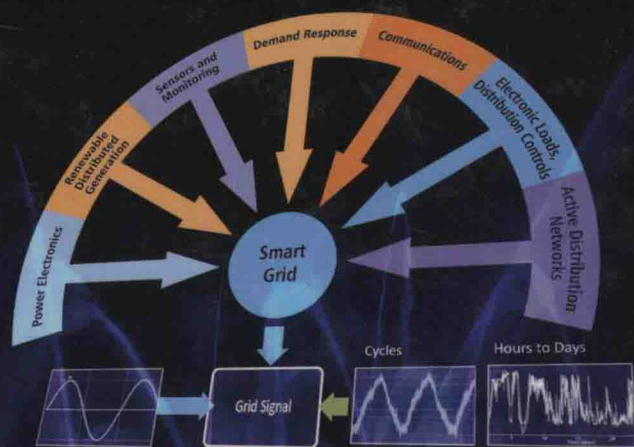


# Power Systems Signal Processing for Smart Grids



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# POWER SYSTEMS SIGNAL PROCESSING FOR SMART GRIDS

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# About the Authors



**Paulo Fernando Ribeiro** achieved a PhD in Electrical Engineering from the University of Manchester and has worked in academia, industrial management, electric companies and research institutes in the fields of power systems, power electronics and power quality engineering, transmission system planning, strategic studies for power utilities, transmission and distribution system modeling, space power systems, power electronics for renewable generation, flexible AC transmission systems, signal processing applied to power systems, superconducting magnetic energy storage systems and smart grids. His professional experience includes teaching at US, European and Brazilian universities, and he has held research positions with the Center for Advanced Power Systems at Florida State University, EPRI and NASA. He is a Distinguished Lecturer and Fellow of the IEEE and IET and has written over 200 peer-reviewed papers, chapters and technical books. He is an active member of IEC, CIGRE and IEEE technical committees, including the chair of the IEEE Task Force on Probabilistic and Time-Varying Aspects of Harmonics and membership of the IEC 77A Working Group 9 (Power Quality Measurement Methods) and the CIGRE C4.112 (Guidelines for Power Quality Monitoring: Measurement Locations, Processing and Presentation of Data).



**Carlos Augusto Duque** achieved a BS degree in Electrical Engineering from the Federal University of Juiz de Fora, Brazil in 1986, and a MSc and PhD degree from the Catholic University of Rio de Janeiro in 1990 and 1997, respectively, in Electrical Engineering. Since 1989 he has been a Professor in the Electrical Engineering Faculty at Federal University of Juiz de Fora (UFJF), Brazil. During 2007 and 2008 he joined the Center for Advanced Power Systems (CAPS) at Florida State University as a visiting researcher. His major research works are in the area of signal processing for power systems including the development of a power quality co-processor, the time-varying harmonic analyzer and signal processing for synchophasor estimation. He is currently the head of the Research Group of Signal Processing Applied to Power Systems, UFJF and associated researcher of the Brazil National Institute of Energy. He has written over 120 peer-reviewed papers and chapters of technical books, and is the author of several patents.



**Paulo Márcio da Silveira** achieved a DSc degree in Electrical Engineering from the Federal University of Santa Catarina, Brazil in 2001. He has industrial design, academic and research experience in power system equipment, substation, protection and power quality issues, operation of power systems studies and development of protective devices and power quality monitoring algorithms for power utilities applications. He has conducted research on transmission and distribution system modeling, monitoring, measurement and signal processing for fault identification, fault location, protective relays, power quality and energy metering. He has worked as a consultant on power quality and power system protection, conducting research for different Brazilian utilities through the Brazilian Electricity Regulatory Agency (ANEEL). Dr Silveira was a visiting researcher at the Center for Advanced Power System at the Florida State University in Tallahassee, US in 2007, when he worked with real-time digital simulations. He is an associate professor at the Itajubá Federal University (UNIFEI) in Brazil, where currently he is also the coordinator of a post-graduate course on Power System Protection, the coordinator of the Electrical Compatibility for Smart Grid Study Center (CERIn), and the head of the Electrical and Energy System Institute of the UNIFEI.



**Augusto Santiago Cerqueira** achieved a DSc degree in Electrical Engineering at the Federal University of Rio de Janeiro, Brazil in 2002. In 2004, he began his academic and research activities at the Federal University of Juiz de Fora (UFJF), where he is currently an associate professor. His academic and research activities mainly involve electronic instrumentation, digital signal processing, computational intelligence for power systems and experimental high-energy physics. He has participated in and coordinated research projects related to power quality issues, applying signal processing and computational intelligence techniques for power quality monitoring and diagnosis. He is coordinator of the UFJF group at the Large Hadron Collider at CERN (European Organization for Nuclear Research), which conduct research into experimental high-energy physics instrumentation, signal processing and computational intelligence mainly for signal detection and estimation.

