

# Distribution Voltage Regulation using Extremum Seeking Control with Power Hardware-in-the-Loop

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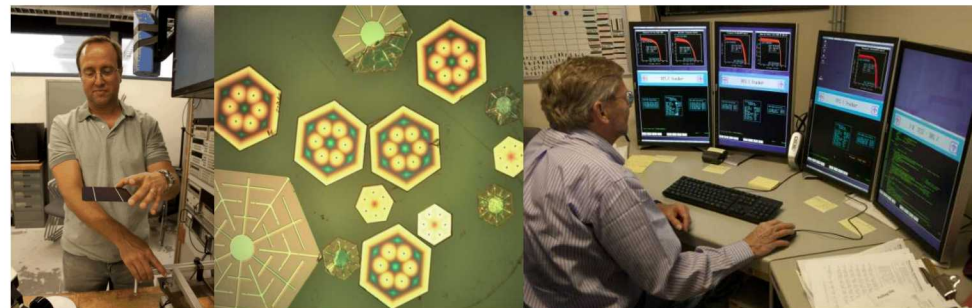
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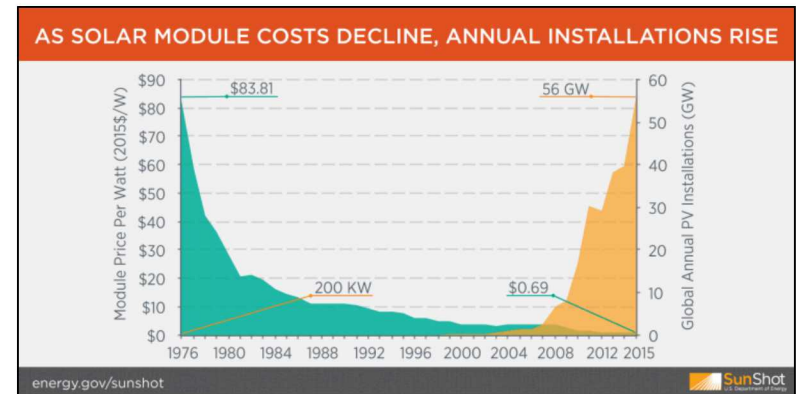


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# Background

- Context
  - Total installed capacity of PV is growing fast
  - Large growth expected in distribution systems
- Problem
  - Grid is slow to evolve, we encounter technical challenges with voltage/frequency regulation, protection, etc.
  - Unless mitigated, these challenges will make it increasingly difficult and costly to continue integrating renewable energy
- Solution: advanced inverters
  - Actively support voltage and frequency by modulating output
  - Have high tolerance to grid disturbances
  - Interact with the system via communications

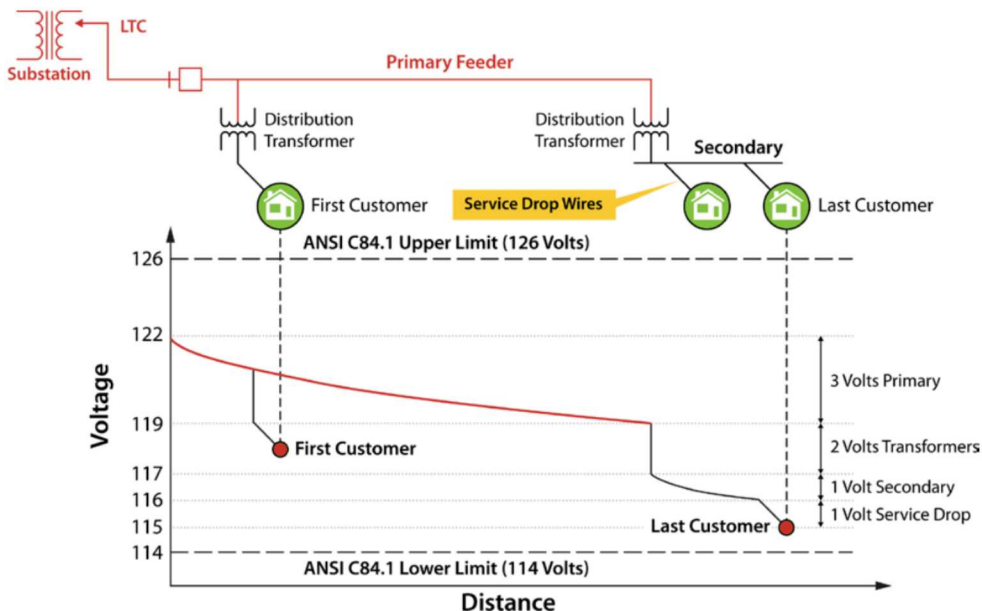


*...Faster than a tap changer*  
*...More powerful than a rotating machine*  
*...Able to leap deep voltage sags in a single bound*

