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# Anomaly Monitoring and Outage Data Pre-processing



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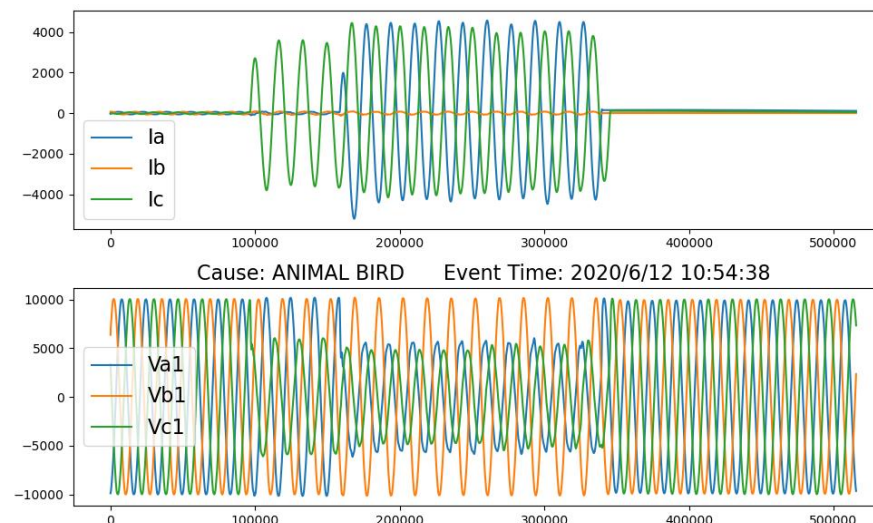
Christopher Sticht, Srijib Mukherjee  
Power Systems Resilience Group, ORNL

# Background



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- Waveform Data
  - Distortion Monitoring
  - Pre-processing
- Help machine learning algorithms to better classify outage causes. E.g. tree, animal, lightning...

