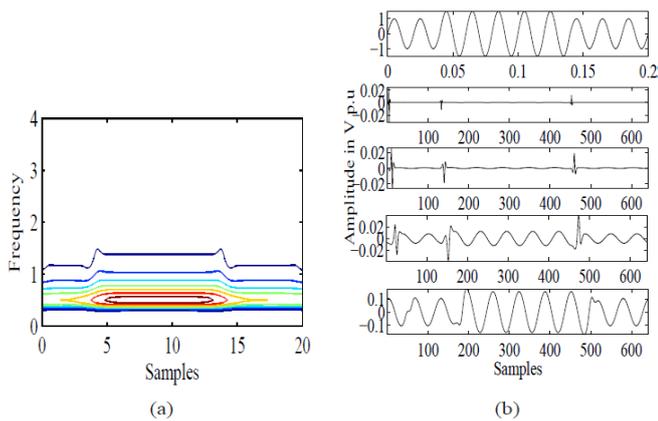


**Fig. 3:** Localization of pure sine wave in (a) S-transform (b) SGWT decomposition

The first decomposition level of each of MODWT shows the exact time of occurrence of the sag. The inception point of sag is shifted along with the initial point of signal towards right due to circular shifting property. The shifting property of MODWT assists the prediction of further inception. The distortions due to sag has been properly identified by the S-contours.

**C. Pure Sinusoidal Wave with Swell**

Similarly, the swell in pure sine wave is detected and localized in the decomposed levels using both S-transform and MODWT in Fig. 4. The point of occurrence of the swell and also the duration can be easily identified in both the cases. The time series analysis of MODWT has given the idea for the further prediction of swell in the subsequent decomposition levels. Moreover, the MODWT provides estimation of disturbance location, which helps in the power system relaying.

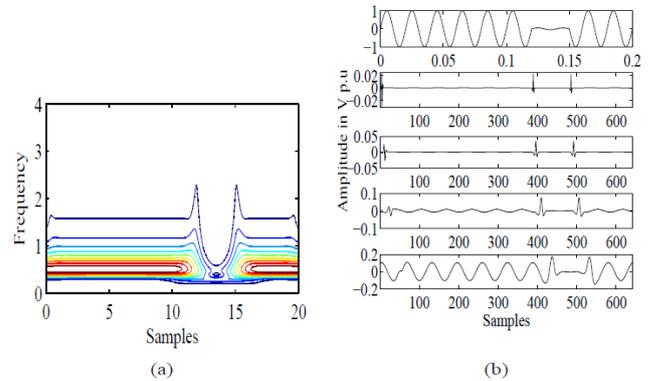


**Fig. 4:** Localization of sine wave with swell in (a) S-transform (b) MODWT decomposition

**D. Pure Sinusoidal Wave with Interruption**

The interruption in pure sine wave is localized and detected at the first decomposition of both MODWT and S-transform. The point of interruption is prominently identified in both MODWT decomposition levels and S-contours given in the Fig.5. One-step-ahead predictions property of MODWT leads

us to the arrival of the onset timing of further interruption in the signal. This one step ahead prediction is suitable for relaying.



**Fig. 5:** Localization of sine wave with interruption in (a) S-transform (b) MODWT decomposition

**E. Pure Sinusoidal Wave with Notch**

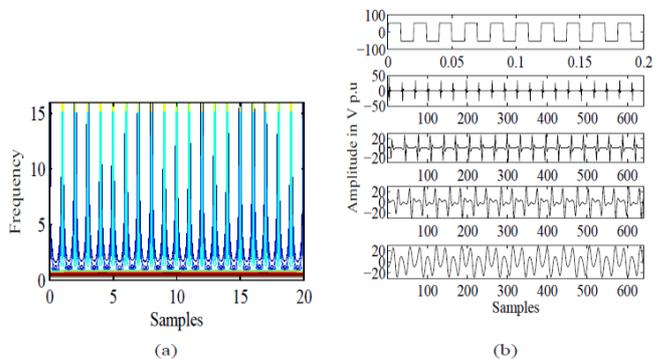
The pure sine wave with the notch at each cycle is considered for analysis. The notches are precisely localized at the decomposition levels of S-transform and MODWT in Fig. 6. The waveforms of MODWT and S-contours have been provided localization of notch.