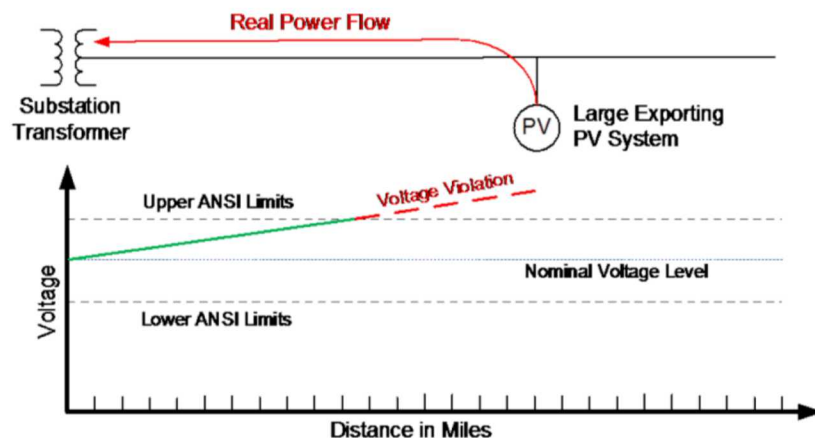
Courtesy of B. Lydic, Fronius

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# Distribution Voltage Regulation



Voltage regulation on a feeder without distributed generation.



Voltage regulation on a feeder with distributed generation.

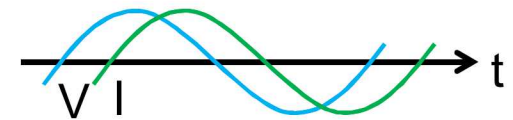
**Solution: Use DER grid-support functions with reactive power capabilities.**

- **Cost-effective: no additional equipment required**
- **Logical: employs devices which are causing voltage rise to mitigate the problem**

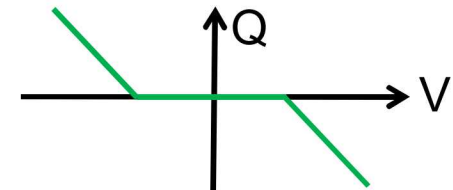
# Options for Voltage Regulation using Grid-Support Functions

- **Centralized Control**
  - Function: power factor or reactive power commands
  - Pros: Direct influence over DER equipment to achieve objective
  - Cons: requires telemetry, knowledge of DER locations, and state estimator/feeder model
- **Distributed (Autonomous) Control**
  - Function: volt-var or volt-watt
  - Pros: Simple, requires little or no communications, DER locations not needed
  - Cons: does not reach global optimum
- **Extremum Seeking Control (ESC)**
  - Function: new grid-support function
  - Pros: can achieve global optimum
  - Cons: requires fitness function broadcast, ideally new inverter functionality

