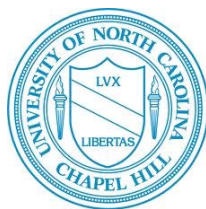


Cyber-Physical Implementation of Wide-Area Control using ExoGENI-WAMS Testbed

Aranya Chakraborty

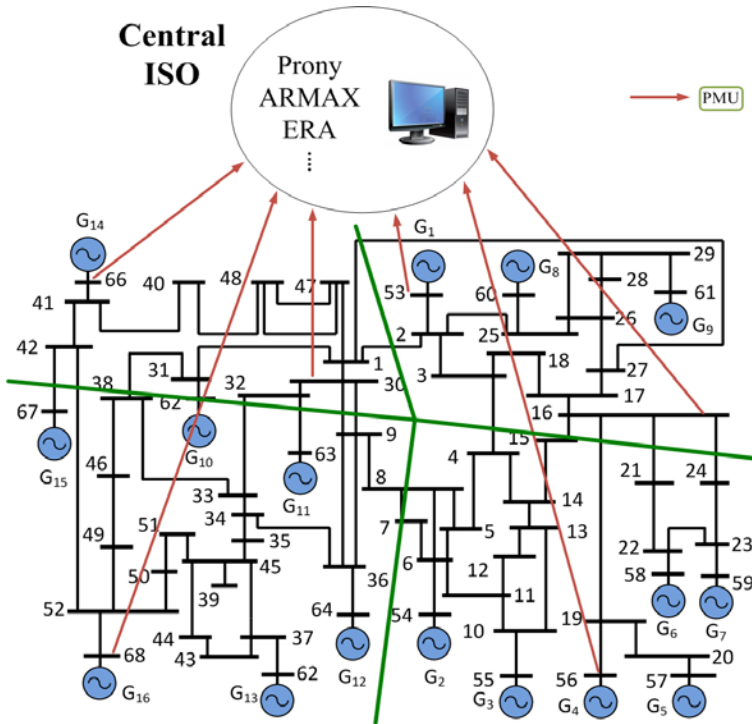
Department of Electrical and Computer Engineering
North Carolina State University

March 23, 2017

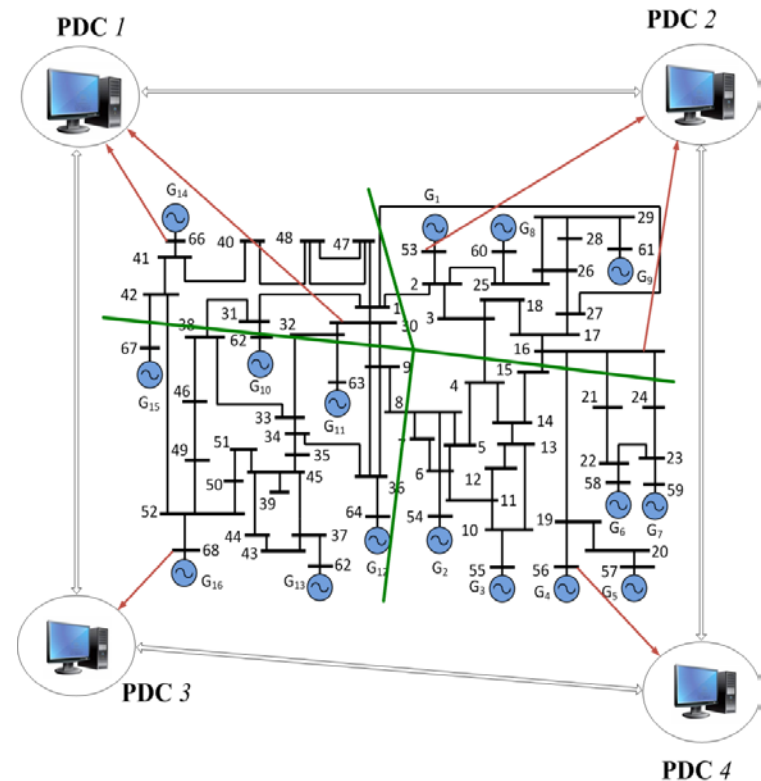


From Centralized to Distributed Architecture

Centralized WAMS

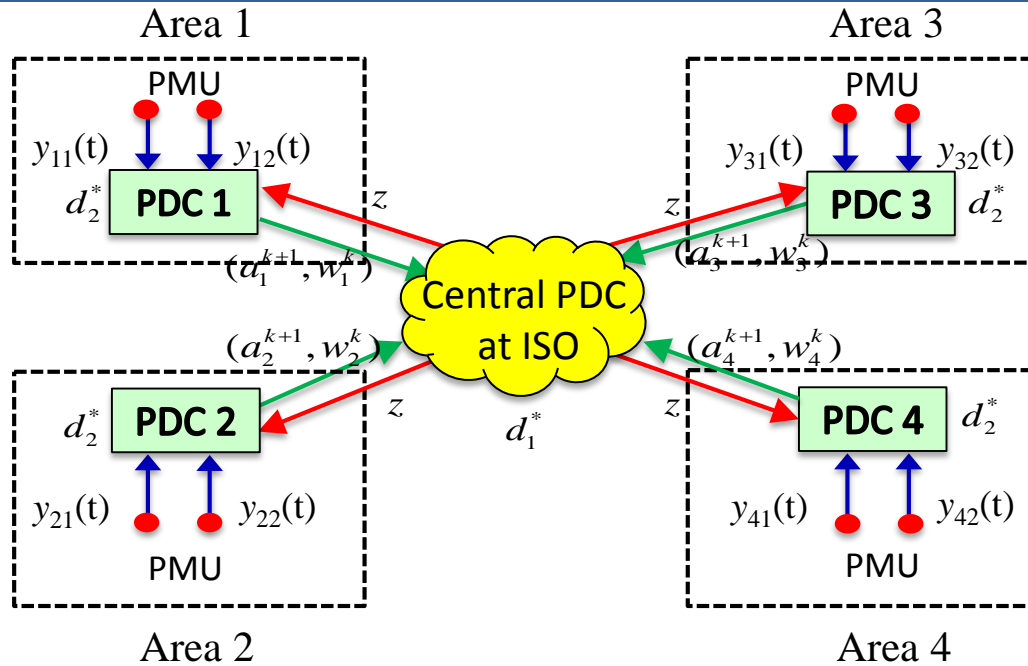


Distributed WAMS



1. Formulation of centralized strategies to distributed algorithms
2. Investigation of cyber-physical issues: delays and cyber-security
3. Validation using cyber-physical networked cloud computing testbed

Distributed Asynchronous Algorithms



Assumption of S-ADMM:
the communication between local PDCs and central PDC is completely synchronized. Practically, it is not always possible.

Proposed method: to counteract asynchrony by defining a set of **flexible deadlines** for message arrival in every PDC, and by modifying the **update rules** based on these deadlines.

Our Objective: Study the impact of asynchronous communication on the convergence of distributed ADMM-based algorithms. Result algorithm is called A-ADMM.

Approach:

Step 1. Consider a probabilistic traffic model for modeling delays in Internet

Step 2. Propose different update strategies to immune asynchrony

*Step 3. Analyze the convergence of the A-ADMM algorithm on 1) **delay distribution parameters** 2) **different update strategies***

Delay Model for Wide-Area Communication

1. Minimum deterministic delay,
2. Internet traffic delay (*alternating renewal process*)
3. Router processing Delay (*Gaussian process*)

Then, the total Probability Density Function (PDF)

$$\phi(t) = \frac{p}{\sigma\sqrt{2\pi}} e^{-\frac{(t-\mu)^2}{2\sigma^2}} + \frac{\lambda(1-p)}{\sigma\sqrt{2\pi}} e^{-\lambda t} \int_0^t e^{\lambda s - \frac{(s-\mu)^2}{2\sigma^2}} ds$$

We derive the Cumulative Distribution Function (CDF)

$$P(t) = \frac{1}{2} \left[\operatorname{erf}\left(\frac{\mu}{\sqrt{2}\sigma}\right) + \operatorname{erf}\left(\frac{t-\mu}{\sqrt{2}\sigma}\right) \right] + \frac{(1-p)}{N} e^{\left(\frac{1}{2}\lambda^2\sigma^2 + \mu\lambda\right)} \left[\operatorname{erf}\left(\frac{\lambda\sigma^2 + \mu}{\sqrt{2}\sigma}\right) + \operatorname{erf}\left(\frac{t - \lambda\sigma^2 - \mu}{\sqrt{2}\sigma}\right) \right]$$

Parameters:

1. μ - mean deterministic delay (5.3ms),
2. σ - derivative value of delay of router processing(0.078ms),
3. λ^{-1} - mean length of the closure period (1/1.39),
4. p - probability of open period of the path with no Internet traffic(0.58),
5. $\tau = P(X \leq d^*)$ - cumulative distribution function of d^* , d^* is the delay threshold.