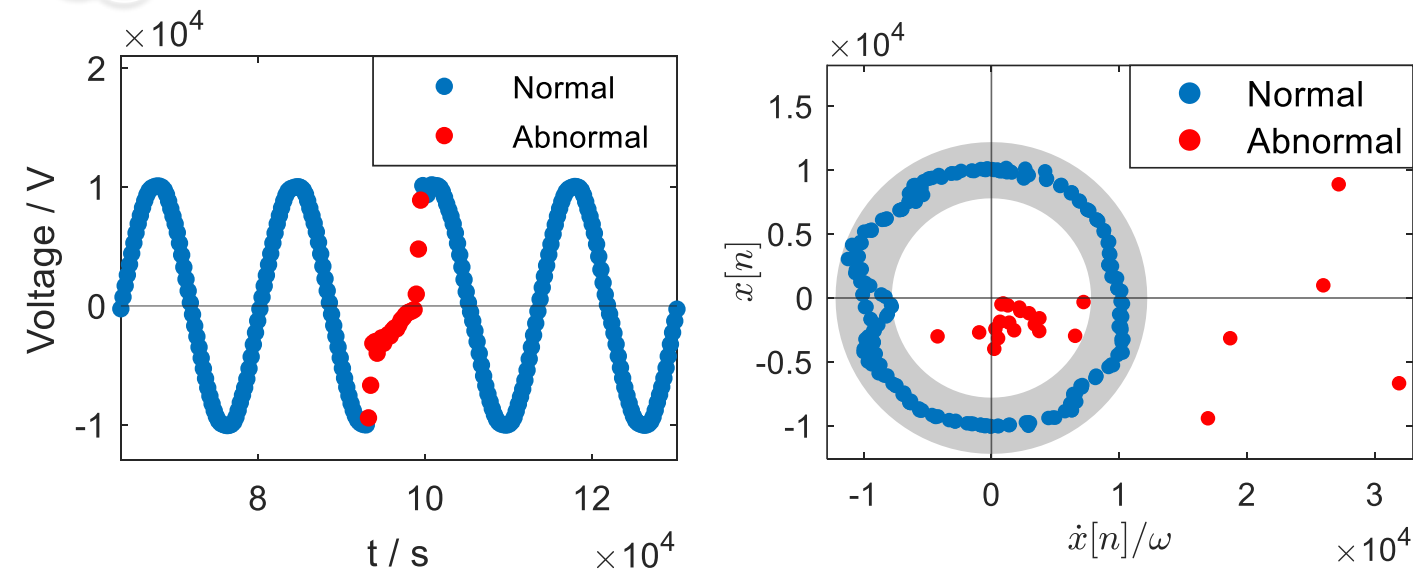


# Distortion Monitoring

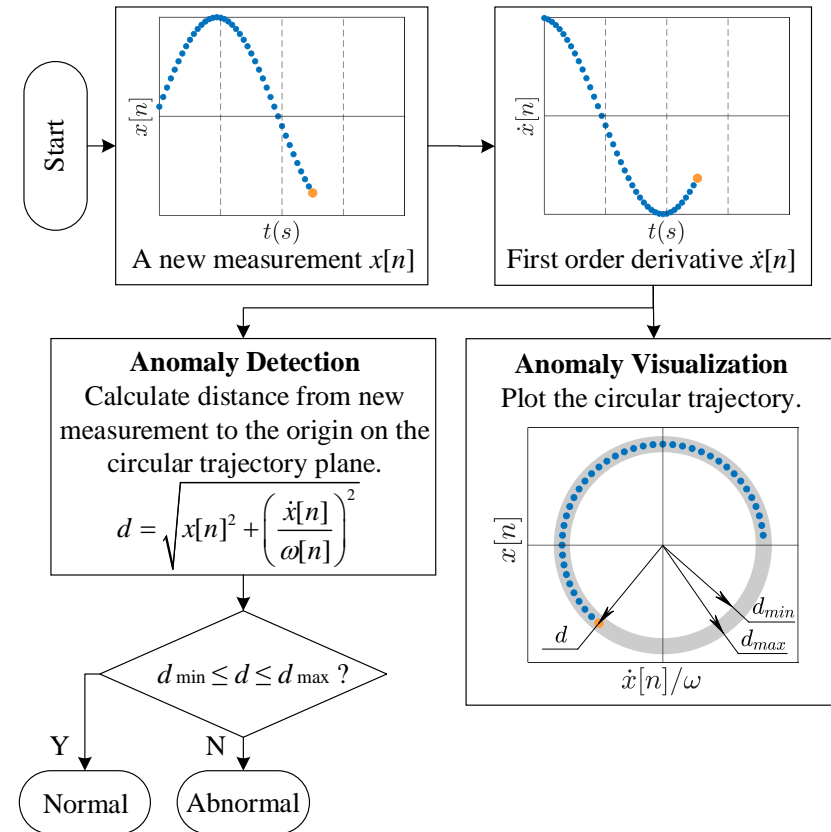
## Anomaly Detection and Visualization

**Why?** To trigger data recording and further analysis.

**How?** Circular Trajectory Approach (CTA)



Haoyuan Sun *et al.*, "Circular Trajectory Approach for Online Sinusoidal Signal Distortion Monitoring and Visualization," IEEE Trans. on Smart Grid (PES letter), July 2022.



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# Waveform Data Pre-processing



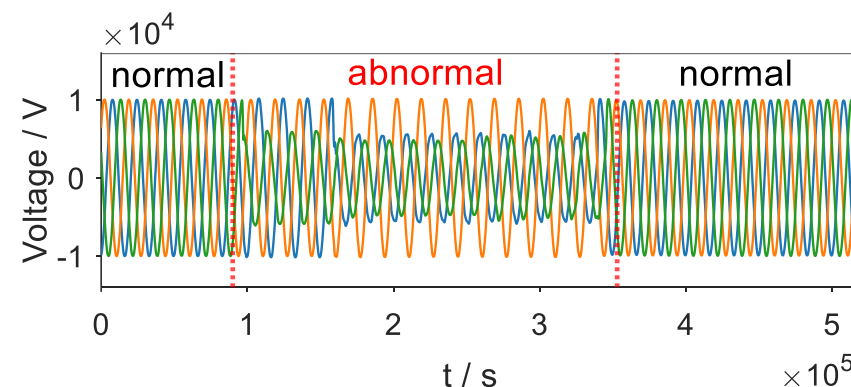
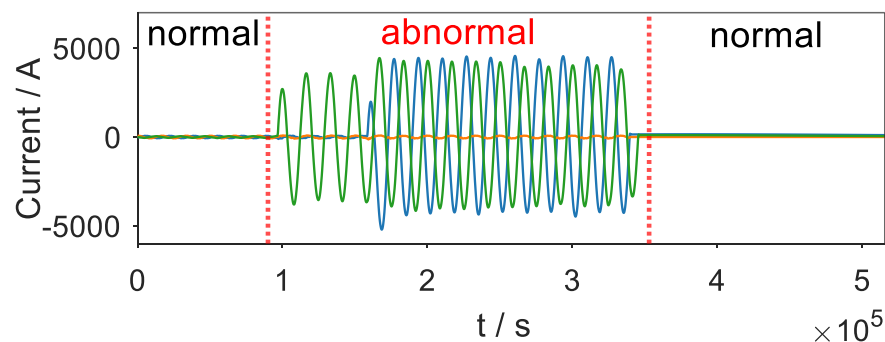
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## Waveform Truncation

**Why?** To remove normal segments and thus focus on abnormal segments.

**How?** (1) Circular Trajectory Approach (CTA)  
(2) Residual Component Method

Take the difference of a cycle and its previous cycle.