# Preface

This book has grown out of a cooperation between friends who have a common interest, expertise and passion for power systems (PS) and signal processing (SP). It has evolved as a consequence of SP projects applied to power quality (PQ) and power systems in general.

The rapid growth of computational power associated with the cross-fertilization of applications and use of SP for analysis and diagnosis of system performance has led to unprecedented development of new methods, theories and models.

The authors have come to appreciate the potential for much wider applications of SP, prompted in particular by the modernization of electric power systems via the current and comprehensive developments associated with the implementation of smart grid (SG) technologies.

The increasing complexity of the electric grid requires intensive and comprehensive signal monitoring followed by the necessary signal processing for characterizing, identifying, diagnosing and protecting and also for a more accurate investigation of the nature of certain phenomena and events. SP can also be used for predicting and anticipating system behavior.

For electrical engineering SP is a vital tool for clarifying, separating, decomposing and revealing different aspects and dimensions of the complex physical reality of the operation of electrical systems, in which different phenomena are usually intricately and intrinsically aggregated and not trivially resolved.

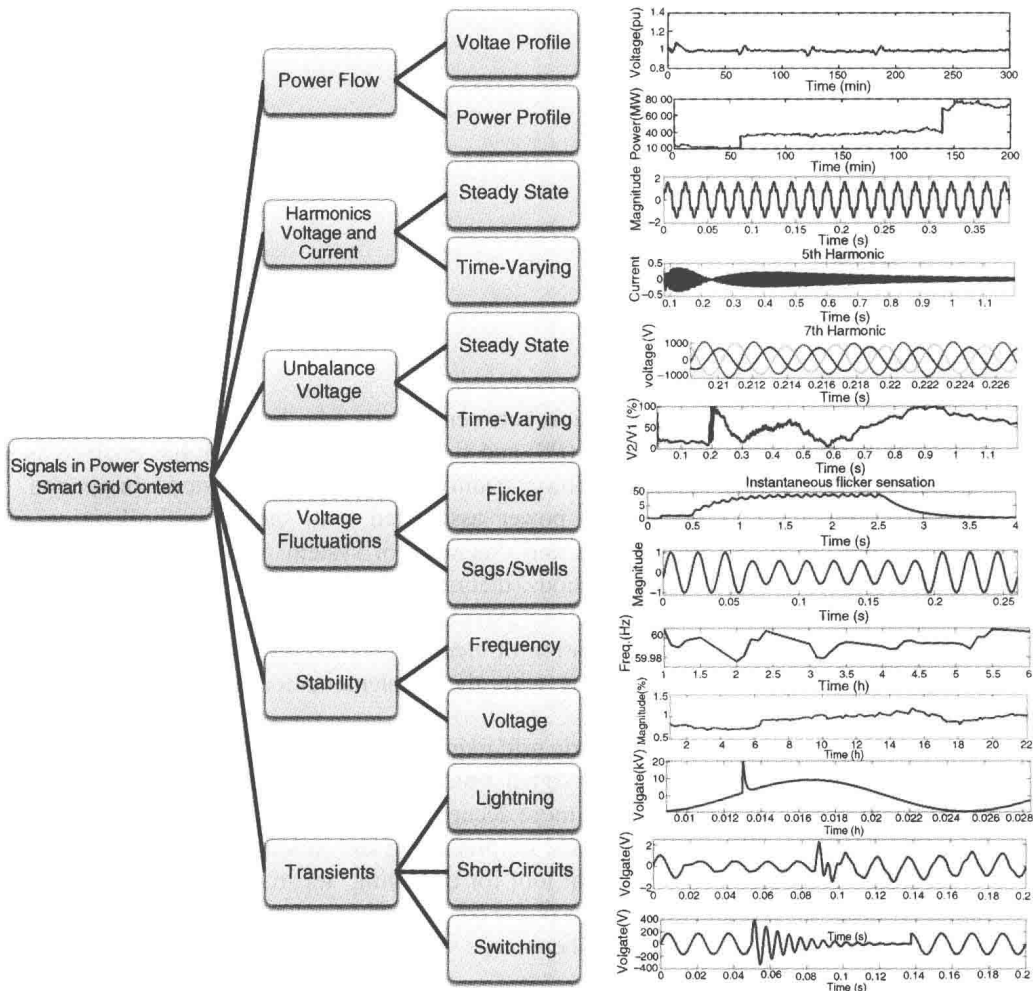
SP can be qualified by the analytical aspects of the electrical systems, and can help to expose and characterize the diversity, unity, meaning and intrinsic purpose of electrical parameters, system phenomena and events.

