



# Sharper TF Representations of GW150914

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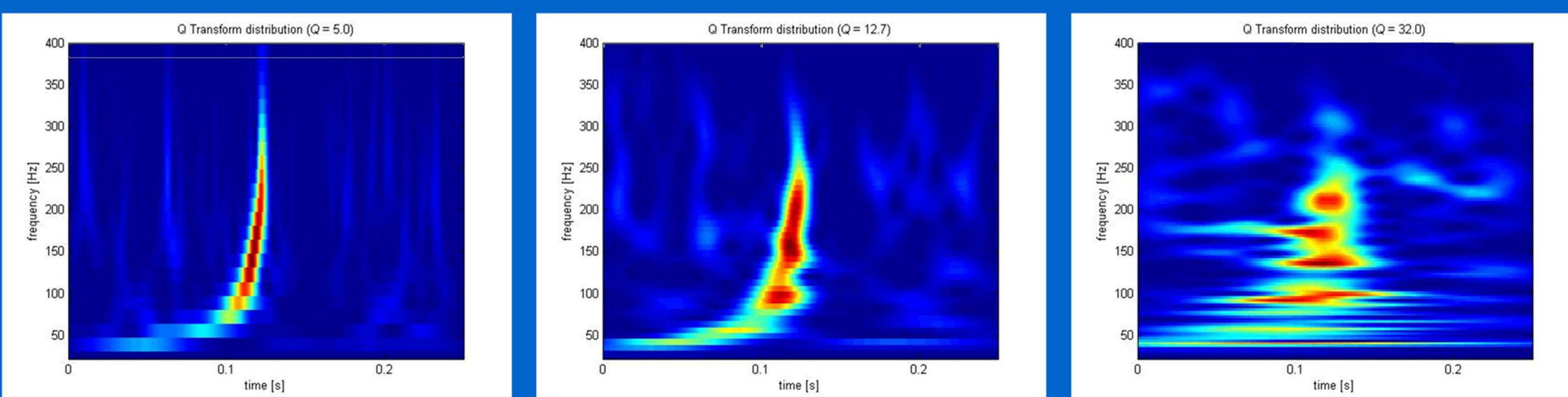
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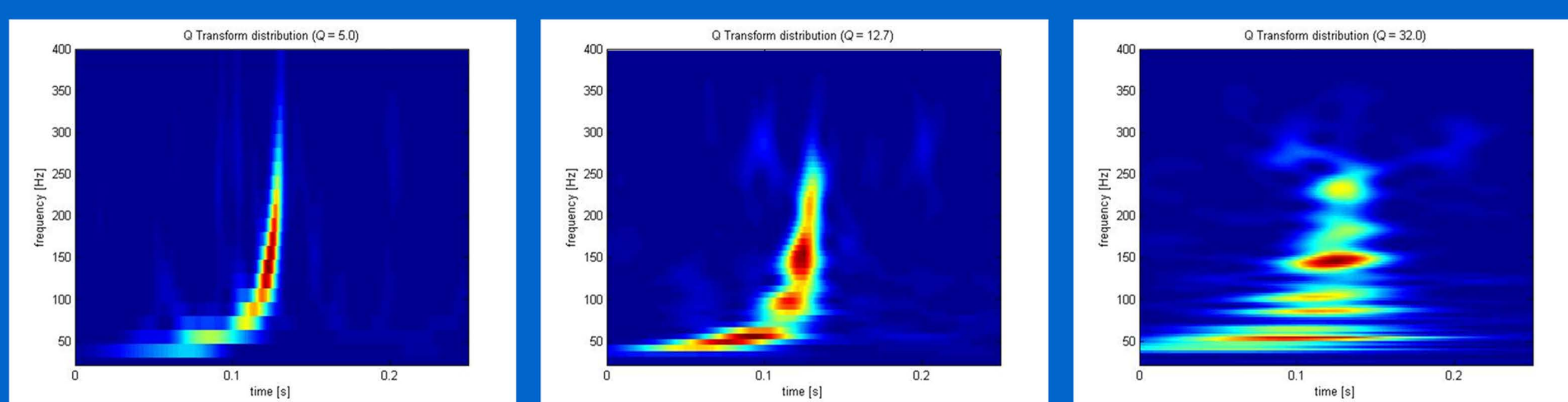
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L1



