

# Real-Time Optimization and Control of Next-Generation Distribution Infrastructure

Andrey Bernstein, Blake Lundstrom, Vahid Salehi, Jorge Elizondo, and Chris Bilby

Network Optimized Distributed Energy Systems (NODES) Workshop and Demonstration





NREL, January 16, 2020



- Distribution feeders
- Microgrids
- □ Campuses, communities, community choice aggregations.





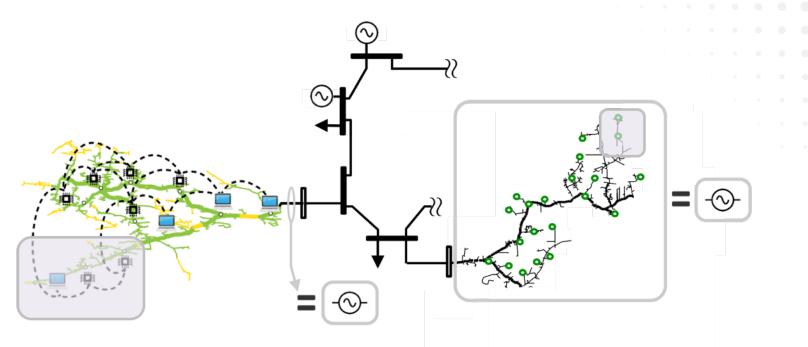


- Distributed, real-time, and network-cognizant operation
- Large-scale distributed energy resource (DER) coordination to acknowledge customer and operator objectives.





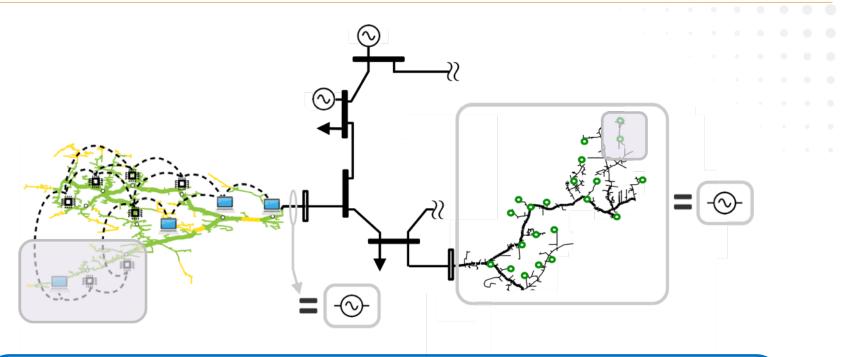




A real-time, distributed, and plug-and-play optimization platform that coordinates the operation of massive numbers of DERs to ensure voltage and power quality, to maximize social welfare, and to emulate virtual power plants.







# Real-time optimization of a single cell in an autonomous energy system





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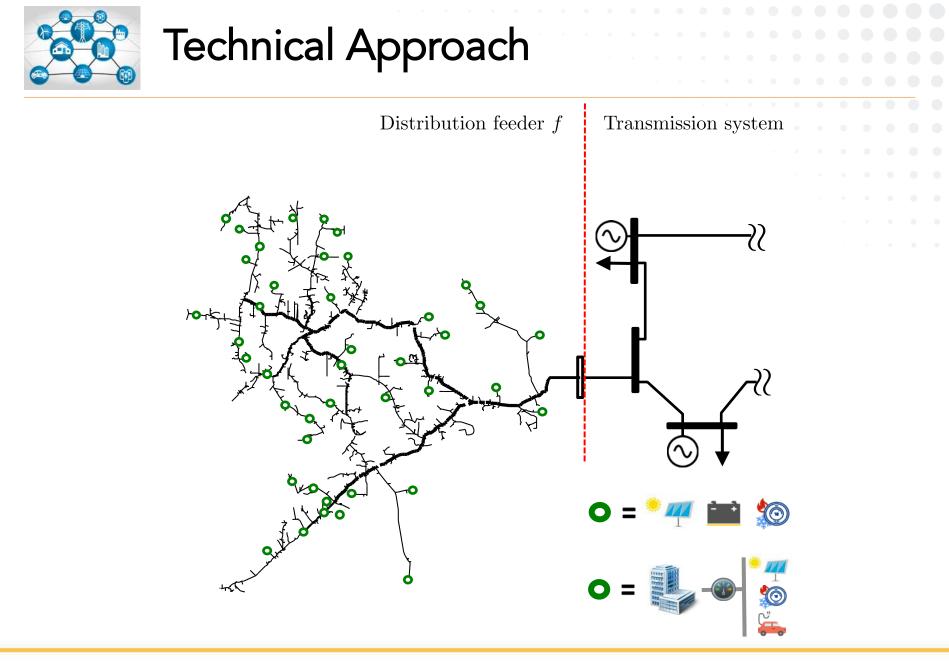
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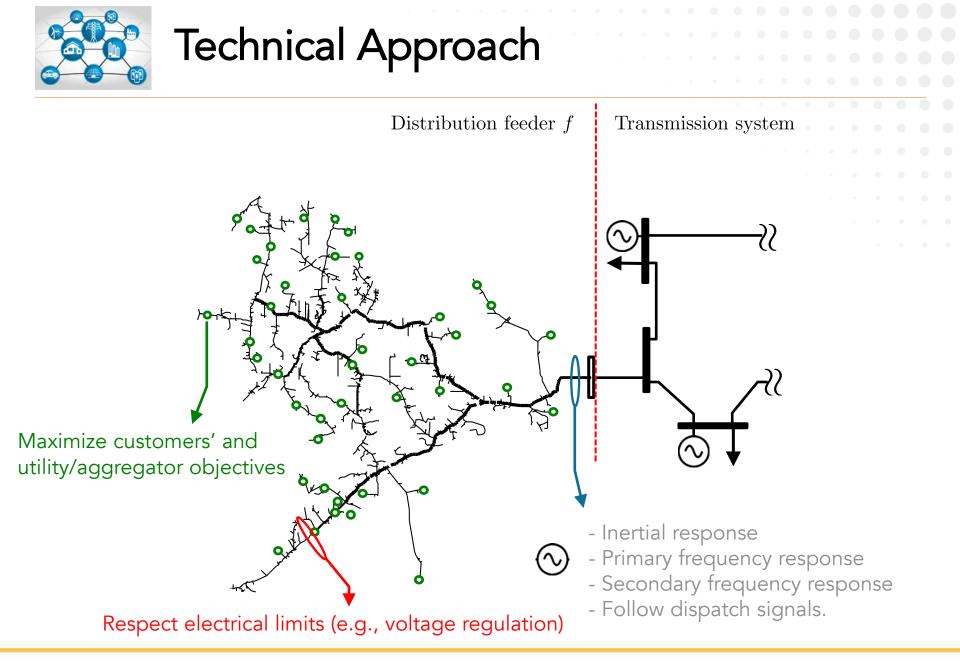
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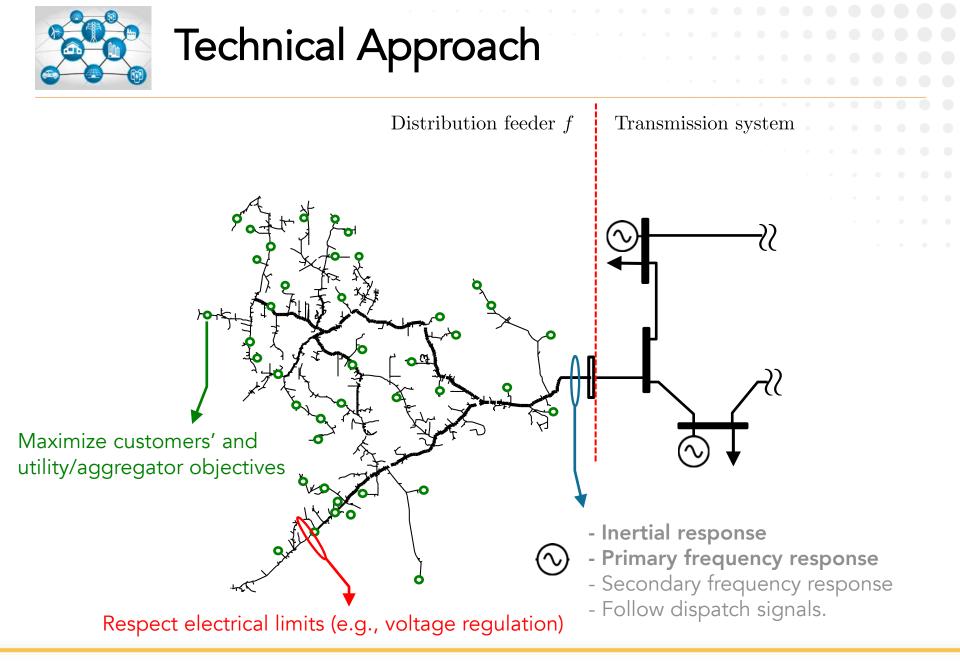






