# Automated Fault Analysis in a Smart Grid

M. Kezunovic, Fellow, IEEE

Abstract—The latest technology development makes many intelligent electronic devices (IEDs) available in substations today. This brings an opportunity for adding new functionalities that go well beyond what the traditional substation automation solutions have provided. The substation automation role in automated fault analysis may be expanding towards better serving many utility groups: operations, protection and asset management.

*Index Terms*—substation automation, expert system, genetic algorithm, intelligent electronic device, neural network

## I. INTRODUCTION

Various types of users in the utilities may benefit from substation automation: operations, protection, asset management, market operations, etc. In order to achieve such benefits, new concepts of substation automation have to meet the following expectations:

- Local protection concept needs to be enhanced to simultaneously improve dependability and security
- Substations need to be interfaced directly and through coordinating centers for better system-wide protection
- Data from IEDs needs to be merged with data from SCADA to enhance monitoring capabilities
- Condition based data from substation IEDs needs to be utilized for failure rate assessment of assets
- Local automated analysis needs to be coordinated with centralized analysis to cope with N-m cascades
- Control actions need to be defined hierarchically from substations to control centers for best outcome
- Monitoring and reporting of disturbances needs to be automated to meet recent NERC standards

## II. SUBSTATION FAULT ANALYSIS REQUIREMENTS

To meet the criteria for automated fault analysis in substations, several research efforts were undertaken, many of them still on-going:

• A solution for automated merging of data captured by digital fault recorders (DFRs), digital protective relays (DPRs), and circuit breaker monitors (CBMs) is developed [1-8]

- A concept for detecting, classifying and mitigating cascading events is demonstrated based on local and system-wide monitoring data [9-12].
- An optimal fault location algorithm that uses data from substation IEDs, as well as data from SCADA PI Historian and simulation data from short circuit program is implemented [13-19]
- A risk-based asset management methodology for maintenance scheduling is being developed taking into account condition-based data captured by substation IEDs [20-23]
- An intelligent alarm processor approach is proposed to take advantage of enhanced protective relay data in explaining cause-effect relationships between alarms [24-27]
- A Neural network based protective relaying scheme that enables simultaneous enhancements in dependability and security of transmission line protection is envisioned [28-31]

## III. SOLUTION EXAMPLES

The new solutions are illustrated through the following figures.

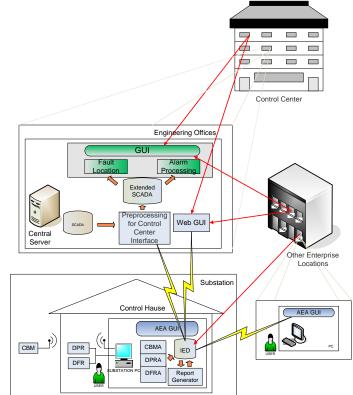


Fig. 1. Automated analysis system architecture

This work was jointly supported by DOE, EPRI, ERCOT, PSerc, and several utilities (AEP, CenterPoint Energy, FirstEnergy. Oncor, and Hydro One)

M. Kezunovic is with the Department of Electrical and Computer Engineering, Texas A&M University, College Station, TX 77843-3128, USA (e-mail: kezunov@ece.tamu.edu).

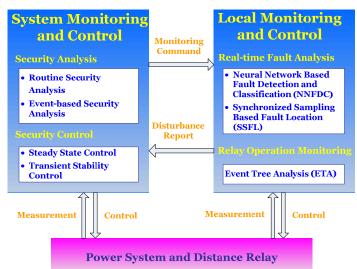


Fig. 2. Solution for detection and mitigation of cascades

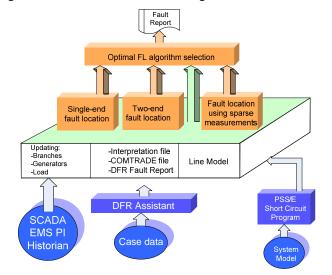


Fig. 3. Optimized fault location

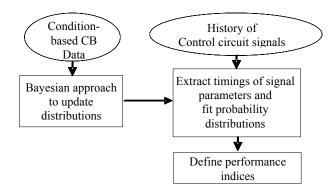


Fig.4. Risk-based circuit breaker maintenance strategy

Figure 1 shows a system for automated analysis of data from substation IEDs [4]. It is located in substations and sends both data and reports to control center, as well as protection and maintenance crews. Figure 2 depicts solution for on-line monitoring of cascading failures [9]. The solution has centralized and local parts. The local part confirms validity of relay operations. Figure 3 illustrates how optimized fault location works [16]. It selects the best algorithm for a given circumstance in the system. To achieve that, it uses direct measurements of phasors, PI historian data and short circuit model. Figure 4 demonstrates how risk-based circuit breaker analysis works [20]. It uses measurements from the control circuit and calculates failure rates. Based on that information, performance indices used in the risk based analysis are computed. Figure 5 gives an outline of an intelligent alarm processor that uses data from substation IEDs to enhance the cause-effect analysis of alarms [25]. Figure 6 gives a neural network clustering algorithm output. This technique is used to detect and classify faults [28].

