

Categorizing Applications Driven by Time-Synchronized Data

PingThings



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Agenda

1. A First Attempt
2. Problem Statement
3. Motivation
4. The Johari Window
5. Proposed Ontology
6. Examples

ABSTRACT

The space of applications enabled by time-synchronized grid measurements is usefully described by the concept of the Johari Window, borrowed from psychology, which sorts characteristics known or unknown to oneself, and known or unknown to others, into four categories (open, blind, hidden, and unknown). In our context, we may consider well-known applications (such as oscillation detection and monitoring); applications whose mechanics are understood by the data science community but that have seen limited implementation in the industry (such as event detection and analysis); recognized needs by the industry that are not supported by available tools; and finally, those categories of data-driven applications of which we have not yet conceived and that may challenge and even invalidate fundamental industry assumptions.

This talk provides an overview of a multi-organization effort to build a hierarchy or ontology of use cases for applications driven by time synchronized grid sensors including transmission synchrophasors, distribution synchrophasors, and continuous point-on-wave (CPOW) devices. We present a grammar of data-driven use cases -- a way of deconstructing use cases into relevant defining characteristics to better understand and categorize each. Finally, we explore and discuss the industry and market dynamics that drive value creation from grid sensors for electric utilities. These drivers explain why vendors and other participants in the industry have favored certain types of applications while other categories have been largely ignored.

SYNCHROPHASOR TECHNOLOGY

FURTHER READING

applied sciences **MDPI**

Article

A Novel Framework for Synchrophasor Based Online Recognition and Efficient Post-Mortem Analysis of Disturbances in Power Systems

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Featured Application: Synchrophasor based data compression and post-mortem analysis as well as online detection and classification of grid disturbances.

Abstract: Synchrophasor based applications become more and more popular in today's control centers to monitor and control transmission systems events. This can ensure secure system operation when dealing with bidirectional power flows, diminishing reserves and an increased number of active grid components. Today's synchrophasor applications provide a lot of additional information about the dynamic system behavior but without significant improvement of the system operation due to the lack of interpretable and condensed results as well as missing integration into existing decision-making processes. This study presents a holistic framework for novel machine learning based applications analyzing both historical as well as online synchrophasor data streams. Different methods from dimension reduction, anomaly detection as well as low-rank matrix classification are used to automatically detect disturbances combined with a web-based online visualization tool. This enables automated decision-making processes in control centers to mitigate critical system states and to ensure secure system operation (e.g., by activating curtail control actions). Measurement and simulation-based results are presented to evaluate the proposed synchrophasor application modules for different use cases at the transmission and distribution level.

Keywords: disturbance detection; data compression; post-mortem analysis

1. Introduction

The electrical power system is in a transition process. While the number of converter-interfaced renewable generation sites, conventional power plants are decommissioned, which leads to a reduced system inertia and slow volatility in the electrical power system [1,2]. The deregulation of electricity generation and unbundling of the market from transmission and distribution tasks introduces additional challenges [3]. Thus, today's control room operators are facing a large number of events during daily system operation. To address these challenges, synchrophasor measurements and wide area monitoring (WAM) systems are deployed worldwide in power system control rooms [4]. Being a valuable resource to observe and understand the dynamics of power systems, they additionally enable a new quality of operator decision support functions, assistant systems and automated control [4–6].

applied sciences 2020, 14, 3208; doi:10.3390/app14073208

Pacific Northwest NATIONAL LABORATORY

PNL 3072

Advanced Power Systems Measurements

A Literature Review

December 2020

Jim Follum
Emily Ellingov
Pavel Etingov
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Harold Kirkham
Laurie Miller
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ENERGY Prepared for the U.S. Department of Energy under Contract DE-AC05-78OR21400

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PNL 3042

Machine Learning for Synchrophasor Analysis

Final Project Report

September 2020

Huiying Ren
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PNL 3043

Open Source Suite for Advanced Synchrophasor Analysis

Final Project Report

September 2020

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Ranika Huang
Tamara Becejac
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ENERGY Prepared for the U.S. Department of Energy under Contract DE-AC05-78OR21400

FINAL TECHNICAL REPORT

Phasor-Measurement-Unit-Based Data Analytics Using Digital Twin and PhasorAnalytics Software

WORK PERFORMED UNDER AGREEMENT
DE-0E000915

GE Research
One Research Circle
Niskayuna, NY, 12309

Period of Performance: 10/01/2019 to 7/31/21
Report Number: DOE-GE-000915-1

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SPONSOR
U. S. Department of Energy (DOE) Office of Electricity
Administrator: U.S. DOE / National Energy Technology Laboratory (NETL)
DOE Project Officer: Carol Pantor

IEEE SA ASSOCIATION

IEEE Guide for Synchronization, Calibration, Testing, and Installation of Phasor Measurement Units (PMUs) for Power System Protection and Control

STANDARDS

IEEE Power and Energy Society

Developed by the Power System Relaying and Control Committee

IEEE Std C37.247™-2021
(Revision of IEEE Std C37.247-2013)

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International Journal of Electrical Power and Energy Systems

State-of-the-art of data collection, analytics, and future needs of transmission utilities worldwide to account for the continuous growth of sensing data

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ABSTRACT
Nowadays, transmission systems require higher degree of observability to real-time to gain operational awareness and improve the decision-making process to guarantee a safe and reliable operation. Digitization of energy systems allows utilities to monitor the system dynamic performance to maintain the safe state. This paper presents the ability assessment and control of the system. Motivated by these challenges, a group of experts have worked together to highlight and establish a baseline of their respective research, which can be used as a reference for proper literature analysis and data-driven solutions. In this document, the results of a survey on 32 novel, advanced system operators and data-driven approaches. In this document, the results of a survey on 32 novel, advanced system operators and data-driven approaches. In this document, the results of a survey on 32 novel, advanced system operators and data-driven approaches. In this document, the results of a survey on 32 novel, advanced system operators and data-driven approaches.

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Pacific Northwest NATIONAL LABORATORY

PNL 3075

Phasors or Waveforms:

Considerations for Choosing Measurements to Match Your Application

April 2021

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ENERGY Prepared for the U.S. Department of Energy under Contract DE-AC05-78OR21400

energies **MDPI**

Review

Research Trends and Applications of PMUs

Gian Piazzi ^{1,*}, Arturo Bretas ^{2,3} and Sean Meyn ¹

Abstract: This work is a survey of current trends in applications of PMUs. PMUs have the potential to solve major problems in the area of power system estimation, protection, and stability. A variety of methods are being used for these purposes, including statistical techniques, mathematical transformations, probability, and AI. The results produced by the techniques reviewed in this work are promising, but there is work to be done in the context of implementation and standardization. As the smart grid initiative continues to advance, the number of intelligent devices monitoring the power grid continues to increase. PMUs are at the center of this initiative, and as a result, each year more PMUs are deployed across the grid. Since their introduction, physical solutions based on PMU technology have been suggested. The high sampling rates and synchronized measurements provided by PMUs are expected to drive significant advancements across multiple fields, such as the protection, estimation, and control of the power grid. This work offers a review of contemporary research trends and applications of PMU technology. Most solutions presented in this work were published in the last five years, and techniques showing potential for significant impact are highlighted in greater detail. Being a relatively new technology, there are several issues that must be addressed before PMU-based solutions can be successfully implemented. This survey found that key areas where improvements are needed include the establishment of PMU observability, data processing algorithms, the handling of heterogeneous sampling rates, and the optimization of the measurement infrastructure for PMU communication. Solutions based on Bayesian estimation, as well as those having a distributed architecture, show great promise. The material presented in this document is tailored to both new researchers entering this field and experienced researchers wishing to become acquainted with emerging trends.