H1

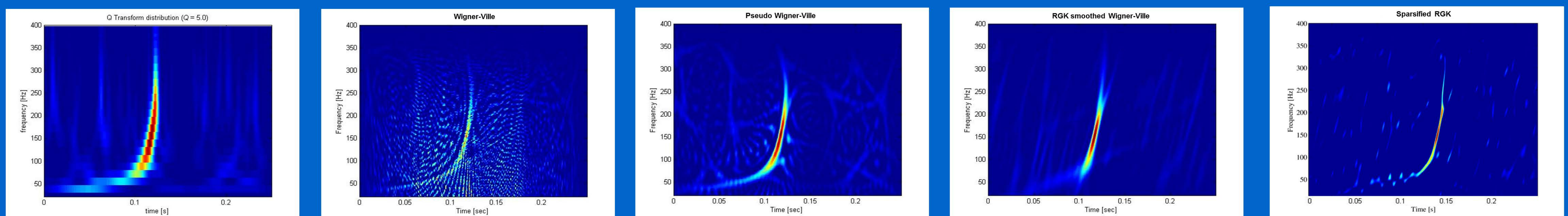


Constant-Q transforms of GW150914 data from L1 and H1 for various Q values.

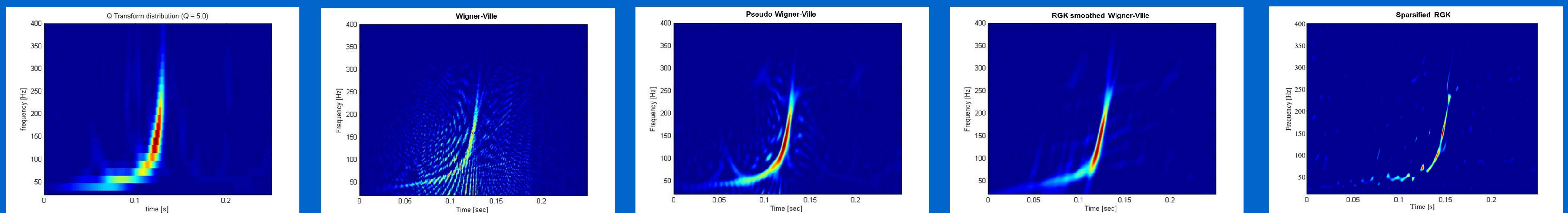
Most time-frequency representations in use today in GW data analysis (including the Q, Omega and Omicron pipelines) are based on the Q-transform [1]. Many alternative TF representations exist. The Wigner-Ville transform features the uniformly largest TF resolution, and nice marginal properties, but is plagued by intermodulation artifacts, due to its nonlinearity [2]. The radial-gaussian kernel (RGK) smoothed Wigner-Ville [3] offers a clever tradeoff between artifact suppression and loss in resolution. Resolution can be restored, in part, using reassignment [4], or enforcing a sparsity constraint [5].

The (sharpest) Q-transform, the Wigner-Ville (WV), and some related TF distribution are visually compared below.