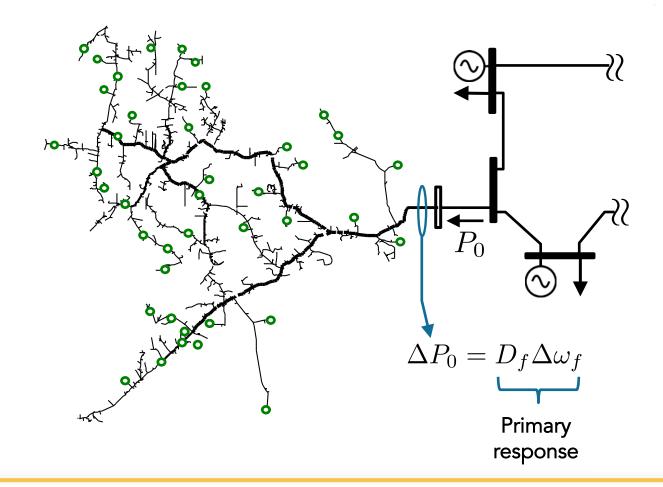






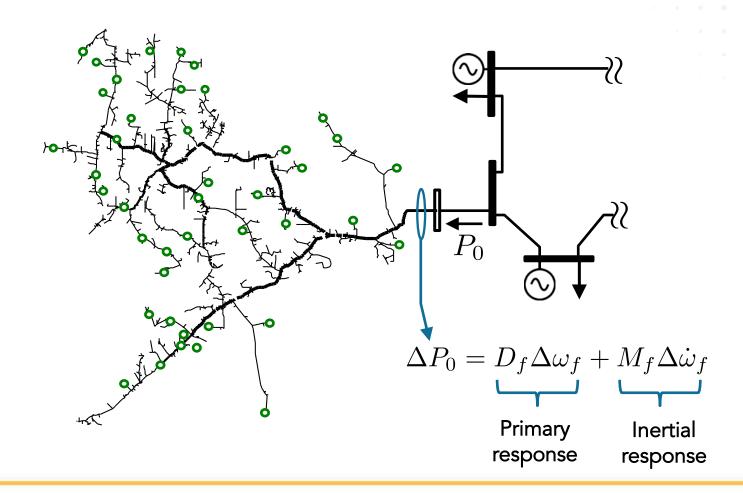


# Inertial and Frequency Response





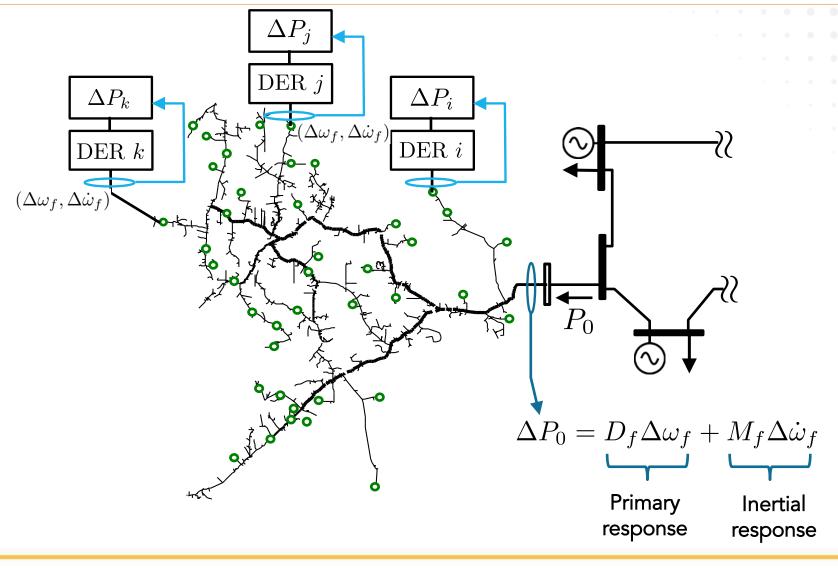








#### Inertial and Frequency Response





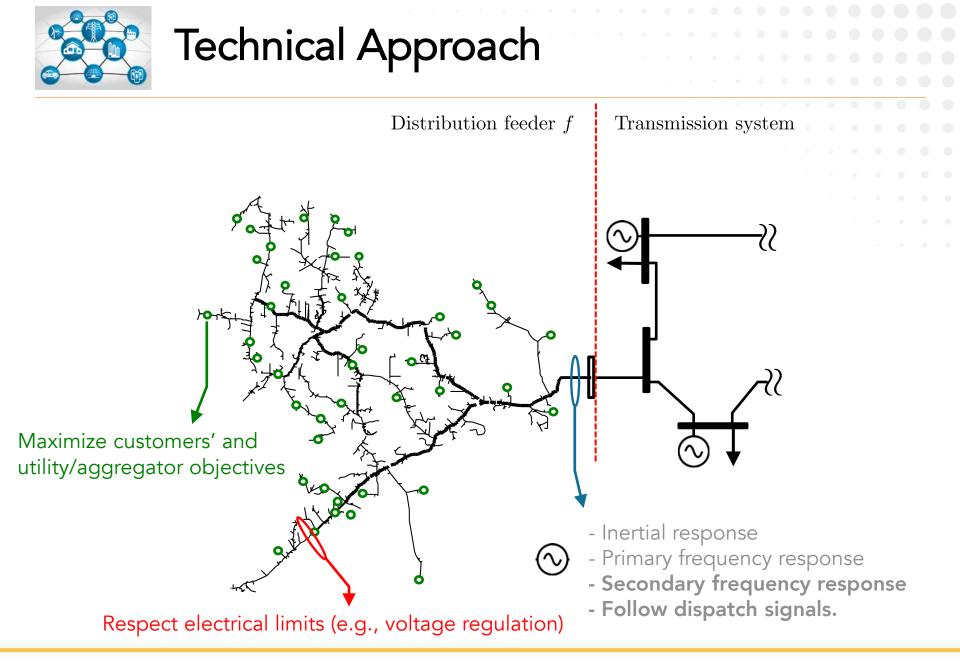


#### Inertial and Frequency Response

Proposed approach (details follow in the presentation by Sairaj Dhople):

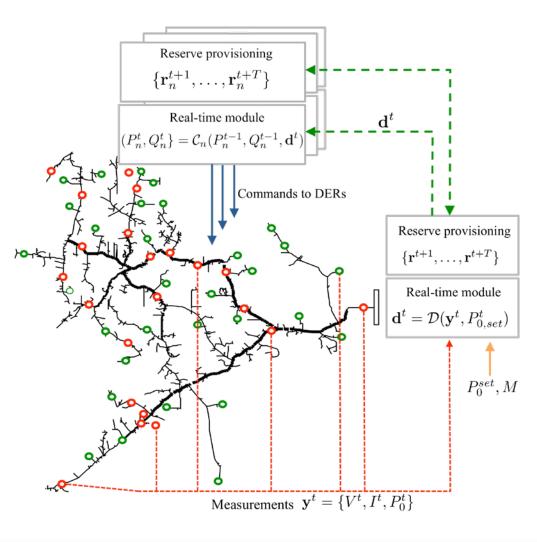
- Optimization model and algorithms to compute coefficients
- □ Ensure *given* aggregate response
- □ Accommodate *fairness* or *economic indicators*.