Keywords: PMU; synchrophasor; wide area measurement systems; WAMS; power system estimation; power system protection; power system monitoring; power system stability; smart grid

1. Introduction

The introduction of the phasor measurement unit (PMU) has unlocked a new realm of possibilities for researchers and engineers. Today, solutions based on PMU technology expand across multiple areas of research. From state estimation to protection, the PMU is driving exciting solutions that have the potential to revolutionize the power grid, and given the ever-increasing number of PMUs installed on the grid, many of these solutions could become feasible in the near future. High sampling rates, combined with the synchronization of measurements provided by PMUs, make it possible to detect dynamics that are invisible to traditional meters. For example, in the context of system modeling, PMUs offer a dynamic view into the behavior of a system, which makes it possible to derive system parameters with greater accuracy which, in turn, leads to improved estimation, control, and protection. In the context of state estimation, PMUs are expected to be the foundation of dynamic state estimation (DSE) which will allow grid operators to make decisions based on real-time data. In terms of protection and control, PMUs could be used to improve corrective actions in the presence of disturbances due to their ability to synchronize measurements across large

Final Scientific/Technical Report

Combinatorial Evaluation of Physical Feature Engineering, Classical Machine Learning, and Deep Learning Models for Synchrophasor Data at Scale

WORK PERFORMED UNDER AGREEMENT
DE-0E000914

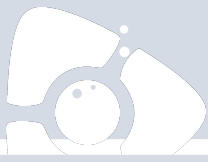
PingTing Analytics
1220 S Street, Suite 150
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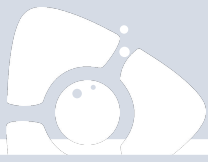


SYNCHROPHASOR TECHNOLOGY

USE CASE TAXONOMY

Each **category** is mapped to one or more **use cases**, and each **use case** is mapped to one or more **objective**. Further, each **use case** is assigned applicability to the transmission system (T), distribution system (D) or both (T&D). Use cases that only pertain to D are omitted from these slides.

| Category | Use Case | Monitoring | Control | Planning | Analysis | T or D |
|---|--|------------|---------|----------|----------|--------|
| Wide area visualization | Improved wide area situational awareness (T&D) | X | | | | T&D |
| | Integration of customer site FNET information | X | | X | X | T&D |
| | Visualization of dynamic system response | X | X | X | X | T&D |
| Technical and commercial loss reduction | Energy accounting | | | X | | T&D |
| Real-time distribution system operation | Distribution state estimation | | | | X | T&D |
| Power quality assessment and analysis | Flicker measurement | X | | | | T |
| | Harmonic state estimation/diagnosis | X | X | | | T |
| | Harmonics measurement | X | | | | T |
| | Short-duration interruption measurement | X | | | | T |
| | Voltage and current imbalance measurement | X | | | | T |
| | Voltage sag and swell measurement | X | | | | T |
| Integrated Gen, Tx, and Dx system planning & analysis | Integrated Gen, Tx, and Dx system planning & analysis | | X | X | X | T&D |
| Improved stability management | Control instability, hunting, or oscillation detection - voltage, var, switching | X | X | | | T&D |
| | Fault Induced Delayed Voltage Recovery (FIDVR) detection | X | | | X | T |
| | Voltage stability monitoring and control | | | | X | T&D |
| Improved load shedding schemes | Improved load shedding schemes - frequency | | X | | | T |
| | Improved load shedding schemes - load flow based | | X | | | T |
| | Improved load shedding schemes - voltage | | X | | | T |
| | Load shedding real time compensative arming to balance 1547 compliant PV | | X | | | T |
| High-accuracy fault detection and location | Falling conductor protection | | | X | | T |
| | High accuracy fault location | X | | | X | T |
| | High impedance fault location | X | | | X | T |
| | Incipient fault & failure detection | X | | | X | T |
| | Open conductor fault detection | X | | | X | T |
| Distribution load, DER, and EV forecasting | DER forecasting | | | X | X | T&D |
| | EV forecasting | | | X | X | T&D |

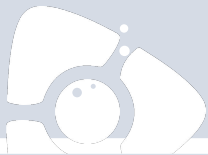


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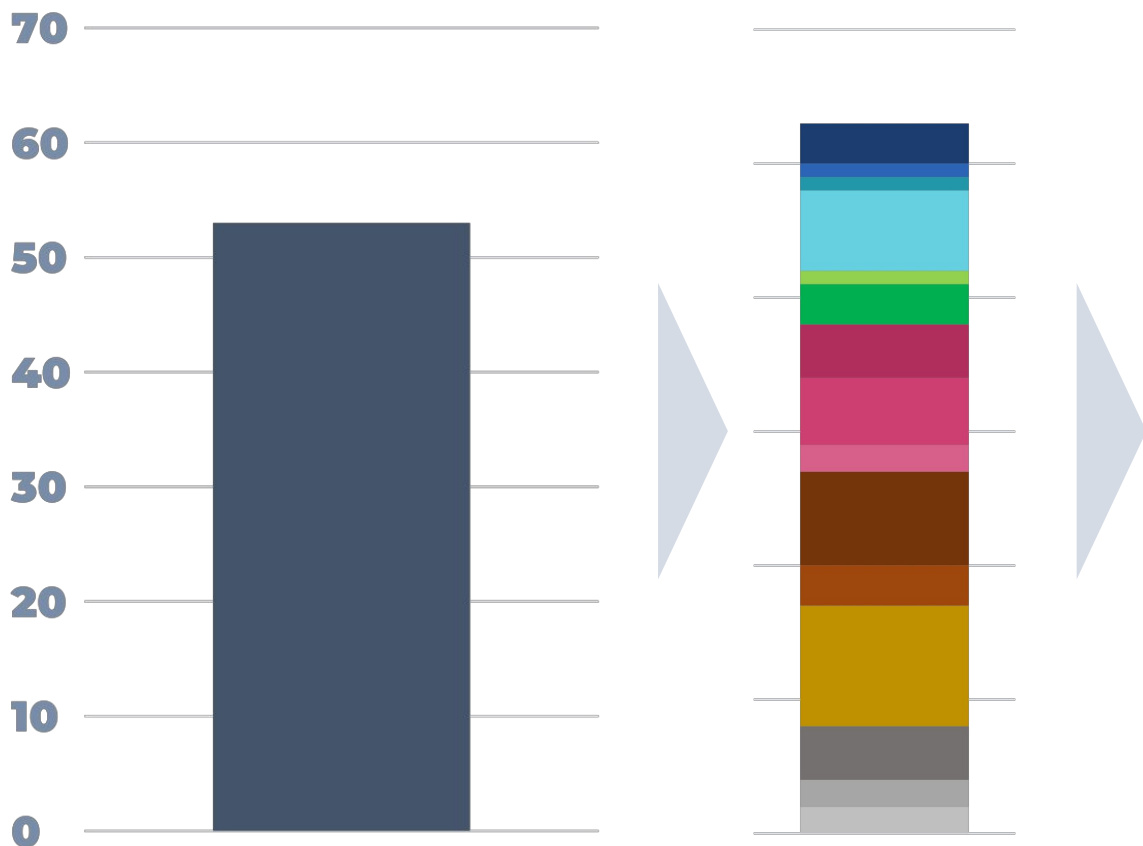
| Category | Use Case | Monitoring | Control | Planning | Analysis | T or D |
|--|---|---|---------|----------|----------|--------|
| DER integration | Active and reactive reverse power flow management | X | X | X | | T&D |
| | DER management and energy balancing with energy storage | | X | | | T |
| | Inertia estimation for turbine monitoring | X | X | | | T |
| | Load unmasking (behind-the-meter DER) | X | | | | T |
| | Monitoring of intermittent DER | X | | | | T |
| | Site optimization | | | X | | T |
| | Voltage impact assessment and mitigation due to high penetration of intermittent energy resources | | | X | X | T&D |
| Asset management of critical infrastructure | Equipment commissioning | X | | | | T&D |
| | Power apparatus asset management | X | | | | T&D |
| | Underground secondary/spot network monitoring and analysis | X | | | | T |
| Advanced monitoring of distribution grid (linear state estimation) | Active and reactive power flow monitoring | X | | | X | T |
| | FACTS performance validation | | X | | | T |
| | Frequency monitoring | X | | | | T |
| | Monitoring of communications system/equipment performance with management metrics | X | | | | T |
| | Near real-time event monitoring (cyber) | X | X | | | T |
| | Near real-time event monitoring (physical) | X | X | | | T |
| | Phase angle monitoring for voltages and currents | X | | | | T |
| | STATCOM controller design | | X | | | T |
| | Voltage profile monitoring | X | | X | | T |
| | Advanced microgrid applications and operation | Advanced distribution system topology, automation and control (holonic grids) | X | X | | |
| Advanced protection of microgrids | | | X | | | T |
| Islanding detection for distributed generation (anti-islanding scheme) | | X | | | | T |
| Planned islanding and restoration of microgrids | | | X | | | T |
| Advanced distribution system planning | EMS back-up | | X | | | T&D |
| | Phase identification | X | | | | T&D |
| Advanced distribution protection and control | Current differential protection of feeder sections | | X | | | T |
| | Reclosing assistance for fast circuit recovery after fault | X | X | | | T |



