# Assured Machine Learning and Cyber Deployment

### John Dirkman, P.E.

Vice President, Product Management jdirkman@resource-innovations.com

resource innovations



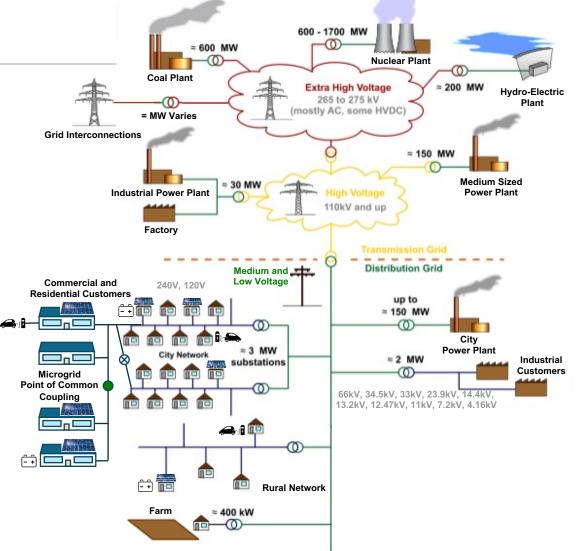
# Electric Grid Organization Complexity and RI Grid Software Solutions

### **Customers Served**

- Electric Transmission and Distribution Utilities
- Independent System Operators
- Energy Traders
- Grid Control System Suppliers (GE, Hitachi Energy, Toshiba, Smarter Grid Solutions)
- Department of Energy via Arizona State University and other partners

# RI Grid software for planning, operational, and financial analytics

- Utilities must always balance supply (generation) and demand (load), or risk voltage and frequency problems which can lead to brownouts and blackouts.
- Variable renewable generation in transmission and distribution contributes to potential unbalance between supply and demand.
- Utilities have less control over the modern grid.





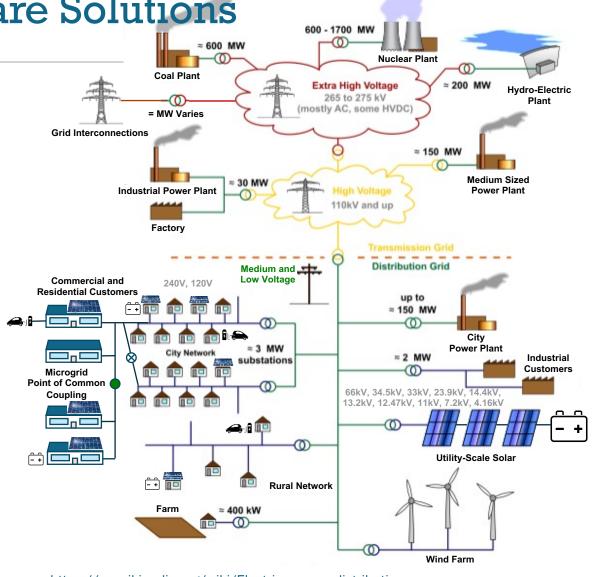
# Electric Grid Organization Complexity and RI Transmission Grid Software Solutions

### Transmission Energy Analytics Software

**Grid360 Engines:** T&D grid planning, operations and analytics

**Day-Ahead Reactive Planning (DARP):** Forecast and optimally dispatch grid resources to mitigate renewable variability, powered by the Grid360 Engines

**Grid360 External Network Modeling (Modelex):** Simplifies and consolidates transmission network models to improve analytical performance

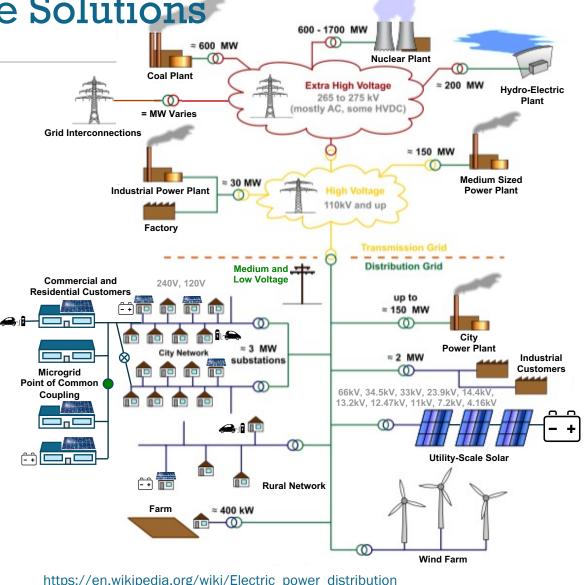


### resource innovations

# Electric Grid Organization Complexity and RI Distribution Grid Software Solutions

### **Distribution Energy Analytics Software**

**Grid360 Distribution Analytics:** Advanced visualization, analytics, and planning applications, enabling demand response, distributed energy resources (solar and wind generation), electric vehicles, cybersecurity, and smart meter analysis and optimization, powered by the Grid360 Engines