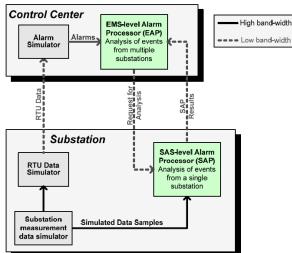


Fig. 5 Intelligent alarm processor

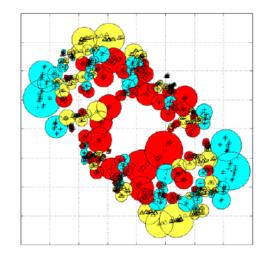


Fig. 6. Neural network based fault detection and classification

## IV. CONCLUSIONS

The conducted research resulted in several potential and demonstrated requirements brought forward by advanced substation automation and fault analysis solutions:

• Operator efficiency: automated fault analysis of events, which increases speed of drawing conclusions leading to better staff decisions, reduces time of restoration

- Assessment accuracy: fault location and asset management functions will increase quality of conclusions related to maintenance and restoration
- Operator awareness: intelligent alarm processor combined with optimized fault location gives more comprehensive view of the faults and consequences
- Equipment operations: automated analysis of faults and disturbances as well as circuit breaker operation using IED data, can offer better monitoring than SCADA
- Protective relaying: new approaches based on pattern recognition and accurate fault location are more dependable and secure than distance protection
- Regulatory compliance: as NERC standards are becoming more stringent, new solutions provide more details about disturbances than ever before

#### V. ACKNOWLEDGMENT

The author wishes to thank several past and current graduate students at TAMU for contributing to the solutions discussed in this paper: Zarko Djekic, Papiya Dutta, Maja Knezev, Yuan Liao, Xu Luo, Jasna Mrkic, Satish Natti, Chengzong Pang, Zhifang Ren, Hongbiao Song, Slavko Vasilic, Yang Wu, and Nan Zhang.

### VI. REFERENCES

- M. Kezunovic, A. Abur, "Merging the Temporal and Spatial Aspects of Data and Information for Improved Power System Monitoring Applications," IEEE Proceedings, Vol. 9, Issue 11, pp 1909-1919, 2005.
- [2] M. Kezunovic, T. Popovic, "Substation Data Integration for Automated Data Analysis Systems," IEEE PES General Meeting, Tampa, Florida, June 2007.
- [3] M. Kezunovic, I. Rikalo, "Automating the Analysis of Faults and Power Quality," IEEE Computer Applications in Power, Vol. 12, No. 1, pp. 46-50, January 1999
- [4] M. Kezunovic, "Future Uses of Substation Data," 7th International Conference on Advances in Power System Control, Operation and Management - APSCOM 2006, Hong Kong, October/November 2006.
- [5] IEEE Inc., 1999 "IEEE Standard Common Format for Transient Data Exchange(COMTRADE) for Power Systems", IEEE Std. C37.111-1999
- [6] M. Kezunovic, Z. Ren, G. Latisko, D.R. Sevcik, J. Lucey, W. Cook, and E. Koch, "Automated monitoring and analysis of circuit breaker operation," *IEEE Transactions on Power Delivery*, vol. 20, no. 3, pp. 1910-1918, Jul 2005.
- [7] M. Knezev, Z. Djekic, and M. Kezunovic, "Automated Circuit Breaker Monitoring," *IEEE PES GM 2007*, Tampa, FL, Jun 2007, pp. 1-6.
- [8] M. Kezunovic, "Automation of Fault Analysis Using DFR Data," in Proceedings of the 60<sup>th</sup> American power Conference, Chicago, IL, pp. 91-98, Apr 1998.
- [9] H. Song, M. Kezunovic, "A New Analysis Method for Early Detection and Prevention of Cascading Events," Electric Power Systems Research, Vol. 77, Issue 8, Pages 1132-1142, June 2007.
- [10] M. Kezunovic, C. Pang, "Improved Transmission Line Protection During Cascading Events," CIGRE B5 Colloquium, Madrid, Spain, October 2007
- [11] H. Song, M. Kezunovic, "Static Analysis of Vulnerability and Security Margin of the Power System," IEEE 2005 PES Transmission & Distribution Conference & Exposition, Dallas, Texas, May 2006
- [12] N. Zhang, Kezunovic, "Improving Real-time Fault Analysis and Validating Relay Operations to Prevent or Mitigate Cascading Blackouts," IEEE 2005 PES Transmission & Distribution Conference & Exposition, Dallas, Texas, May 2006
- [13] M. Kezunovic, B. Perunicic, J. Mrkic, "An Accurate Fault Location Algorithm Using Synchronized Sampling," Electric Power Systems Research Journal, Vol. 29, No. 3, pp. 161-169, May 1994