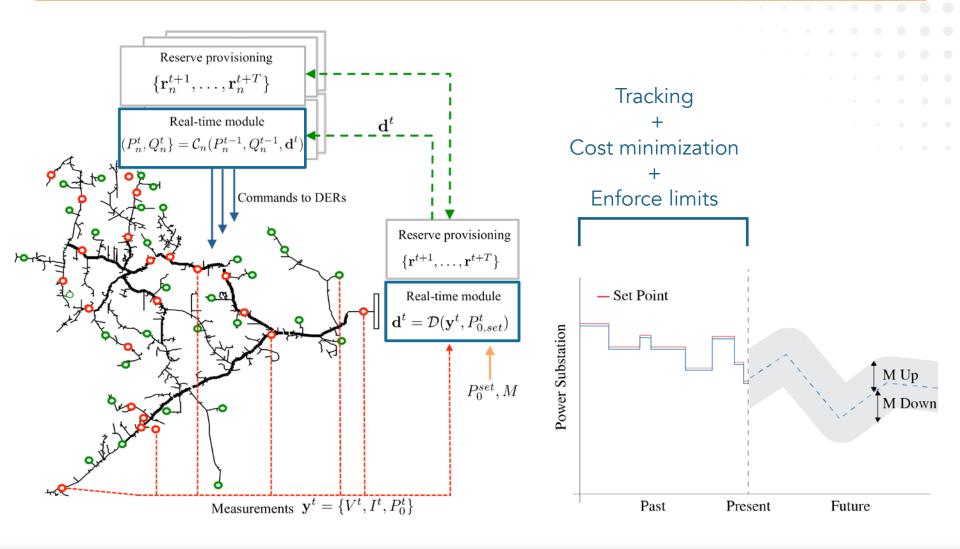






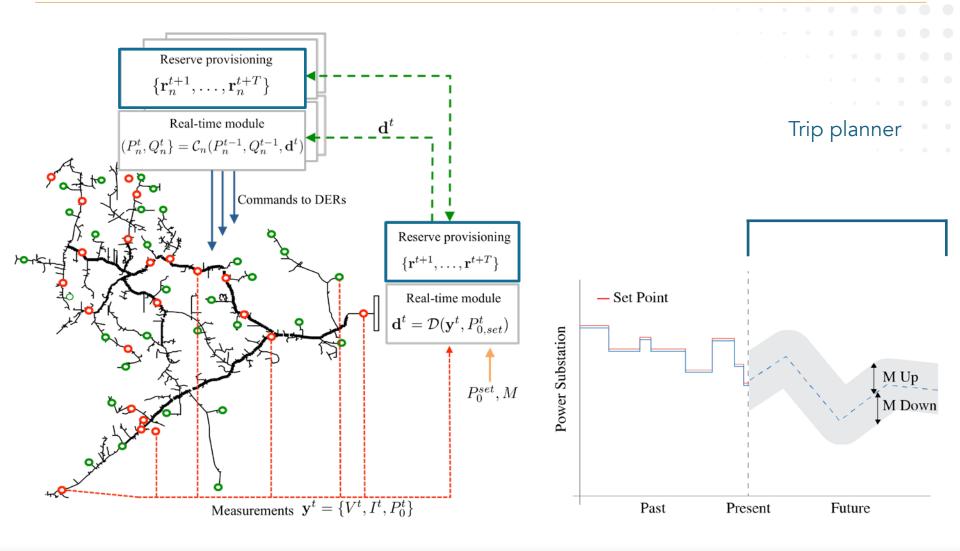






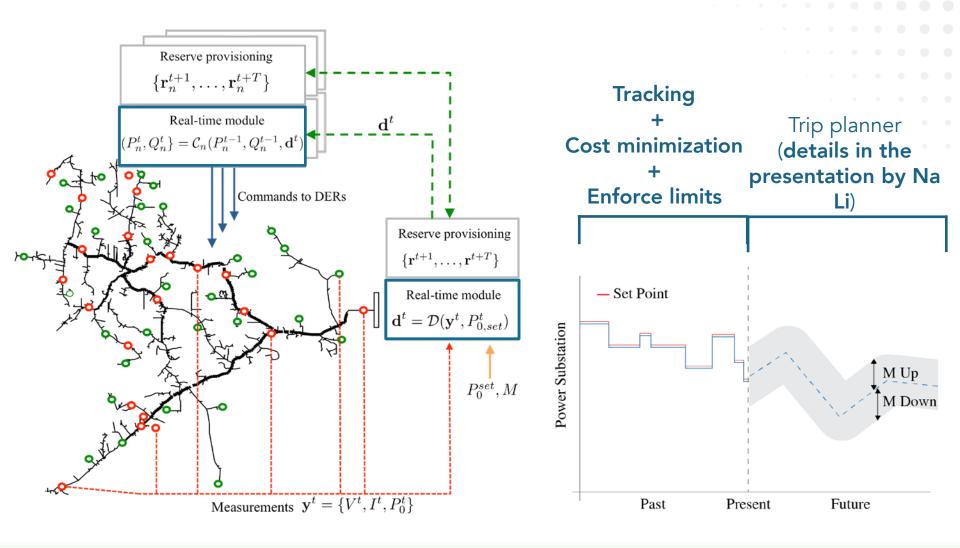




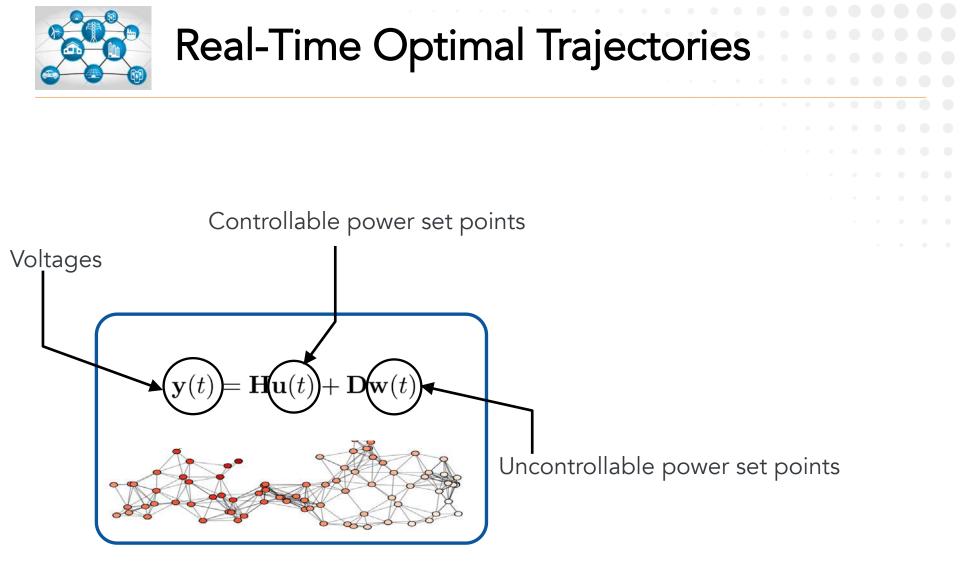










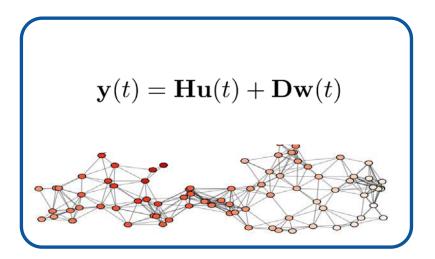






### Real-Time Optimal Trajectories

 Continuous-time optimal power flow (OPF)  $\min_{\{\mathbf{u}_i\}} c_0(\mathbf{y}(\mathbf{u};t);t) + \sum_i c_i(\mathbf{u}_i;t)$ subject to  $\mathbf{u}_i \in \mathcal{U}_i(t) \ \forall i$   $\mathbf{g}(\mathbf{u},\mathbf{y}(\mathbf{u};t);t) \leq \mathbf{0}$ 



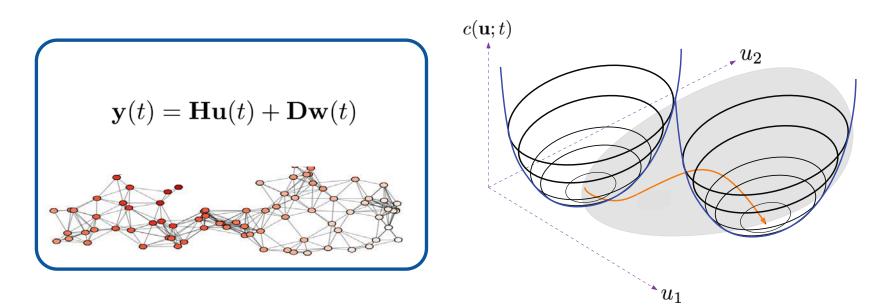




#### Real-Time Optimal Trajectories

Continuous-time OPF

 $\min_{\{\mathbf{u}_i\}} c_0(\mathbf{y}(\mathbf{u};t);t) + \sum_i c_i(\mathbf{u}_i;t)$ subject to  $\mathbf{u}_i \in \mathcal{U}_i(t) \ \forall i$   $\mathbf{g}(\mathbf{u},\mathbf{y}(\mathbf{u};t);t) \leq \mathbf{0}$ 



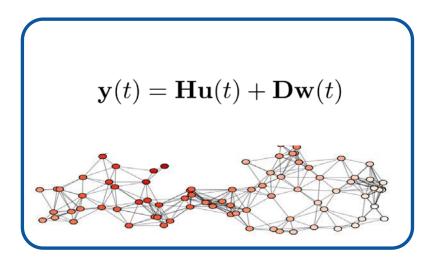




### Real-Time Optimal Trajectories

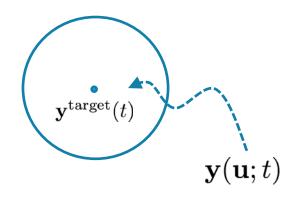
□ Continuous-time OPF

 $\min_{\{\mathbf{u}_i\}} c_0(\mathbf{y}(\mathbf{u};t);t) + \sum_i c_i(\mathbf{u}_i;t)$ subject to  $\mathbf{u}_i \in \mathcal{U}_i(t) \ \forall i$   $\mathbf{g}(\mathbf{u},\mathbf{y}(\mathbf{u};t);t) \leq \mathbf{0}$ 

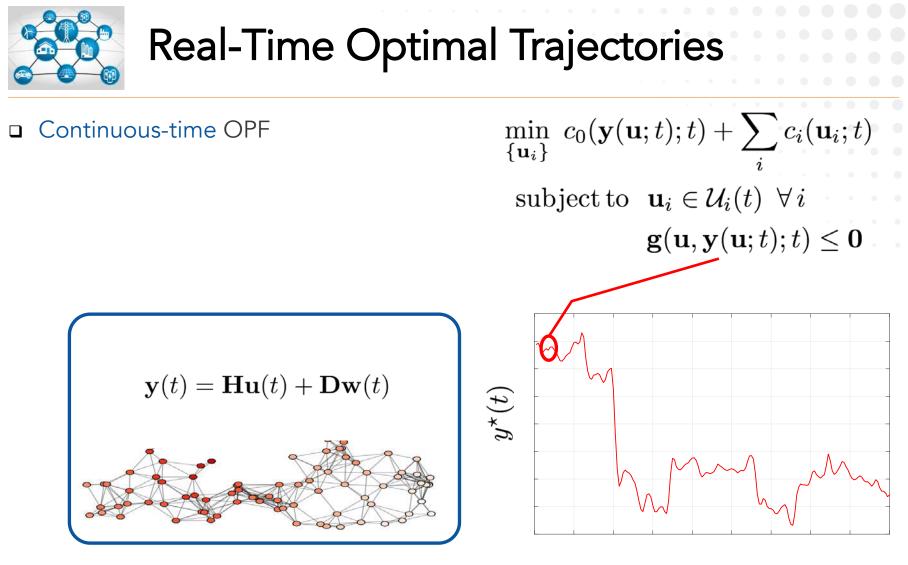


Example:

 $\|\mathbf{y}(\mathbf{u};t) - \mathbf{y}^{\text{target}}(t)\|_2^2 - \nu \le 0$ 





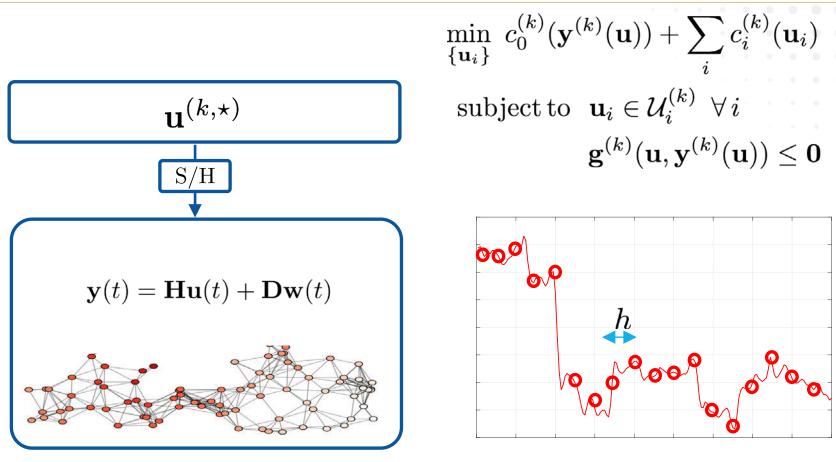


Time [s]





#### **Batch Optimization**



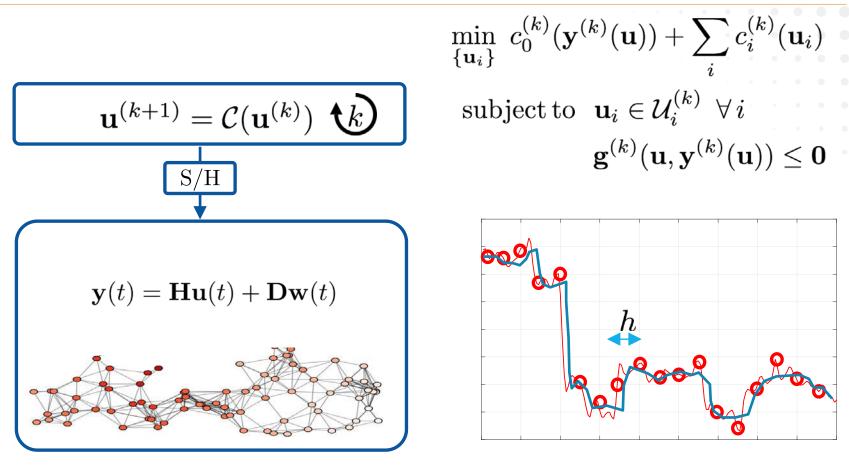
Time [s]

Series of time-invariant optimization problems: impractical in real time





#### Feed-Forward Online Optimization



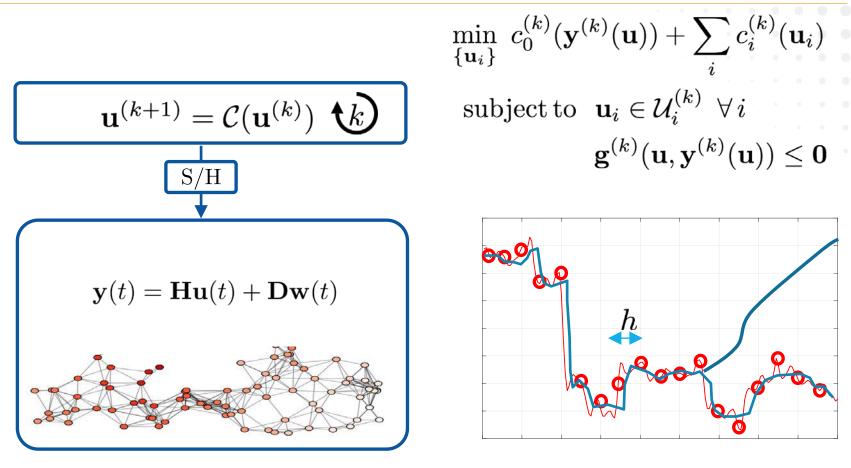
Time [s]

Online algorithm to track optimal solutions (Dontchev et al. 2013; Simonetto-Leus)





#### Feed-Forward Online Optimization



Time [s]

 $\Box$  Feed-forward; time-scale separation; needs expression  $\mathbf{y}^{(k)}(\mathbf{u}) = \mathbf{H}\mathbf{u} + \mathbf{D}\mathbf{w}^{(k)}$ 





#### Feedback Online Optimization

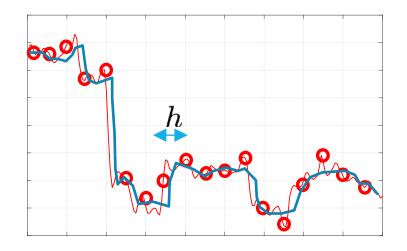
$$\mathbf{u}_{i}^{(k+1)} = C_{i}(\mathbf{u}_{i}^{(k)}, \hat{\mathbf{y}}^{(k)}), \forall i$$

$$\mathbf{\hat{y}}^{(k)}$$

$$\mathbf{y}(t) = \mathbf{H}\mathbf{u}(t) + \mathbf{D}\mathbf{w}(t)$$

$$\mathbf{\hat{y}}^{(t)} = \mathbf{H}\mathbf{\hat{y}}^{(t)} + \mathbf{D}\mathbf{\hat{y}}^{(t)}$$

 $\min_{\{\mathbf{u}_i\}} c_0^{(k)}(\mathbf{y}^{(k)}(\mathbf{u})) + \sum_i c_i^{(k)}(\mathbf{u}_i)$ subject to  $\mathbf{u}_i \in \mathcal{U}_i^{(k)} \ \forall i$   $\mathbf{g}^{(k)}(\mathbf{u}, \mathbf{y}^{(k)}(\mathbf{u})) \leq \mathbf{0}$ 



Time [s]





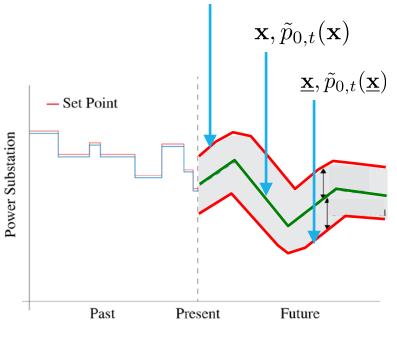
Multiperiod optimization problem, rolling horizon, multicase

Base case: maximize customer/aggregator objectives

□ Subject to: voltage constraint, hardware constraints.  $\overline{\mathbf{x}}, \tilde{p}_{0,t}(\overline{\mathbf{x}})$ 

#### □ Reserve provisioning:

- □ Headroom for power at substation
- □ Fair reserve provisioning participation.

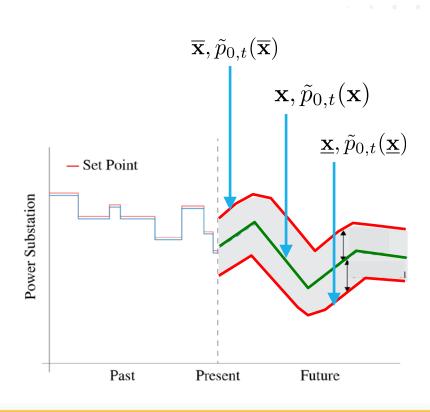






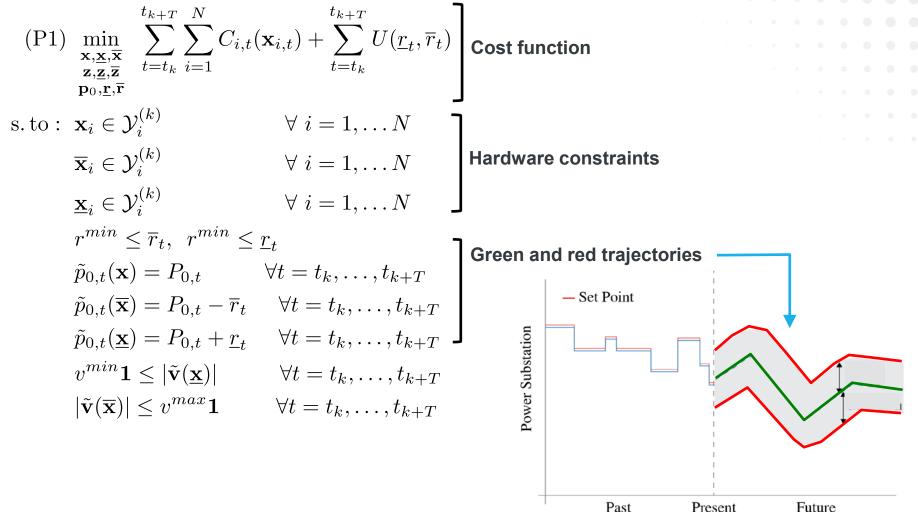
#### Trip Planner

$$(P1) \min_{\substack{\mathbf{x}, \underline{\mathbf{x}}, \overline{\mathbf{x}} \\ \mathbf{z}, \underline{\mathbf{z}}, \overline{\mathbf{z}} \\ \mathbf{p}_0, \underline{\mathbf{r}}, \overline{\mathbf{r}}}} \sum_{t=t_k}^{N} \sum_{i=1}^{N} C_{i,t}(\mathbf{x}_{i,t}) + \sum_{t=t_k}^{t_{k+T}} U(\underline{r}_t, \overline{r}_t)$$
s. to:  $\mathbf{x}_i \in \mathcal{Y}_i^{(k)}$   $\forall i = 1, \dots N$   
 $\overline{\mathbf{x}}_i \in \mathcal{Y}_i^{(k)}$   $\forall i = 1, \dots N$   
 $\underline{\mathbf{x}}_i \in \mathcal{Y}_i^{(k)}$   $\forall i = 1, \dots N$   
 $r^{min} \leq \overline{r}_t, r^{min} \leq \underline{r}_t$   
 $\tilde{p}_{0,t}(\mathbf{x}) = P_{0,t}$   $\forall t = t_k, \dots, t_{k+T}$   
 $\tilde{p}_{0,t}(\overline{\mathbf{x}}) = P_{0,t} - \overline{r}_t$   $\forall t = t_k, \dots, t_{k+T}$   
 $\tilde{p}_{0,t}(\underline{\mathbf{x}}) = P_{0,t} + \underline{r}_t$   $\forall t = t_k, \dots, t_{k+T}$   
 $v^{min} \mathbf{1} \leq |\tilde{\mathbf{v}}(\underline{\mathbf{x}})|$   $\forall t = t_k, \dots, t_{k+T}$   
 $|\tilde{\mathbf{v}}(\overline{\mathbf{x}})| \leq v^{max} \mathbf{1}$   $\forall t = t_k, \dots, t_{k+T}$ 