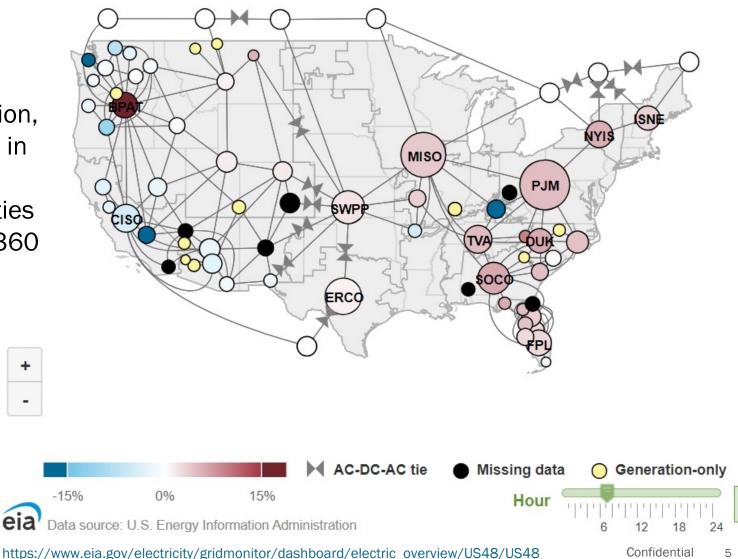
# Electric Grid Organization Complexity and RI Financial Grid Software Solutions

### Transmission Financial Analytics Software

**iHedge:** Energy market financial simulation, analysis, and engagement; used at ISOs in North America and New Zealand for congestion hedging by load serving entities and power traders, powered by the Grid360 Engines

**\$3B** 

Annual FTR Value Managed by iHedge Software





# Tech to Market Approach and Industry Advisory Board

#### Technical approach

Six primary markets: (1) Energy Management Systems (EMS), (2) Distribution Management Systems (DMS), (3) Supervisory Control and Data Acquisition (SCADA), (4) Programmable Logic Controller (PLC), (5) Industrial Control Systems (ICS)/Cyber-Physical Systems (CPS), and (6) IoT devices Integration/add on of new technology without need for wholesale replacement of systems/devices

**Commercialization approach** 

Development of engines is preferred

#### Market segments

EMS/DMS/SCADA: IOU T&D utilities, municipal utilities and cooperatives in North America, T&D utilities in rest of the world PLC/ICS/CPS/IoT: many potential applications

#### Key commercial partners, customers/advisors

Input from Industry Advisory Board (IAB) IAB composed of utility personnel, vendors, system integrators, and academics IAB provides feedback/validation of our proposed approach and market strategy IAB also helps identify early adopters Market via eco-system of utilities, vendors, and system integrators Executed successfully for DOE ARPA-E Sensor Enabled Modeling of Future Distribution Systems with DER and other projects

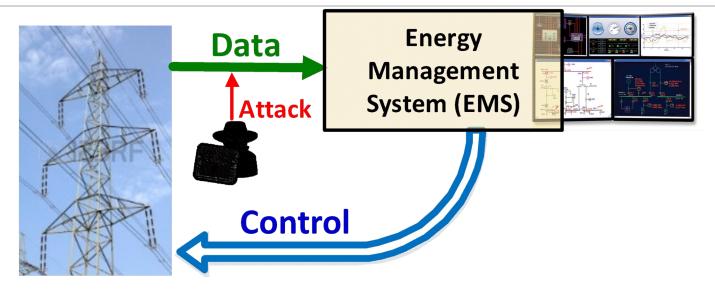
#### Additional commercial activities

Promotion of technology and preliminary outreach to potential customers

Publication of results obtained during project - journals, white papers, conferences, etc.