Security Enhancement of Distributed Optimization

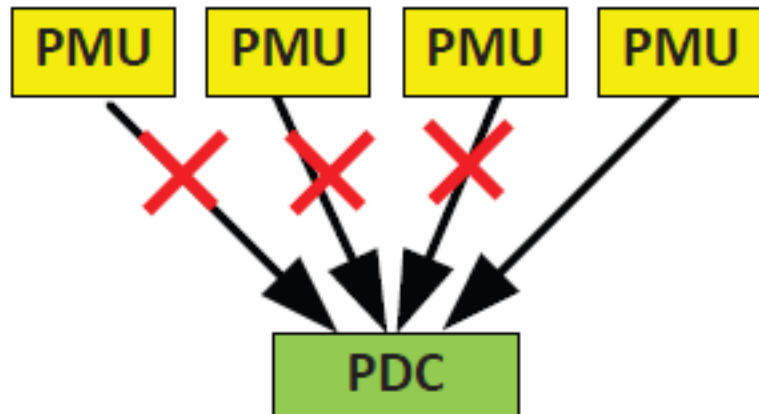
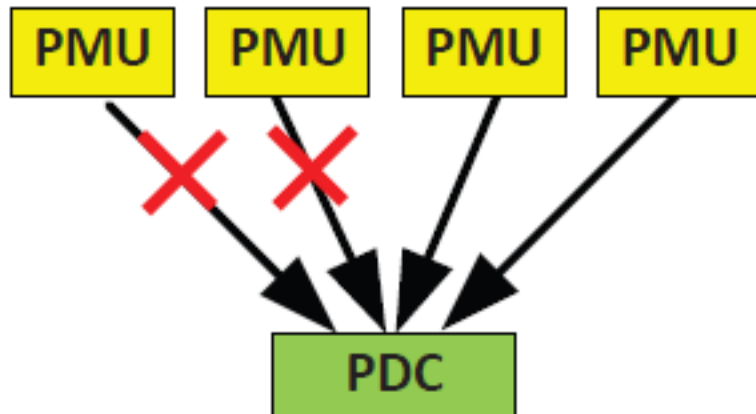
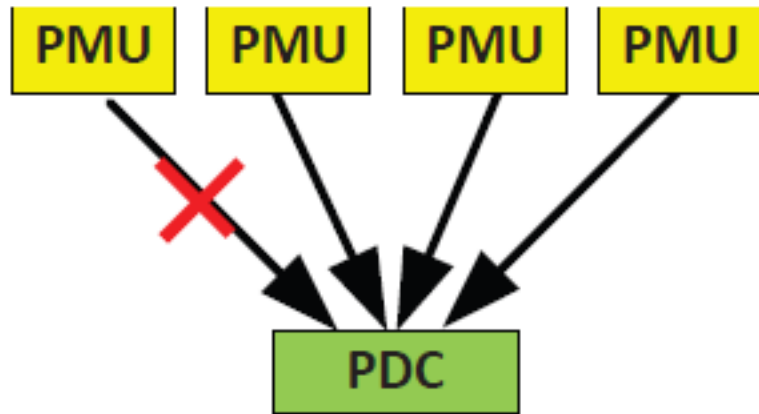
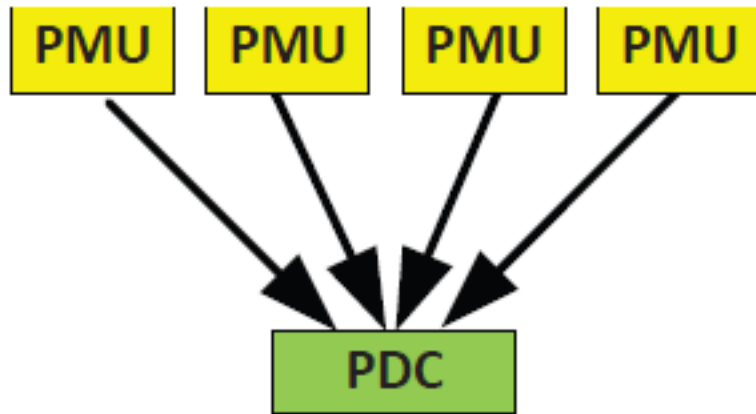
Question: Cyber-physical architectures are prone to failures and attacks on their physical infrastructure, as well as cyber attacks on their data management and communication layer.

Objective: To investigate how distributing a monitoring functionality over multiple estimators can guarantee significantly more resiliency against extreme events.

Attack Scenarios:

1. Malware attack that disrupts the normal execution of monitoring algorithms
2. Flooding attack by generating malicious traffic to delay messages
3. Malfunction of physical infrastructure due to natural calamities such as storms and earthquakes

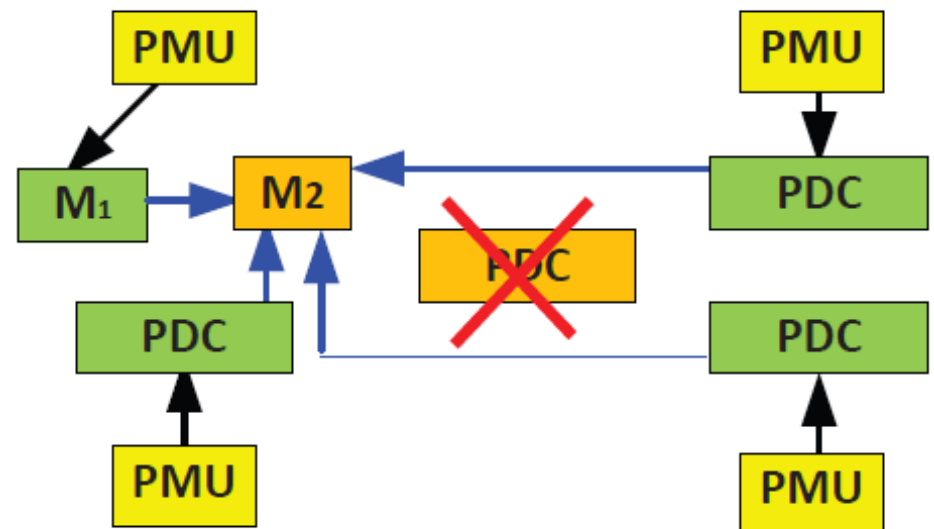
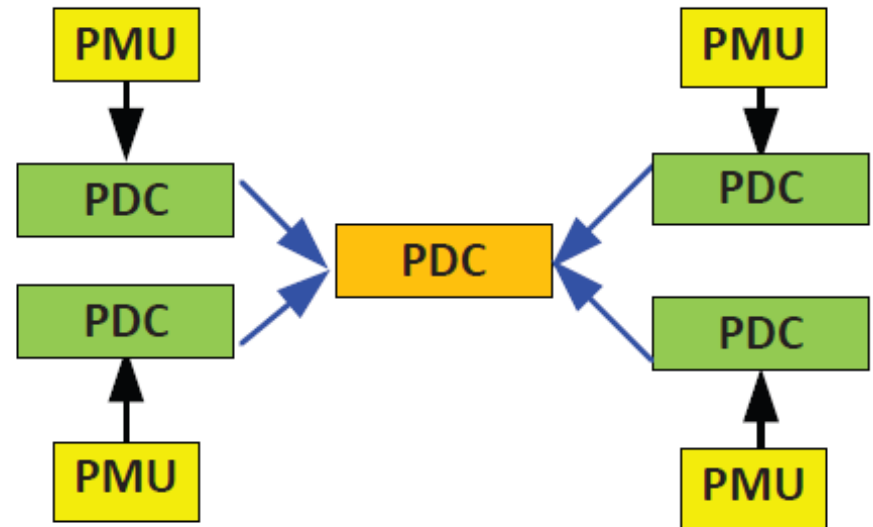
Resilient Strategy for Centralized RLS