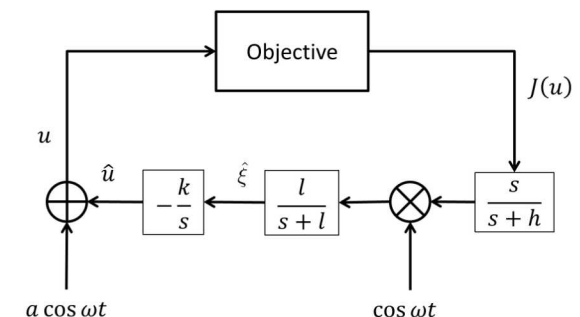
## Adjust Power Factor



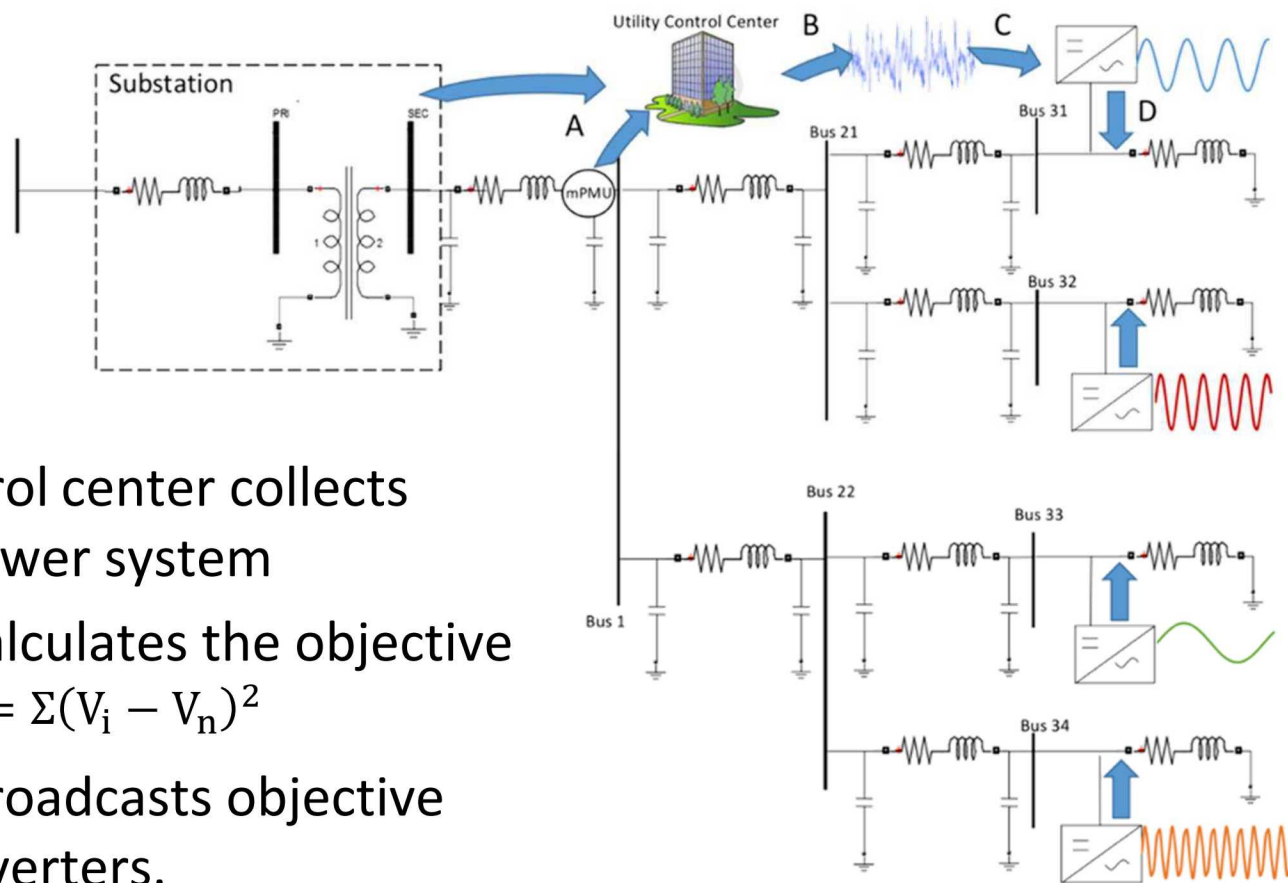
## Volt-Var Mode



## ESC



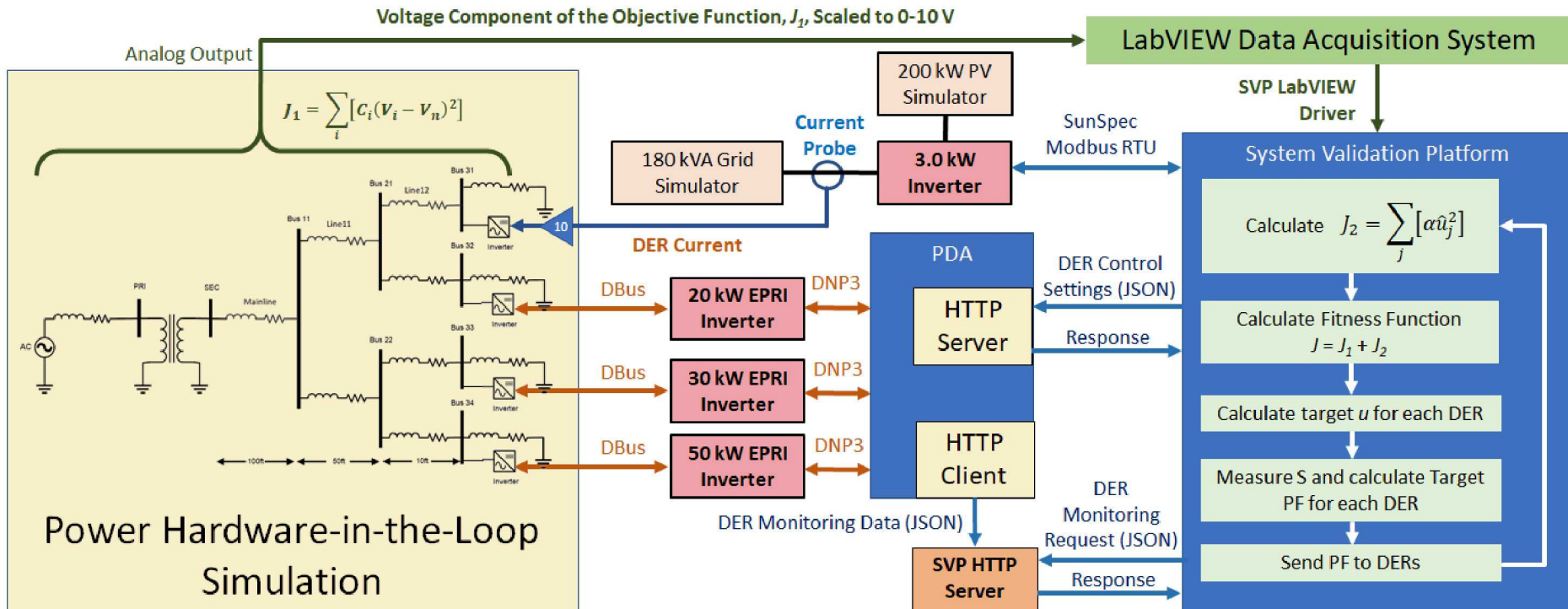
# Extremum Seeking Control Steps



- A. Centralized control center collects data from the power system
- B. Control center calculates the objective function, e.g.,  $J = \Sigma(V_i - V_n)^2$
- C. Control center broadcasts objective function to all inverters.
- D. Individual inverters extract their frequency-specific effect on the objective function and adjust output to trend toward the global optimum.