L1

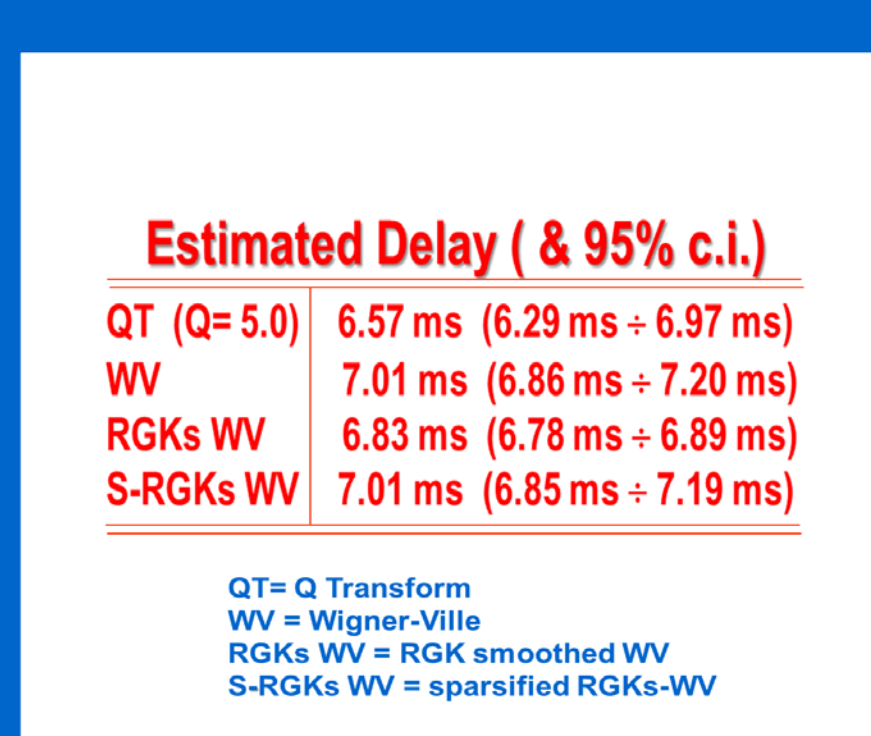
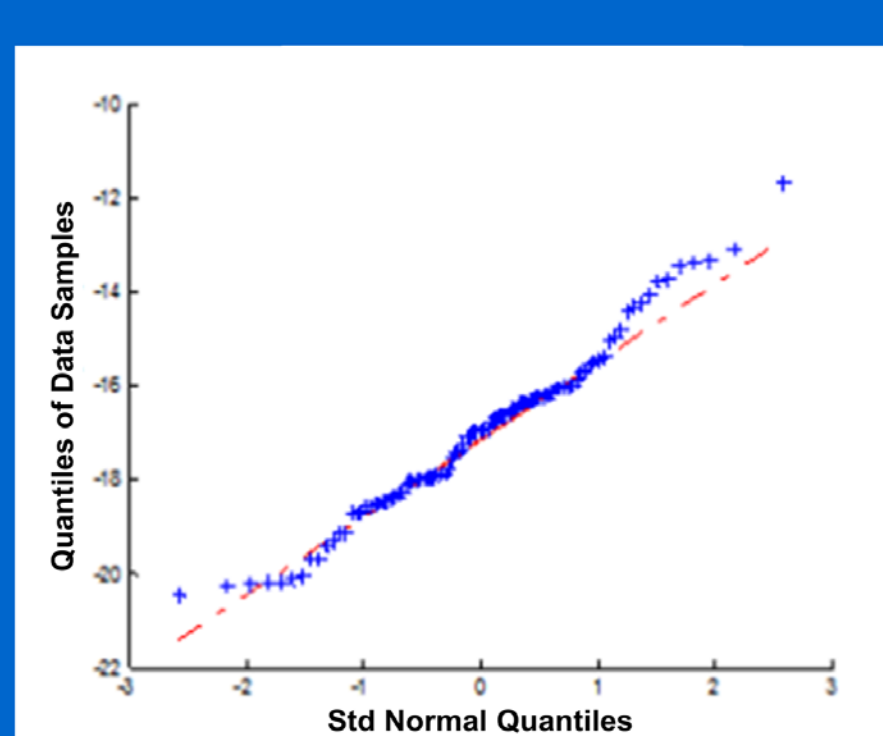
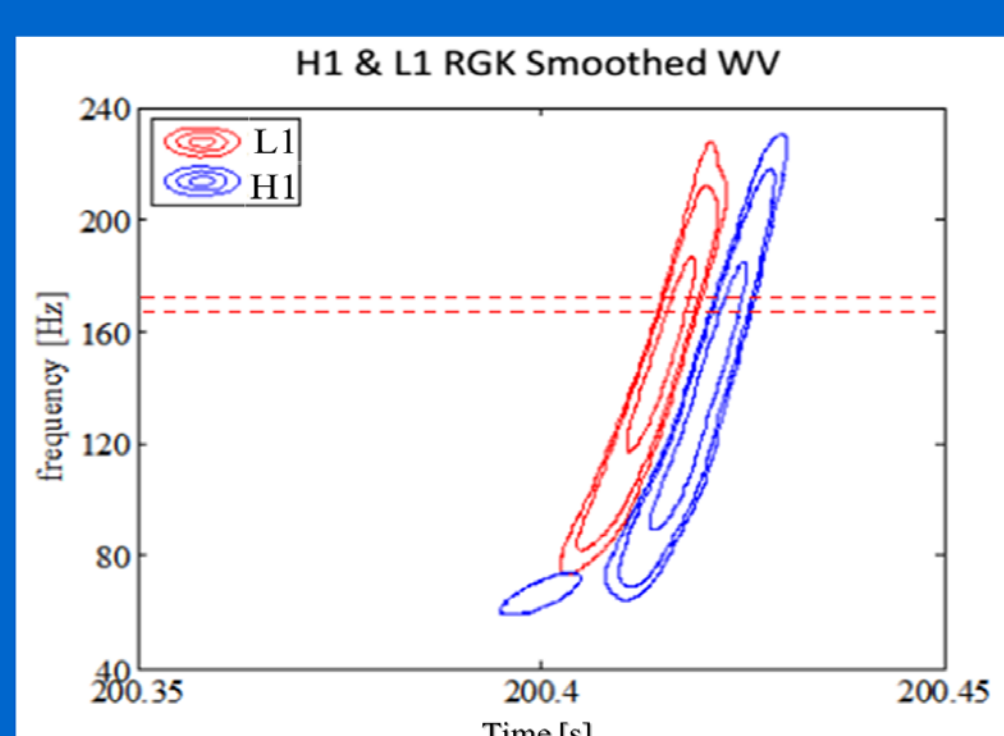