As the electric grid becomes more complex, modeling and simulation become less capable of capturing the influence of the multitude of independent and intertwined components within the network. SP deals with the actual system and not with modeling abstraction or reduction (although it may be used in connection with simulations), so may clarify aspects of the whole through a multiplicity of analytical tools. Consequently, SP allows the engineer to detect and measure the behavior and true nature of the electric grid.

Today, the vast majority of analog signals are converted to digital signals. In the context of electrical systems, this conversion is carried out by numerous secondary smart digital devices that perform the tasks of controlling, metering, protecting, supervising or communicating with other components of the system. Moreover, the quality of such smart devices is enhanced by their ability to perform digital signal processing (DSP).

The term DSP is used to describe the mathematics, algorithms and techniques used to manipulate signals after they have been converted into a convenient digital form in order to





**Figure 1** Power systems signals in the context of smart grids.

address a wide variety of needs such as the enhancement of visual images, recognition and generation of speech and compression of data for storage and transmission [1].

The aim of this book is to further promote the use of DSP within power systems, and to expand its application in the context of smart grids. Various techniques are presented, discussed and applied to typical and expected system conditions. Figure 1 illustrates a sample of the gamma of waveforms of typical power systems signals in a context of traditional and smart-grid power system environments.

Chapter 1 describes the motivation for the use of signal processing in different applications of power systems in the context of the smart grids of the future. A wide variety of digital measurements and data analysis techniques required to deliver diagnostic solutions and correlations is provided.

Chapter 2 provides a comprehensive list of power system events and phenomena in terms of time-varying voltage and current signals, characterizing these in terms of magnitude, phase

and waveform. It will become apparent that many signals can be represented by a mathematical expression (e.g. exponential DC, faults, waveform distortions).

Chapter 3 describes the different aspects as related to voltage transformers, current transformers, analog filters and analog to digital converters. These components are sources of noise and errors, and impose speed constraints. Due to the lack of information about acquisition systems for electric power signals, this chapter addresses a few of the important demands that are generally neglected in common signal processing literature.

Chapter 4 covers discrete transforms essential in the analysis and synthesis of power systems signal processing. The chapter describes the discrete-time Fourier transform (DTFT), discrete Fourier transform (DFT) and z-transform, as well as a summary of the continuous transforms. Although these transforms are widely treated in several textbooks, the focus of the authors is on specific and common power systems applications.

Chapter 5 covers basic aspects of power system signal processing. These include digital signal operators (delay, adders, multipliers), digital signal operations (modulation, filtering, correlation and convolution), finite impulse response filters and infinite impulse response filters. Several power systems applications are used to illustrate these concepts.

Chapter 6 covers the multirate and sampling frequency alterations, a common time-variant method used in power systems to change the sampling frequency or to analyze a signal. Such an example is using filter banks or wavelet transform. (Filter banks and wavelet transform are covered in Chapter 9, but the digital principles for the implementation of these structures are presented in Chapter 6.) Offline and real-time frequency alterations for power systems application are also discussed.

In Chapter 7 the focus is on algorithms that are capable of estimating parameters such as phasor, frequency, RMS (root mean square), harmonics and transients (decaying exponential) for real-time and offline applications. The basic concepts of estimation theory are presented, including the Cramer–Rao lower bound (CRLB), the MVU estimator, BLUE and LSE estimators. The smart-grid environment is one of higher-complexity electrical signals, which need to be properly and accurately measured.