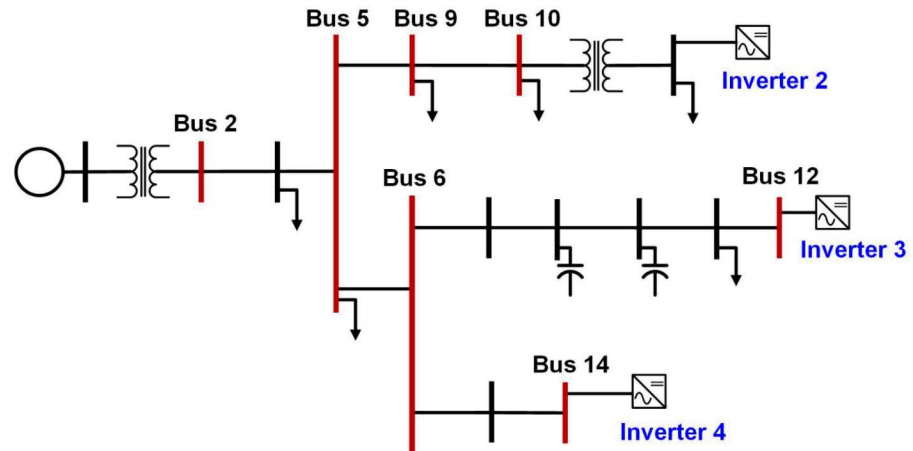
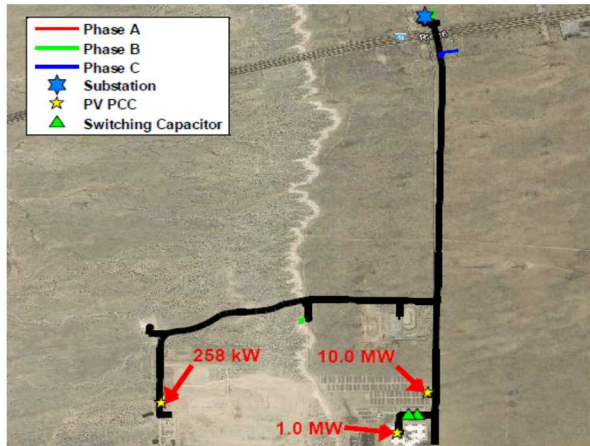
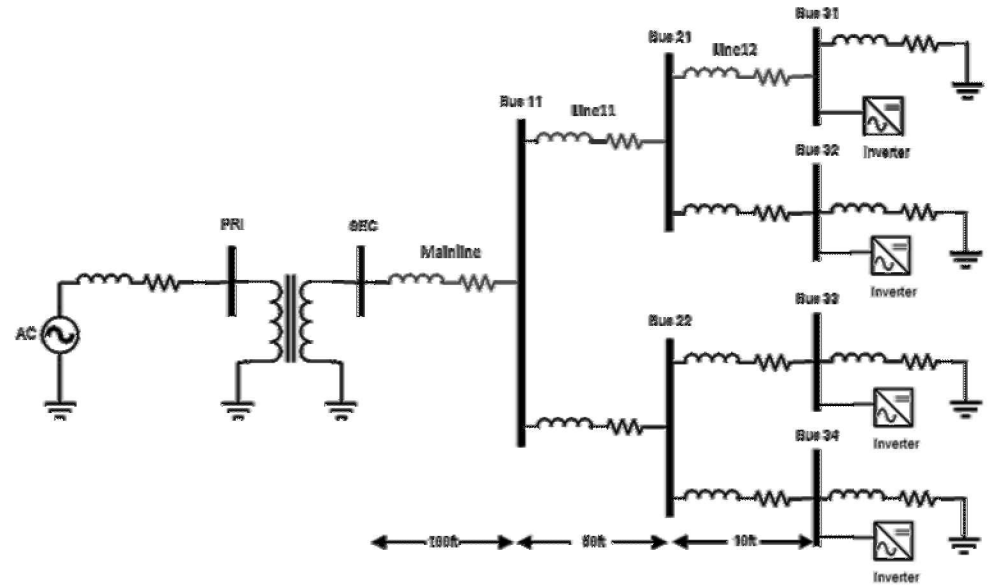
# Implementation with PHIL System

- Opal-RT power hardware-in-the-loop (PHIL) experiments conducted to demonstrate the technology on larger distribution circuits.



# Implementation with PHIL System

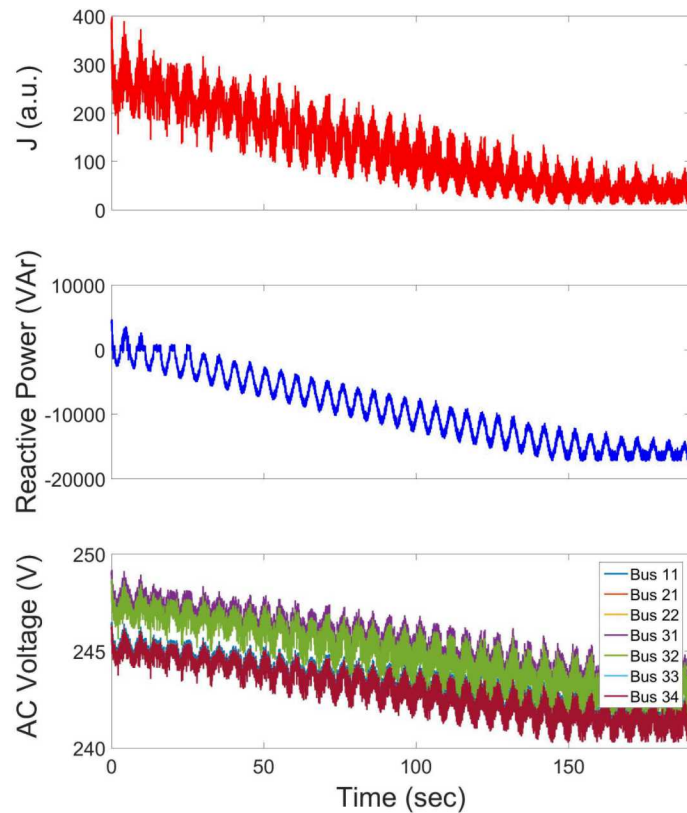
- Two feeders used for this study.
  - 7-bus neighborhood model
  - PNM rural feeder west of Albuquerque with ~440% PV penetration.