Resilient Strategies for Distributed S-ADMM

Redundancy-based Strategy

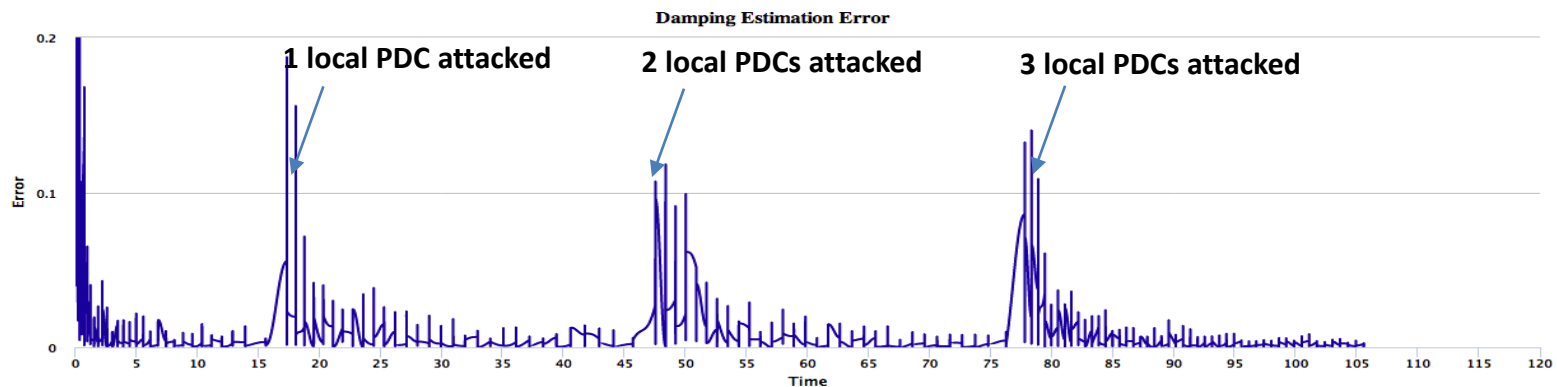
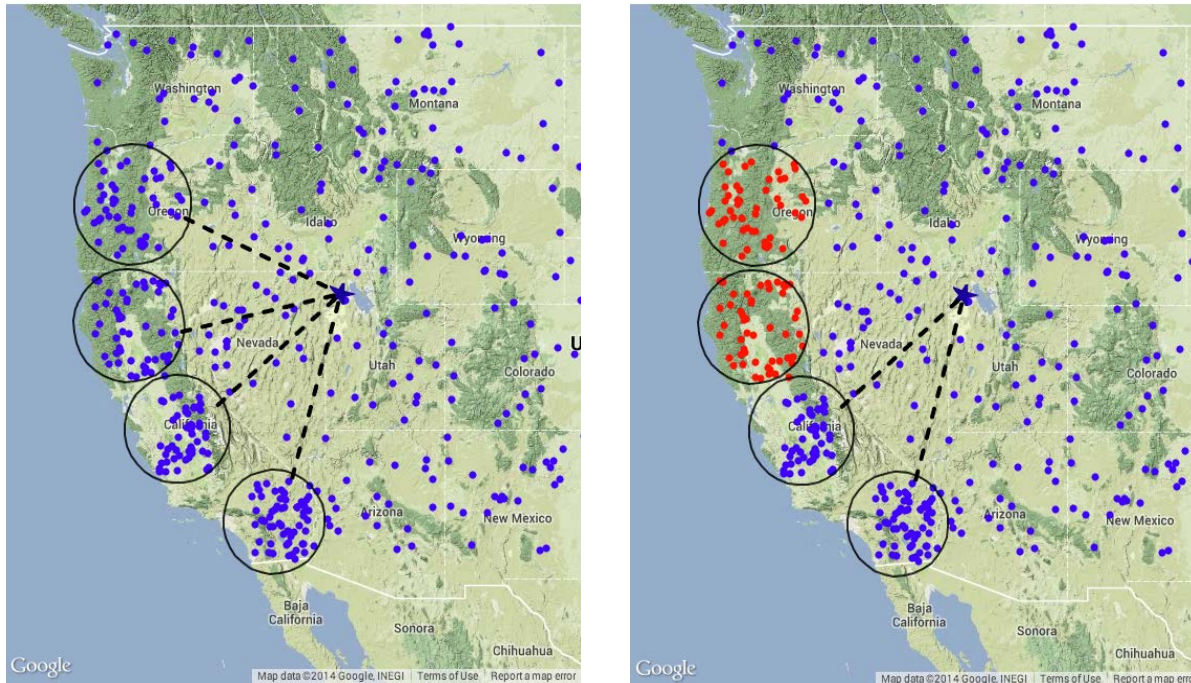
*Local PDC runs as dual roles
of local estimator and central estimator*



Experimental Validation on Federated Testbeds

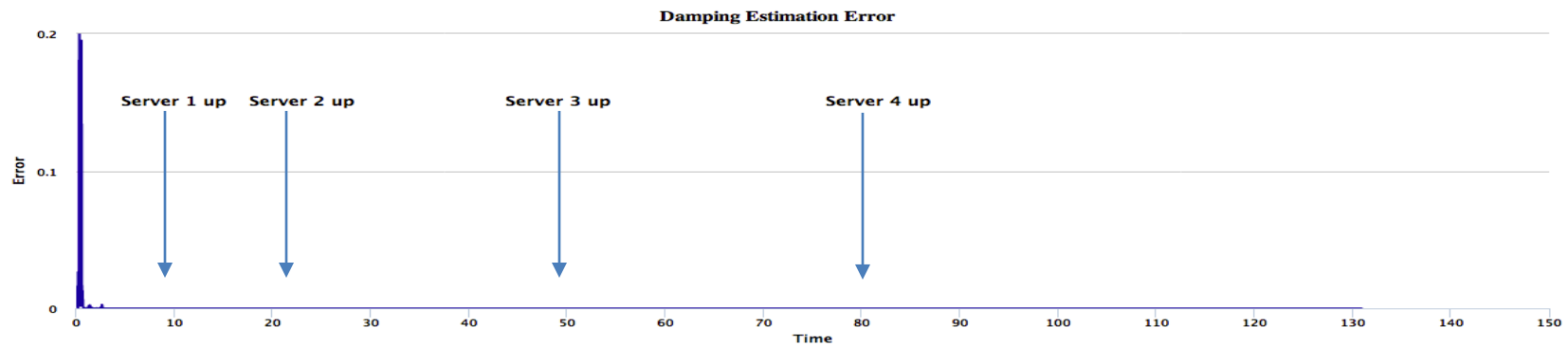
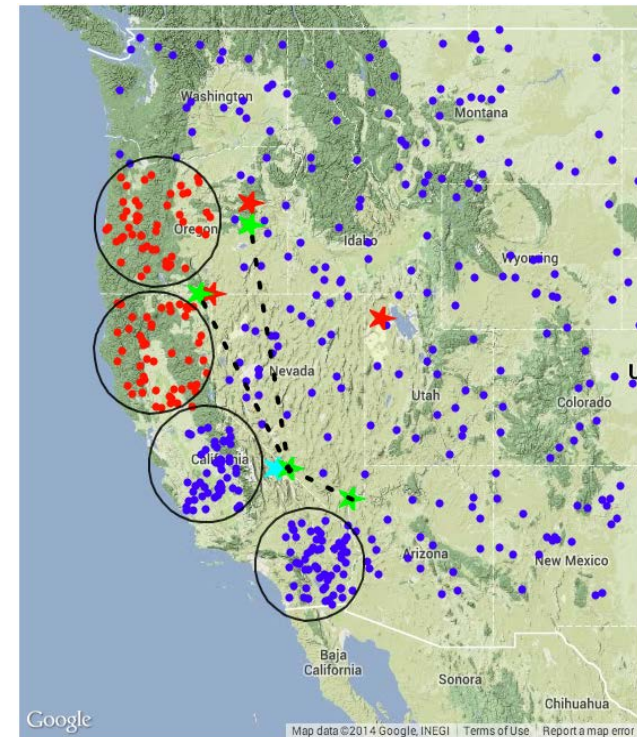
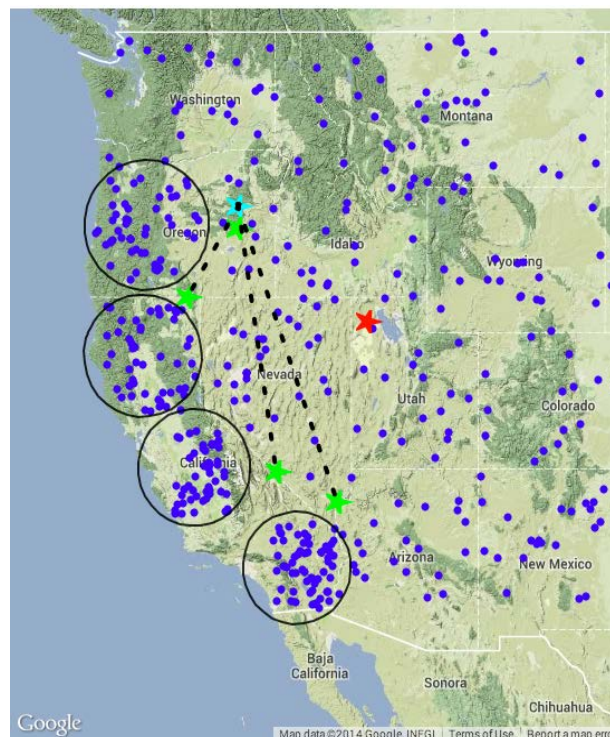
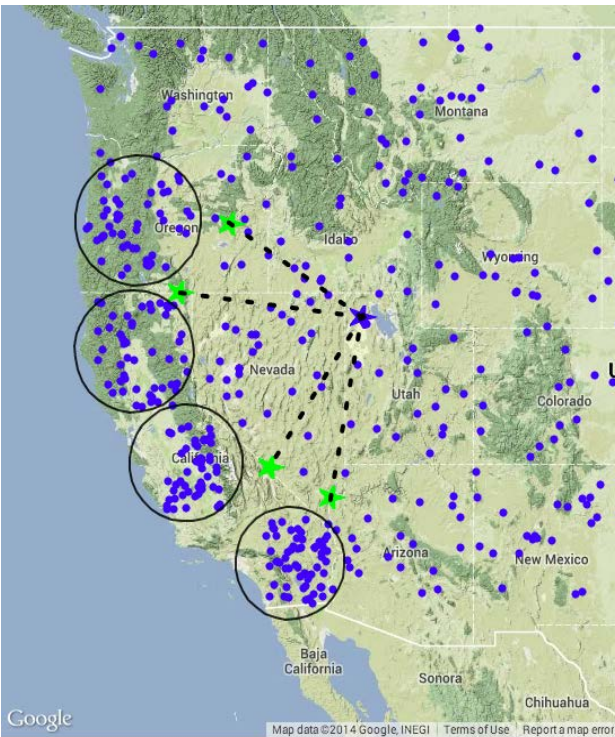
Federated Testbeds: *RTDS Lab of NC State + DETER Lab of Univ. of South California*

