

**EMPIRICAL MODE DECOMPOSITION
WITH ANALYTIC SIGNAL FOR POWER-
QUALITY ASSESSMENT**

A DISSERTATION
SUBMITTED IN PARTIAL FULFILLMENT OF THE REQUIREMENTS
FOR THE AWARD OF THE DEGREE
OF

**MASTER OF TECHNOLOGY
IN
SIGNAL PROCESSING AND DIGITAL DESIGN**

Submitted by

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Certificate

This is to certify that the dissertation title “**Empirical Mode Decomposition with Analytic Signal for Power- Quality Assessment**” submitted by **Mr Amarendra Kumar Mishra**, Roll. No. *2K13/SPD/02*, in partial fulfilment for the award of degree of Master of Technology in Signal Processing & Digital Design at **Delhi Technological University, Delhi**, is a bonafide record of student’s own work carried out by him under my supervision and guidance in the academic session 2014-15. To the best of my belief and knowledge the matter embodied in dissertation has not been submitted for the award of any other degree or certificate in this or any other university or institute.

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Abbreviations

EMD	Empirical Mode Decomposition
IMF	Intrinsic Mode function
PQ	Power Quality
DSP	Digital Signal Processing
FT	Fourier Transform
STFT	Short Time Fourier Transform
WT	Wavelet Transform
FFT	Fast Fourier Transform
IF	Instantaneous Frequency
HT	Hilbert Transform
DFT	Discrete Fourier Transform
DHT	Discrete Hilbert Transform
IDFT	Inverse Discrete Fourier Transform
SDA	Standard Deviation of Amplitude
SDP	Standard Deviation of Phase
PNN	Probabilistic Neural Network
ANN	Artificial Neural Network
ST	S-Transform
LDA	Linear Discriminant Analysis
KNN	K-Nearest neighbour
RBFNN	Radial Basis Function Neural network

Abstract

This thesis presents a wavelet transform method in combination with empirical mode decomposition (EMD) for power quality (PQ) events assesment. EMD is a time frequency analysis that decomposes the complex signals into several instrinsic mode functions(IMF). As the PQ events are nonstationary, instantaneous parameters have been extracted from these IMFs. We extracted three parameters from IMFs and then used KNN classifier for assesment of PQ disturbance. We compared the assesment of PQ events by extracting the features using Hilbert transform method.

A maximum classification accuracy of 97.25 % in both the cases (Wavelet transform method and Hilbert transform method).