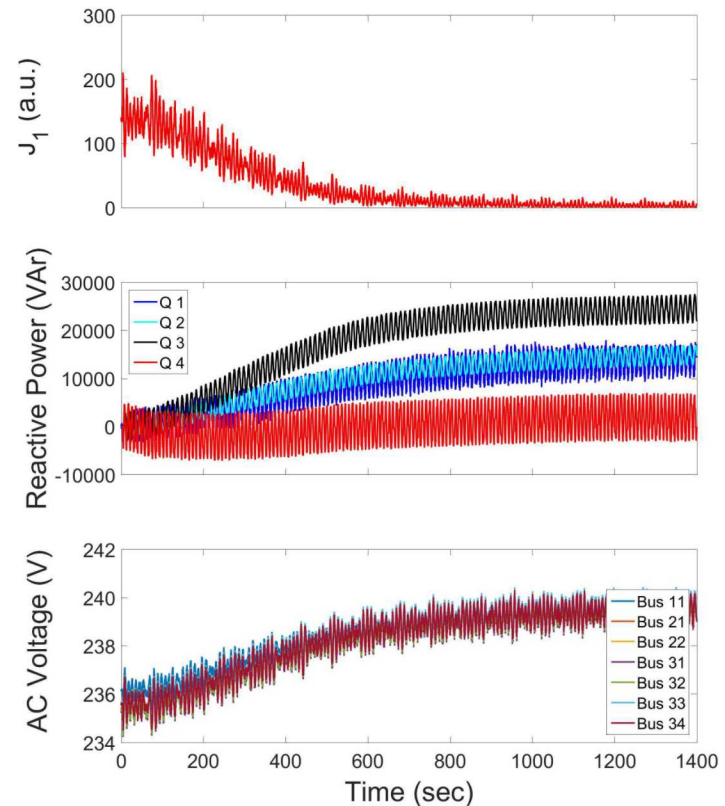
# Results

- ESC adjusts reactive power to reduce the overvoltage conditions on the simulated power system buses.