Centralized Architecture



Experimental Validation on Federated Testbeds

Distributed Architecture

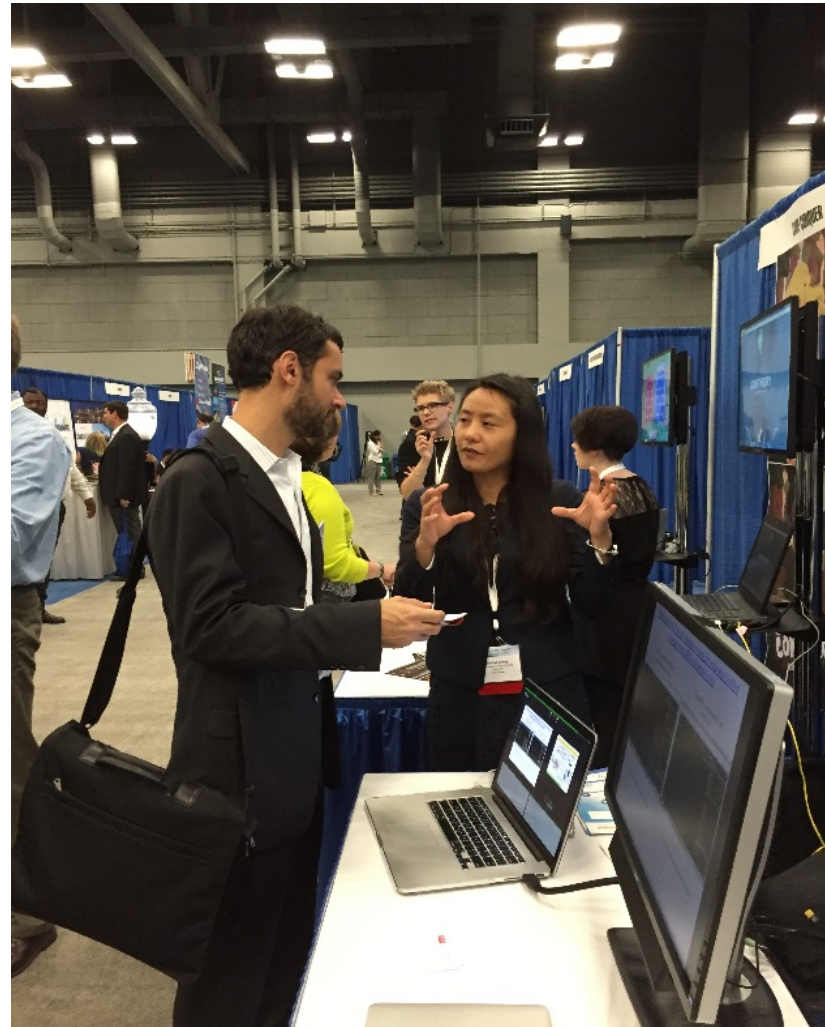


Project Demos:



DETER Demo at Smart-America 2014

Best Energy App Award at US Ignite 2015



US Ignite & NIST
Smart Cities Application
Summit, Austin, TX, 2016

ExoGENI-WAMS Testbed

Bring Concepts of Cloud Computing and Software Defined Networking into Research of Wide-Area Monitoring and Control with PMU data

- Wide-Area Monitoring and Control is a typical cyber-physical system
- Problems of the physical subsystem
 1. Accessing of real PMU measurements due to *privacy and non-disclosure issues*
 2. Not sufficient for studying dynamics of the entire system due to *limited coverage*
- Requirements of the cyber subsystem
 - To utilize next-generation cyber-infrastructure technologies:*
 1. high-speed virtual networking
 2. high performance networked cloud computing
 3. virtualization and data management

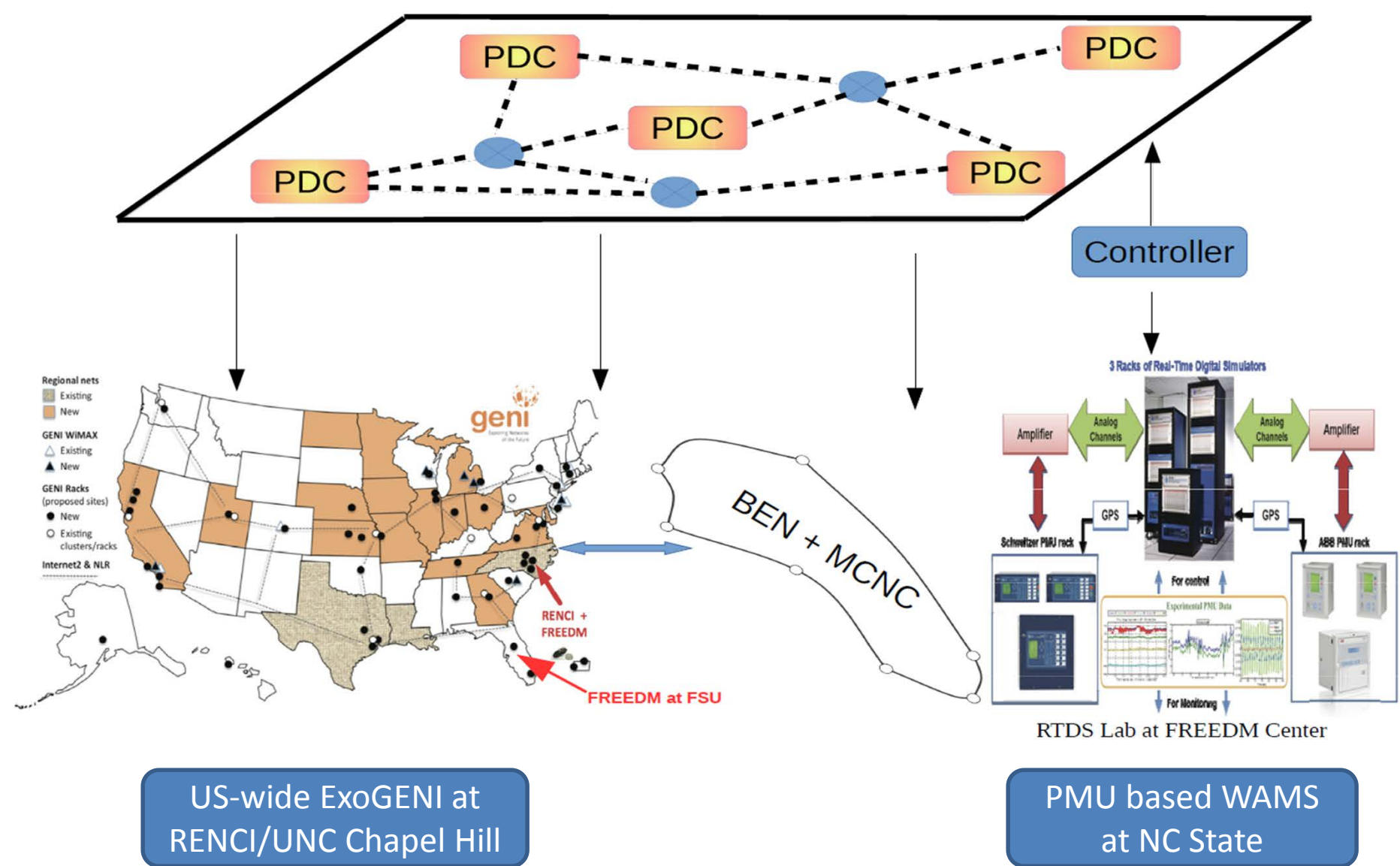
Objective: *build up a perfect cyber-physical testbed for WAMS research*

