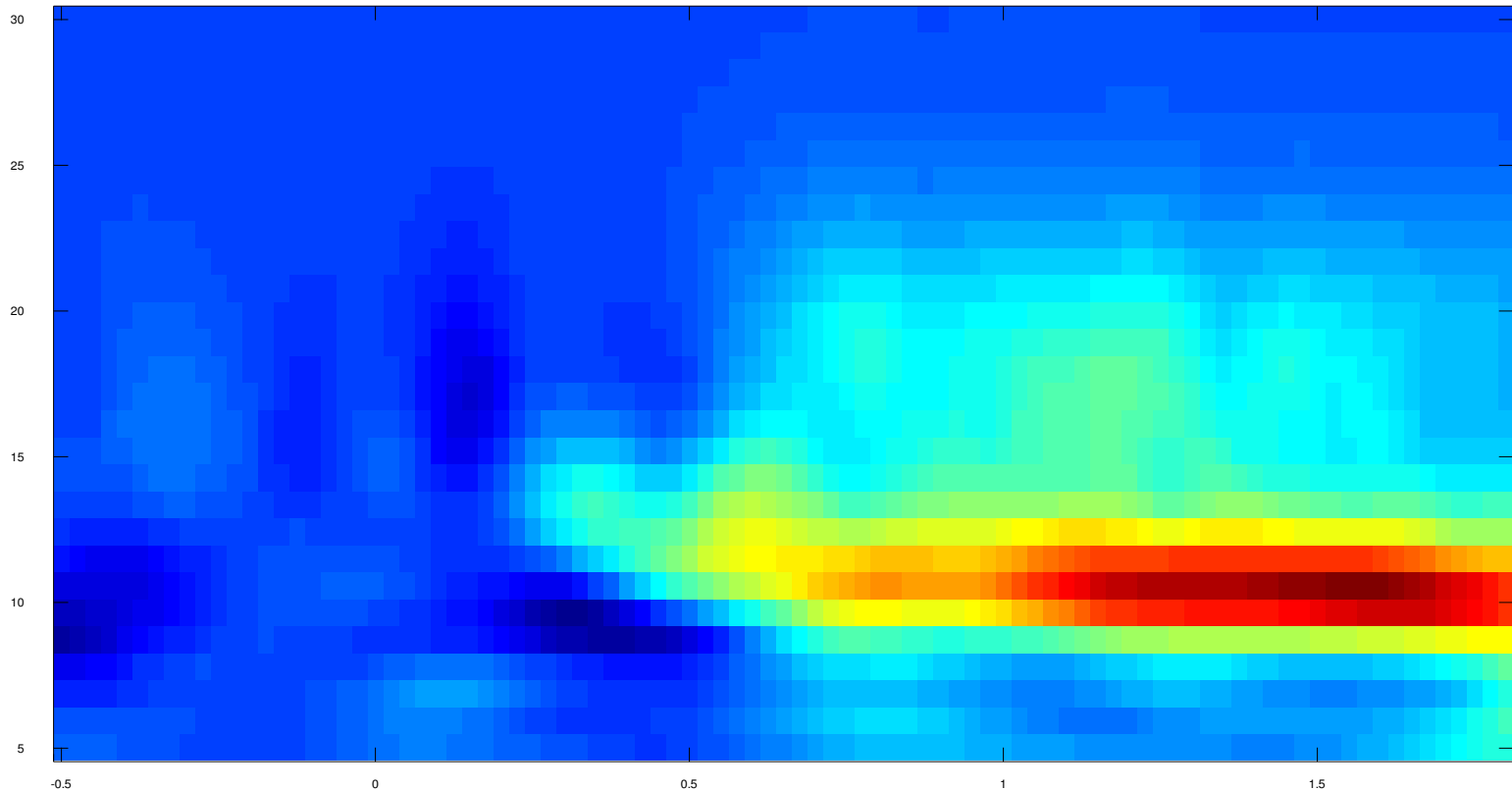
- Convolve the wavelet with the time-domain signal
- Can choose the width of the Gaussian envelope of the wavelet relative to its frequency: Morlet factor
- Morlet factor M determines the tradeoff between time and frequency resolution
- Gaussian in both freq and time