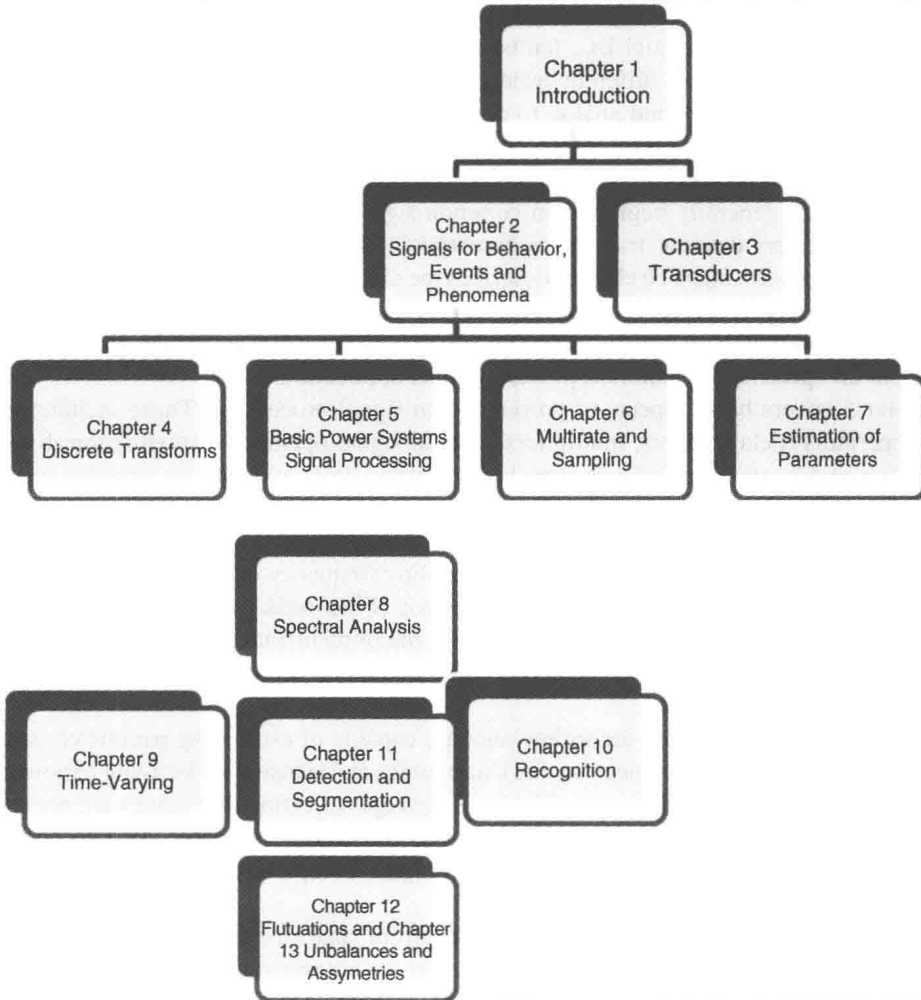
Chapter 8 covers the basic concepts of spectrum analysis and parametric and non-parametric spectrum estimations. Common errors in parametric estimation are covered, including aliasing, scalloping loss and spectrum leakage. Among the parametric methods discussed are the Prony, Pisarenko, MUSIC and ESPRIT methods.

Chapter 9 introduces a unified view of time-frequency decomposition based on filter banks and wavelet transforms for power system applications. The short-time Fourier transform (STFT) is presented, and the basic principle of filter banks theory and its connection with wavelets is discussed. The basic theory of the wavelet and relevant signal processing techniques are described. Guidance on how to choose the mother wavelet for power system applications is provided.

Chapter 10 covers pattern recognition as an essential enabling tool for the operation and control of the upcoming electric smart-grid environment. The chapter highlights the main aspects and necessary steps required for providing necessary tools to operate the grid of the future.

Chapter 11 presents the basic aspects of detection theory using the Bayesian framework and discusses the deterministic signal detection for white Gaussian noise.

Chapter 12 discusses the application of wavelet analysis to determine fluctuation patterns in generation and load profiles. This is achieved by the filtering of its wavelet components based



**Figure 2** Structure of the book.

on their RMS values, from which it is possible to identify the most-relevant scaling factors. The procedure reveals fluctuation patterns which cannot be visualized via frequency decomposition methods.

Chapter 13 describes an application in which the evaluation of unbalances and asymmetries in power systems can be facilitated by the use of a time-varying decomposition method based on SW-DFT. The time-varying harmonics and their positive-, negative- and zero-sequence components are calculated for each frequency.

Figure 2 depicts the structure of the book.

Finally, some philosophical considerations with regards to the utilization and reception of this book (or any other book) is adapted below from the writings of British author C. S. Lewis:

‘A scientific or engineering work such as this can be either *received* or *used*. When we *receive* it, we exercise our senses and imagination and various other powers according to a pattern suggested by the authors. When we *use* it we treat it as an assistance for our own activities. . . . *Using* is inferior to *receiving* because, in science and engineering, *using* merely facilitates, relieves or palliates our research/applications; it does not add to it.’ [2]

The authors hope that the reader will both use and receive this book as a valuable and thought-provoking guide and tool.

## References

1. Smith, S.W. (1997) *The Scientist and Engineer's Guide to Digital Signal Processing*, California Technical Publishing.
2. Lewis, C.S. (1961) *An Experiment in Criticism*, Cambridge University Press.



# Accompanying Websites

To accompany this book, two websites have been set up containing MATLAB<sup>®</sup> files for additional waveforms of typical non-linear loads; these can be signal-processed by different techniques for further understanding. Two MATLAB<sup>®</sup>-based time-varying harmonic decomposition techniques are also available on site for waveform processing.

Please visit <http://www.ufjf.br/pscope-eng/digital-signal-processing-to-smart-grids/>

Password: dspsgird

Or [http://www.wiley.com/go/signal\\_processing](http://www.wiley.com/go/signal_processing)

Readers are welcome to send additional waveforms for signals and MATLAB<sup>®</sup> scripts to be included in the database to Professor Paulo Fernando Ribeiro at [pfribeiro@ieee.org](mailto:pfribeiro@ieee.org).



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