Result: ExoGENI-WAMS Testbed

Physical subsystem – Hardware-In-Loop Framework (RTDS + PMU-based WAMS)

Cyber subsystem – Networked Cloud Computing Platform (ExoGENI)

Architecture of ExoGENI-WAMS Testbed

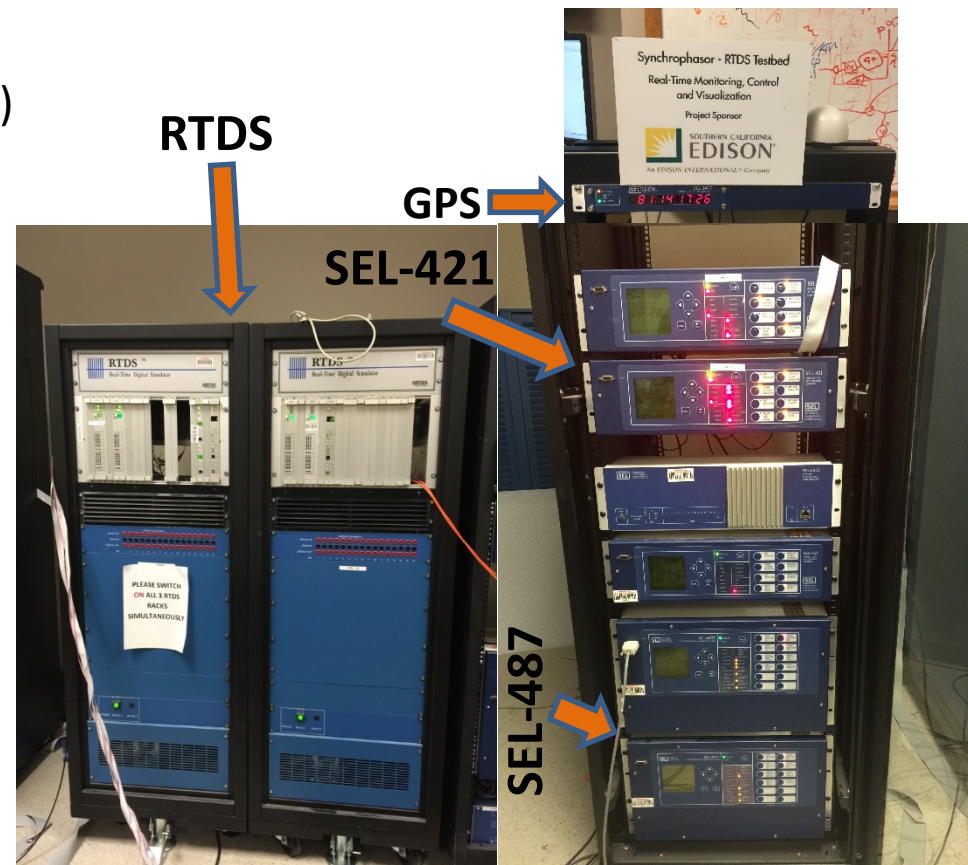
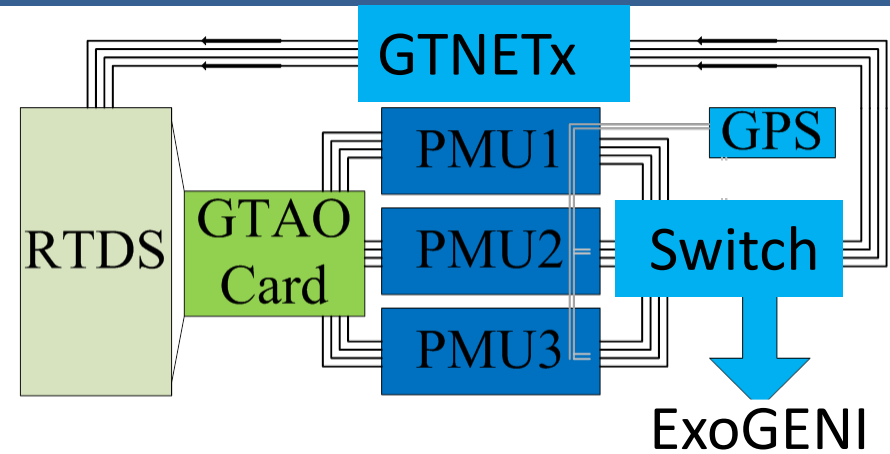


Components: RTDS-PMU based WAMS

RTDS – two racks, 50 us of time step,
RSCAD – software to develop models for the
RTDS to simulate
GATO – hardware interface of Gigabit
Transceiver Analog Output to generate voltage
and current waveforms to the PMUs
GTNETx2 – Gigabit Transceiver Network
interface card to communicate with remote
station. Multiple protocols (TCP socket, DNP, ...)
IEEE 754 floating-point and integer type.

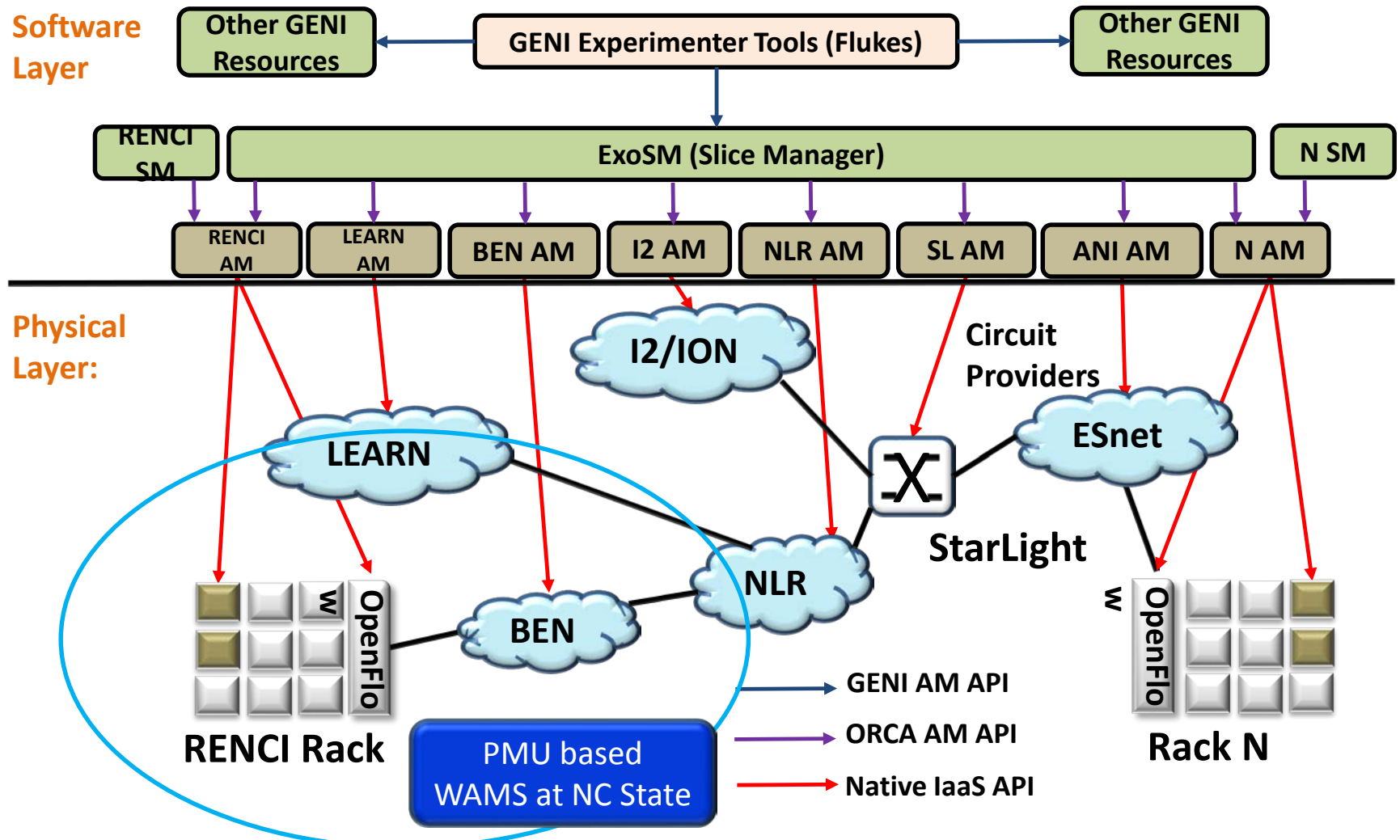
PMU – 5 units: 3 SEL-421 & 2 SEL-487
Functions: accepting IRIG-B signal for
satellite synchronization