### Validation and Demonstration

#### □ PHIL at NREL:

□ Real feeder from SCE territory, ~7-MW peak load

□ Hundreds of DERs; at least 100 physical DERs at power.

□ CHIL at SCE:

Substation model with multiple feeders: 50-MW peak, 350-GWh yearly energy

□ Hundreds of DERs.

□ Field deployments:

□ Stone Edge Farm microgrid

□ Holy Cross Energy Basalt Vista Affordable Housing Project





## Power Hardware-in-the-loop at NREL

#### Test case overview

- □ Feeder located in California, within SCE territory
- □ **366** single-phase points of connection
- □ Residential, commercial, and industrial customers
- Peak load of ~7 MW
- Mix of delta and wye connections
- Real load data
- Real irradiance data
- Summer/Peak day
- □ Winter/Min day





## Power Hardware-in-the-loop at NREL

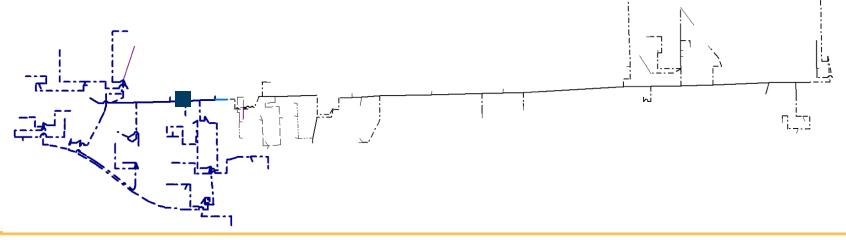
#### **Considered DERs**

□ PV systems (string and microinverters), batteries, EVs, controllable load

- □ Total DER capacity:
  - □ PV: ~8.5 MW
  - □ Batt: ~1 MW
- □ Results in renewable energy penetration (annual energy basis) of ~51%

□ Over 100 controlled powered devices (via PHIL)

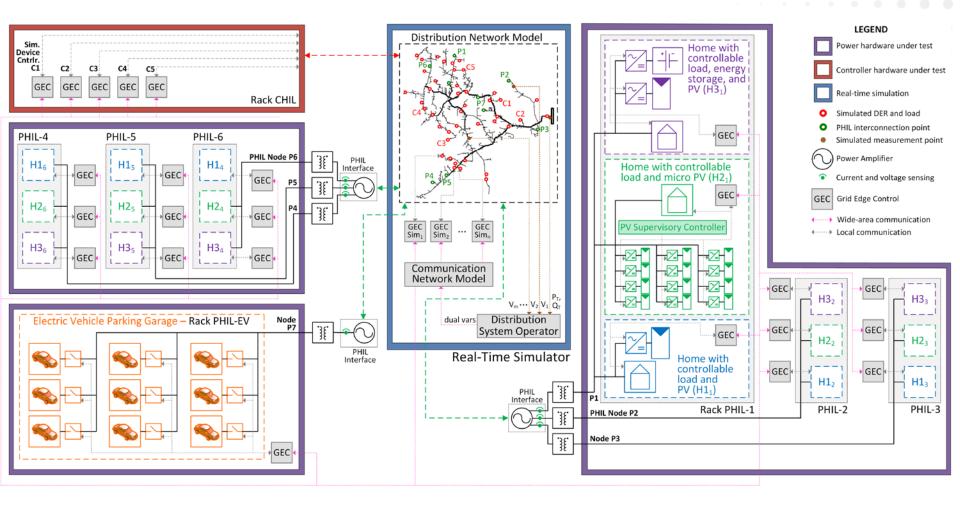
- 10 additional CHIL devices
- Over 100 controlled simulated devices







#### PHIL & CHIL Setup Overview







# PHIL & CHIL Setup Overview

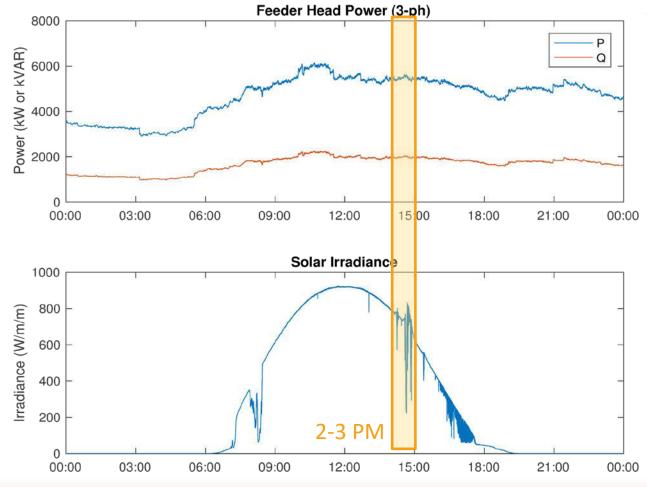
| Rack     | # Devices  | Simulated Device   | Physical Device  |
|----------|------------|--|--|
| CHIL     | 50         | (3) Batteries – 14/12, 23/35, 150/150 kW/kWh<br>(2) PV – 100 and 1500 kW         | BBB Microcontroller  |
| PHIL-1   | 16         | PV Inverters – 199 kW total<br>Batt Inverters – 60.6 kW total<br>Loads - varying | <ul> <li>(1) 3 kW sPV, (1) 3 kW sPV, (12) 320 W uPV</li> <li>(1) 5 kW / 10 kWh Li-ion Batt</li> <li>(1) 12 kVA load bank with profile</li> </ul>   |
| PHIL-2   | 16         | PV Inverters – 1000 kW total<br>Batt Inverters – 237 kW total<br>Loads - varying | <ul> <li>(1) 5 kW sPV, (1) 3.8 kW sPV, (12) 320 W uPV</li> <li>(1) 5 kW / 10 kWh Li-ion Batt</li> <li>(1) 12 kVA load bank with profile</li> </ul> |
| PHIL-3   | 16         | PV Inverters – 481 kW total<br>Batt Inverters – 114 kW total<br>Loads - varying  | <ul> <li>(1) 5 kW sPV, (1) 3.8 kW sPV, (12) 320 W uPV</li> <li>(1) 5 kW / 10 kWh Li-ion Batt</li> <li>(1) 12 kVA load bank with profile</li> </ul> |
| PHIL-4   | 16         | PV Inverters – 185 kW total<br>Batt Inverters – 47 kW total<br>Loads - varying   | <ul> <li>(1) 3 kW sPV, (1) 5 kW sPV, (12) 320 W uPV</li> <li>(1) 5 kW / 10 kWh Li-ion Batt</li> <li>(1) 62 kVA load bank with profile</li> </ul>   |
| PHIL-5   | 15         | PV Inverters – 791 kW total<br>Loads - varying                                   | (1) 3 kW sPV, (1) 5 kW sPV, (12) 320 W uPV<br>(1) 62 kVA load bank with profile  |
| PHIL-6   | 16         | PV Inverters – 62 kW total<br>Batt Inverters – 17 kW total<br>Loads - varying    | <ul> <li>(1) 3 kW sPV, (1) 5 kW sPV, (12) 320 W uPV</li> <li>(1) 5 kW / 10 kWh Li-ion Batt</li> <li>(1) 62 kVA load bank with profile</li> </ul>   |
| PHIL-EVs | 9          | Parking Garage – 388 kW  | (9) 5 kW Level 2 EVSE with EV  |
| Total    | 104 + (10) |  |  |