**F. Pure Sinusoidal Wave with Oscillatory Transients**

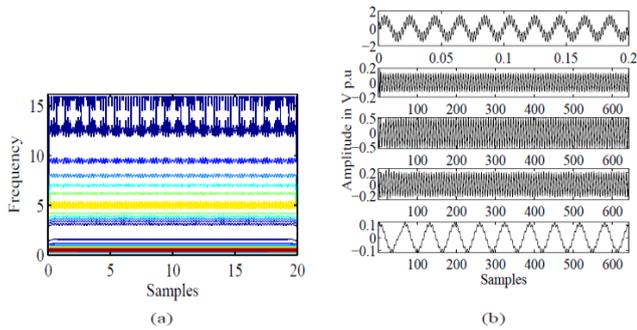
The transient oscillatory signal is analyzed in Fig. 7 with both S-transform contours and MODWT decomposition levels as shown in Fig. 7. The distortion due to transient properly detected in both ST and MODWT.

**G. Pure Sinusoidal Wave with Flicker**

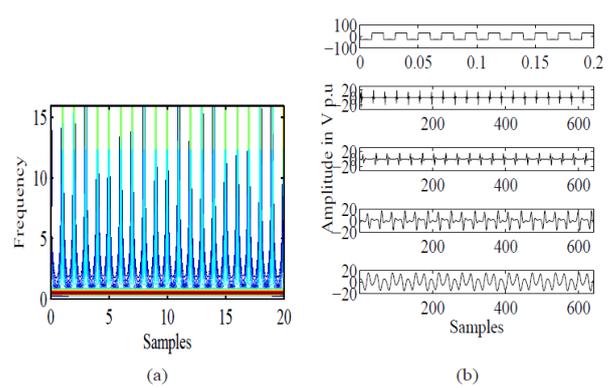
The flicker signal is considered for analysis in Fig. 8. The detection and the localization of flicker are accomplished using S-transform and shifting based MODWT are given in Fig. 8. The MODWT has provided proper localization of flicker at all levels of decomposition like ST.



**Fig. 6:** Localization of sine wave with notch in (a) S-transform (b) SGWT decomposition



**Fig. 7:** Localization of sine wave with oscillatory transient in (a) S-transform (b) MODWT decomposition



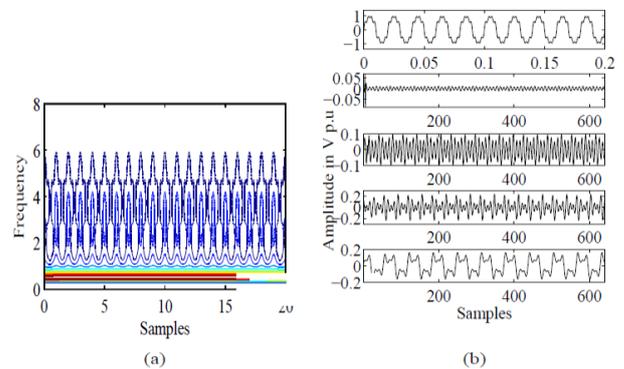
**Fig. 9:** Localization of sine wave with spike in (a) S-transform (b) MODWT decomposition

**H. Pure Sinusoidal Wave with Spike**

Similar to the notch signal, the spike at each cycle of pure sine wave has been considered for analysis. The localization of spike has done satisfactorily with both S-contours and MODWT decomposition levels as shown in Fig. 9.

**I. Pure Sinusoidal Wave with Harmonics**

The harmonics with fundamental is analysed in Fig. 10 with S-transform and MODWT. From the Figs. 10 and 2, it can be observe that for sinusoidal signal the magnitude of 1<sup>st</sup> two levels are almost zero and for harmonic signal, 1<sup>st</sup> two levels have some magnitude both in MODWT. The presence of harmonic is properly localized by S-transform contours.



**Fig. 10:** Localization of sine wave with harmonics in (a) S-transform (b) MODWT decomposition

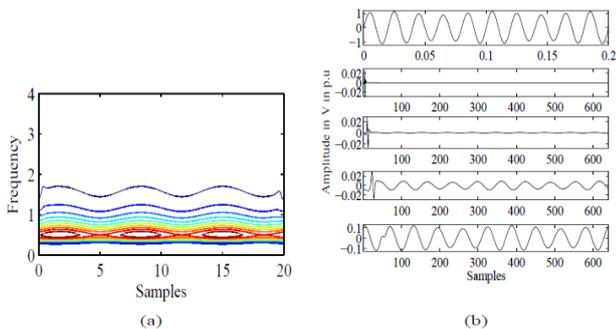
**J. Pure Sinusoidal Wave with Sag and Harmonics**

The distortions of a pure sine wave due the sag and harmonic are localized in the decomposition levels of S-contours and MODWT as shown in Fig. 11.

