

Synchro-Waveforms in Power Distribution Systems: Field Data, Data-Analytics, and Use Cases

IEEE SGSM (May 24, 2022)

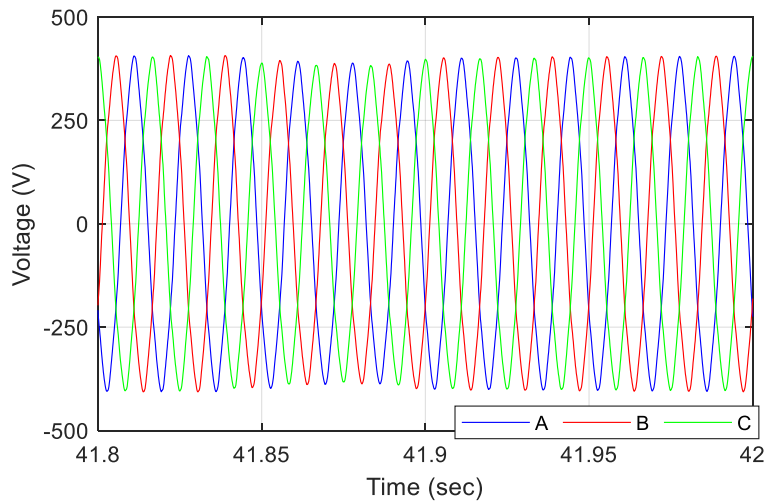
Hamed Mohsenian-Rad, *Ph.D., IEEE Fellow*

Professor and Bourns Family Faculty Fellow
Department of Electrical Engineering, University of California, Riverside
Associate Director, Winston Chung Global Energy Center

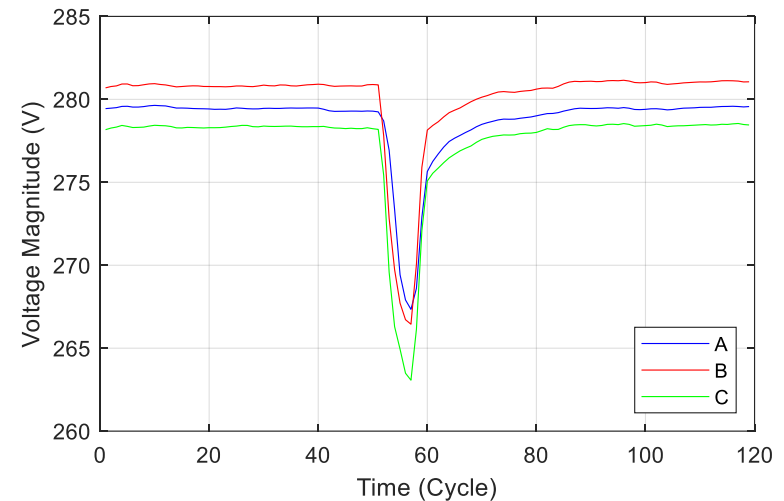
Acknowledgement: Milad Izadi (Ph.D. Student)

Waveform: Real-World Examples

- Example 1 (Voltage Sag):



Waveform

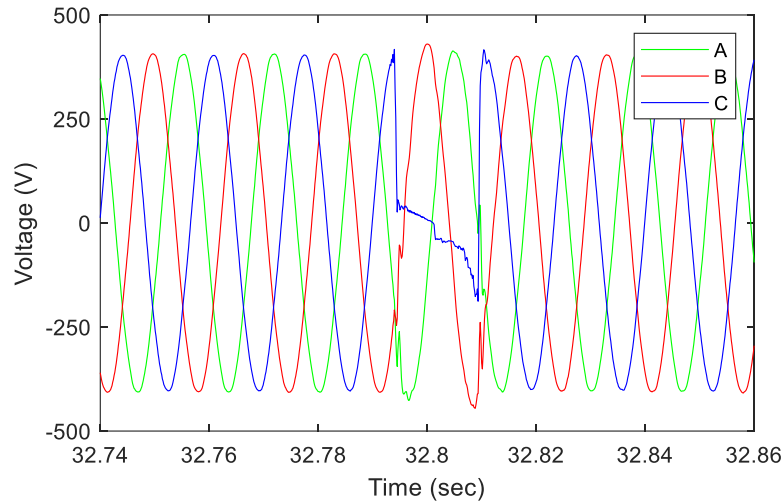


Phasor

- Looking at voltage waveform may *not* be necessary in this example.

Waveform: Real-World Examples

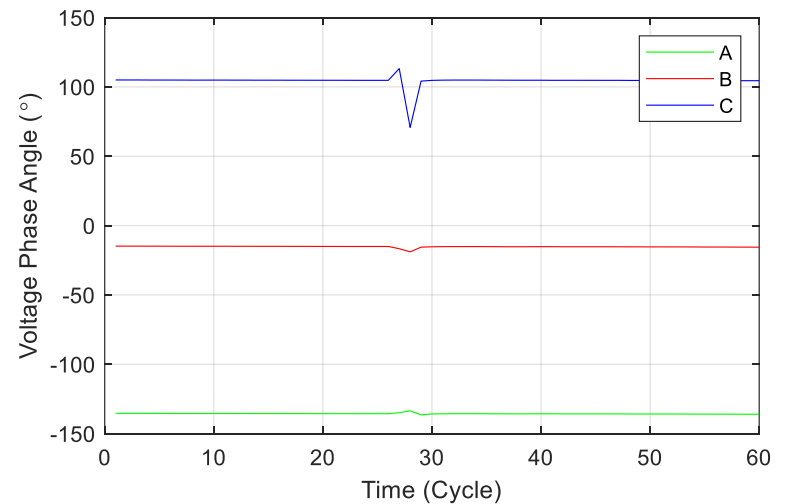
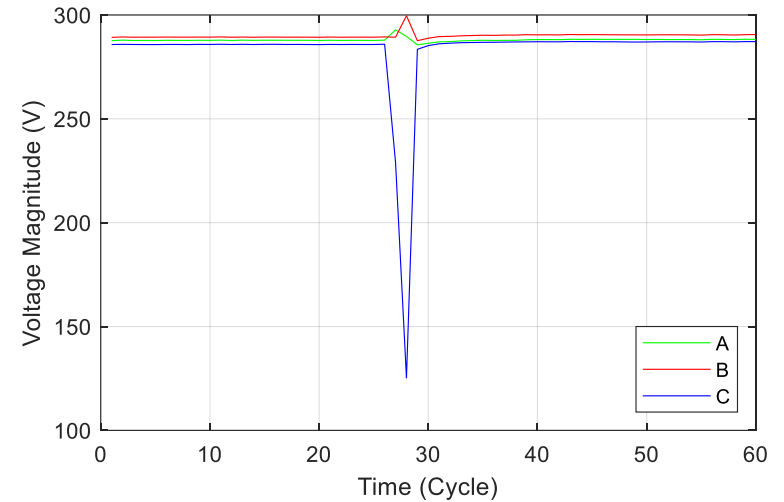
- Example 2 (Fault):