## Generating and Detecting Mimicking Attacks Tasks 5 and 8



Knowing system configuration, attacker can maliciously change a subset of measurements with counterfeit data before they reach the EMS

Requires attacker to have access to measurement devices or data concentrators

Can be unobservable and result in physical / economic consequences

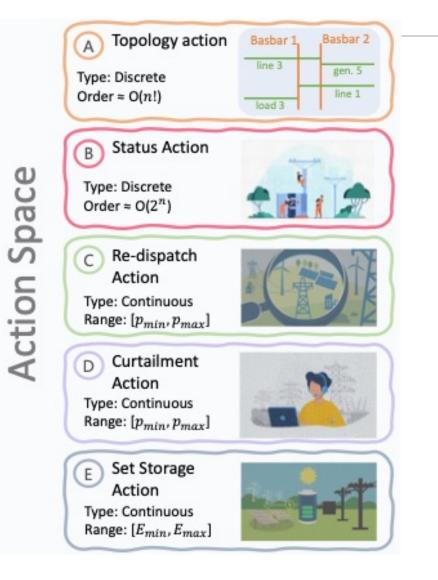


# Generating and Detecting Mimicking Attacks Tasks 5 and 8

- SVR load predictor to accurately predict loads
- SVM attack detector to identify attacks with high accuracy
- Predicted loads are used to mitigate attacks when they are detected
- SVR load predictor and SVM attack detector as separate engines to be applied to EMS and ADMS products



# Large Power Grids: Action Space for RL Task 16





### **Discrete actions:**

- *Topology actions*: changing the topology of certain substations
- Status actions: transmission or power line switching

### **Continuous actions:**

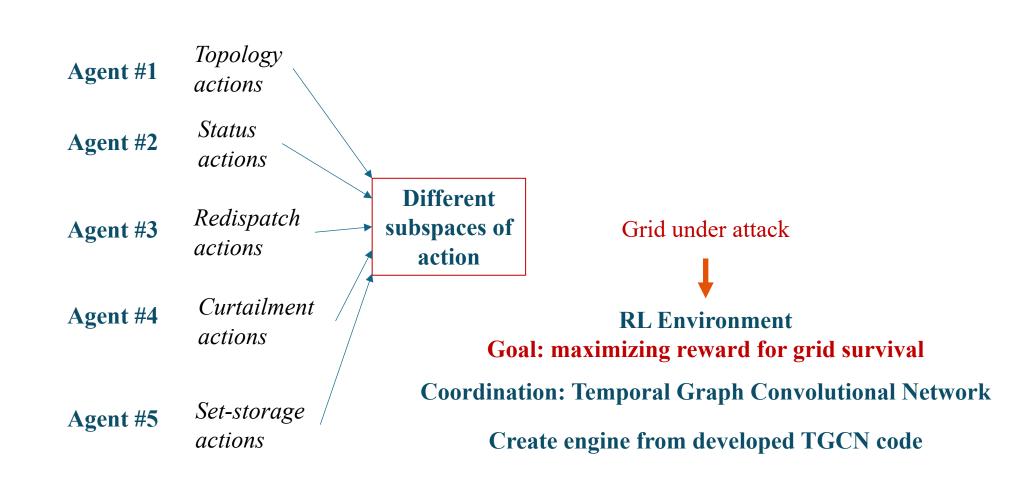
- *Redispatch actions*: changing the operating schedule of power plants
- *Curtailment actions*: limiting the production of renewable generators
- *Set-storage actions*: changing the role of some storage units from loads to generators or vice versa

Example: IEEE 118-Bus system: about 12 million possible actions

Confidential



### Large Power Grids: Action Space for RL Task 16



Confidential



# **Commercialization Efforts – Coding and Testing**

- Ongoing team meetings with ASU and RI
- Discussions on data, testing, and code changes
- Methods for streamlining code
- Testing of algorithms under various industry level simulations
- Methods for visualization in Grid360



### **Commercialization Process**

#### Setup:

- Obtain and install developed code on local machine
- Obtain and install input data on local machine
- Obtain and review user guide/guidance
- Obtain and install third-party applications
- License fee for thirdparty applications
- License structure for commercialization

#### Commercialization Plan and Revenue

- Estimate:
- Lean Canvas
  Discuss product with potential customers
  Revenue Estimate
- Cost of Commercialization
   Price for Product
- Price for Support and Maintenance
- Number of
   Installations
- Revenue from
   Product
- Revenue from
- Support and
- Maintenance • Go/No Go Decision