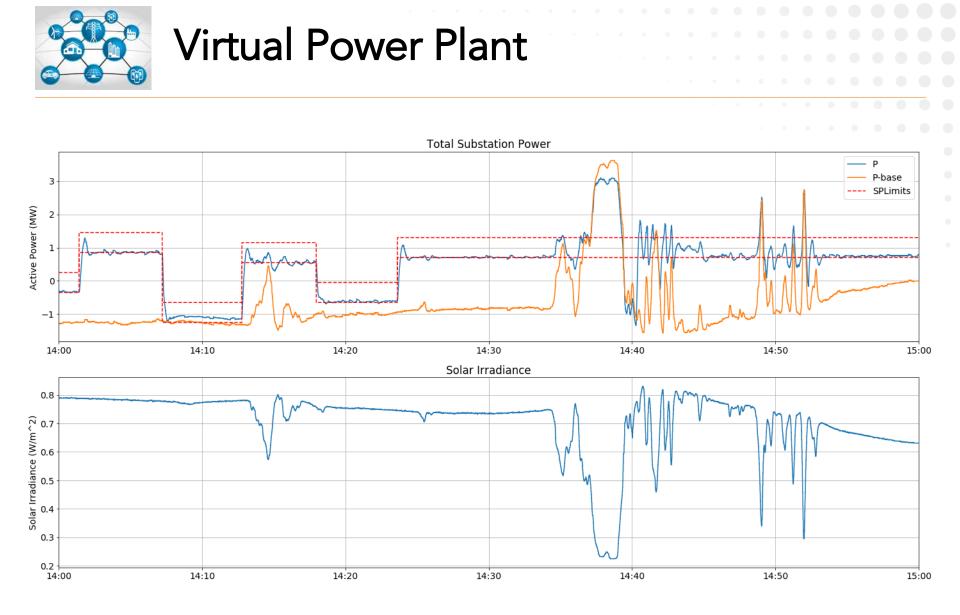


# Test Case #1

- Max Load Day
  - Virtual Power Plant

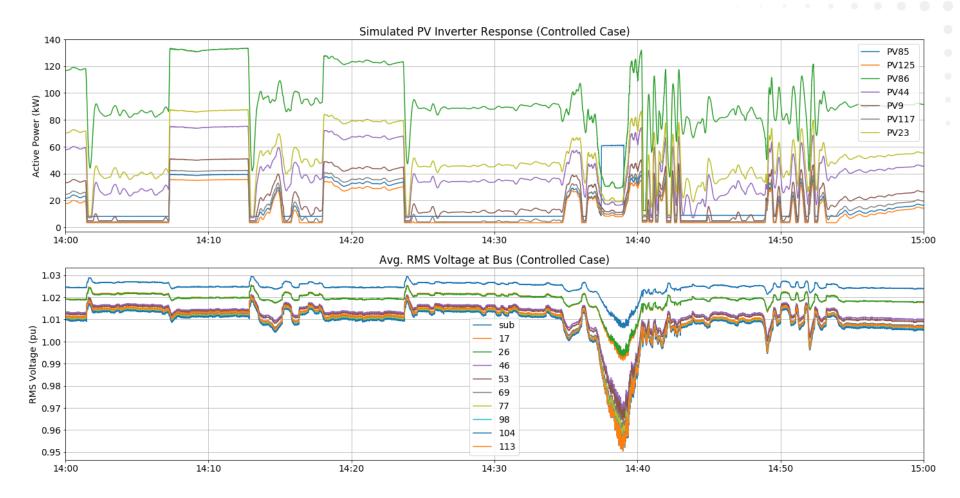






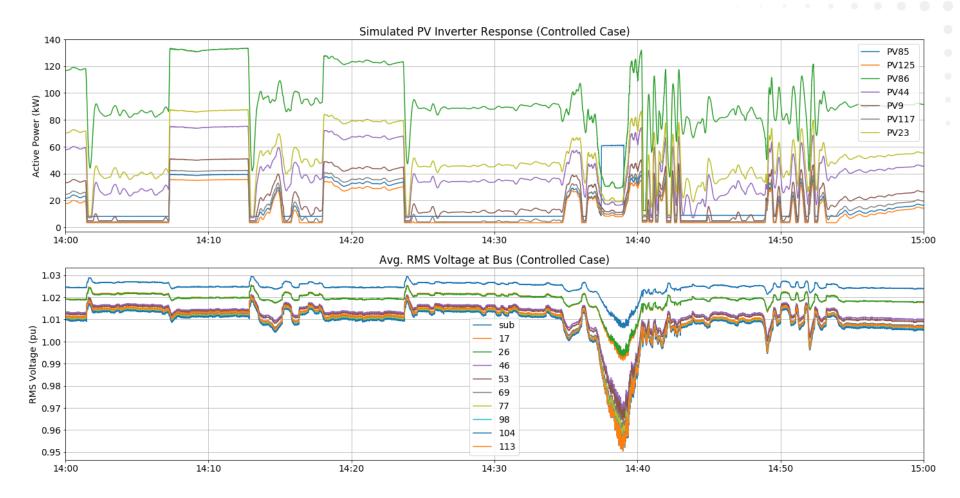


**Virtual Power Plant** 





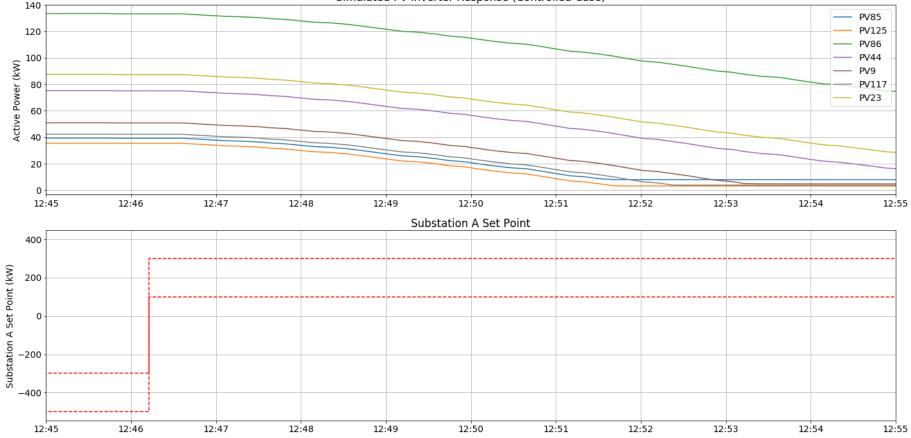
**Virtual Power Plant** 





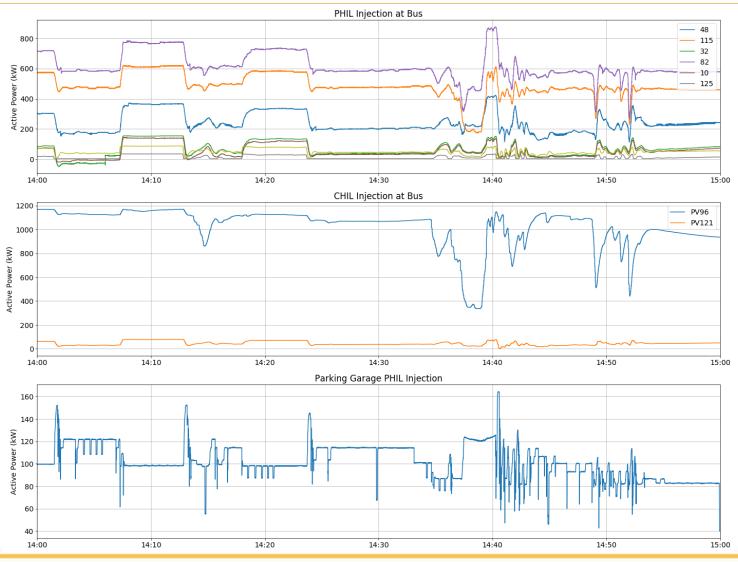






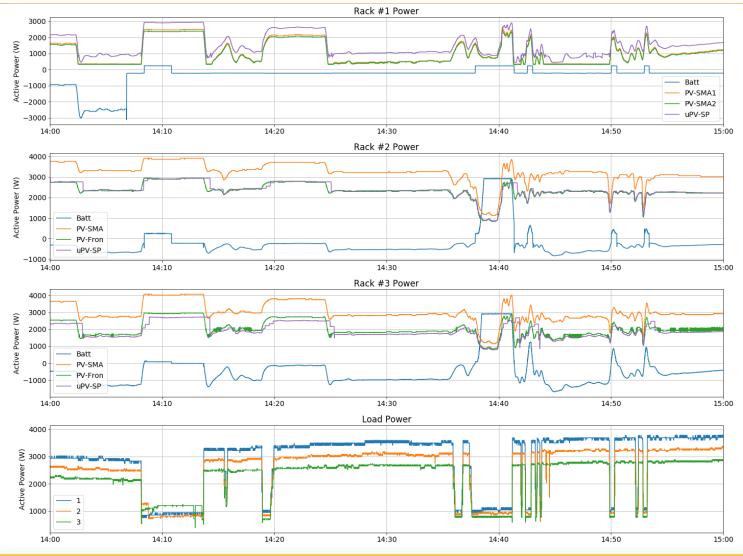






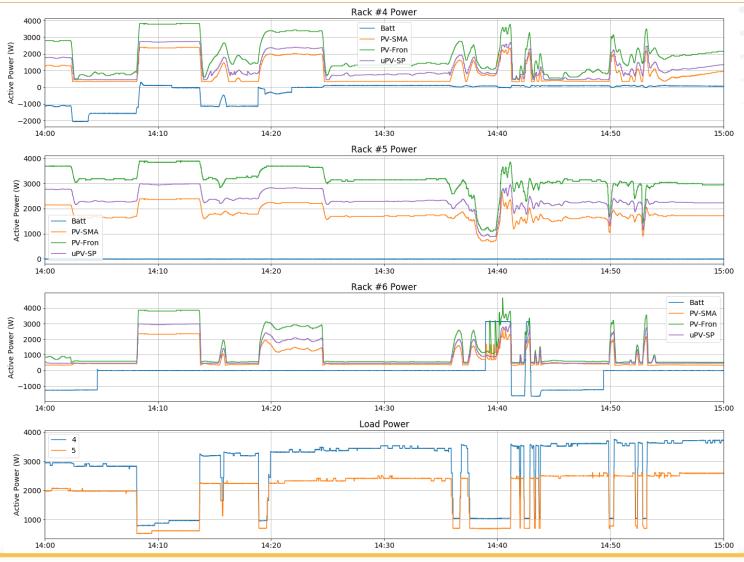






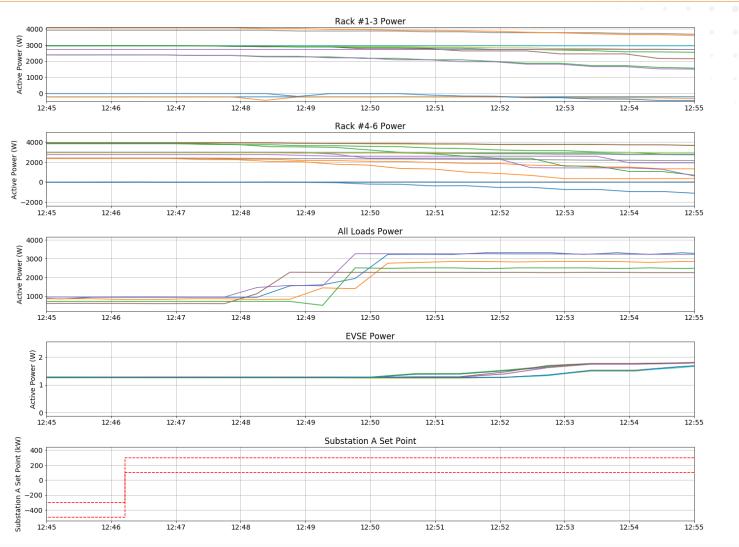




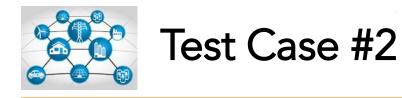




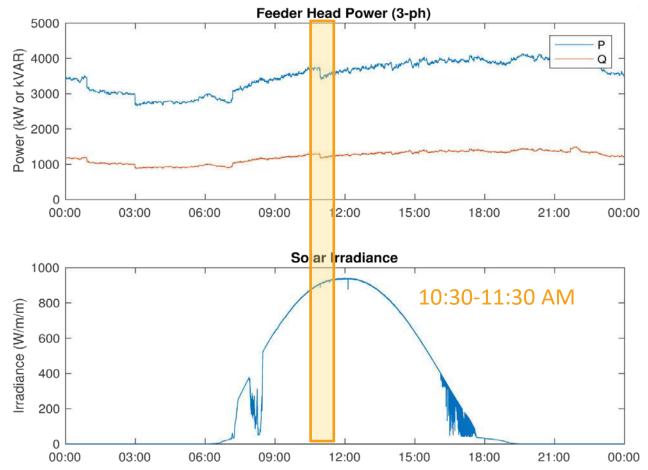






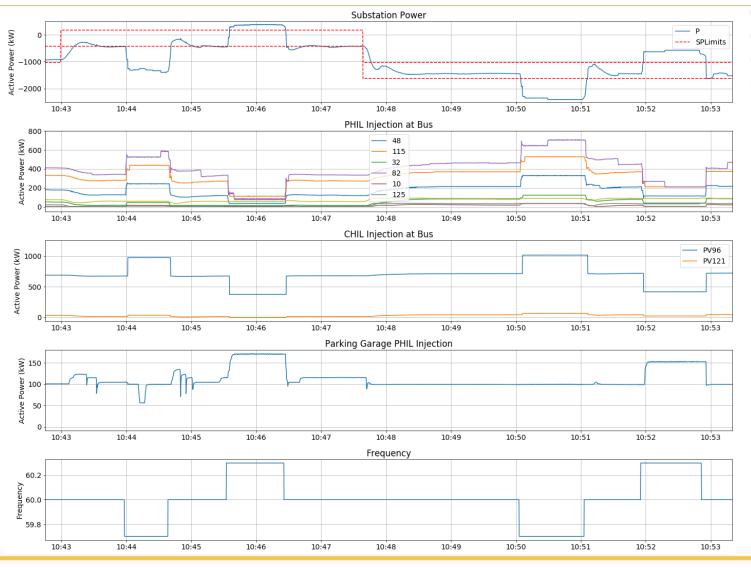


- □ Min Load Day
  - **□** Frequency Response + Virtual Power Plant





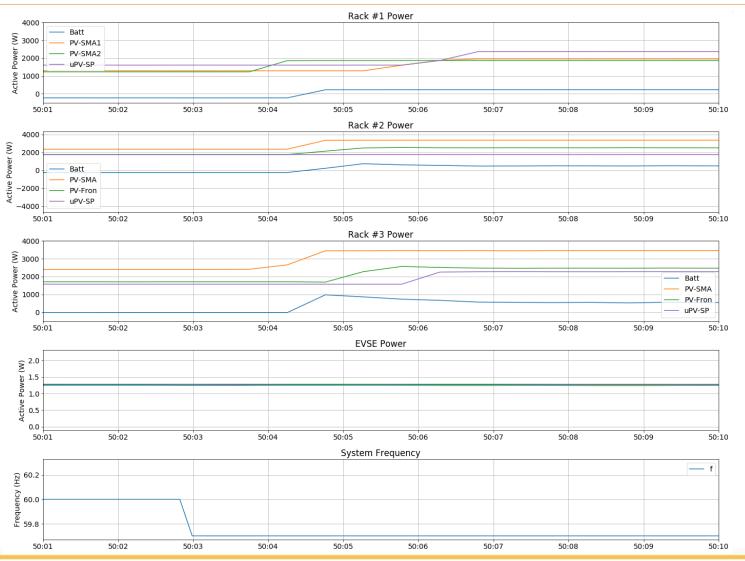
### Frequency Response + Virtual Power Plant







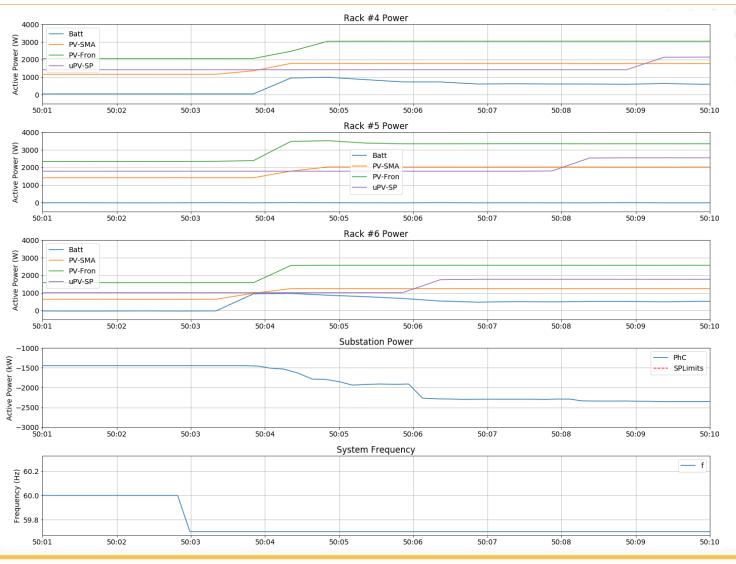
### Frequency Response + Virtual Power Plant







### Frequency Response + Virtual Power Plant







### Controller-Hardware-in-the-Loop at SCE

- □ CHIL experiments at SCE