GPS – SEL-2407 Satellite-Synchronized
Clock



Networked Cloud Computing Testbed—ExoGENI

ExoGENI provides in virtual IaaS services for innovative research on distributed applications for Wide-Area Monitoring and Control (14 rack sites at universities & labs over the US)



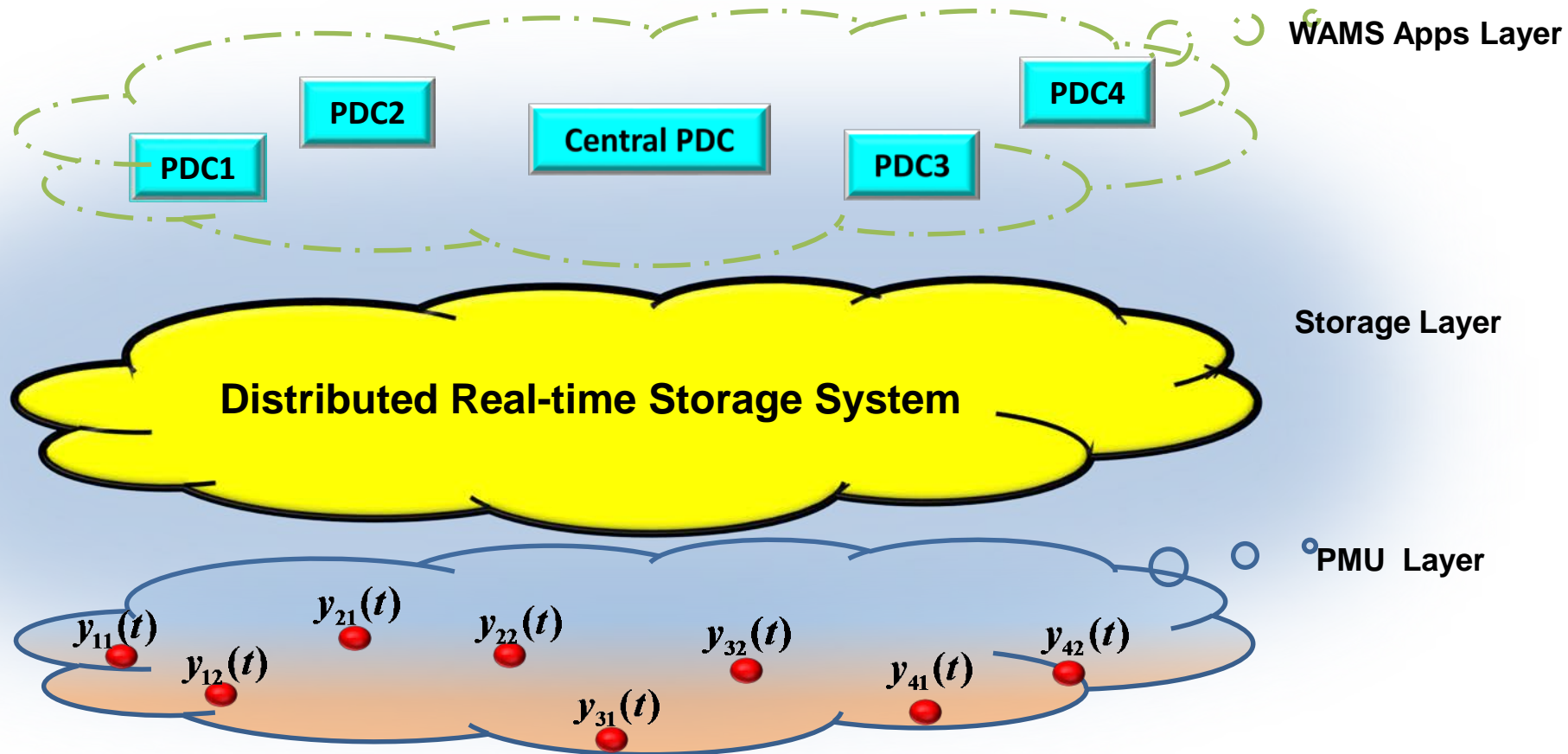
Validations of ExoGENI-WAMS testbed

- **Visualization of Power Grid**
- **Delay Evaluation of CLS, DLS and RLS**
- **Distributed Oscillation Monitoring Algorithm**
- **Distributed Storage System (DSS) for Multiple Applications**
- **Distributed Control Algorithm**