### Design:

- User Experience:
   Data Input
  - ProcessingOutput/Visualization
  - Review use of thirdparty applications and options for mitigating or not using them
  - Integration with other applications APIs
  - Testing Plan
  - Discuss product design with potential customers

#### Develop:

- User Experience:
- Data Input
- Processing
- Output/Visualization
- Minimize use of thirdparty tools
- Integration with other <u>appl</u>ications APIs
- Testing and defect
- resolution
- Installation and User Guides

#### Deploy:

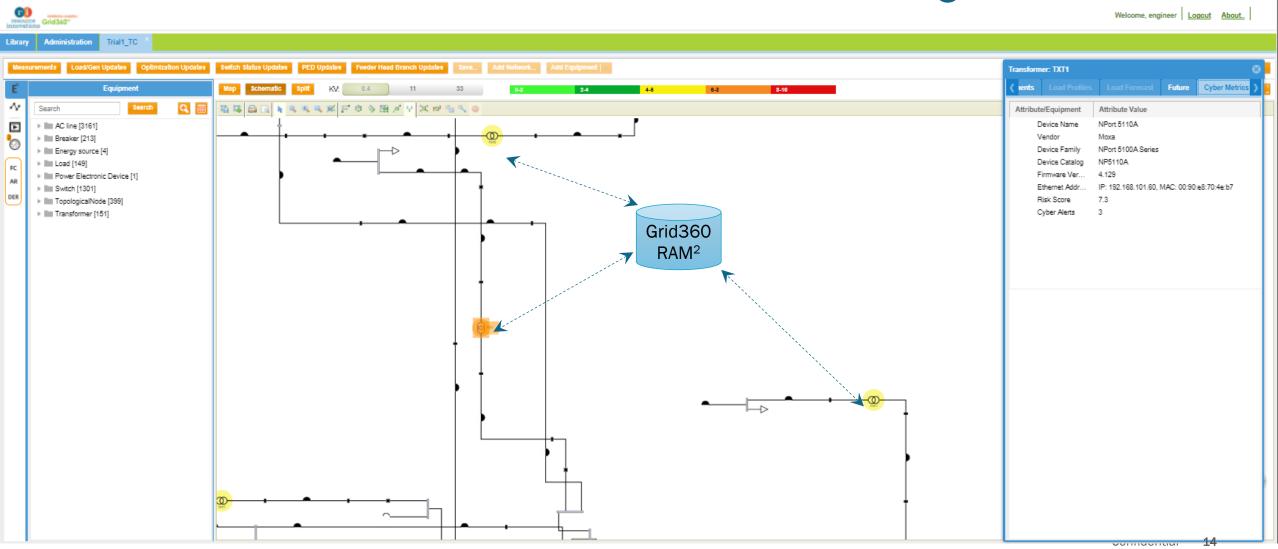
- Marketing Collateral
- Sales Support
- Installation Support
- Training
- Testing and defect resolution
- Ongoing Support

Confidential

		Designed for:		ned by:	Date:	Version:	
The Lean Canvas		Load Prediction, Redistribution Attack Detection and Mitigation		hn Dirkman	9 March 2023	1.0	
Problem	Solution	Unique Value Prop		Unfair Advantage	Customer Segments	4	
Utilities lack software to predict and detect attacks intended to redistribute load measurement data.	Develop software to predict and detect attacks intended to redistribute load measurement data that can work with existing SCADA systems.			<ol> <li>ASU domain knowledge and research.</li> <li>Easier path to commercializatior using Grid360 engines frameword 3. Established sales and delivery channels.</li> </ol>	Worldwide	Electric Distribution Utility Companies Worldwide	
Existing Alternatives	Key Metrics	High-Level Concep	t 🌾	Channels	Early Adopters		
While there have been technical papers published on this topic, no known commercial software currently provides this capability.	Customer contacts, RFP's received, contracts closed.	Use support vector regression (SVR) for enhanced load prediction, then combine with a support vector machine (SVM) classifier to classify incoming load estimate as either normative or attacked.		<ol> <li>Direct to utilities</li> <li>Via business partners: GE, Hitachi/ABB</li> <li>Via SI's: Infosys, Accenture, Capgemini, Deloitte, Guidehous HCL</li> </ol>	Existing RI and busine clients e,	ess partner	
Cost Structure			Revenue Streams				
List your fixed and variable costs: • Business development costs • Software development and testing costs • Sales engineering costs • Project implementation costs			<ul> <li>List your sources of revenue:</li> <li>Software licenses: one-time/perpetual or annual/subscription/SaaS</li> <li>Implementation/integration</li> <li>Ongoing support and maintenance</li> </ul>				