Waveform

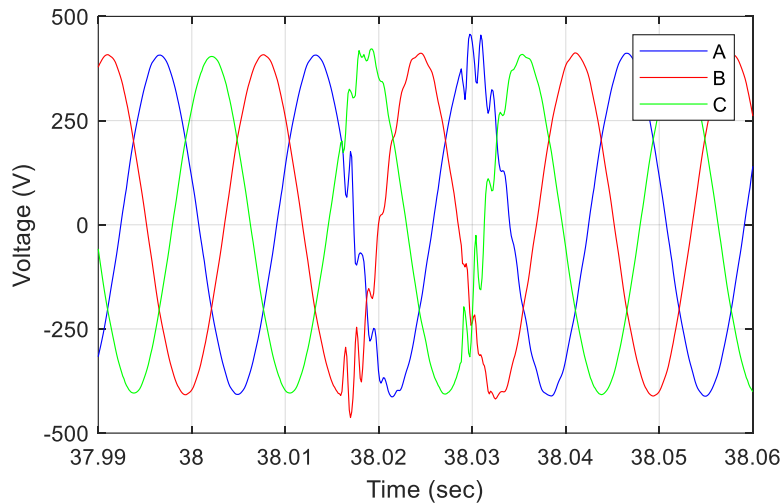
- Waveform shows much more details about the event.

Phasor

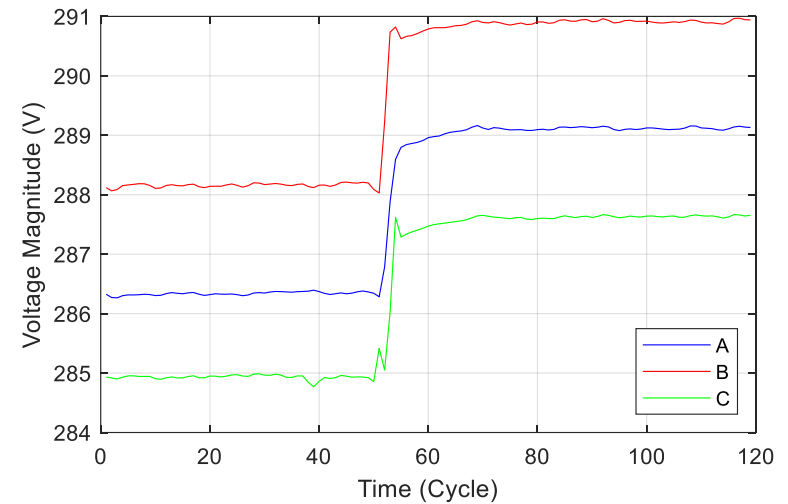


Waveform: Real-World Examples

- Example 3 (**Resonance**):



Waveform



Phasor

- We *do not notice* such high-frequency resonance in the phasors.

- These are just a few examples of comparing waveforms and phasors.
- Two Concepts:

Synchro-Phasors = Phasors + Time Synchronization

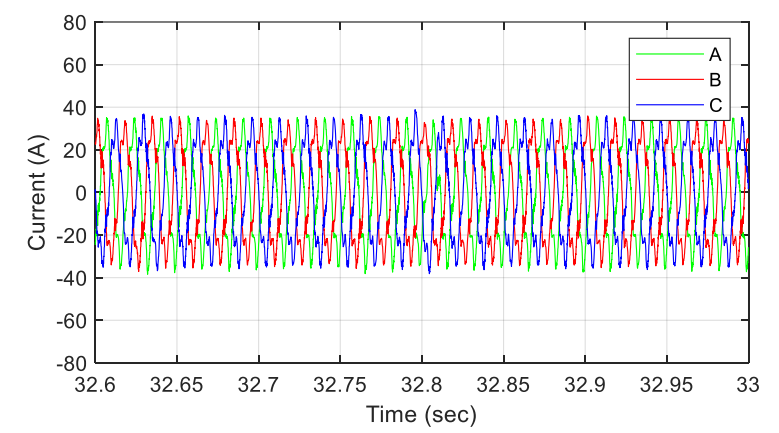
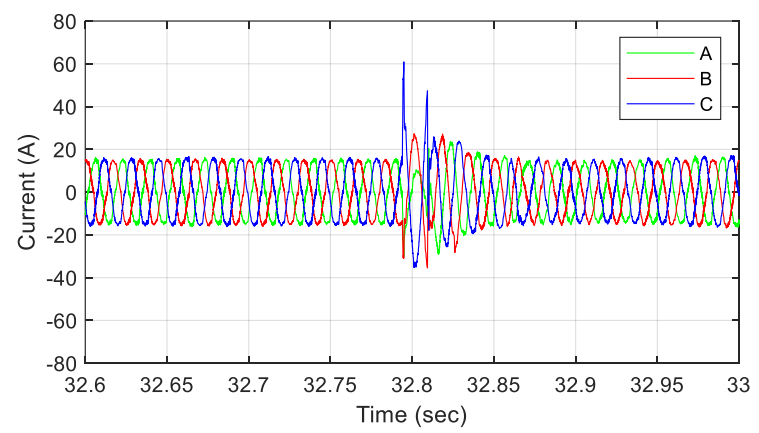
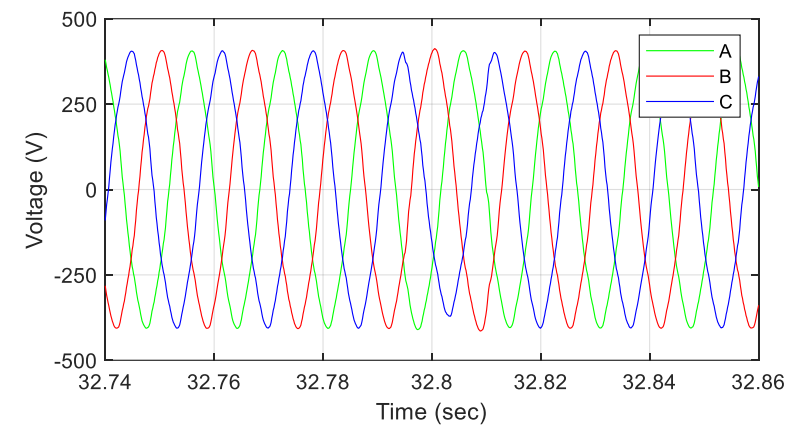
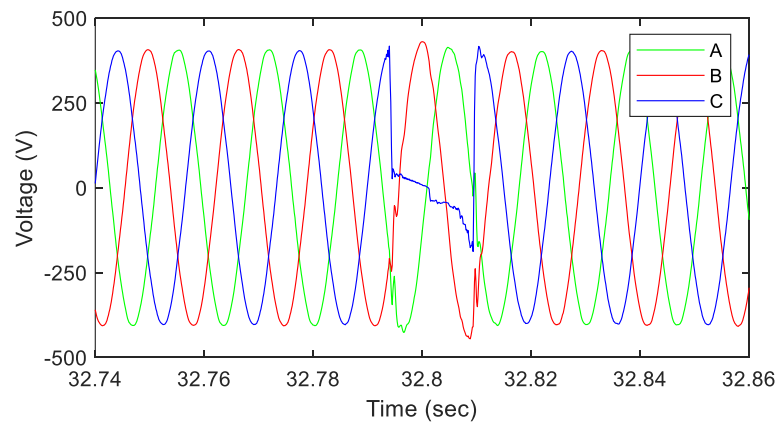
Synchro-Waveforms = Waveforms + Time Synchronization