Case Study I — Distributed Storage System with S-ADMM

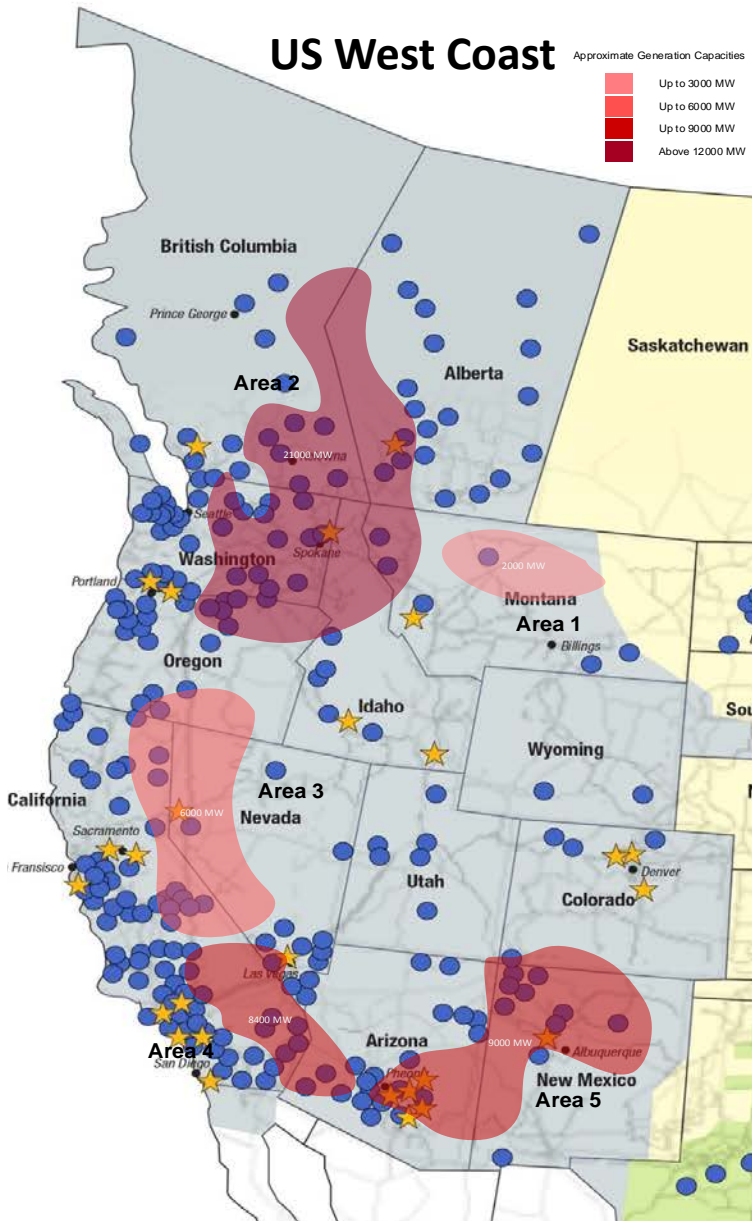
Synchronized ADMM + Storage System

Step 1: PMUs keep storing data into Storage System

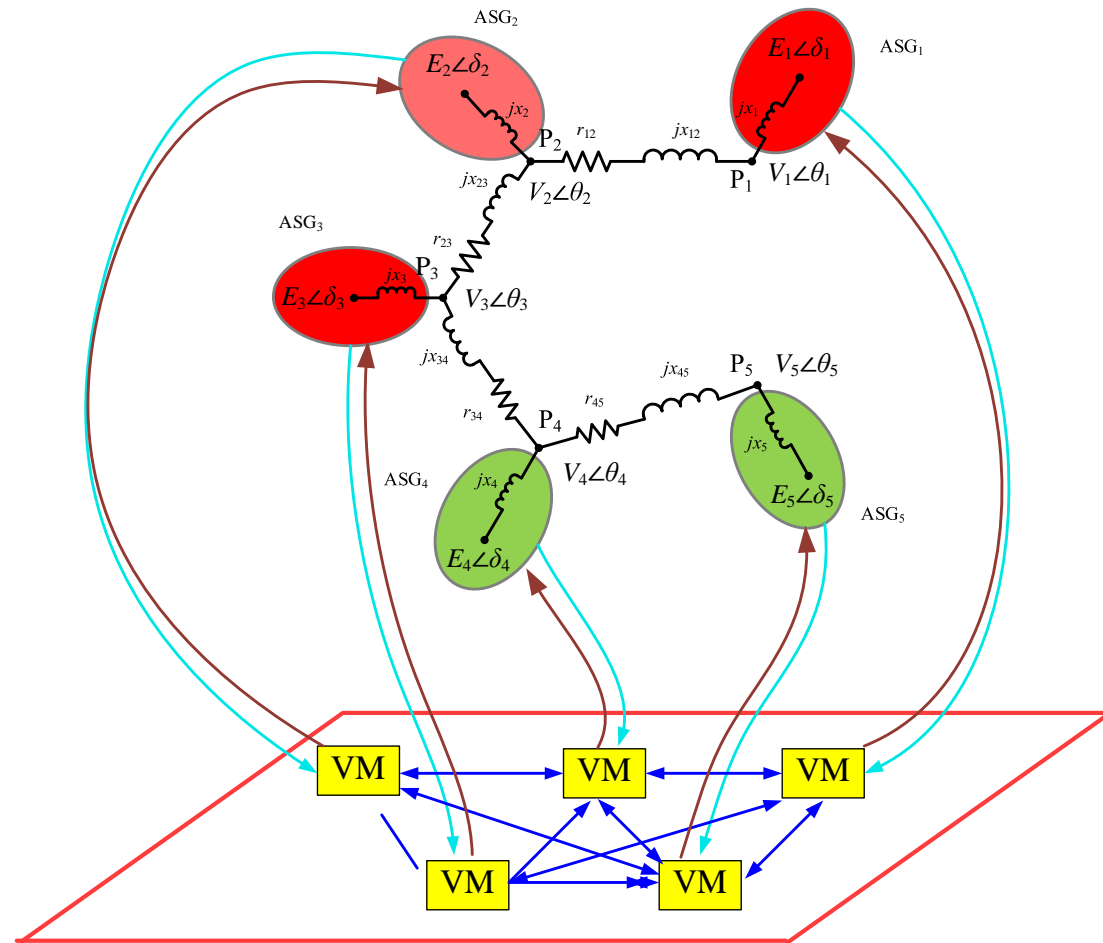


Case Study II - Distributed Control Algorithm

US West Coast



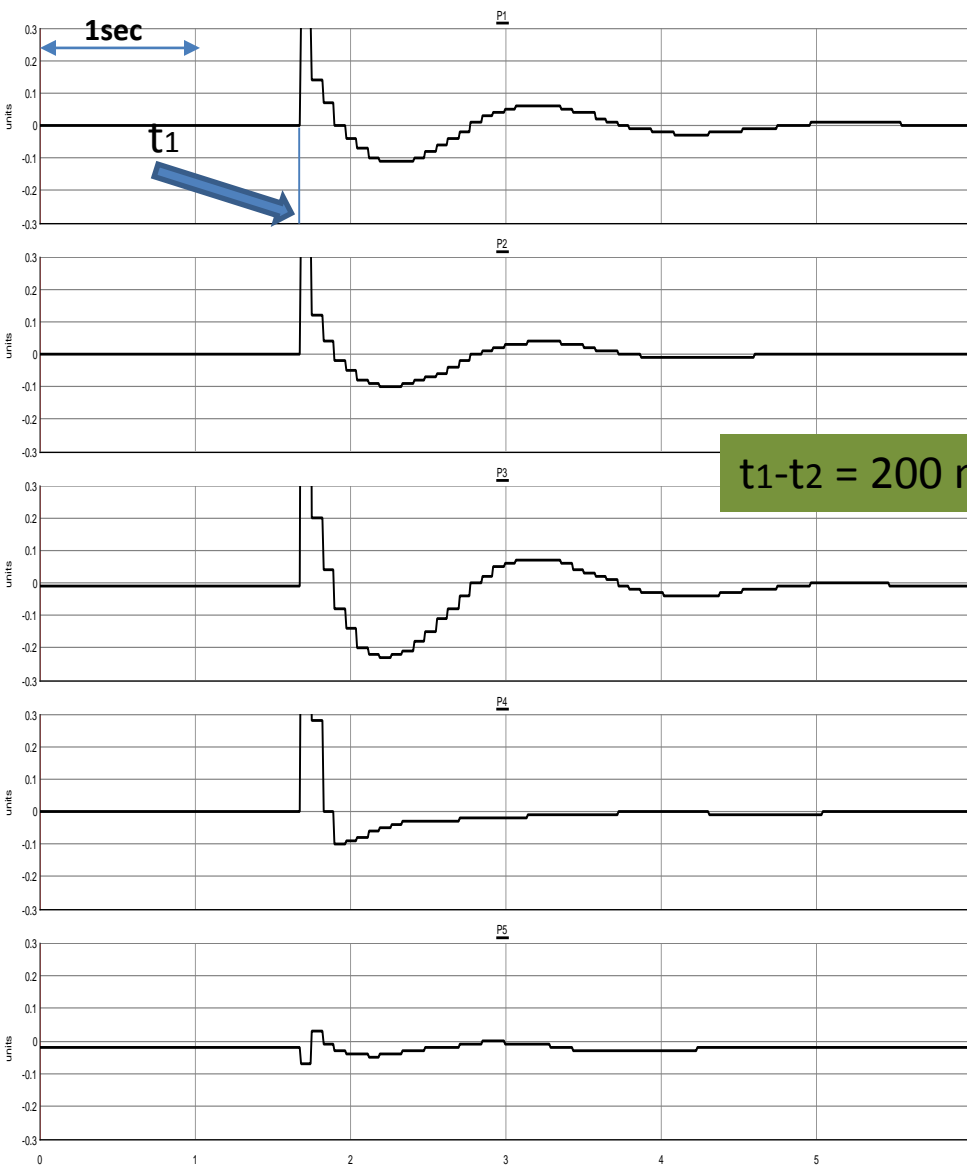
Close the loop from cloud to grid



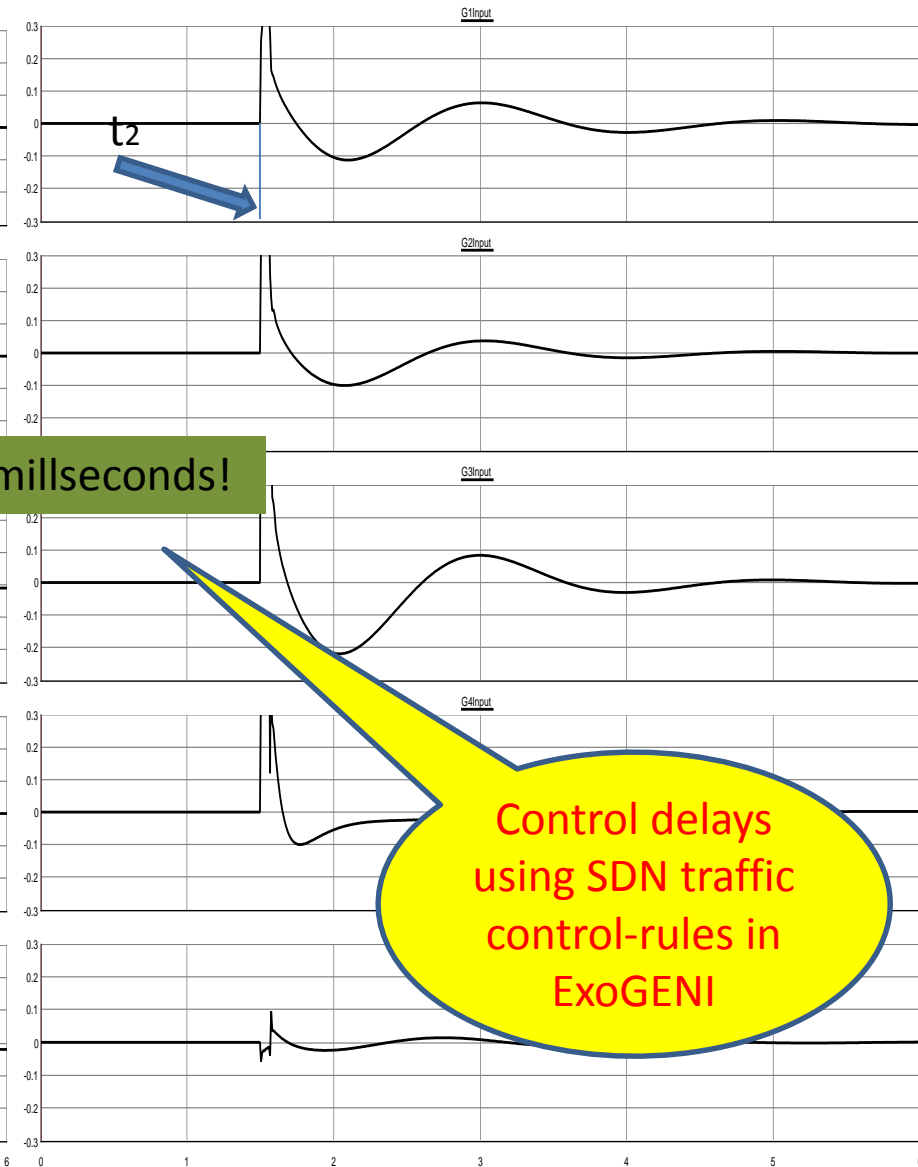
Third-Party Private Cloud
+ Controllable Network

Implementation of Distributed Control Algorithm

Control Signals from ExoGENI



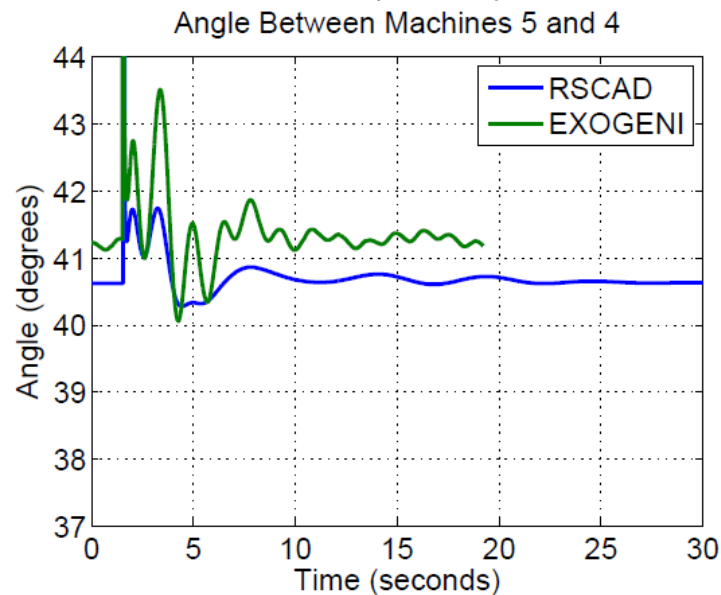
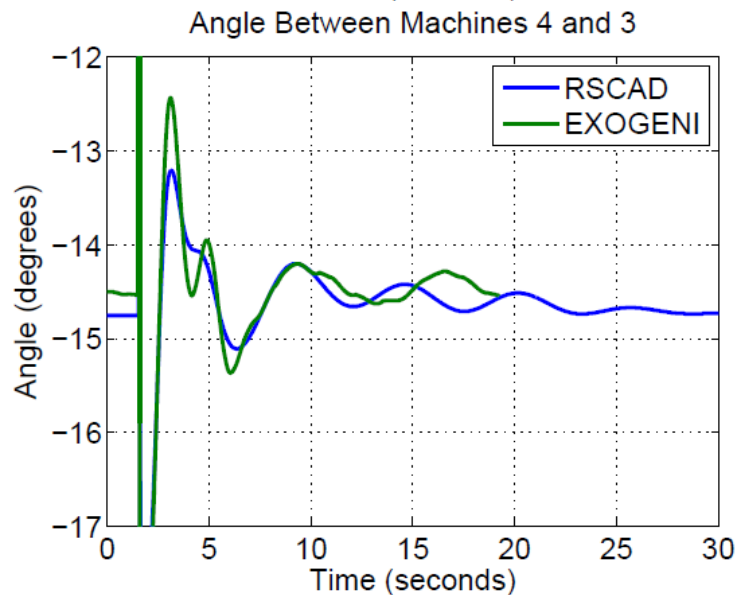
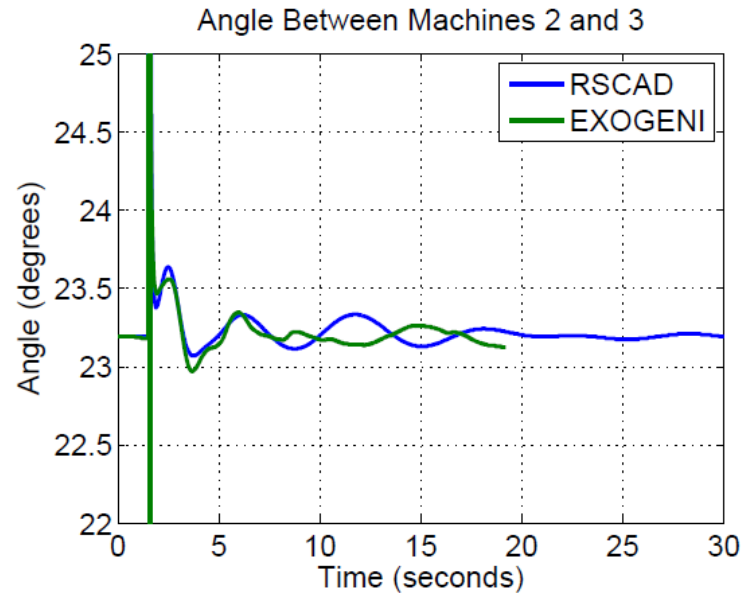
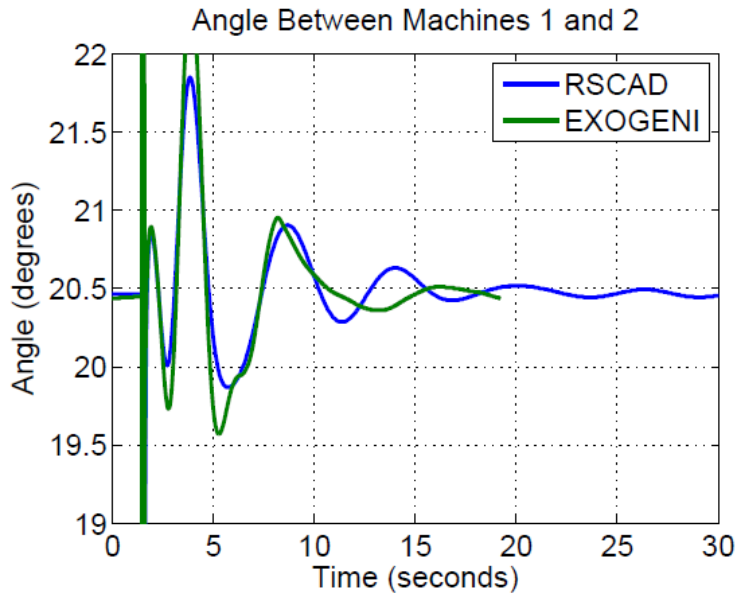
Control Signals from RSCAD



$t_1 - t_2 = 200$ milliseconds!

Control delays
using SDN traffic
control-rules in
ExoGENI

Comparison of LQR Controller Performance



Performance of RSCAD-based LQR-WAC compared against a cloud-computing implementation using the ExoGENI Network.

Conclusions and Future Work

Conclusions

- Develop distributed delay-robust algorithms for wide-area oscillation mode monitoring of power systems
- Investigate the convergence performance of these distributed algorithms on delay distribution parameters and different variants of asynchronous strategies
- ExoGENI-WAMS-DETER testbed
- Validations of these distributed architecture using distributed cloud computing

Future Work

- Investigate the scalability problem of distributed algorithms
- Resilience of ExoGENI using SDN principles
- Delay management in ExoGENI using SDN principles

Thank You

Email: achakra2@ncsu.edu

Website: <http://people.engr.ncsu.edu/achakra2>