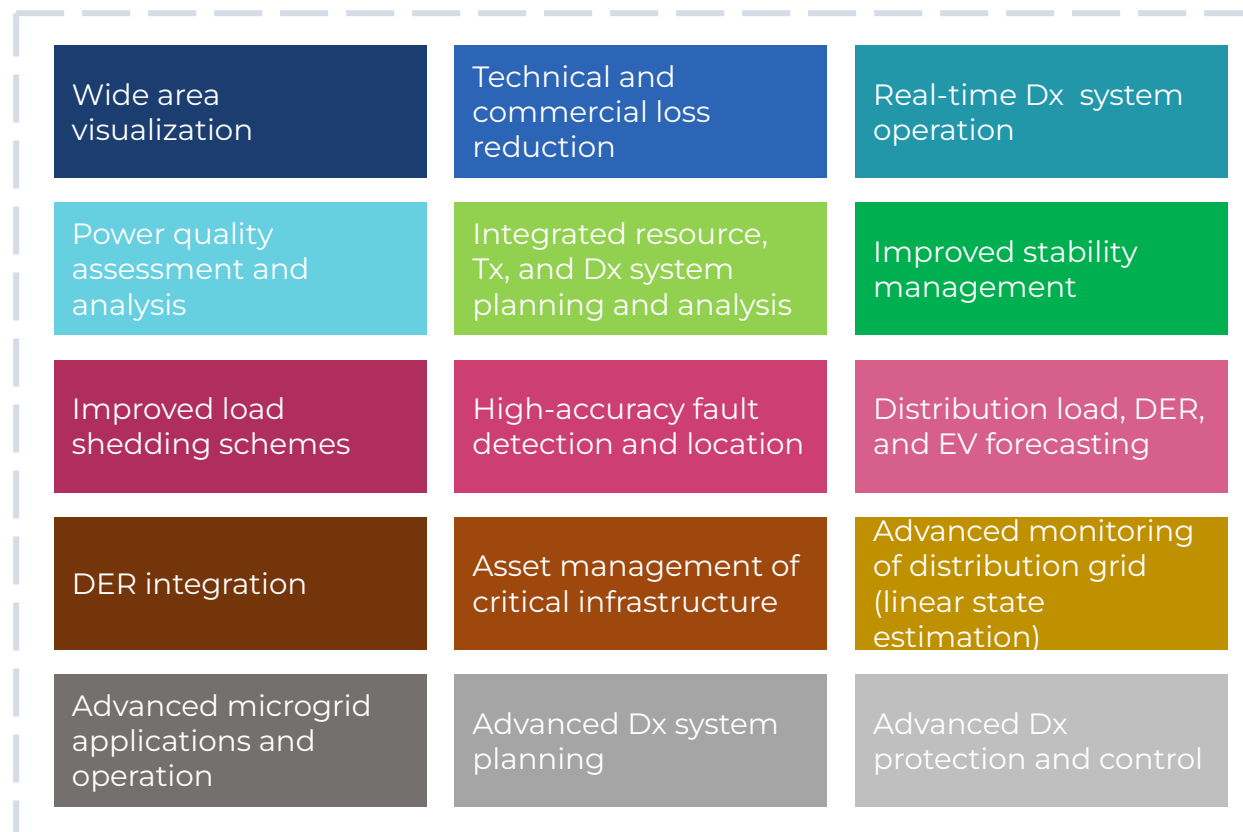
SYNCHROPHASOR TECHNOLOGY USE CASE TAXONOMY

A Darcy-led survey resulted in the identification and classification of **81 use cases** across **19 categories**, each with varying **objectives** (monitoring, control, planning, analysis), **deployment maturity** and **application** (transmission system, distribution system or both). The full list of use cases and categories is available via separate file; the following slides focus only on the **53 use cases** and **15 categories** with applicability to the transmission system.

53 Transmission Use Cases



15 Categories



The Problems with Use Cases

Everyone wants them, no one really understands them.

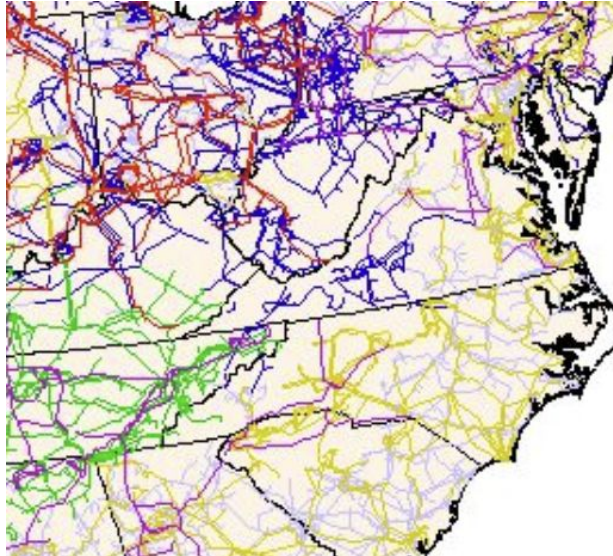
- We can only enumerate use cases retrospectively.
- Language for use cases is lacking.
 - We don't have terms for novel use cases.
 - Many terms are overloaded with multiple meanings (ex: event detection).
- Use cases exist at greatly varying levels of abstractions:
 - from broad capabilities (event detection)
 - to highly specific engineering calculations (impedance calculations).
- Applications tackling the same challenge can do so in radically different ways, yielding vary different use cases.