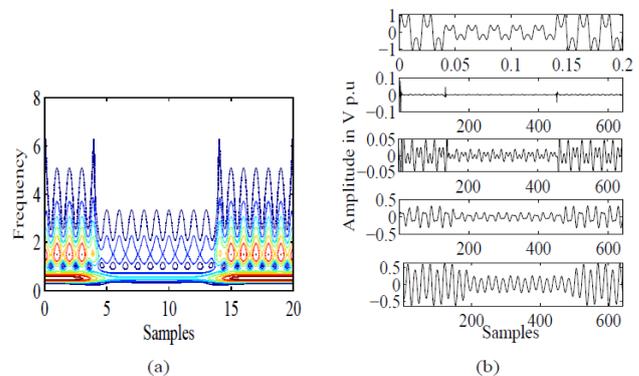
**K. Pure Sinusoidal Wave with Swell and Harmonics**

Similarly, the swell with harmonic signal is considered for analysis. The swell with harmonic is detected and localized at the decomposition levels of MODWT decomposition and S-transform as shown in Fig.12.

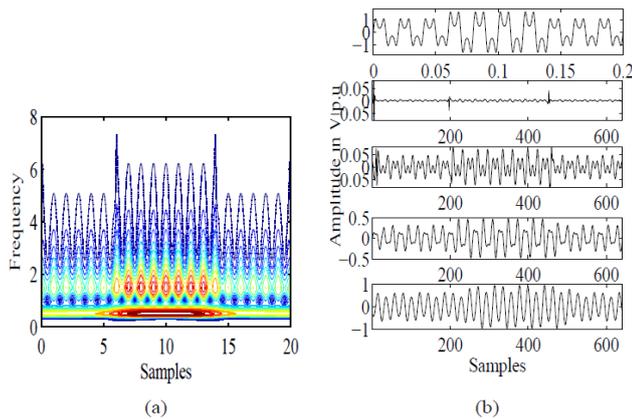
The aforementioned PQ signals are simulated with a core-i5,2.40 GHz under MATLAB environment. The MODWT use a low-pass filter and a high-pass filter (quadrature mirror filter) to split the frequency band of these aforementioned input signals in order to get scaling and wavelet coefficients, respectively, but there is no down sampling in MODWT. Though S-transform is a common technique for analysis of signals, it is very complex. It suffers from computational burden and the system becomes sluggish. The shifting property of MODWT can be used for future prediction of occurrence of disturbances.



**Fig. 8:** Localization of sine wave with flicker in (a) S-transform (b) MODWT decomposition



**Fig. 11:** Localization of sine wave with sag and harmonics in (a) S-transform (b) MODWT decomposition



**Fig. 12:** Localization of sine wave with swell and harmonic in (a) S-transform (b) MODWT decomposition

## V. CONCLUSION

The Wavelet Transform is a significant tool for the analysis in PQ environment disturbances. The S-transform and the time series based MODWT have been used to localize the PQDs. Ten types of PQ disturbances along with the sinusoidal voltage signal wave form are properly analyzed with the MODWT. Though S-transform is good technique for analysis of signals but it suffers from computational burden. The computational complexity of S-transform makes the system sluggish. The down sampling free MODWT provides the proper localization of PQDs along with the shifting. Elimination of down sampling overcomes the restriction in the choice of signal length. MODWT is simple and requires less running time as compared to S-transform.