- [14] M. Kezunovic, B. Perunicic, "Automated Transmission Line Fault Analysis Using Synchronized Sampling at Two Ends," IEEE Transactions on Power Systems, Vol. 11, No. 1, February 1996.
- [15] M. Kezunovic, B. Perunicic, "Fault Location", Wiley Encyclopedia of Electrical and Electronics Terminology, Vol. 7, pp. 276-285, John Wiley, 1999
- [16] M. Kezunovic, M. Knezev, "Temporal and Spatial Requirements for Optimized Fault Location," Hawaii Int'l. Conference on System Sciences, HICCS-39, Hawaii, January 2008.
- [17] S. Luo, M. Kezunovic, D.R. Sevcik, "Locating Faults in the Transmission Network Using Sparse Field Measurements, Simulation Data and Genetic Algorithms," Electric Power Systems Research, Vol. 71, No. 2, October 2004.
- [18] Y. Liao, M. Kezunovic, "Optimal Estimate of Transmission Line Fault Location Considering Measurement Errors," IEEE Transactions on Power Delivery, Vol. 24, No. 3, pp. 1335-1341, July 2007
- [19] A. Gopalakrishnan, M. Kezunovic, S. M. McKenna, D. M. Hamai, "Fault Location Using Distributed Parameter Transmission Line Model," IEEE Transactions on Power Delivery, Vol. 15, No. 4, pp. 1169-1174, October 2000
- [20] S. Natti, M. Kezunovic, "A Risk-based Decision Approach for Maintenance Scheduling Strategies for Transmission System Equipment," The 10<sup>th</sup> Intl. Conf. on Probabilistic Methods Applied to Power Systems – PMAPS 08, Rincon, Puerto Rico, May 2008.
- [21] S. Natti, M. Kezunovic, "Transmission System Equipment Maintenance: On-line Use of Circuit Breaker Condition Data," IEEE PES General Meeting, Tampa, Florida, June 2007.
- [22] S. Natti, M. Kezunovic, C. Singh, "Sensitivity Analysis on the Probabilistic Maintenance Model of Circuit Breaker," 9<sup>th</sup> International Conference on Probabilistic Methods Applied to Power Systems, Stockholm, Sweden, June 11-15, 2006.
- [23] M. Kezunovic, S. Natti, "Condition Monitoring and Diagnostics Using Operational and Non-Operational Data," International Conference on Condition Monitoring and Diagnosis, Changwon, Korea, April, 2006
- [24] X. Luo, M. Kezunovic, "Implementing Fuzzy Reasoning Petri-nets for Fault Section Estimation," IEEE Transactions on Power Delivery, Vol. 23, No. 2, pp. 676-685, April 2008.
- [25] Y. Wu, M. Kezunovic, T. Kostic, "An Advance Alarm Processor Using Two-level Processing Structure," Power Tech 2007, Lausanne, Switzerland, July 2007.
- [26] M. Kezunovic, P. Spasojevic, C. Fromen, D. Sevcik, "An Expert System for Transmission Substation Event Analysis," IEEE Transactions on Power Delivery, Vol. 8, No. 4, pp. 1942-1949, October 1993.
- [27] X. Luo, M. Kezunovic, "An Expert System for Diagnosis of Digital Relay Operation," 13<sup>th</sup> Conference on Intelligent Systems Application to Power Systems, Washington DC, USA, November 2005.
- [28] S. Vasilić, M. Kezunović, "Fuzzy ART Neural Network Algorithm for Classifying the Power System Faults," *IEEE Transactions on Power Delivery*, Vol. 20, No. 2, pp 1306-1314, April 2005
- [29] M Kezunović, S. Vasilić, "Analysis of Protective Relaying Operation and Related Power System Interaction," *IFAC Symposium on Power Plants and Power System Control*, Seoul, Korea, September, 2003.
- [30] M. Kezunović, S. Vasilić, F. Gul-Bagriyanik, "Advanced Approaches for Detecting and Diagnosing Transients and Faults," *Med Power 2002*, Athens, Greece, November 2002.
- [31] M. Kezunović, S. Vasilić, D. Ristanović, "Interfacing Protective Relays and Relay Models to Power System Modeling Software and Data Files," *PowerCon 2002*, Kunming, China, October 2002.

#### VII. BIOGRAPHY



**Mladen Kezunovic** (S'77-M'80–SM'85–F'99) received the Dipl. Ing., M.S. and Ph.D. degrees in electrical engineering in 1974, 1977 and 1980, respectively. Currently, he is the Eugene E. Webb Professor and Site Director of Power Engineering Research Center (PSerc), an NSF I/UCRC.at Texas A&M University He worked for Westinghouse Electric Corp., Pittsburgh, PA, 1979-1980 and the Energoinvest Company, in Europe 1980-1986. Dr. Kezunovic is a member of CIGRE, Registered

Professional Engineer in Texas, and a Fellow of the IEEE.