Line Impedance

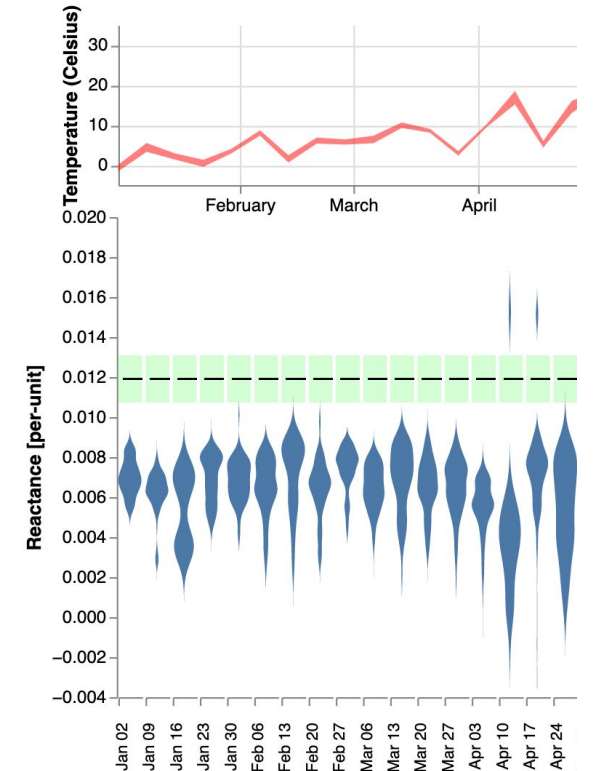
Are these all the same use case?



Calculate transmission line impedance for a single line at a particular point in time.



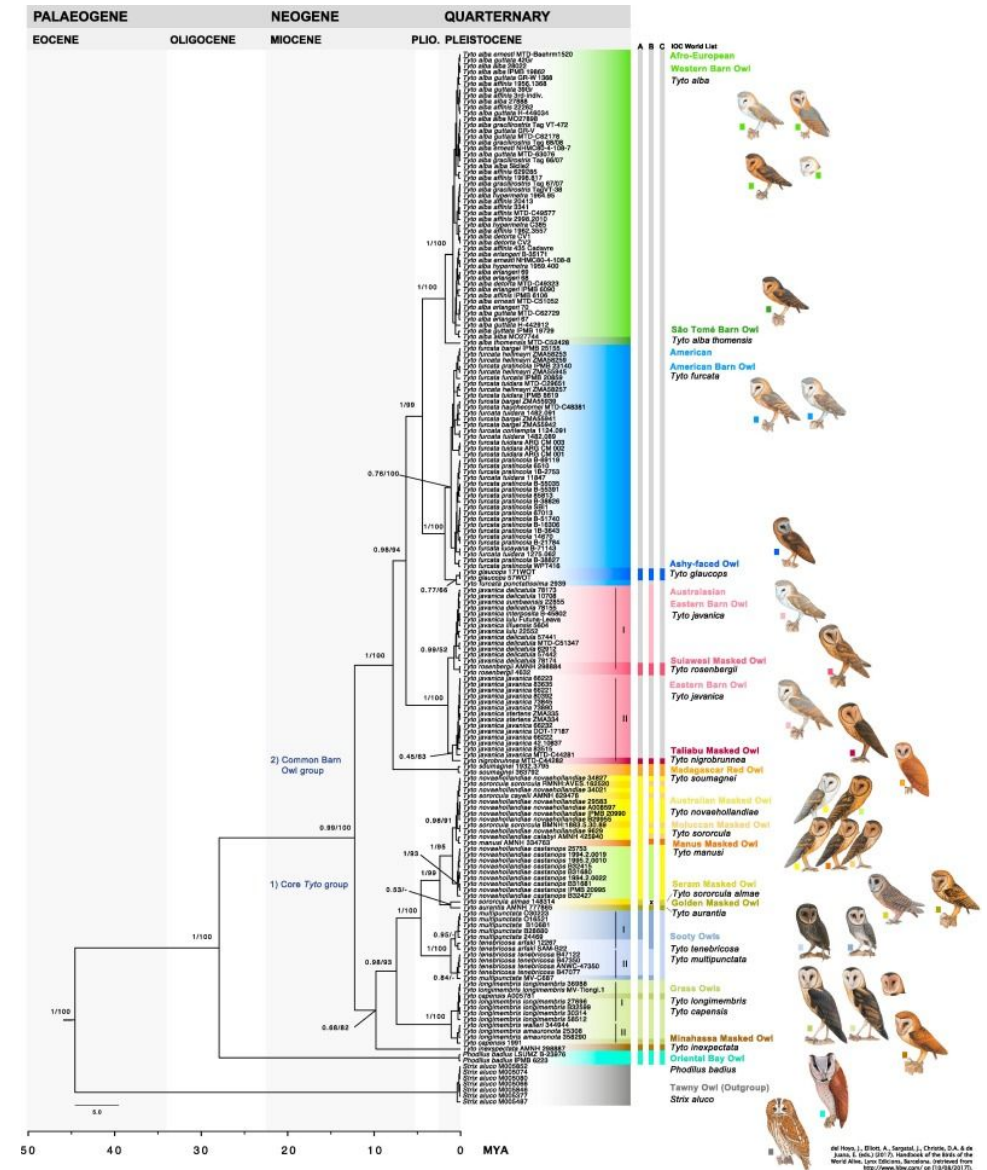
Examine transmission line impedances across the grid at a particular point in time.



Explore transmission line impedance dynamics across time as a function of environmental conditions.

Motivation and Objectives

- Provide a framework to structure thinking about use cases
- Enumerate and explain characteristics that can describe and categorize data-driven use cases
- Understand how existing use cases fit into this framework and can be characterized
- Identify broad areas that are under explored and ripe for exploitation

