

# **Faculty Research Overview**

## **CURENT Annual Industry Conference April 29 and May 1, 2024 Knoxville, TN**









## **Fangxing "Fran" Li**

- **UTK John W. Fisher Professor, CURENT Director, LTB Lead**
- **Research Interests: resilience, demand response, power system economics, machine learning for power.**
- **fli6@utk.edu; http://web.eecs.utk.edu/~fli6/**

## **2023-24 Research Projects/Highlights**

- 1. CURENT Large-scale testbed (LTB)
- 2. Development of Load Flexibility Valuation Methodology & Framework to Input into Planning Tools (**Southern Company**)
- 3. Networked Microgrids and Solid-State Power Substations Hierarchical Systems Frameworks (**ORNL**)
- 4. Production Cost Modeling to Assess the Benefit of Geothermal Deployment (**ORNL**)
- 5. Model-Free Adaptive Control (MFAC) for Autonomous and Resilient Microgrids (**DOD ESTCP**)
- 6. Adaptive dynamic coordination of damping controllers through deep reinforcement and transfer learning (**NSF**, PI: H. Pulgar)
- 7. An Equitable, Affordable & Resilient Nationwide Energy System Transition (EARNEST) (**DOE/Stanford**)
- 8. POSE: Phase I: Toward an Open-Source Ecosystem for Power Systems Research, Education, and Industry Applications (**NSF/Oklahoma State University**)



# **CURENT Large-scale Testbed (LTB)**



### **Project Objectives**

- To develop a closed-loop platform that includes both dynamic and dispatch/market simulation
- To enable dispatch-dynamic interfaced co-simulation

#### **Recent Achievements**

- Created Homepage for CURENT LTB
- Created Linkedin Account for CURENT LTB
- AMS development, benchmark, and release
- AGVis backend improvement with web application



# **Model-Free Adaptive Control (MFAC) for Autonomous and Resilient Microgrids (1)**



### **Project Objectives**

- Employ domain knowledge and **AI** to achieve autonomous grid-following and grid-forming controls for microgrids
- Achieve higher grid resilience
- Microgrid control under insufficient capacity
- Virtual Inertia Scheduling

### **Recent Achievements — Part I:**

### **PQ Control with trajectory tracking capability [1]**

- Developed inverter PQ control for trajectory tracking using physics-informed deep reinforcement learning
- Configurate modified Banshee microgrids in CURENT HTB and validate the controller through power HIL experiment





Power curve tracking the predefined trajectory Modified Banshee microgrid in HTB

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Model-free adaptive PQ control based on physics-informed reinforcement learning and power HIL experiment

[1] B. She, F. Li\*, et.al. "Inverter PQ Control with Trajectory Tracking Capability for Microgrids Based on Physics-informed Reinforcement Learning ", *IEEE Transactions on Smart Grid*, 2024.

# **Results of PQ control with trajectory tracking 
SESTEP**



**Reward curve with and without model-based analysis**

RENT



## **Model-Free Adaptive Control (MFAC) for Autonomous and Resilient Microgrids (2)**



**Recent Achievements - Part II:** 

### V-f Control considering DER inadequacy [2]

- Developed decentralized and coordinated V-f control under insufficient resource capacity for islanded microgrids
- Mathematically proved the existence of equilibriums and small signal stability



Grid-forming inverter output following the limited DER capacity



Diagram of the proposed decentralized and coordinated control framework



[2] B. She, F. Li\*, et.al. "Decentralized and Coordinated V-f Control for Islanded Microgrids Considering DER Adequacy and Demand Control ", IEEE Transactions on Energy Conversion, 2023.