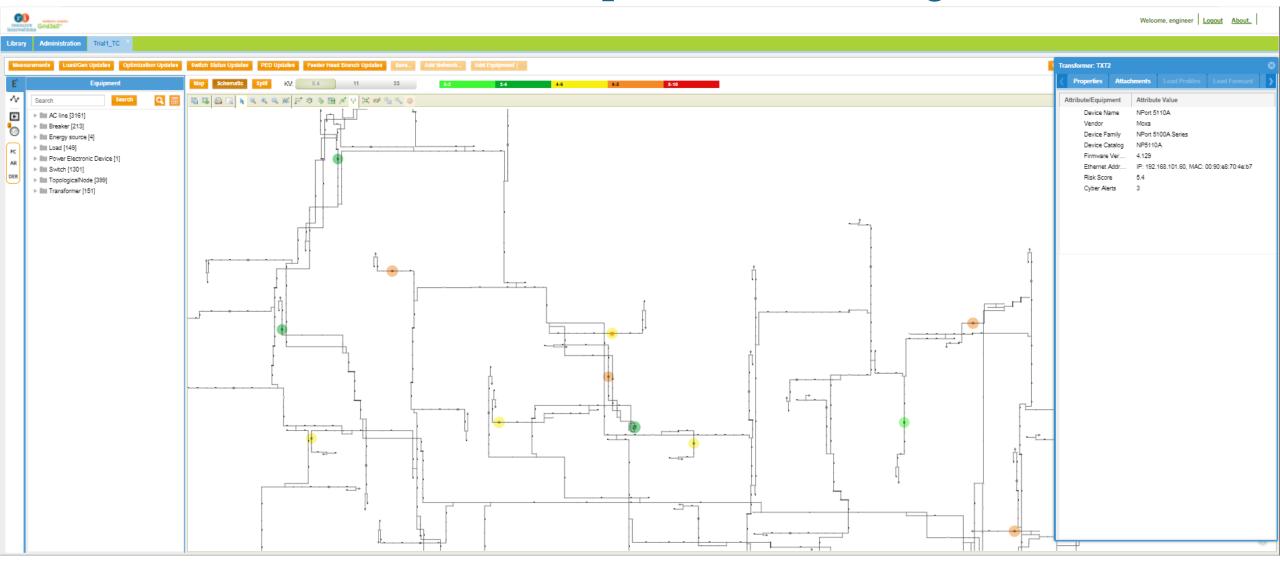


### **Threat Assessment Risk Score – OTORIO Integration**





### Threat Assessment Heat Map – OTORIO Integration



# THANK YOU!

John Dirkman, P.E. Vice President, Product Management jdirkman@resource-innovations.com





U.S. DEPARTMENT OF

# DOE ARPA-E and BIRD ICRDE Grant Projects

### Sensor-enabled Modeling of Future Distribution Systems with Distributed Energy Resources

Partners include Arizona State University, Arizona Public Service, Resource Innovations

- Development of accurate, sensor-driven mathematical models of APS distribution feeders, loads, and dispatchable resource assets
- Development of monitoring and control algorithms for optimal scheduling of DERs
- Technology to Market strategy via Industry Advisory Board

### Stochastic Optimal Power Flow for Real-time Management of Distributed Renewable Generation and Demand Response

Partners include Arizona State University, Resource Innovations, Sandia National Labs, PJM, MISO, NREL

- Prototype software for stochastic Security Constrained Economic Dispatch (SCED)/ Stochastic Look-Ahead Commitment (SLAC), scalable for large systems with high percentage of renewable generation (stochastic resources)
- Forecast algorithms for bulk and distributed wind and solar generation
- Classification and aggregate modelling of DR

### <u>Comprehensive Cybersecurity Technology for Critical Power Infrastructure Al-based Centralized Defense and Edge</u> <u>Resilience</u>

Many partners, utilities include Arava Power, Duquesne Light Company, Arizona Public Service, Delek US

Support research, development, testing, and commercialization of software to harden utility EMS, DMS, and SCADA
against cyberattacks