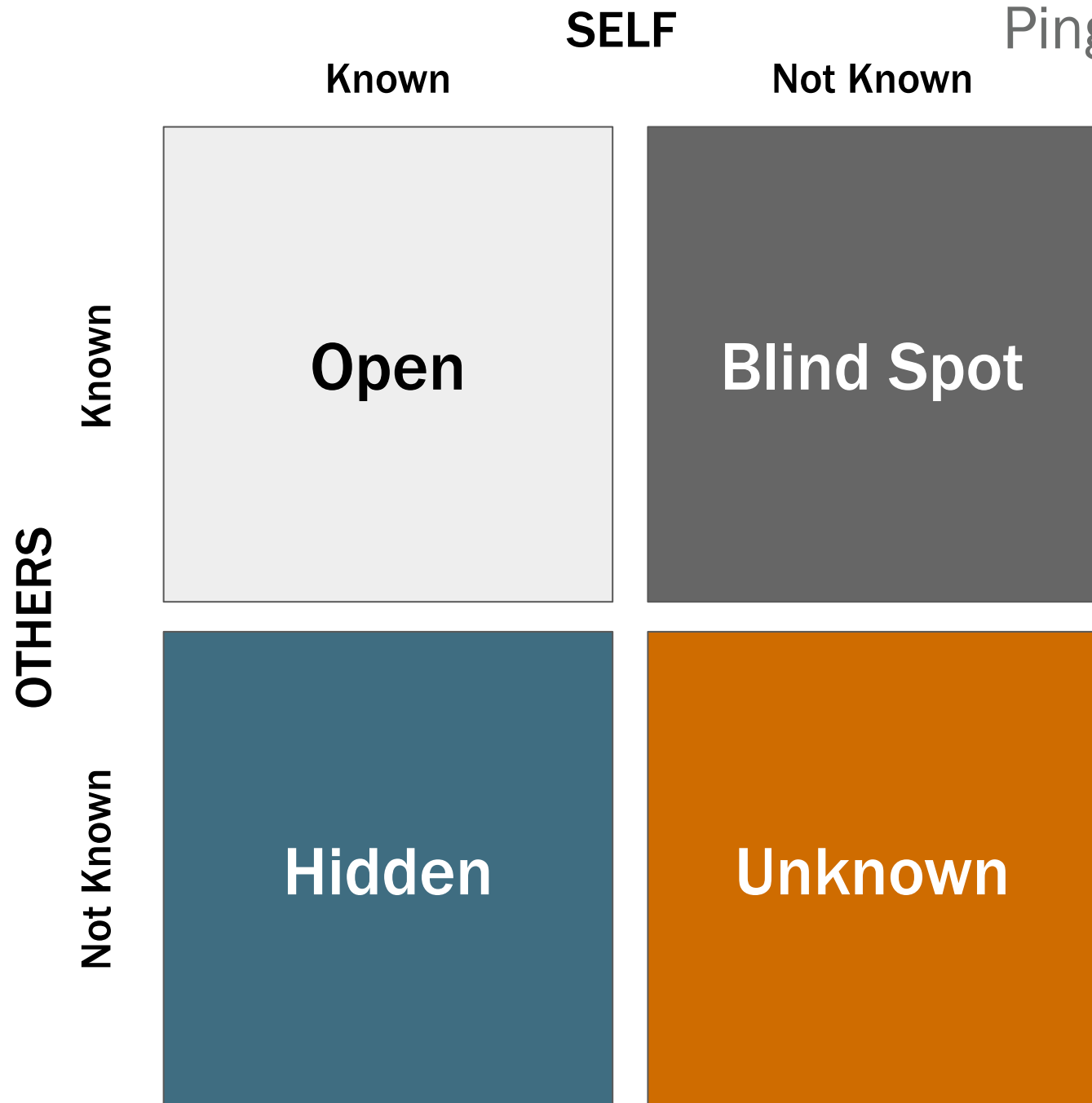


del Hoyo, J., Elliott, A., Sargall, J., Christie, D.A., 2010. *World Bird List*. Version 10.2. BirdLife International, Cambridge, United Kingdom. <http://www.birdlife.org>

