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Power System Data Management and Analysis using Synchrophasor Data

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2 Methodology

3 Results







Introduction

- Electricity and society. Grid as aged well still operates daily and paces demand.
- Grid has experienced:
 - Renewables
 - Load congestion, demand for quality electric power
 - Threats to cyber security / physical infrastructure
- National Energy Technology Laboratory (NETL) identifies key technological areas. Applicable areas:
 - improved and accurate sensing and measurement capability
 - advanced control methods
 - decision support

Synchrophasor Fundamentals Project Fundamentals Correlation Fundamentals

Synchrophasor Fundamentals

- Synchrophasor \equiv Phasor Measurement Unit (PMU)
- Power system sensors for tracking voltage, current, frequency.
- Values recorded in phasor format: magnitude and angle.
- High fidelity (60Hz) vs SCADA (pprox 5 sec.)
- Synchronized Data via Global Positioning System (GPS) timestamps.
- Phasor Data Concentrator (PDC) single data logging point containing multiplexed PMU data steam.

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Synchrophasor Fundamentals Project Fundamentals Correlation Fundamentals

Project Fundamentals

- BPA provides dataset
 - 950 GB of positive sequence voltage data.
 - Span: August 2012 August 2013
 - 20 PMUs: various locations inside BPA balancing authority.
- Our Goal:
 - Develop multidisciplinary methodology to handle high cardinality data.
 - 2 Begin identifying data vs. power system issues.
 - Onstruct a fast, reliable database for handling big data issues.

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Synchrophasor Fundamentals Project Fundamentals Correlation Fundamentals

Pearson Correlation

- Pearson Correlation determines how well data is linearly correlated.
- Given two independent input sets of data X and Y of length N, the Pearson correlation yields a correlation coefficient r between -1 and 1 based on the following equation:

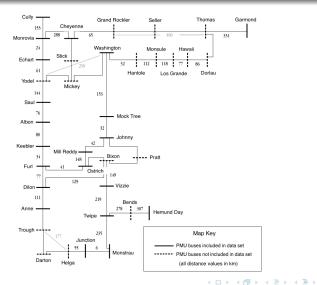
$$r = \frac{\Sigma(XY) - \frac{\Sigma X \Sigma Y}{N}}{\sqrt{(\Sigma(X^2) - \frac{(\Sigma X)^2}{N}) \times (\Sigma(Y^2) - \frac{(\Sigma Y)^2}{N})}}$$

PDC Engine Data Structure Correlation Algorithm Window Sizes

Phasor Data Concentrator (PDC) Engine

- Phasor Data Concentrator (PDC) Engine
 - Data files 1-5 minutes in length
 - Understanding the data:
 - File framework
 - Recorded power system attributes
 - Data discretization rate
 - Topological layout of the PMUs
 - Historical data playback

PDC Engine Data Structure Correlation Algorithm Window Sizes



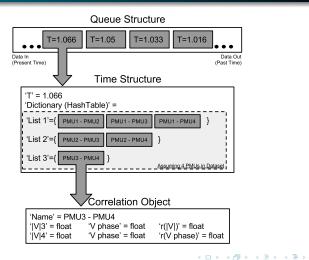
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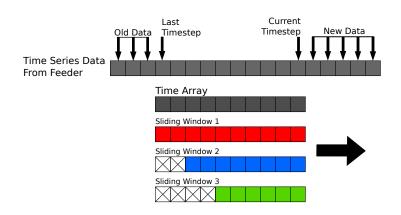
PDC Engine Data Structure Correlation Algorithm Window Sizes

Data Structure



PDC Engine Data Structure Correlation Algorithm Window Sizes

Correlation Algorithm



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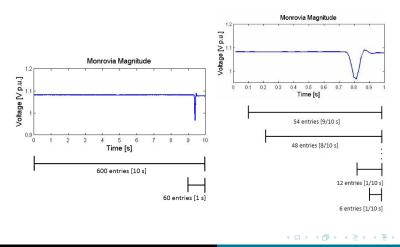
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PDC Engine Data Structure Correlation Algorithm Window Sizes

Window Size Application



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Event Classification Visualization Data Inconsistency Case Study - Monrovia Event Demonstration

Data & Power System Event Identification

Data Event	Expected Identifier/Description
Data Drop	V^\dagger and/or ϕ^* data $=$ 0
PMU Misread / Communication Error	Identical repeated values
Loss of GPS Synchronization	ϕ drift, PMU units not synced
Power System Event	Expected Identifier/Description
Power Flow Contingency	Change in $\frac{d\phi}{dt}$
Generator/Load Trip	Change in voltage and/or $\frac{d\phi}{dt}$
Transmission Line Trip	Change in V and/or change in ϕ
Power Transformer Tap Change	Change in V
Miscalibration of Transformer	Pending further investigation
Capacitor/Reactor Switching	Change in V and ϕ
Inter & Intra Zone Oscillations	Slow-coherent change in V or ϕ