# **Results of V-f control with DER inadequacy**





#### $1.1$ 0.8  $\frac{\text{N}}{\text{R1}}$  1.0<br>  $\frac{\text{N}}{\text{R}}$  0.9  $0.6 \leq$  $-$  Pl  $-$  P3  $\rightarrow$  Trigger V-f regulator  $-0.4 \geq$  $\rightarrow$  Load  $\rightarrow$  Trigger power  $-$  P<sub>2</sub> increase regulator 0.8  $0.2$ 0.70  $Q1, Q3 / MNa$ <br>  $Q1, Q3$ <br>  $Q1, Q5$  $\frac{0.4}{0.3}$   $\sum_{0.2}^{1.4}$   $\sum_{0.2}^{1.4}$  $-$  01  $-$  Q3  $-$  Q<sub>2</sub> 0.60 0.75  $\sum_{S}^{1.3}$ <br> $\sum_{S}^{1.3}$ <br> $\sum_{S}^{1.3}$  $0.70 \leq$  $-$  s<sub>1</sub>  $0.65 -$  S3 S<sub>2</sub>  $S<sub>2</sub>$  $0.60$ 10  $12$  $14$ 18 20 6 16  $time / s$  $\overset{\text{N}}{\pm} 60.0$ - frequency  $\begin{array}{c}\n\text{frequency} \\
\text{frequency} \\
\text{frequency} \\
\text{d} \\
\text$  $---$  lower limit  $\rightarrow$  Trigger power  $\rightarrow$  Trigger V-f regulator  $\mapsto$  Load increase 59.0  $\frac{a}{\omega}$  1.000<br> $\frac{b}{\omega}$  0.975<br> $\frac{b}{\omega}$  0.950 voltage --- lower limit 0.950 10  $12$  $14$ 16 18 20 6  $time/s$

# $\triangleright$  Formulation of VIS Inertia support cost  $\min_{P,M,D} C_{gen}(P) + C_{aux}(P,M,D)$

## **Generation cost**

#### 1) Standard dispatch constraints s.t.

$$
2) \begin{cases} M_i^{\min, ibr} \leq M_i^{ibr} \leq M_i^{\max, ibr}, \forall i \in \{1, \cdots, N_{ibr}\} \\ D_i^{\min, ibr} \leq D_i^{ibr} \leq D_i^{\max, ibr}, \forall i \in \{1, \cdots, N_{ibr}\} \\ -RoCof_{\lim} \leq f_0 \frac{\Delta P_{e,t}}{M_t} \leq RoCof_{\lim}, \forall t \in \{1, \cdots, T\} \\ f_{\min} \leq f_0 + \Delta f_{nadir, t} \leq f_{\max}, \forall t \in \{1, \cdots, T\} \end{cases}
$$

[3] B. She, F. Li\*, et.al. "Virtual Inertia Scheduling for Power Systems with High Penetration of Inverter-based Resources". IEEE Transaction on Sustainable Energy, 2024.

### **Recent Achievements - Part III:**

### Virtual Inertia Scheduling (VIS) for low inertia grids [3]

**Model-Free Adaptive Control (MFAC) for** 

**Autonomous and Resilient Microgrids (3)** 

- Proposed the concept of VIS, a security-constrained and economy-oriented inertia scheduling and generation dispatch framework for power grids with a large scale of **IBRs**
- VIS schedules the power setting points, as well as the  $\bullet$ control modes and control parameters of IBRs to provide secure and cost-effective inertia support.





# **Results of Virtual Inertia Scheduling (VIS)**



### $\triangleright$  Comparison study of one-hour dispatch + time-domain simulation



(I) Constant power; (II) Fixed M & D, no reserve; (III) Fixed M & D, with reserve; (IV) VIS algorithm



## **Yilu Liu**

- **UT/ORNL Governor's Chair, CURENT Deputy Director**
- **Research Interests: grid monitoring and applications, oscillation damping control, Inertia and grid strength, EMP impact, Micro Grid,**
- **Liu@utk.edu 865 266 3597, powerit.utk.edu, fnetpublic.utk.edu**
- 1. Forced oscillation source location tool (EPRI)
- 2. Forced oscillation source type classification (TVA)
- 3. EI system inertia trending study (Dominion)
- 4. Data center models (Dominion)
- 5. Digital twin for microgrid (Southern Company)
- 6. Adaptive oscillation damping control and field test (EPRI, NYPA, TERNA, DOE)
- 7. EMP susceptibility characterization of generation stations (ORNL, TVA, Domimion)
- 8. Secure timing system using pulsar signal (NSF)
- 9. BESS probing for inertia estimation in real time (NREL, KIUC, AES, GPTech)
- 11. Pump storage operation signature-based inertia estimation (WPTO, Dominion, TVA, PG&E)
- 12. Develop low cost syn-wave monitors for PV systems (ORNL, DiGiCollect).
- 13. OEDI Distribution state estimation, VW control, and transient data generation (ORNL, DOE SETO)
- 14. Virtual Operator Assistance AI based fast real time transient stability prediction tool (ORNL, DOE AGM)
- 15. FNET/GridEye data transmission, visualization, and real time applications (NERC, AGM)
- 16. Oscillation and inertia trending (ORNL)
- 17. Landfill site microgrid development feasibility study (EPB, KUB)
- 18. Real time grid frequency prediction (Apple)