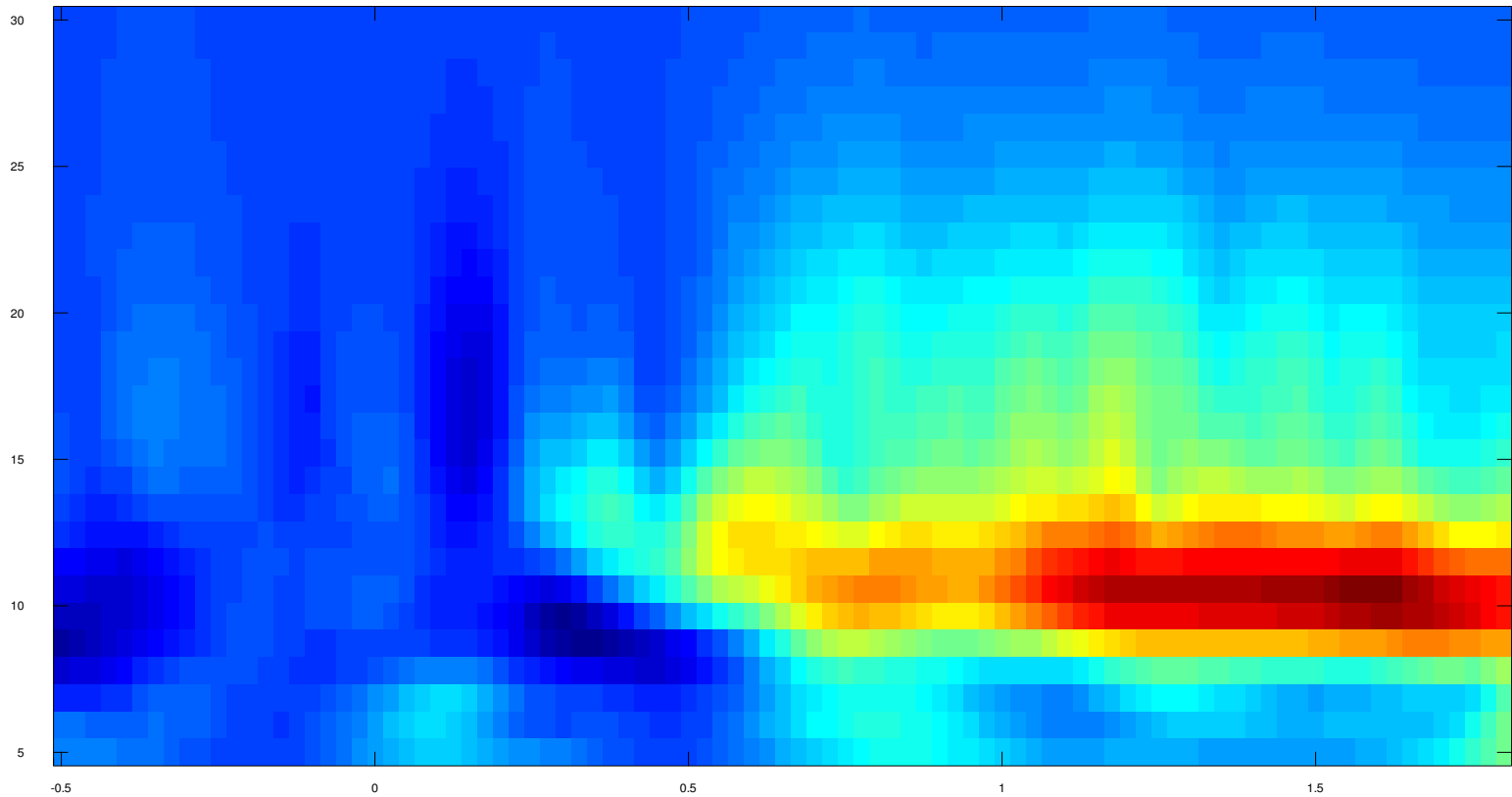
WAVELET

$$freqres = \frac{freq}{M} \quad timeres = \frac{M}{2 \cdot \pi \cdot freq}$$

Morlet wavelets, morlet factor 7



Morlet wavelets, morlet factor 5



Gamma analysis ($> 30\text{Hz}$)

- Really benefits from control over the time/freq tradeoff (see fieldtrip tutorial)
- Using multiple orthogonal tapers (separate TF transform for each taper) allows for multiple independent estimates of the spectrum and increased signal/noise (see wikipedia)
- Not implemented in OSL as would have to adapt beamformer to include a separate weights multiplication for each taper

Gamma analysis – how??

- Do whole-brain analysis using Morlet (or maybe Hanning??)
- To do a multitaper analysis, use the ‘save trialwise’ option in osl to export trialwise *time-domain* data for a gamma-frequency (e.g. 40-120Hz) beamformer (best to use some ROIs or the data will be too big!)
- Then convert to fieldtrip format and use the fieldtrip multi-taper algorithm (‘dpss’)
- See Fieldtrip website for best parameters (10Hz freq smoothing, 5 tapers works quite well)

Checklist

- Is `oat.first_level.tf_freq_range` contained within `oat.source_recon.freq_range`?
- Is `oat.first_level.cope_type` set to 'cope'? ('acope' used for ERF analysis only)
- Is there some 'space' left at the end of each trial for the TF edge effect? `oat.first_level.time_range` should be shorter than `oat.source_recon.time_range` by at least $\frac{1}{2}$ of the wavelength of the lowest frequency, at each end
- If using the hilbert for single-frequency analysis, do you want to do an additional bandpass on top of the source recon bandpass? If so, is `oat.first_level.tf_hilbert_do_bandpass_for_single_freq` set to 1? And is `oat.first_level.tf_freq_range` set?
- Is the down-sampling appropriate? Power time-courses for low frequency oscillations can be sampled quite coarsely, e.g. every 25ms (40Hz; `oat.first_level.tf_time_step` = 0.025), or perhaps lower still