- PowerFactory model with updates of 1-second in real-time simulation platforms
- Validate synthetic regulating reserve (voltage regulation and dispatch signalfollowing) algorithms
- Model properties:
  - ~1,500 single-phase points of interconnection representing approximately 2,000 customers (a mix of residential, commercial, and industrial customers)
  - ~500 controllable devices are included. Controllable devices are at both the residential and commercial/utility scales.





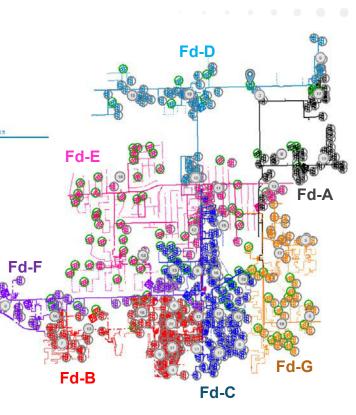
### SCE Distribution System Model

- Peak load of ~49 MW and a minimum load of ~15 MW in 2015.
- Sub-A annual net energy delivered in 2015 was ~216 GWh
- To meet the 50% renewable penetration level, ~108 GWh should be provided by DERs.
- Based on NREL's PVWatts<sup>®</sup> data, a 1-kW PV system in Santa Ana produces approximately 1,586 kWh annually.
- Sub-A requires at least 68 MW of distributed renewable sources.