## **2023-2024 Research Projects**

# **ERCOT Frequency - Eclipse Time 18:00 -19:00 UTC**





Map Source: https://science.nasa.gov/eclipses/future-eclipses/eclipse-2024/where-when/ Photo Source: Dr. Anil Pahwa

# **Probability Density of ERCOT (Eclipse hours)**





# Inertia Monitoring - El, WECC, KIUC



# EI, WECC Inertia Trend 2012-2022 (DOM, ORNL)



**e**—Original Data

- Trendline

202201

# **Micro Grid Digital Twin (Southern Company)**



### **Microgrid Components**

- Photovoltaic generation  $\bullet$
- Battery energy storage  $\bullet$
- **Diesel Generation**  $\bullet$
- **Residential load**  $\bullet$





### **Digital Twin Functionality**

- RMS voltage and current  $\bullet$ measurements
- 14 second measurement  $\bullet$ period
- Opal-RT real-time  $\bullet$ simulator



# **Building EMP Shield Effect (ORNL)**



Rebar provides significant H field shielding throughout the frequency range

**URENT** 

# **Tool Development**

- Distribution three phase state estimator
- SPOT- distribution grid sensor placement tool
- Distribution Volt-Watt optimization tool
- Automatic DC to AC power flow conversion tool.
- Forced oscillation source location tool
- PSS/e to PSCAD model conversion tool
- Renewable integration tool in development
- Regional inertia estimation tool in development RENT



## **Hector Pulgar**

- **UTK Associate Professor**
- **Research Interests: Power system stability and dynamics, energy storage systems and renewable generation.**
- **hpulgar@utk.edu**

## **2023-2024 Research Projects**

- 1. Adaptive dynamic coordination of damping controllers: Enhancing oscillation damping through a datadriven approach (funded by NSF)
- 2. Towards enhanced grid robustness: Augmenting grid regulating capabilities through discrete controls on emerging power technologies (funded by NSF)



## **Adaptive dynamic coordination of damping controllers:** Enhancing oscillation damping through a data-driven approach

### **Project Objectives**

- Adaptability to faults and operating conditions.
- Modal-based and data-driven approaches.
- IBRs are used for damping control only when the system requires them (control commitment determined promptly using activation/deactivation signals based on our datadriven scheme)





#### **Control coordination framework**



## **Kai Sun**

- **UTK Professor in Power Systems**
- **Research Interests:** Power System Dynamics, Stability and Control; Cascading Outages; Renewable Integration.
- kaisun@utk.edu

## **2023-2024 Research Projects**

- 1. A Semi-Analytical, Heterogeneous Multiscale Method for Simulation of Inverter-Dense Power Grids (NSF, ANL)
- 2. Intelligent Phasor-EMT Partitioning for Hybrid Simulations to Accelerate Large-scale IBR Integration Studies (SETO/NREL, ISO New England, EPRI)
- 3. Mobility-Energy-Coordinated Platform for Infrastructure Planning to Support AAM Aircraft Operations (NASA/New Mexico State University)





## A Semi-Analytical, Heterogeneous Multiscale Method for Simulation of Inverter-Dense Power Grids

### **Project Objectives:**

- Developing a Heterogenous Multiscale Method (HMM)  $\bullet$ framework for automatic, case-specific model reduction on the fly of each EMT/phasor simulation.
- Developing variable-order variable-step semi-analytical  $\bullet$ solution (SAS) methods to accelerate EMT/phasor simulations
- Targeting a 10-100x speedup of EMT simulations on  $\bullet$ large-scale grid models with 50-100% IBR penetration.

#### HMM framework for simulating multi-timescale (EMT, electromechanical and quasi-steady-state) grid dynamics



#### High-order SAS method achieves a 5-20x speedup of accurate EMT simulation by using a 10-100x stepsize.



#### COMPARISON OF PERFORMANCE ON A 390-RHS SYSTEM











### **Intelligent Phasor-EMT Partitioning (I-PEP) for Hybrid Simulations** to Accelerate Large-scale IBR Integration Studies



2. Parellelized Simulation on HPC

CPU core #2

CPU core #N

22

### **Project Objectives and Achievements:**

- Intelligent determination of which portions of the grid to be simulated in EMT models while the rest in phasor models.
- Accelerated NREL's opensource simulator ParaEMT by integrating the SAS method.