## REFERENCES

- [1] M. Valtierra-Rodriguez, R. de Jesus Romero-Troncoso, R. A. Osornio-Rios, and A. Garcia-Perez, "Detection and classification of single and combined power quality disturbances using neural networks," *Industrial Electronics, IEEE Transactions on*, vol. 61, no. 5, pp. 2473–2482, 2014.
- [2] T. Abdel-Galil, E. El-Saadany, A. Youssef, and M. Salama, "Disturbance classification using hidden markov models and vector quantization," *Power Delivery, IEEE Transactions on*, vol. 20, no. 3, pp. 2129–2135, 2005.
- [3] L. Coppola, Q. Liu, S. Buso, D. Boroyevich, and A. Bell, "Wavelet transform as an alternative to the short-time fourier transform for the study of conducted noise in power electronics," *Industrial Electronics, IEEE Transactions on*, vol. 55, no. 2, pp. 880–887, 2008.
- [4] Z.-L. Gaing, "Wavelet-based neural network for power disturbance recognition and classification," *Power Delivery, IEEE Transactions on*, vol. 19, no. 4, pp. 1560–1568, 2004.
- [5] J. G. Decanini, M. S. Tonelli-Neto, F. C. Malange, and C. R. Minussi, "Detection and classification of voltage disturbances using a fuzzy-artmap-wavelet network," *Electric Power Systems Research*, vol. 81, no. 12, pp. 2057–2065, 2011.
- [6] J. Barros, M. de Apraiz, and R. I. Diego, "A virtual measurement instrument for electrical power quality analysis using wavelets," *Measurement*, vol. 42, no. 2, pp. 298–307, 2009.
- [7] C. Bhende, S. Mishra, and B. Panigrahi, "Detection and classification of power quality disturbances using s-transform and modular neural network," *Electric Power Systems Research*, vol. 78, no. 1, pp. 122–128, 2008.
- [8] T. Nguyen and Y. Liao, "Power quality disturbance classification utilizing s-transform and binary feature matrix method," *Electric Power Systems Research*, vol. 79, no. 4, pp. 569–575, 2009.
- [9] M. Uyar, S. Yildirim, and M. T. Gencoglu, "An expert system based on s-transform and neural network for automatic classification of power quality disturbances," *Expert Systems with Applications*, vol. 36, no. 3, pp. 5962–5975, 2009.
- [10] A. A. Abdelsalam, A. A. Eldesouky, and A. A. Sallam, "Characterization of power quality disturbances using hybrid technique of linear kalman filter and fuzzy-expert system," *Electric power systems Research*, vol. 83, no. 1, pp. 41–50, 2012.
- [11] A. Gaouda, M. Salama, M. Sultan, A. Chikhani, *et al.*, "Power quality detection and classification using wavelet-multiresolution signal decomposition," *IEEE Transactions on Power Delivery*, vol. 14, no. 4, pp. 1469–1476, 1999.
- [12] L. Angrisani, P. Daponte, M. Apuzzo, and A. Testa, "A measurement method based on the wavelet transform for power quality analysis," *Power Delivery, IEEE Transactions on*, vol. 13, no. 4, pp. 990–998, 1998.
- [13] B. Biswal and S. Mishra, "Power signal disturbance identification and classification using a modified frequency slice wavelet transform," *Generation, Transmission & Distribution, IET*, vol. 8, no. 2, pp. 353–362, 2014.
- [14] A. G. Hafez, E. Ghamry, H. Yayama, and K. Yumoto, "A wavelet spectral analysis technique for automatic detection of geomagnetic sudden commencements," *Geoscience and Remote Sensing, IEEE Transactions on*, vol. 50, no. 11, pp. 4503–4512, 2012.
- [15] D. B. Percival and A. T. Walden, "Wavelet methods for time series analysis (cambridge series in statistical and probabilistic mathematics)," 2000.
- [16] M. J. Shensa, "The discrete wavelet transform: wedding the a trous and mallat algorithms," *Signal Processing, IEEE Transactions on*, vol. 40, no. 10, pp. 2464–2482, 1992.

- [17] G. P. Nason and B. W. Silverman, "The stationary wavelet transform and some statistical applications," *LECTURE NOTES IN STATISTICS-NEW YORK-SPRINGER VERLAG-*, pp. 281–281, 1995.
- [18] R. Coifman and D. Donoho, "Translation-invariant denoising, in wavelets and statistics(a. antoniadis, ed.)," 1995.
- [20] J.-C. Pesquet, H. Krim, and H. Carfantan, "Time-invariant orthonormal wavelet representations," *Signal Processing, IEEE Transactions on*, vol. 44, no. 8, pp. 1964–1970, 1996.
- [21] C.-Y. Lee and Y.-X. Shen, "Optimal feature selection for power-quality disturbances classification," *Power Delivery, IEEE Transactions on*, vol. 26, no. 4, pp. 2342–2351, 2011.
- [22] S. Upadhyaya and S. Mohanty, "Power quality disturbance detection using wavelet based signal processing," in *India Conference (INDICON), 2013 Annual IEEE*, pp. 1–6, IEEE, 2013.