- We can generally refer to the sensors that measure synchro-waveforms as Waveform Measurement Units (**WMUs**¹), in contrast to **PMUs**.
- **WMUs**: PQ Meters, DFRs, etc. [*with Time-Synchronization*]

¹ a.k.a SWMU, see A. F. Bastos, et. al, "SynchroWaveform Measurement Units & Applications", *IEEE PESGM 2019*.

Synchro-Waveforms

- Synchro-Waveforms in **Example 2 (Fault)**:



WMU 1

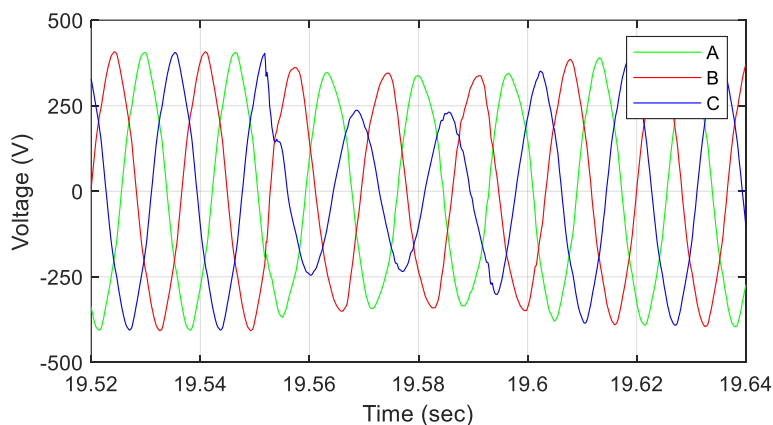


WMU 2

Time Synchronized

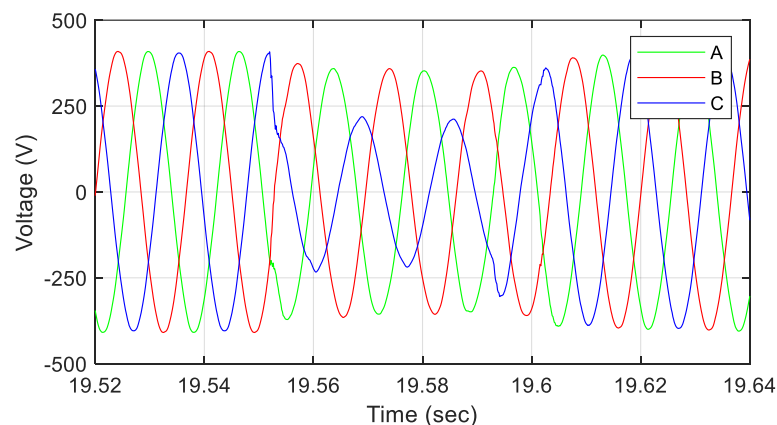
Synchro-Waveforms

- The last fault was seen *very differently* by WMU 1 and WMU 2.
- But there are other faults that are seen *very similarly* by these two WMUs.
- Example 4 (**Another Fault**) - Synchro-Waveforms:



WMU 1

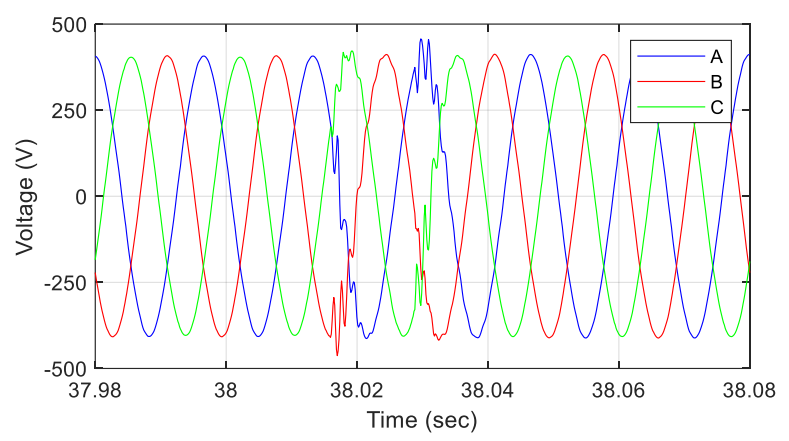
← Time Synchronized →



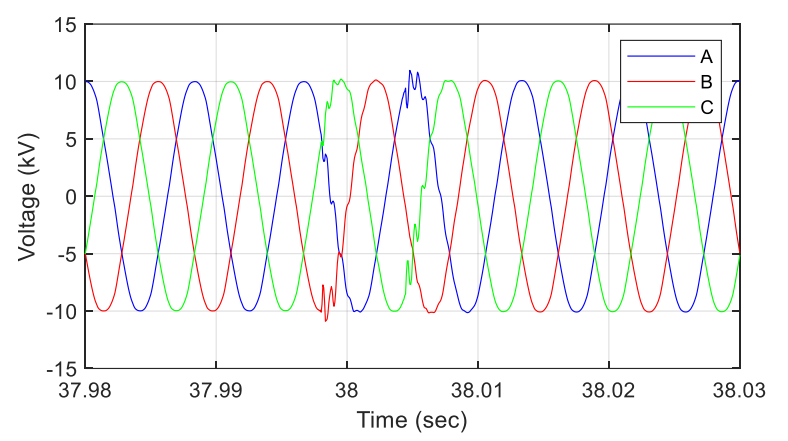
WMU 2

Synchro-Waveforms

- Synchro-Waveforms in **Example 3 (Resonance)**:



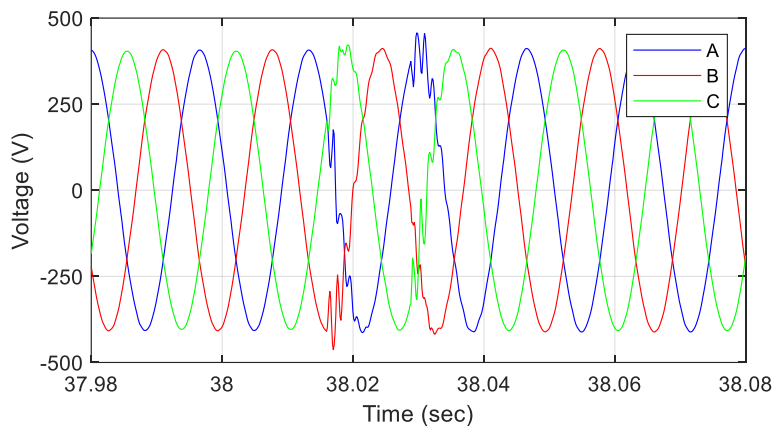
WMU 1



WMU 3

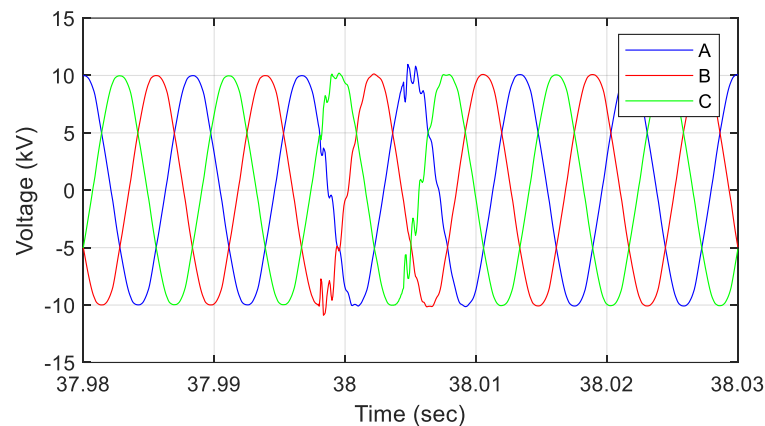
Synchro-Waveforms

- Synchro-Waveforms in **Example 3 (Resonance)**:



WMU 1

← Time Synchronized →



WMU 3

- WMUs observe the **same** physical phenomena at **different** locations.

→ **Synchro-Waveform Situational Awareness**

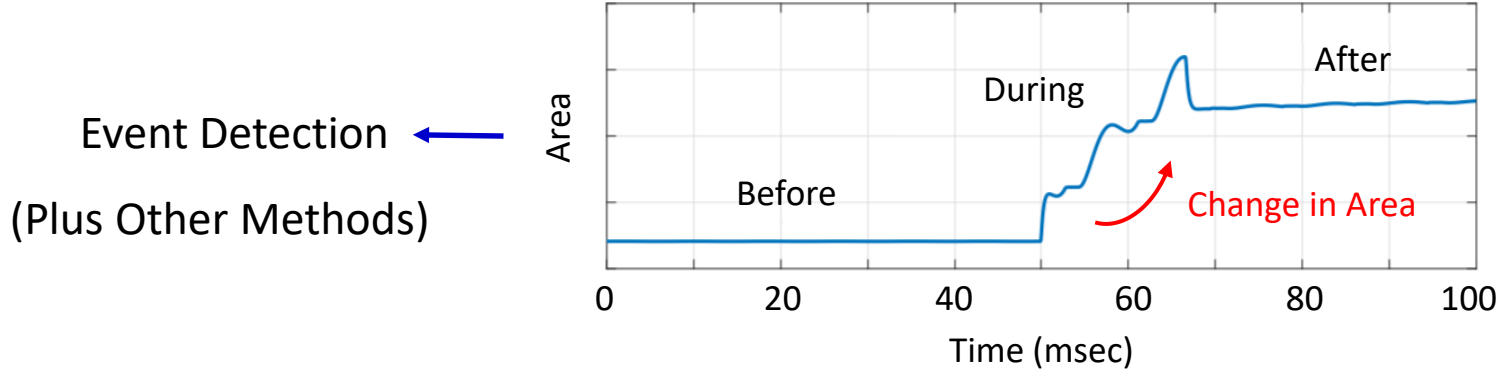
→ **Covering Various Event Signatures (Sub-Cycle, Few-Cycle, etc.)**