Test 1:  $J$ , Inverter Reactive Power, and Bus Voltages

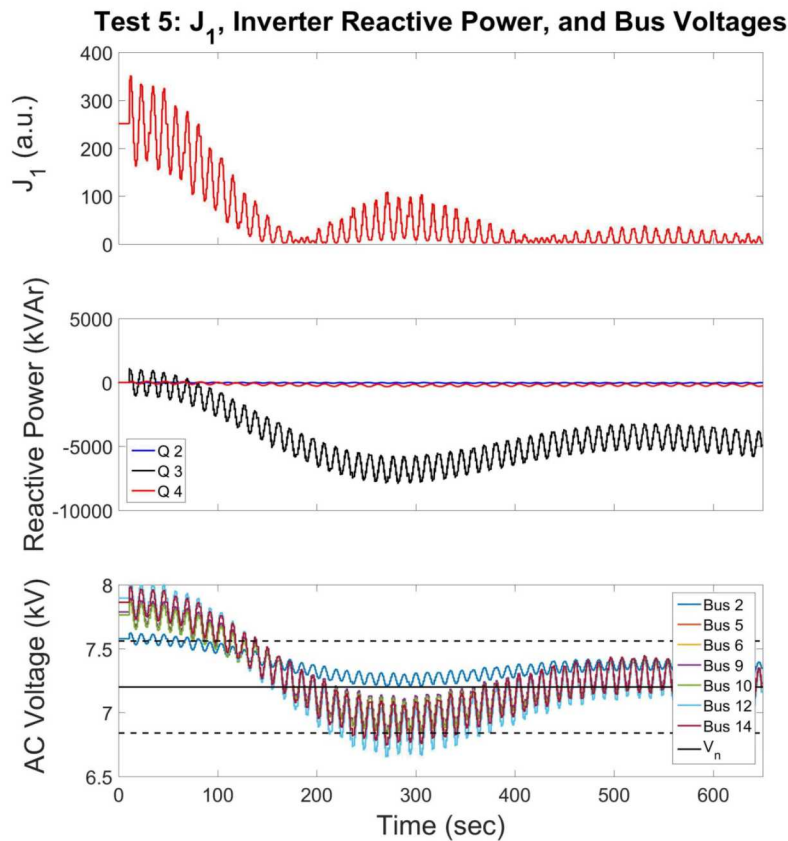


Test 2:  $J_1$ , Inverter Reactive Power, and Bus Voltages

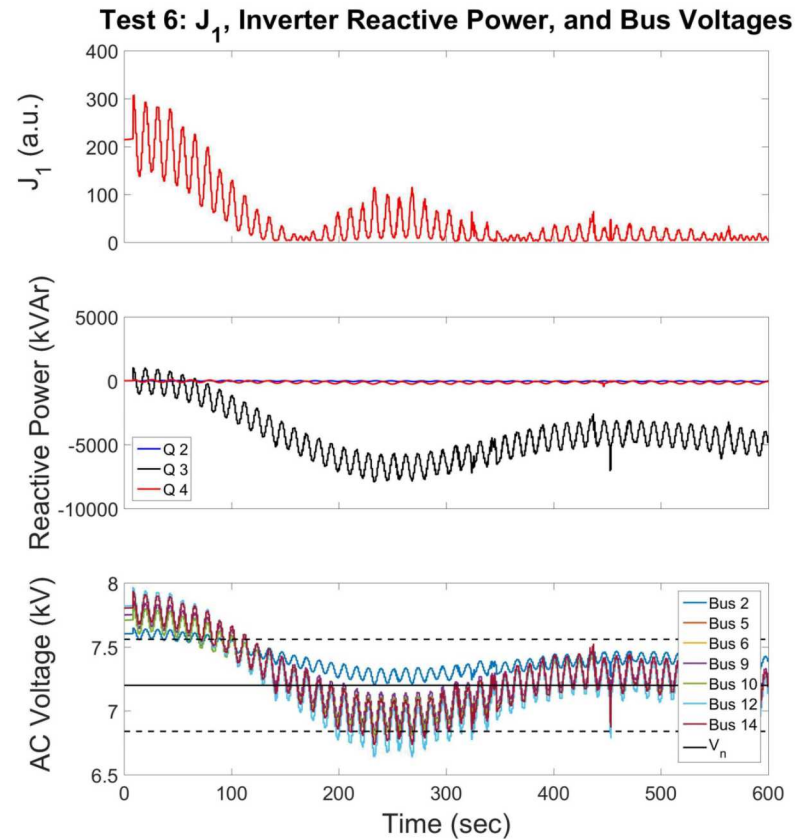


# Results with Variable Irradiance

- The 3 inverters have PV range of  $\pm 0.2$  so they can produce a large range of reactive power, even at low irradiance.