# Waveform Data Pre-processing



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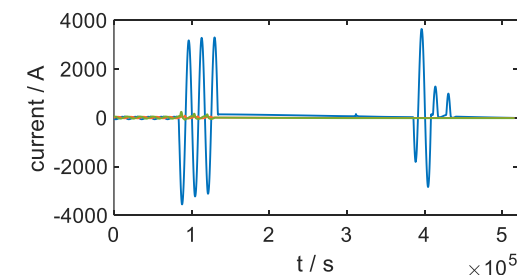
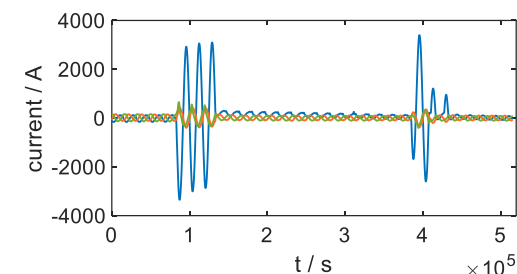
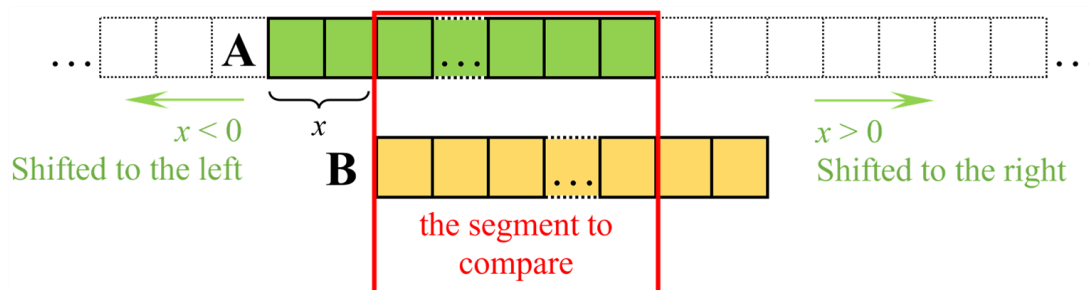
## Remove Repetitive Waveforms

Why?

- (1) One event could be recorded by multiple devices.
- (2) Two waveforms may not be perfectly aligned along the time axis.

How?

- (1) Euclidean Distance  
To measure similarity of two waveforms.
- (2) Waveform Shifting  
We look for the highest similarity along the shifting.



# Waveform Data Pre-processing

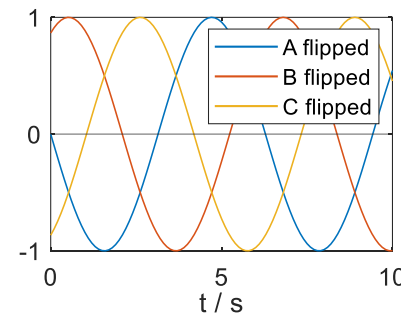
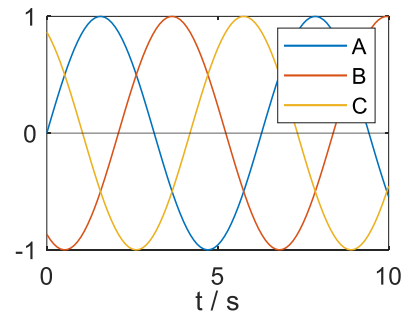
## 6x Data Augmentation

**Why?**

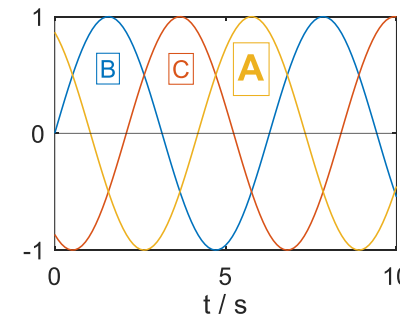
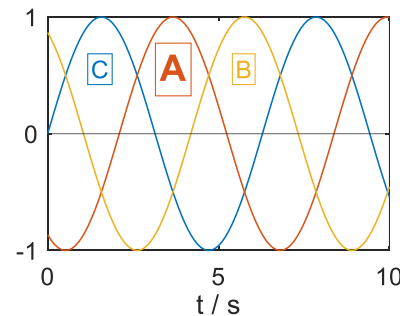
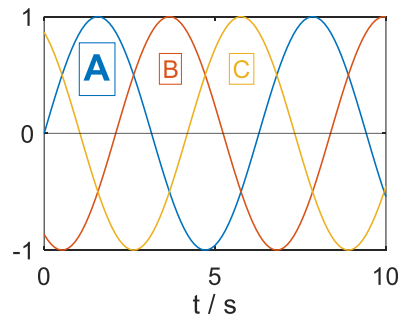
To enrich the inherently insufficient outage data.

**How?**

(1) Flipping (2x data)



(2) Alternating phase sequence (3x data)



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# Conclusions



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- We first present a general solution for sine wave distortion monitoring and visualization — the Circular Trajectory Approach (CTA).
- We then provide three broadly applicable techniques for waveform data pre-processing. These techniques help machine learning algorithms to achieve better efficiency and better accuracy.