H1

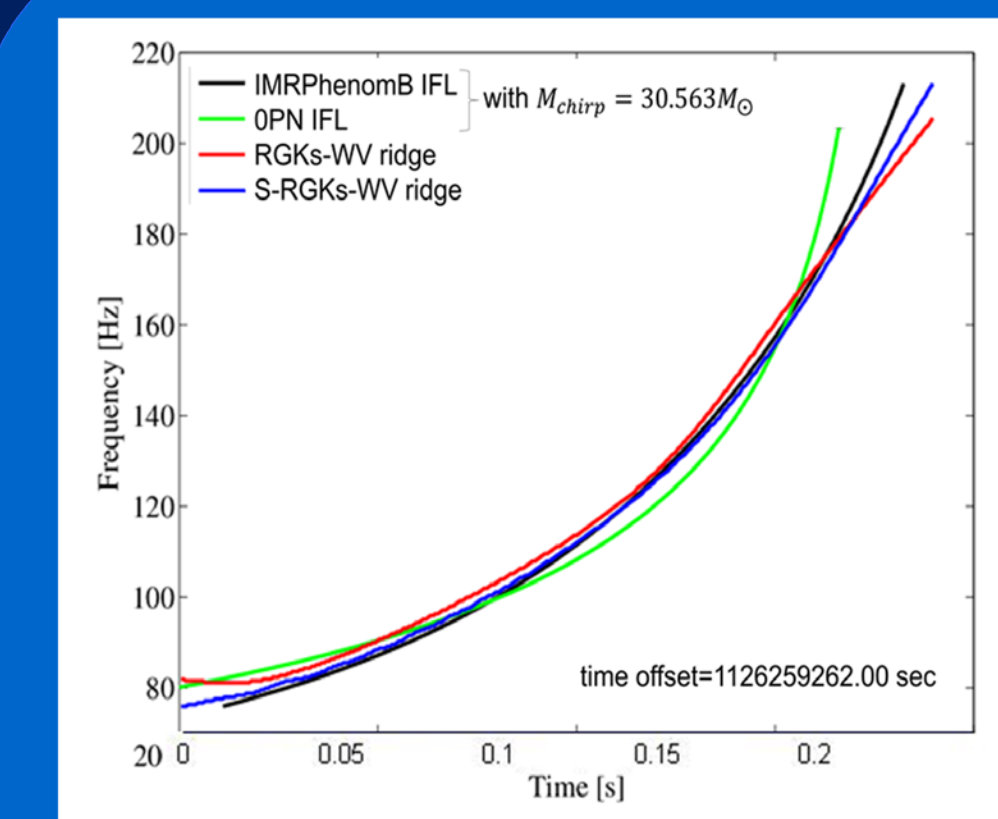


Alternative time-frequency representations of GW150914 (data resampled at 4096 Hz).  
Left to right: Q-transform (Q=5); Wigner-Ville; pseudo Wigner-Ville (121 bin Hanning window); radial-gaussian kernel smoothed Wigner-Ville (a la Baraniuk – Jones); sparsified radial-gaussian kernel smoothed Wigner-Ville.

Improved visual sharpness allows accurate estimation of H1-L1 delay using sub-pixel accurate image co-registration algorithms. It also makes easy to estimate the TF distribution ridge (peak locus), representing the *bona-fide* frequency evolution of the signal. The ridge fits well the instantaneous frequency line computed, e.g., from an IMR-PhenomB model using the official estimated chirp-mass of GW150914.



Arrival time delay estimation based on TF contour co-registration of GW150914 data from L1 and H1.  
Left: the RGK-smoothed WV contour plots of the GW150914 data from L1 and H1 are segmented into 78 horizontal stripes between 70Hz and 250Hz, and for each stripe the time-shift is estimated using the PCR algorithm [5].  
Center: quantile-quantile plot of the time-shift population residuals, showing almost Gaussian behaviour. Confidence intervals are estimated using Efron bootstrap technique. Right: the results for different TF representations.



IMR-PhenomB and OPN frequency evolutions (both with  $M_{\text{chirp}} = 30.563 M_{\odot}$ ) and ridges of the TF RGK-smoothed and sparsified RGK-smoothed Wigner-Ville distributions (GW150914 H1 data)

## References

- [1] S. K. Chatterji et al., "Multiresolution Techniques for the Detection of GW Bursts," CQG **21** (2004) S1809.
- [2] P. Flandrin, *Time-Frequency/Time-Scale Analysis*, Academic Press 1999.
- [3] R.G. Baraniuk and D.L. Jones, "Signal-Dependent Time-Frequency Analysis using a Radially Gaussian Kernel," Signal Proc. **32** (1993) 263.
- [4] P. Flandrin and P. Borgnat, "Time-Frequency Energy Distributions Meet Compressed Sensing," IEEE Trans. **SP-58** (2010) 2974.
- [5] M. Guizar-Sicairos, "Efficient Sub-Pixel Image Registration Algorithm," Optics Lett. **33** (2008) 189.