 $\dagger~V=$ Positive sequence bus voltage magnitude

* ϕ = Positive sequence bus phase angle

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Clean Dataset



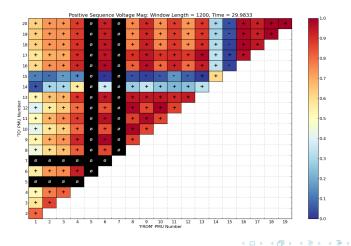
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Lightning Event Dataset



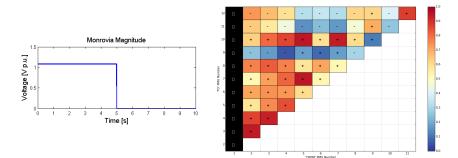
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Data Dropout



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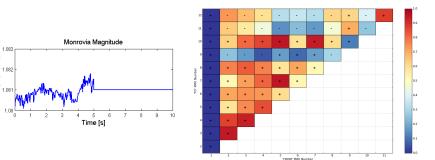
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Data Misread

Voltage [V p.u.]

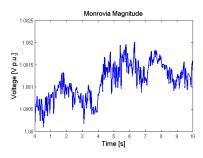


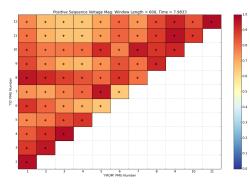
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Prior to Event





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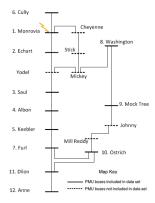
 Background
 Event Classification

 Methodology
 Visualization

 Results
 Data Inconsistency

 Future Work
 Case Study - Monrovia Event

 Conclusion
 Demonstration



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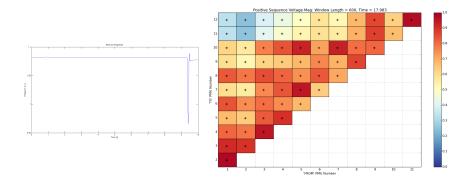
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Lightning Event - Window Size: 600 entries



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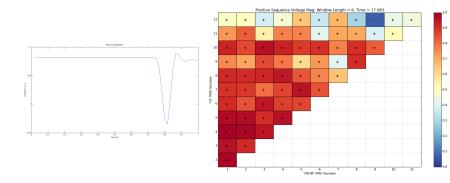
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Image: A matrix

Event Classification Visualization Data Inconsistency Case Study - Monrovia Event Demonstration

Lightning Event - Window Size: 6 entries





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Event Classification Visualization Data Inconsistency Case Study - Monrovia Event Demonstration

Correlation Algorithm Demo

Demo Page

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End Goal and Motivation Correlation Noise Qualification Improved Pattern Recognition Coupling of Correlation Algorithm & Bitmap Index

End Goal and Motivation

- Real-time PMU data analysis machine.
- Automated contingency signature detection.
- Facilitate grid operator ease-of-use.
 - Appealing GUI and visualization methodology.
 - Fast and efficient database back end.
 - Integration of historical event querying.

End Goal and Motivation Correlation Noise Qualification Improved Pattern Recognition Coupling of Correlation Algorithm & Bitmap Index

Correlation Noise Qualification

GOAL: Quantify PMU correlation noise levels across varying window lengths.

PURPOSE: Further develop specific event identification.

PROPOSED METHOD: Statistical analysis of stochasticity in clean PMU data streams over various time durations.

End Goal and Motivation Correlation Noise Qualification Improved Pattern Recognition Coupling of Correlation Algorithm & Bitmap Index

Improved Pattern Recognition

GOAL: Optimize accuracy, timing, and amount of information output.

PURPOSE: Provide operators with most accurate, efficient, and ample amount of information gathered from the installed PMU sensor network.

PROPOSED METHOD: Implement improved correlation, regression, classification, or machine learning algorithms.

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End Goal and Motivation Correlation Noise Qualification Improved Pattern Recognition Coupling of Correlation Algorithm & Bitmap Index

Coupling of Correlation Algorithm & Bitmap Index

GOAL: Merging correlation algorithm with the bitmap index **PURPOSE:** Ability to query correlation values **PROPOSED METHOD:** Store correlation values in bitmap index

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- Recommendations
 - Consistent Formatting of Data
 - Computational Needs
- What we have accomplished
 - Visual tool to identify events
 - Quickly retrieve elements from the database
 - Identify new research directions

THANK YOU

QUESTIONS?

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