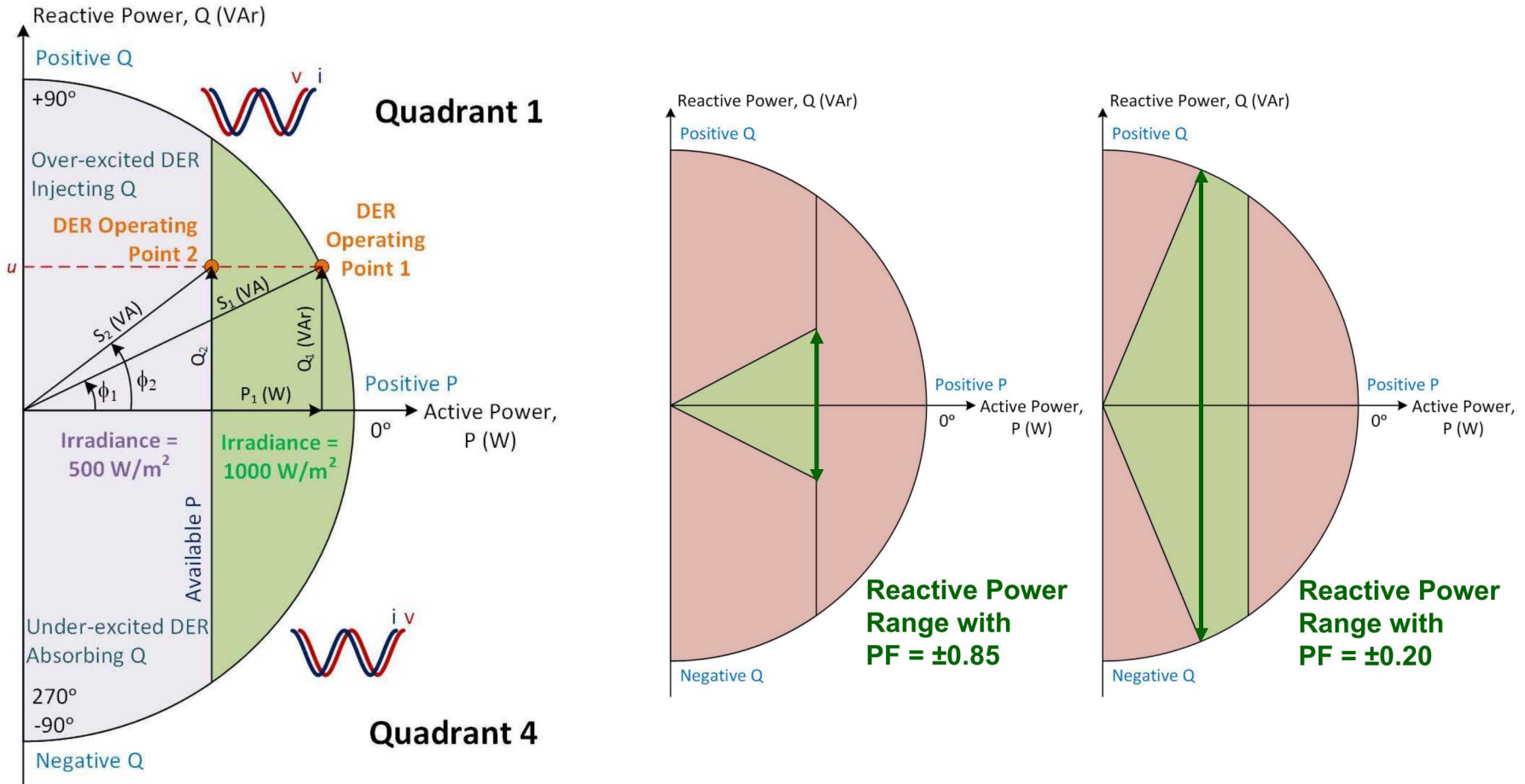
(C) Extremum Seeking Control on the PNM Feeder with 1000 W/m<sup>2</sup> Irradiance.



(D) Extremum Seeking Control on the PNM Feeder with Variable Irradiance.

# ESC Considerations with Variable Irradiance

- Reactive power considerations with variable irradiance



- Extremum seeking control can be used for a range of power system objectives when speed is not critical and an objective function can be broadcast to control equipment. Some applications are:
  - Voltage regulation<sup>1</sup>
  - Transmission services<sup>2</sup>
  - Microgrid control
  
- Future work:
  - 1+ day long ESC simulations with solar variability
  - Tune control parameters and increase ESC response time
  - Run experiments with additional distribution circuit models

1. D.B. Arnold, et al., Model-Free Optimal Control of VAR Resources in Distribution Systems: An Extremum Seeking Approach, IEEE Trans. Power Systems, Vol. 31. No. 5, Sept. 2016.

2. D. B. Arnold, M. D. Sankur, M. Negrete-Pincetic and D. Callaway, "Model-Free Optimal Coordination of Distributed Energy Resources for Provisioning Transmission-Level Services," in IEEE Transactions on Power Systems, vol. PP, no. 99, pp. 1-1, 2017.

# Thank You!

**Jay Johnson**

Renewable and Distributed Systems Integration

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# Prior Experimental Work

- Fixed power factor, volt-var, ESC control functions evaluated with 6 controllable DER (orange)
- The global optimum was when all DER absorbed their rated reactive power
- VV did not reach the global optimum
- ESC tracked to the global optimum, but in much longer times than directly setting the fixed power factor