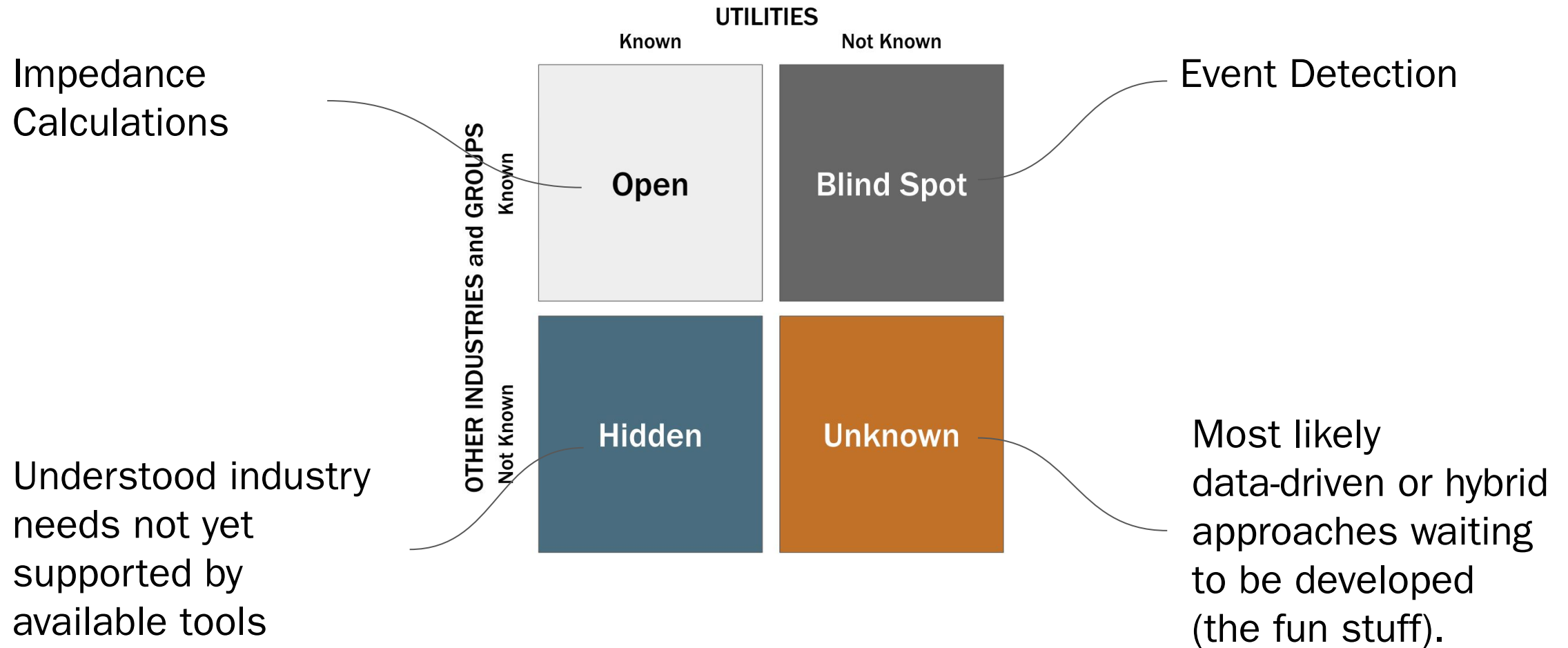
The Johari Window

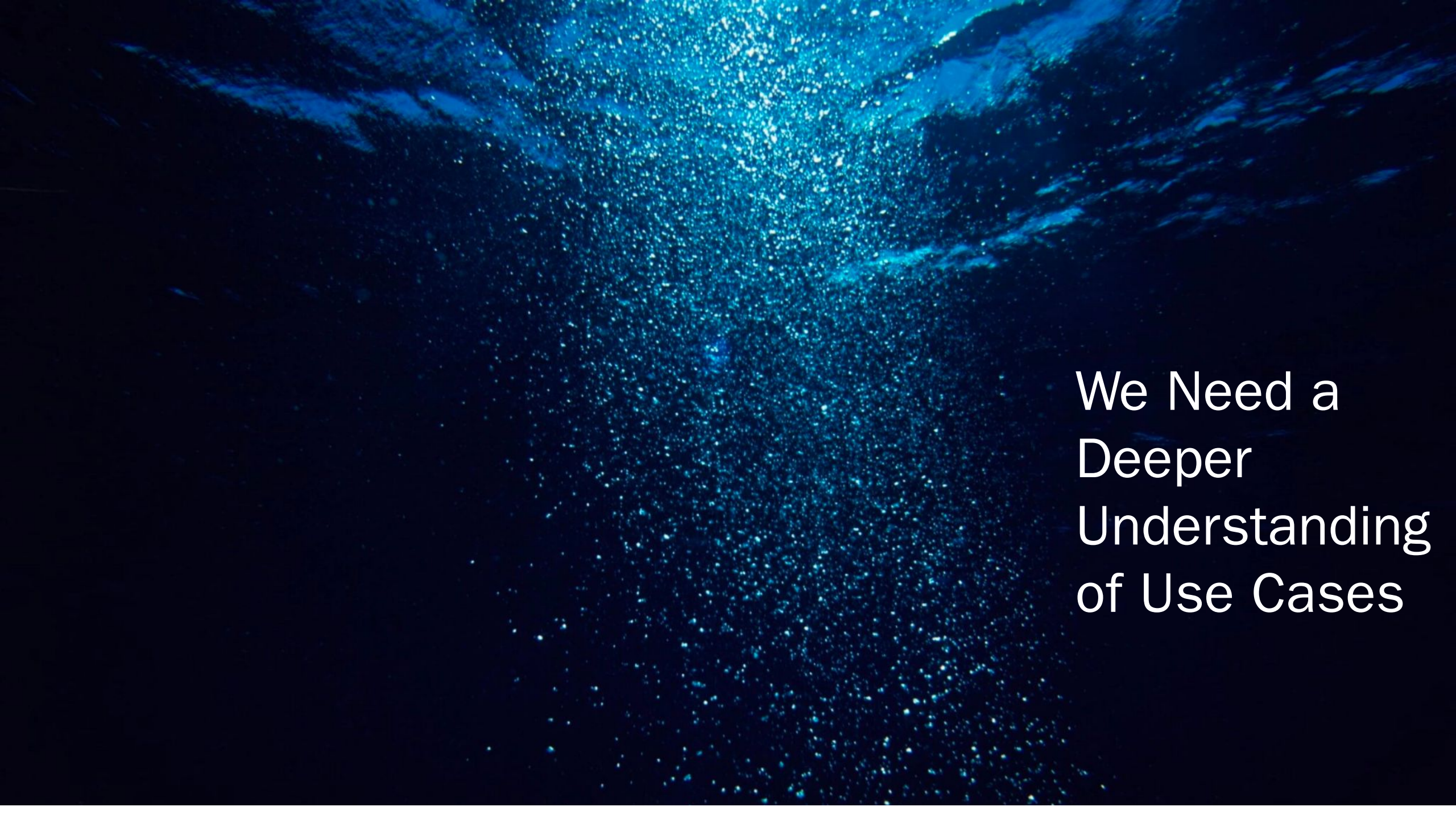
The **Johari window** is a technique^[1] designed to help people better understand their relationship with themselves and others. It was created by psychologists Joseph Luft (1916–2014) and Harrington Ingham (1916–1995) in 1955, and is used primarily in **self-help** groups and corporate settings as a **heuristic** exercise.^{[2][3]}

https://en.wikipedia.org/wiki/Johari_window



The Johari Window - Examples

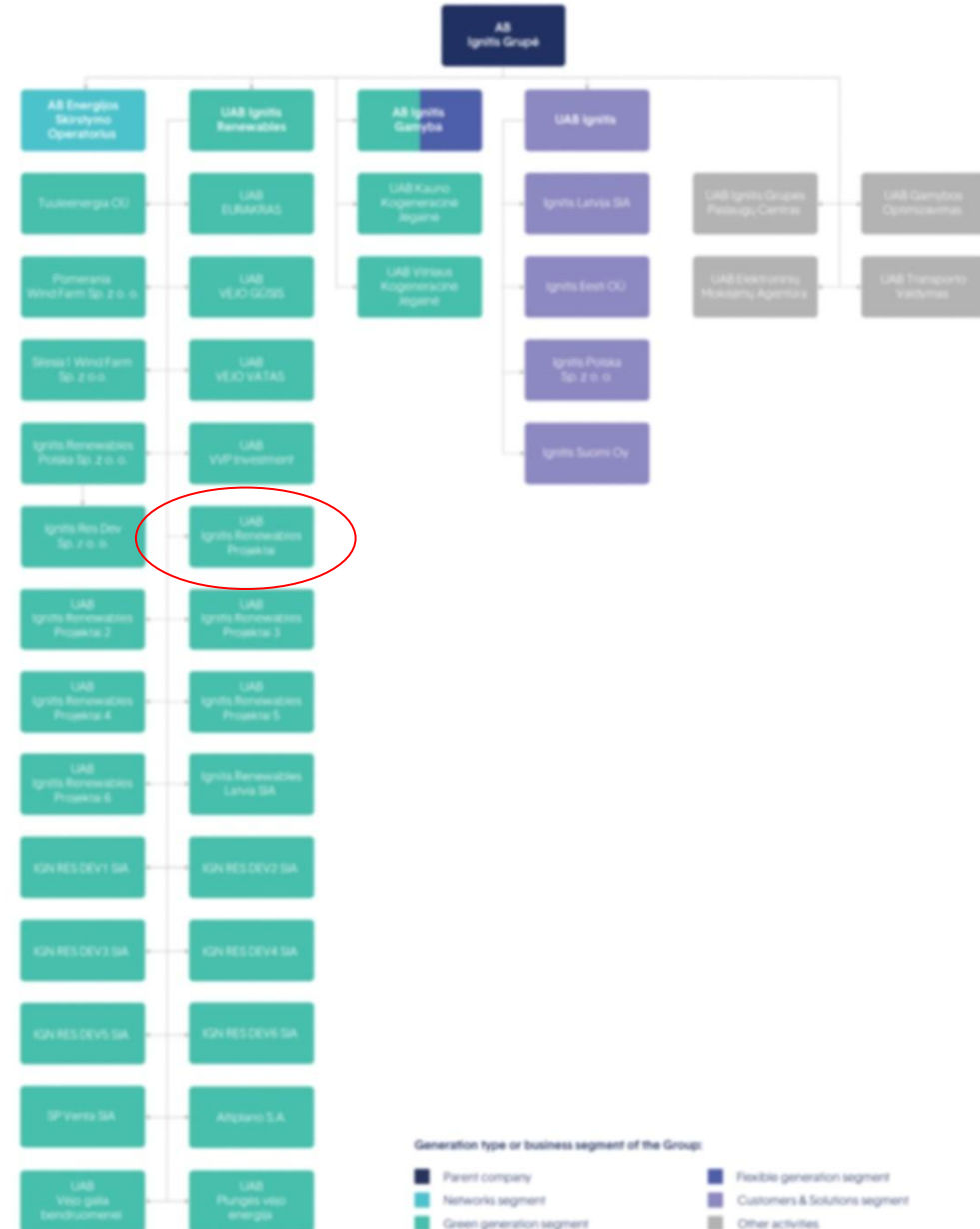


An underwater scene with a deep blue color palette. The water is dark, and a bright blue light source from above creates a shimmering, bubbly column of light that tapers towards the bottom. The bubbles are small and numerous, creating a textured, ethereal effect. The overall mood is mysterious and deep.

We Need a
Deeper
Understanding
of Use Cases

The Owner/Provider

- Who is responsible for the use case?
 - Is this an existing, well understood need?
 - Is this a new need?
 - Does the owner recognize this need?
- What happens if the owner doesn't perform the use case?



The Consumer/Audience

- Who needs to consume this use case?
 - Internal or external?
 - Which groups & departments?
 - Which users specifically?
 - How technical are they?
- If the answer is always the “Control Room,” something is wrong.