Situational Awareness with Synchro-Waveforms

- Analysis of waveform disturbances using synchro-waveforms:
 - **Detection**
 - **Characterization / Classification**
 - **Location Identification**

Situational Awareness with Synchro-Waveforms

- Detection²:



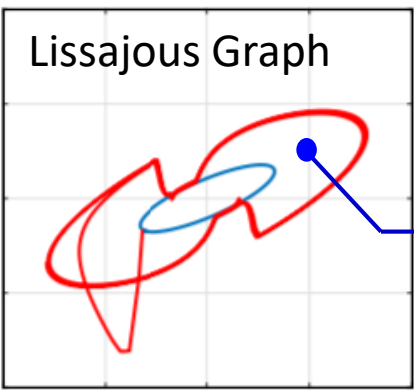
Location 1 / WMU 1

$$v_1(t), i_1(t)$$

Location 2 / WMU 2

$$v_2(t), i_2(t)$$

$$v(t) = v_1(t) - v_2(t)$$



$$i(t) = i_1(t) - i_2(t)$$

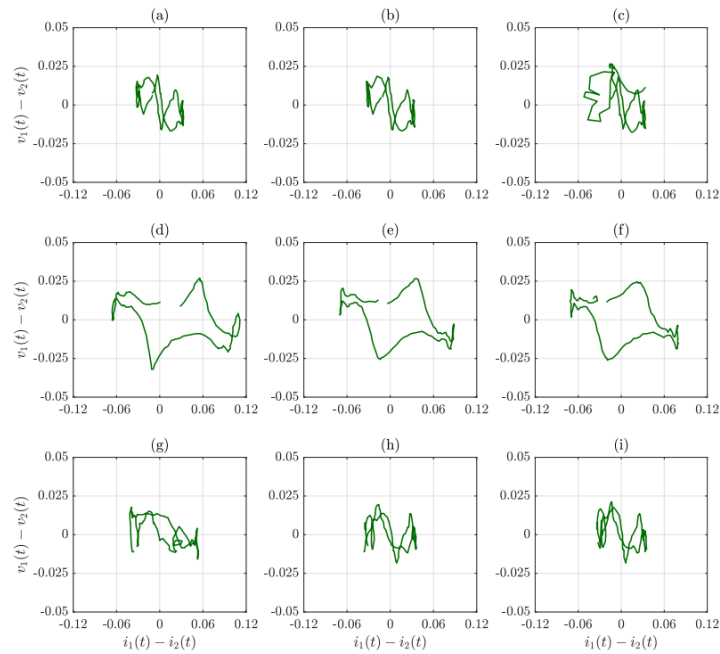
$$\text{Area} = \left| \int_{i(t=0)}^{i(t=T)} v(t) di(t) \right|$$

(Or Other Metrics)

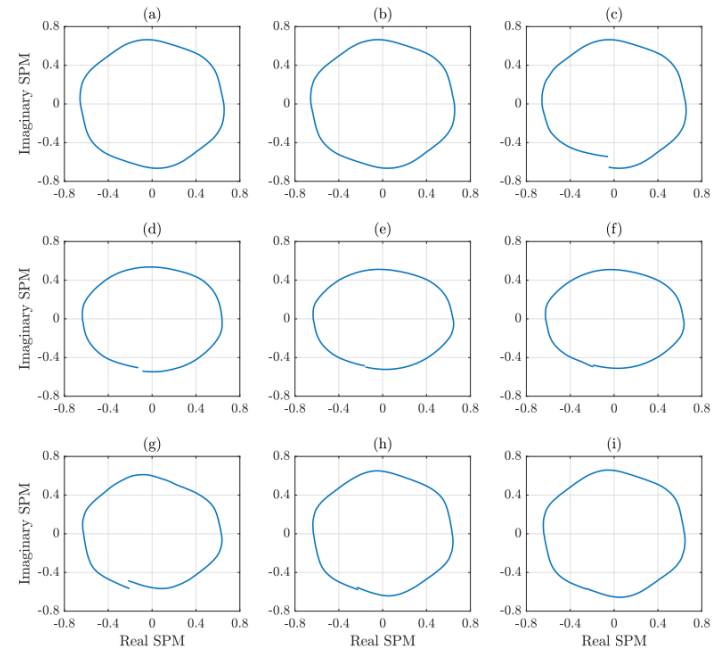
² M. Izadi and H. Mohsenian-Rad, "Characterizing synchronized Lissajous curves to scrutinize power distribution synchro-waveform measurements," in *IEEE Trans. on Power Systems*, vol. 36, no. 5, pp. 4880-4884, Sept 2021.

Situational Awareness with Synchro-Waveforms

- Characterization/Classification³:



Synchronized Lissajous Graph

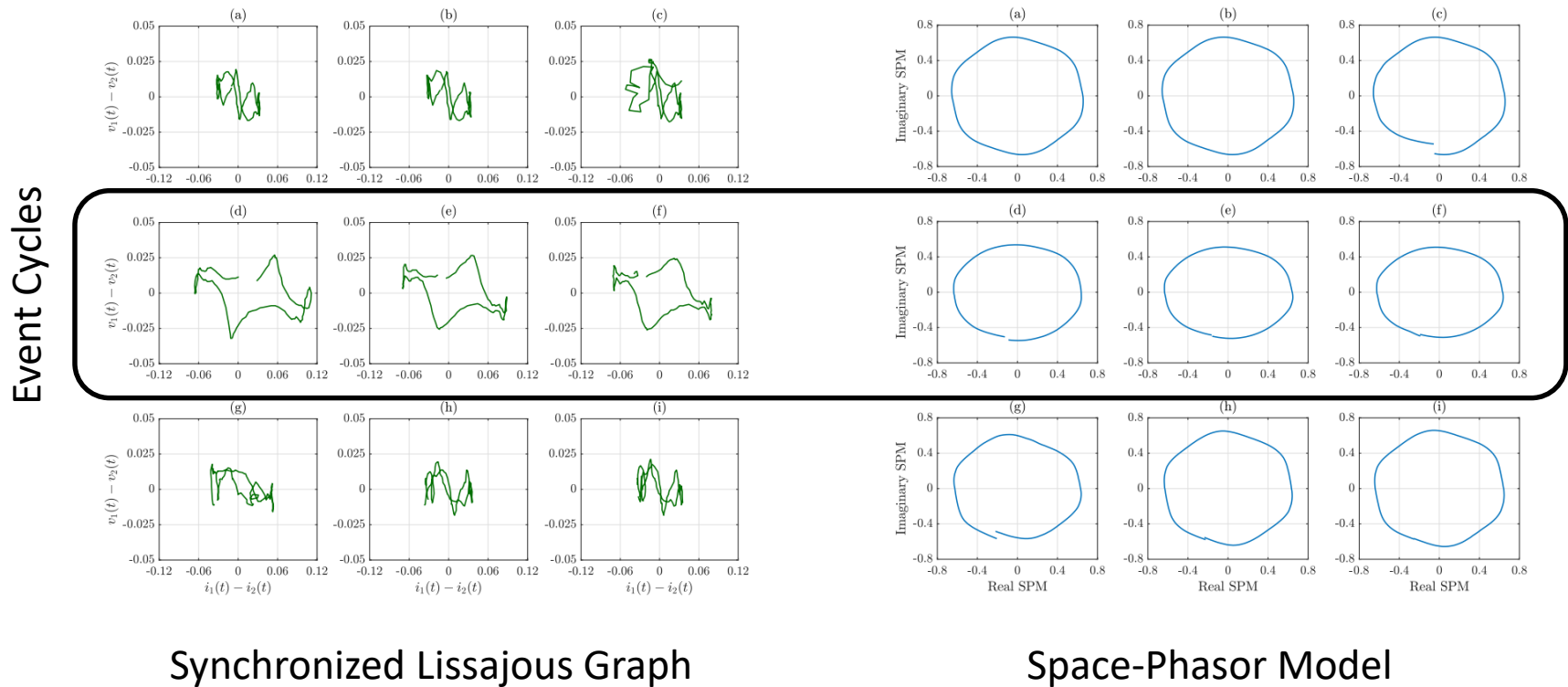


Space-Phasor Model

³ M. Izadi, H. Mohsenian-Rad, " Synchronized Lissajous-based method to detect & classify events in synchro-waveform measurements in power distribution networks," in *IEEE Trans. on Smart Grid*, vol. 13, no. 3, pp. 2170-2184, May 2022.

Situational Awareness with Synchro-Waveforms

- Characterization/Classification³:

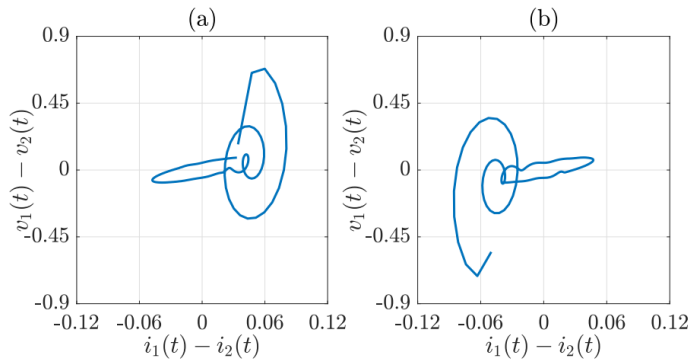


³ M. Izadi, H. Mohsenian-Rad, " Synchronized Lissajous-based method to detect & classify events in synchro-waveform measurements in power distribution networks," in *IEEE Trans. on Smart Grid*, vol. 13, no. 3, pp. 2170-2184, May 2022.

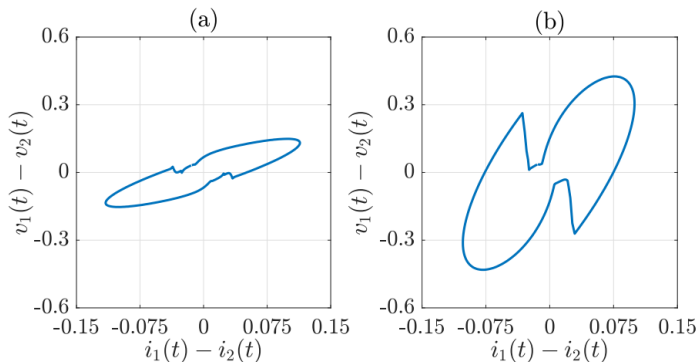
Situational Awareness with Synchro-Waveforms

- Characterization/Classification³:

Image Processing Using **Convolutional Neural Networks (CNN)**.



Same Event, *Different Firing Angles*
(Mirrored Images)



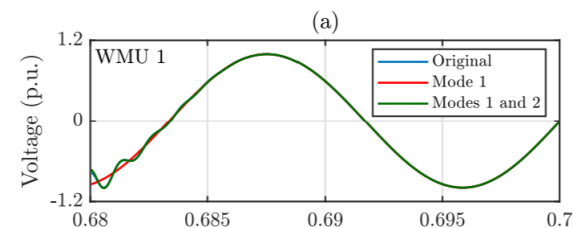
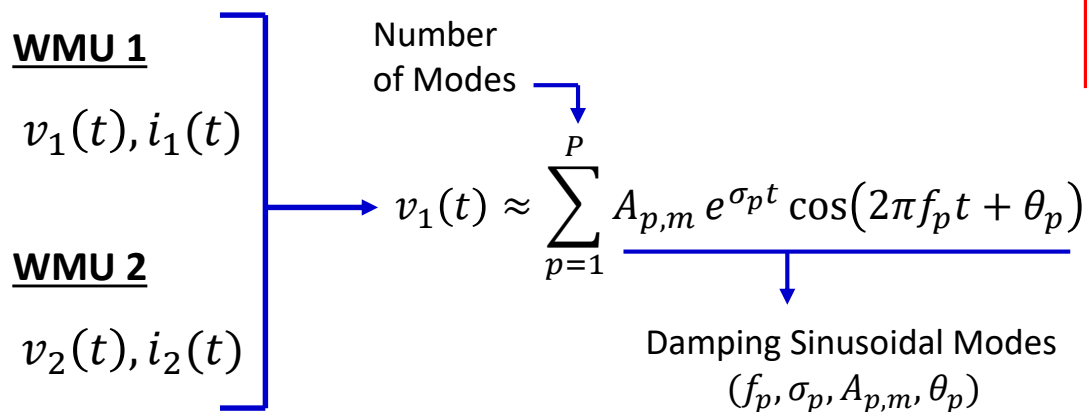
Same Event, *Different Locations*
(Inflated Images)

³ M. Izadi, H. Mohsenian-Rad, " Synchronized Lissajous-based method to detect & classify events in synchro-waveform measurements in power distribution networks," in *IEEE Trans. on Smart Grid*, vol. 13, no. 3, pp. 2170-2184, May 2022.