#### **I-PEP project overview**

CPU core #1

**1. Network Partition** 

Phasor Model

**EMT** Model



## **Mobility-Energy-Coordinated Platform for Infrastructure Planning to Support AAM Aircraft Operations**

**STATE** 

### **Project Objectives:**

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- Building power system testbeds to support Advanced Air Mobility (AAM) planning and operation studies.
- Evaluating the impacts of AAM operations on grid reliability and resilience based on power system reliability criteria.
- Accessing electric infrastructure readiness to support AAM aircraft charging.
- Supporting the optimal siting studies on UAM (Urban Air Mobility) and RAM (Regional Air Mobility) portals.

#### **Concept of AAM in Tennessee and candidate** locations for RAM portals





## **Kevin Tomsovic**

- **UTK Chancellor's Professor and CTI Professor**
- **Research Interests: control, optimization, renewable energy integration, demand response, resilience, cybersecurity.**
- **tomsovic@utk.edu**

## **2023-24 Research Projects/Highlights**

Recently Completed

- 1. WISP: Watching grid Infrastructure Stealthily through Proxies (**DOE, Raytheon**) (PI: F. Li PI; co-PI: J. Sun)
- 2. National Transmission Resilience and Reliability (**DOE**) (PI: F. Li)

Recently awarded and on-going

- 1. CPS: Medium: Secure Constrained Machine Learning for Critical Infrastructure CPS (**NSF**) (PI: J. Sun, co-PI: H. Qi, H. Lee)
- 2. A Novel Approach to Mitigating Communication Failures (**NSF**) (co-PIs: S. Djouadi, F. Taousser)



## **A New Approach to Control under Network Communication Delays**



#### **Project goals and previous accomplishments**

- A new mathematical method to estimate the maximum allowed communication delay that does not violate the stability and performance of the power system.
- Manage continuous and discrete dynamics as switching between a continuous-time subsystem (when the communication occurs without any interruption) and a discretetime subsystem (when the communication fails) by introducing time scales theory.

#### **Recent activities**

• A stability criteria has been derived to estimate bounds of the communication loss duration, which guarantees the stability of the system.

#### **Future works**

• Test stability criteria in larger system with considering communication failure.

**PIs – Djouadi, Taousser and Tomsovic (PI) Students: Yichao Wang**





## **Exploring Physical-Based Constraints in Forecasting: A Defense Mechanism Against Cyberattack**



**Project goals and previous accomplishments** 

- Concern with Cyber attacks in machine learning systems  $\bullet$
- Physical-based constraints can provide obstacles that makes  $\bullet$ attacks more difficult.
- Attacker needs to meet the constraints imposed by the  $\bullet$ physical/topology of system and evade any built-in detection mechanisms in the system.

#### **Recent activities**

- Proposed a framework to spatially investigate STLF for a  $\bullet$ defense mechanism (also for traffic systems)
- Applied similarity measures to explore physical-based  $\bullet$ constraint.
- Outperformed of SAX method, showing more sensitivity to  $\bullet$ false data injection.

#### **Future works**

Test stability criteria in larger system with considering  $\bullet$ communication failure.

#### Pis - Han, Qi, Sun (PI) and Tomsovic

**Students:** Mojtaba Dezvarei, Farhin Farhad Riya, Ony Hoque, Diyi Liu, Lanmin Liu, Quan Zhou





**Spatial correlations** 

#### Correlation-based distance:  $d_{COR}(X,Y) = \sqrt{2(1 - COR(X,Y))}$

• Periodogram-based distance: 
$$
d_p(X, Y) = \sqrt{\sum_{j=1}^{[\frac{n}{2}]} [\rho_x(\omega_j) - \rho_y(\omega_j)]^2}
$$

$$
\bullet
$$
 Autocorrelation-based distance:  $d_{ACF}(X,Y) =$ 

$$
\sqrt{(\hat{\rho}_{X_T} - \hat{\rho}_{Y_T})^T \Omega (\hat{\rho}_{X_T} - \hat{\rho}_{Y_T})}
$$

Symbolic representation SAX: Time series transforming into a string.

Euclidean-based distance: 
$$
d_{EUC}(X,Y) = \sqrt{\sum_{j=0}^{N-1} (x_i - y_i)^2}
$$