The Objective(s)

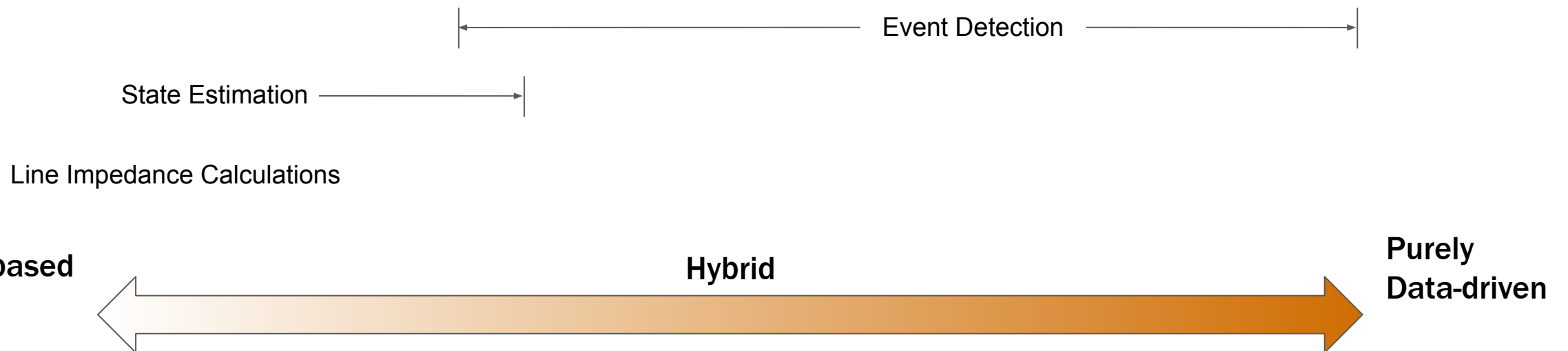
- Why is this use case needed?
- What are the associated KPIs?
- What is the ROI?
- How is the ROI calculated?
- ROI takes time and effort into calculating.
- Many business processes don't have a known ROI, they just are "how things are done."



The Modeling Methodology

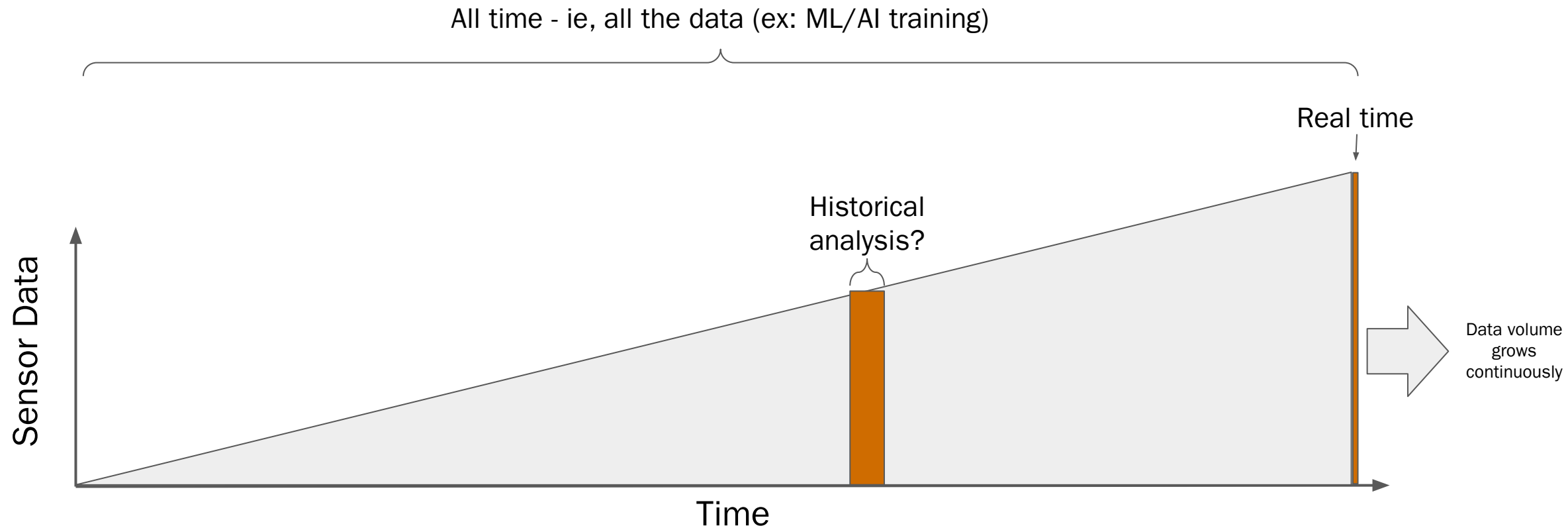
How do we choose to represent the world?

- Strong bias toward traditional, physics-based approaches.
- Purely data-driven models (AI/ML) are underexploited.
- Hybrid approaches are likely to dominate in the future.



The Temporal Location of the Data

When did the data needed for the use case occur?



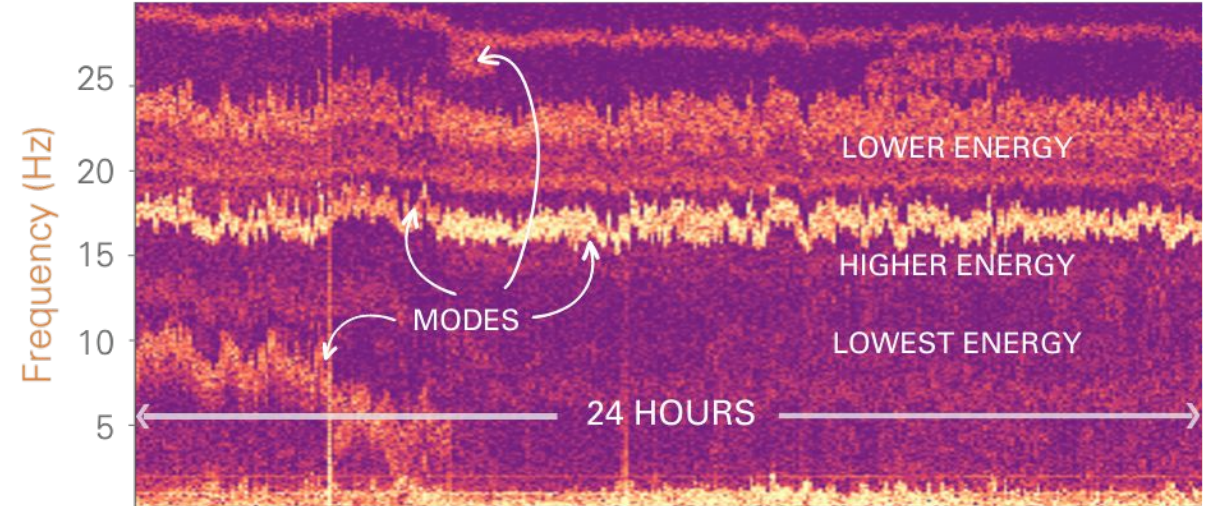
(1) We lack appropriate terminology. (2) Enormous bias toward real time to shrink the size of the data analyzed.

Oscillation Detection vs Oscillation Management

Are these the same use case?

Oscillation Detection

- Are oscillations of sufficient magnitude happening right now?



Oscillation Management

- How have the dynamics of the system evolved over time?
- How close to an impactful oscillatory event are we?
- What is causing each oscillation?
- What is the permanent or seasonal solution to the oscillation?
- What are the operational recommendations to mitigate the event?

The Scope of the Data

Data from how much of the physical world is required for the use case?