Situational Awareness with Synchro-Waveforms

- Location Identification⁴:

Multi-Signal (**Synchronized**) Modal Analysis



Event starts at $t = 0.68$ sec
(Sub-Cycle Event)

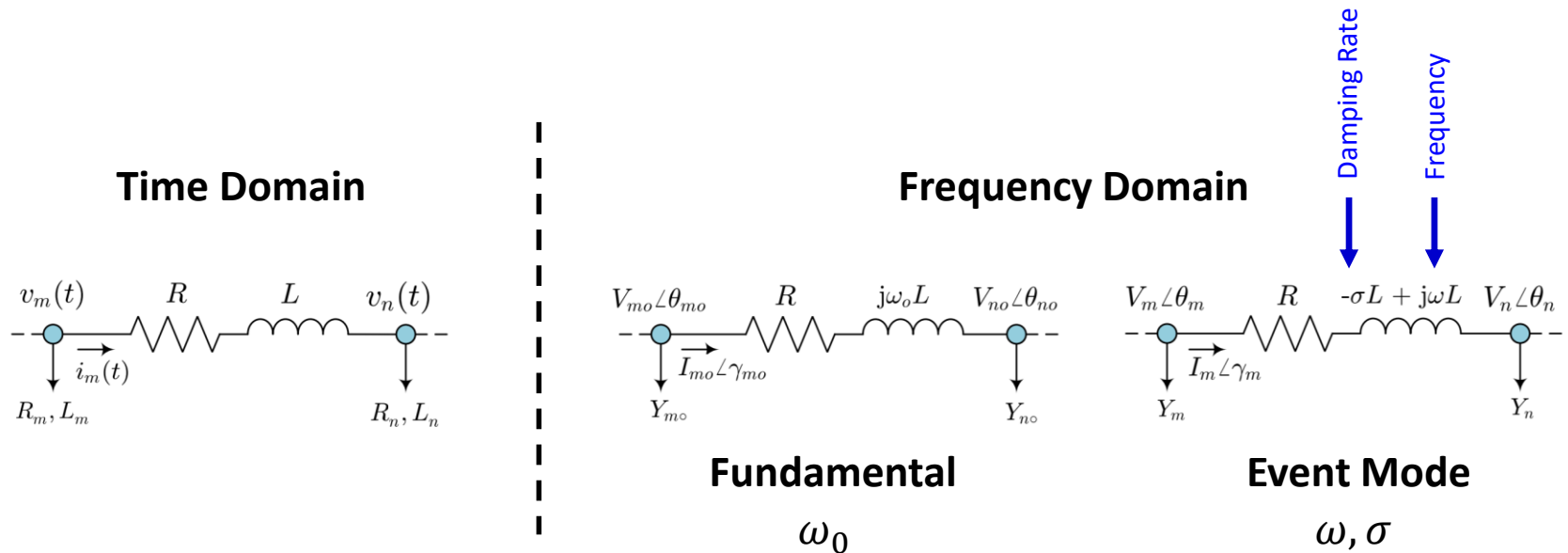
Also for $i_1(t), v_2(t), i_2(t)$

⁴ M. Izadi and H. Mohsenian-Rad, "synchronous waveform measurements to locate transient events and incipient faults in power distribution networks," in *IEEE Trans. on Smart Grid*, vol. 12, no. 5, pp. 4295, Sept 2021.

Situational Awareness with Synchro-Waveforms

- Location Identification⁴:

Analysis of Circuit at **Event Mode**.



⁴ M. Izadi and H. Mohsenian-Rad, "synchronous waveform measurements to locate transient events and incipient faults in power distribution networks," in *IEEE Trans. on Smart Grid*, vol. 12, no. 5, pp. 4295, Sept 2021.

Situational Awareness with Synchro-Waveforms

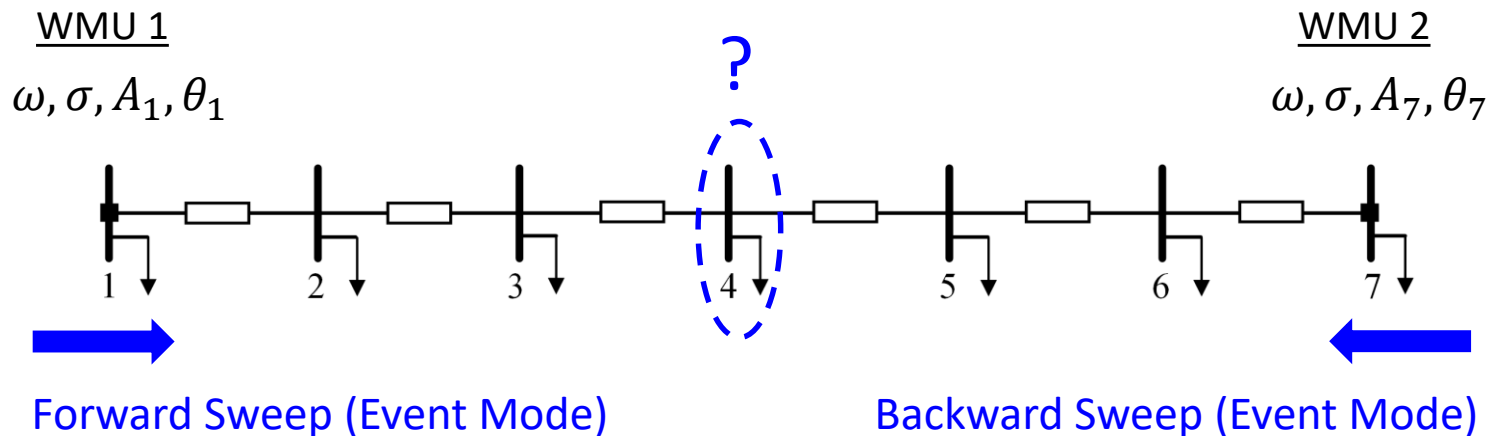
- Location Identification⁴:

Forward/Backward Method.

$$k^* = \underset{i}{\operatorname{argmin}} \Psi_i$$

Discrepancy

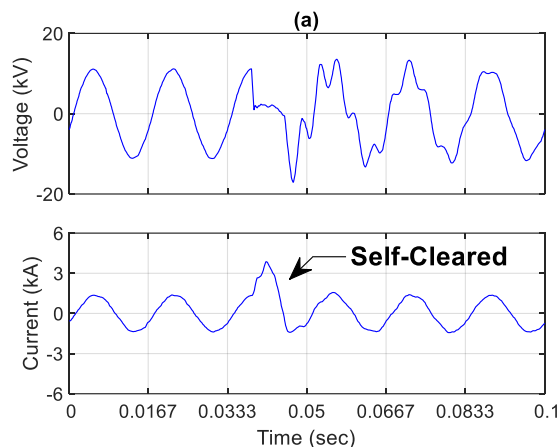
$$\text{where } \Psi_i = |V_i^f - V_i^b|, \quad i = 1, \dots, 7.$$



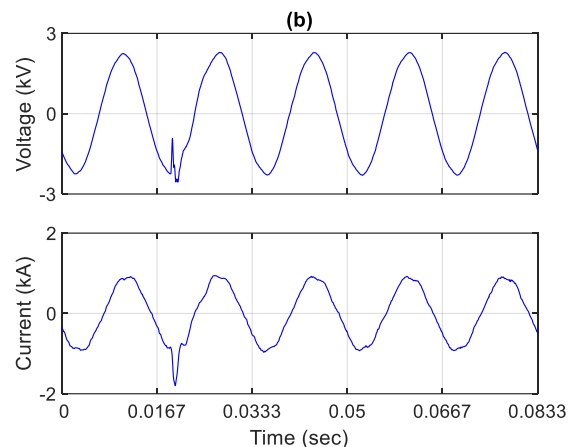
⁴ M. Izadi and H. Mohsenian-Rad, "synchronous waveform measurements to locate transient events and incipient faults in power distribution networks," in *IEEE Trans. on Smart Grid*, vol. 12, no. 5, pp. 4295, Sept 2021.

Potential Use Cases: (Remote) Incipient Faults

- **Transient Signatures:** Asset Monitoring, Wildfire Detection⁵, etc.



Power Lines⁶



Capacitor Bank⁷

- Using **synchronized waveform measurements** helps with more effective detection, characterization, classification, and location identification.

⁵ H. Mohsenian-Rad, "Synchro-Waveforms in Power Distribution with Application to Wildfire Monitoring" Panel Presentation, *IEEE Power and Energy Society General Meeting*, July 26, 2022.

⁶ S. Kulkarni, S. Santoso, and T. A. Short, "Incipient Fault Location Algorithm for Underground Cables," *IEEE Transactions on Smart Grid*, vol. 5, no. 3, pp. 1165–1174, May 2014.

⁷ S. Santoso, and D. D. Sabin, "Power Quality Data Analytics: Tracking, Interpreting, and Predicting Performance," in *Proc. of the IEEE Power and Energy Society General Meeting*, Jul. 2012.

Conclusions

- **Synchro-Waveforms**: new frontier in power grid situational awareness.
- **Examples**: transient sub-cycle and few-cycle disturbances.
- New method: **Detection and Characterization**
 - Image processing and analysis of synchronized Lissajous graphs
- New method: **Location Identification**
 - Analysis of the sub-cycle event mode(s)
- The results show accurate and robust performance.
- Synchro-waveforms have great potential in incipient fault analysis.

Synchro-Waveform Analysis:

- [1] M. Izadi and H. Mohsenian-Rad, "Characterizing synchronized Lissajous curves to scrutinize power distribution synchro-waveform measurements," in *IEEE Trans. on Power Systems*, vol. 36, no. 5, p. 4880, Sept 2021.
- [2] M. Izadi and H. Mohsenian-Rad, "Synchronized Lissajous-based method to detect & classify events in synchro-waveform measurements in power distribution networks," in *IEEE Trans. on Smart Grid*, vol. 13, pp. 2170, May 2022.
- [3] M. Izadi and H. Mohsenian-Rad, "synchronous waveform measurements to locate transient events and incipient faults in power distribution networks," in *IEEE Trans. on Smart Grid*, vol. 12, no. 5, pp. 4295, Sept 2021.

Textbook on Smart Grid Sensors:

- Working Principles
- Sample Data Sets
- Data-Driven Methods

[Synchro-phasors](#)
[Synchro-waveforms](#)

Smart Meters

SCADA

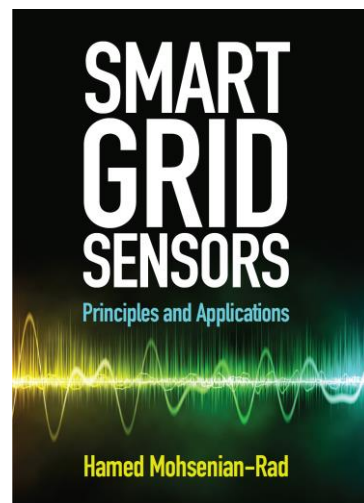
Sensors in Buildings

Device and Asset Sensors

Probing and Perturbation

Off-Domain Data

⋮



Cambridge University Press
April 2022
348 Pages
120 Examples
150 Exercise Questions
Solutions Manual
Instructional Slides

Thank You!

Hamed Mohsenian-Rad, *Ph.D., IEEE Fellow*

Professor and Bourns Family Fellow
Department of Electrical and Computer Engineering
University of California, Riverside

E-mail: hamed@ece.ucr.edu

Homepage: www.ece.ucr.edu/~hamed