- Does the use case apply to:
 - 1 sensor/asset
 - a regional set of devices
 - or the entire system?
- Measurements are time synchronized and meant for comparison

De-energize a line for a
conductor break

State Estimation

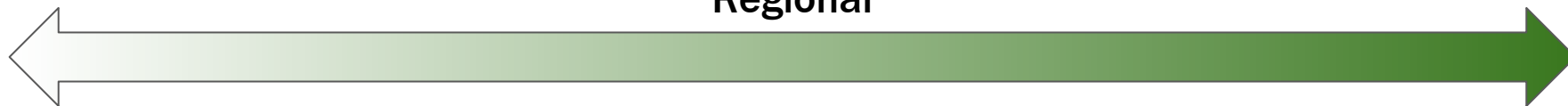
Local
"Edge"

Regional

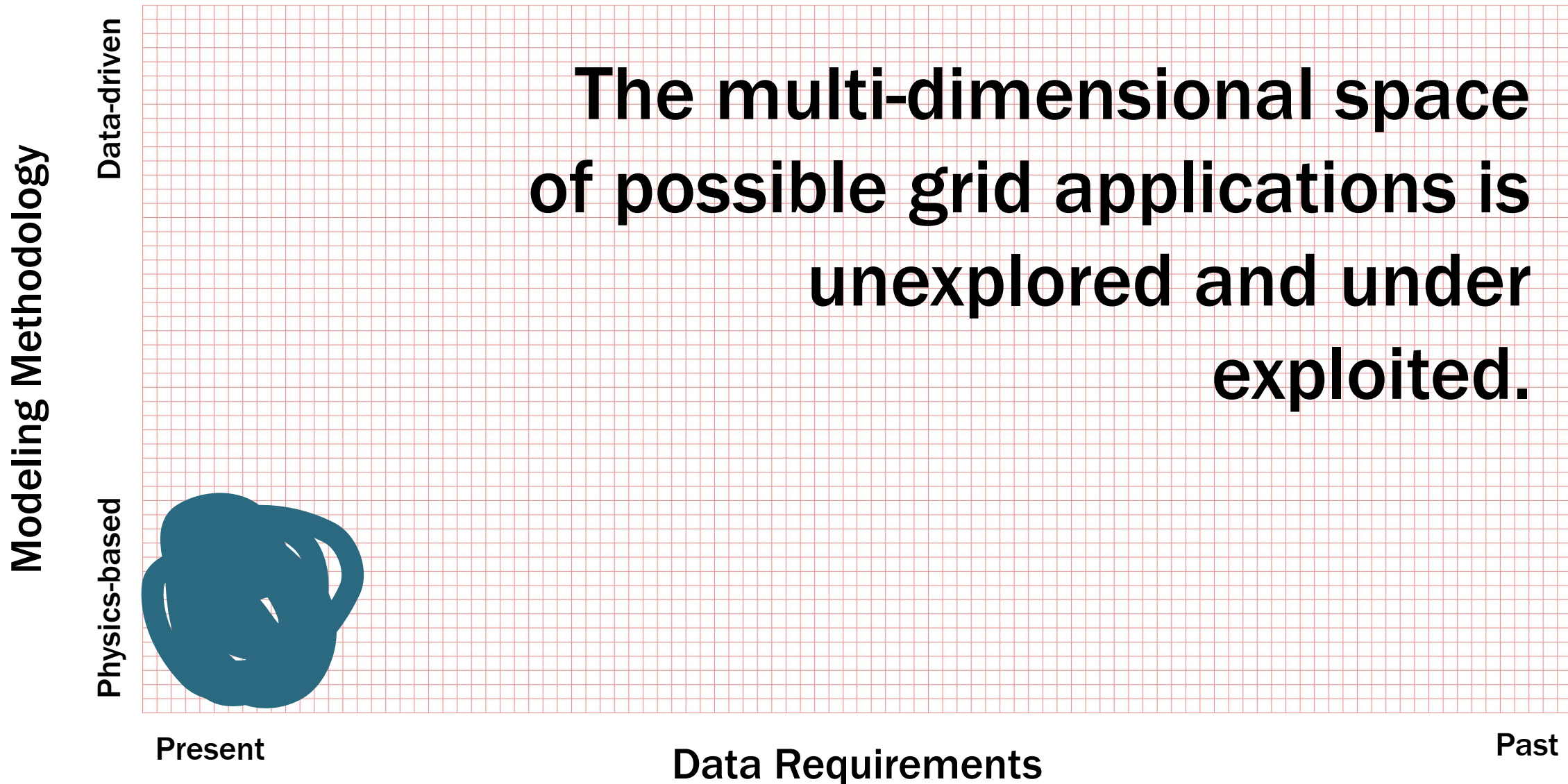
Global
"Centralized"

Less Information

More Information

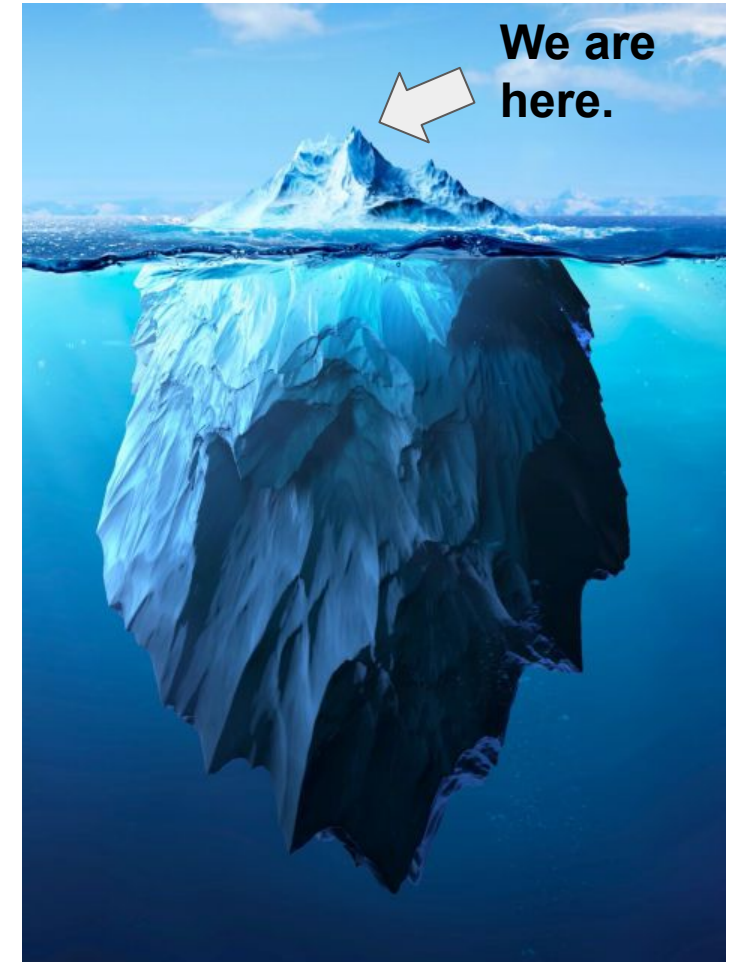


Implications for the Future



Conclusion

- Use cases are the transformation of data and process into some form of business value.
- An industry-wide shared understanding of use cases is critical for ultimate sensor acceptance by utilities.
- The adoption of use cases is the basis for any “digital transformation.”
- These are not the only characteristics that can describe use cases.
- Shared language must be developed to provide clarity for use cases that share a similar calculation or technical foundation.



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