## Existing and Added Fictitious DERs

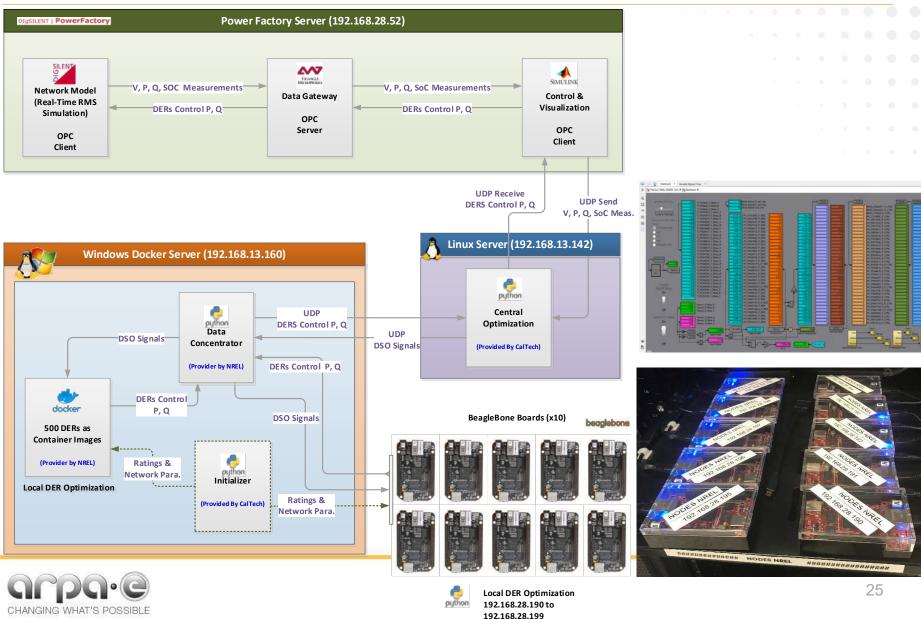
| Feeder                      | Exist-<br>ing<br>DER<br>Count | Exist-<br>ing PV<br>MW | Exist-<br>ing<br>BESS<br>MW | Fictitious<br>PV Inst. | Fictitious<br>PV MW | Fictitious<br>BESS<br>MW/<br>MWh | Total DER<br>Count |       |
|-----------------------------|-------------------------------|------------------------|-----------------------------|------------------------|---------------------|----------------------------------|--------------------|-------|
| Fd-A_12KV                   |                               |                        |                             | 41                     | 5.425               | 1 MW/<br>6 MWh                   | 46                 |       |
| Fd-B_12KV                   |                               |                        |                             | 123                    | 10.085              | 1 MW/<br>6 MWh                   | 128                |       |
| Fd-C_12KV                   |                               |                        |                             | 97                     | 10.25               | 1 MW/<br>6 MWh                   | 115                | 2500  |
| Fd-D_12KV                   |                               |                        |                             | 52                     | 9.29                | 1 MW/<br>6 MWh                   | 60                 |       |
| Fd-E_12KV                   |                               |                        |                             | 33                     | 10.03               | 1 MW/<br>6 MWh                   | 74                 |       |
| Fd-F_12KV                   |                               |                        |                             | 30                     | 10.1275             | -                                | 37                 |       |
| Fd-G_12KV                   |                               |                        |                             | 33                     | 9.53                | 1 MW/<br>6 MWh                   | 49                 |       |
| All 4-kV feeders @<br>Sub-B |                               |                        |                             | -                      |                     |                                  |                    | - B23 |
| Total feeders               |                               |                        |                             | 409                    | 64.727              | 6 MW/<br>36 MWh                  | 514                |       |
| Existing data redacted      |                               | Total DE               | Rs                          | 514                    |                     |                                  |                    |       |
|                             |                               |                        |                             | Total PV               | MW                  | 68.786                           |                    |       |
|                             |                               |                        | SS<br>Wh                    | 9.5 /54                |                     |                                  |                    |       |





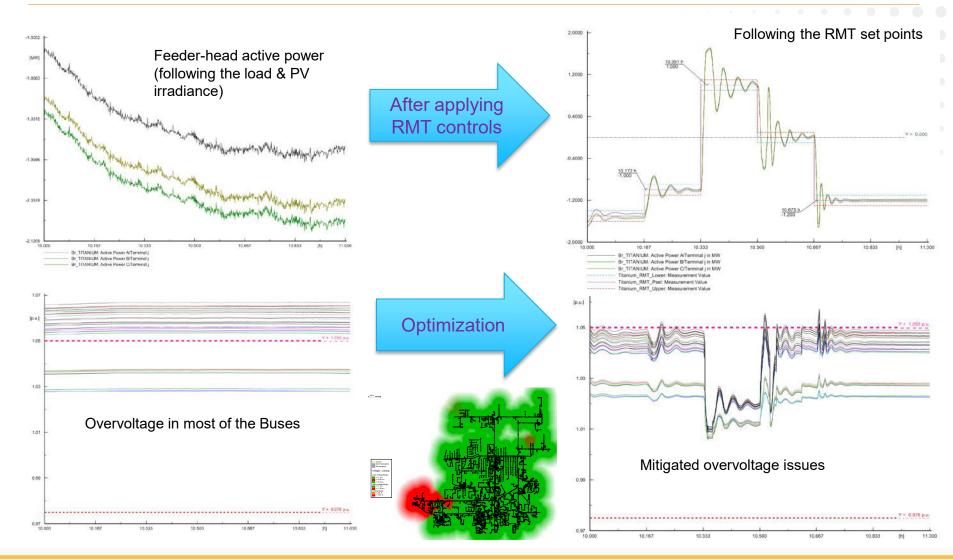


### SCE's CHIL Architecture

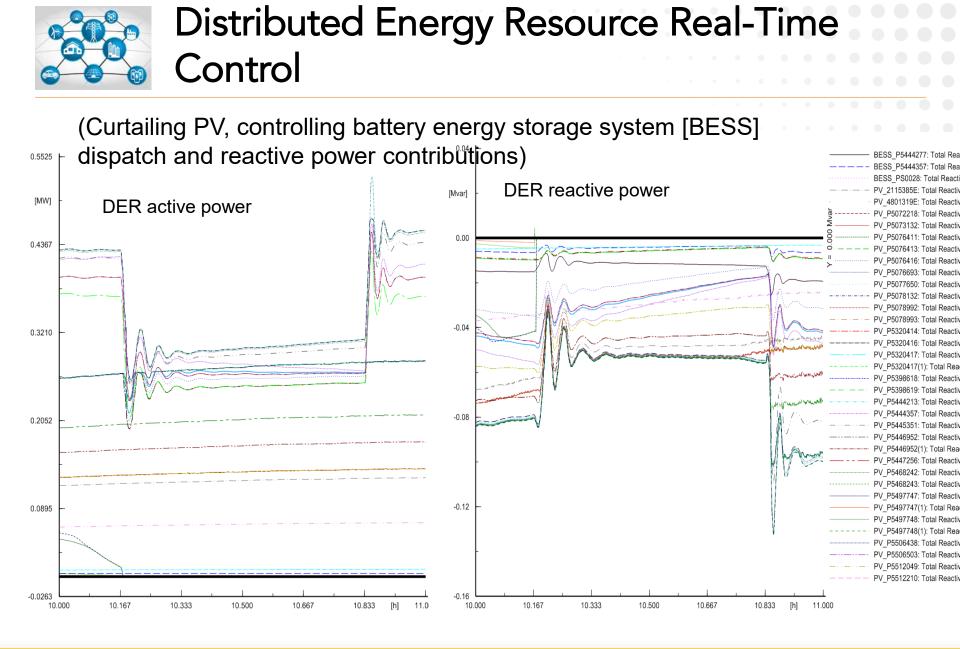




### **Results of Optimization**











## Stone Edge Farm Demonstration

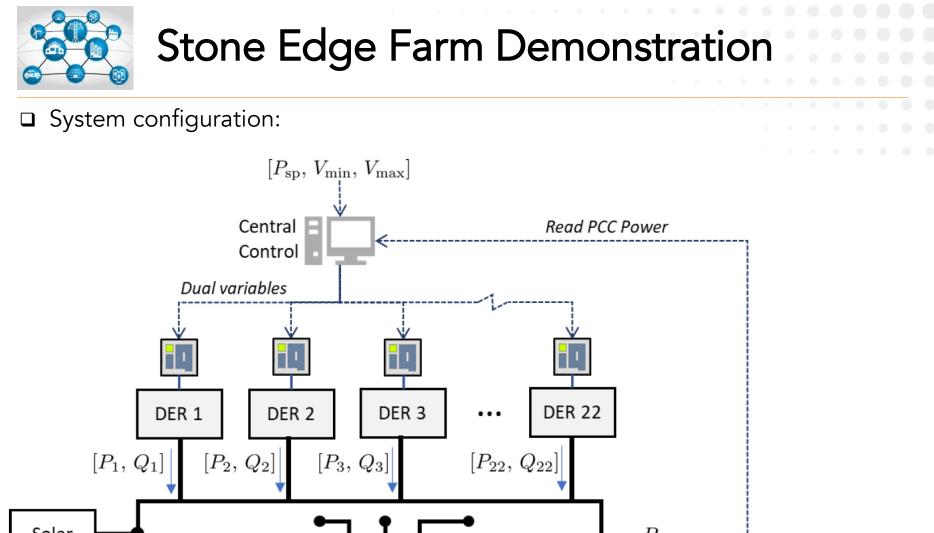
- Stone Edge Farm Microgrid
- Extending more than 16 acres in Sonoma, CA
- □ ~20 assets:
  - PV systems, energy storage systems, hydrogen electrolyzer, gas turbine, controllable loads.
- In collaboration with Heila
   Technologies.

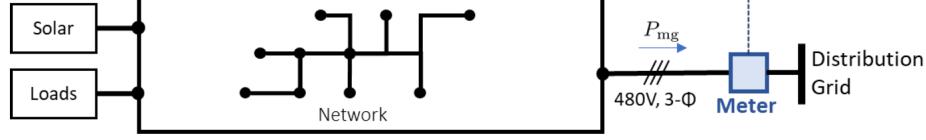






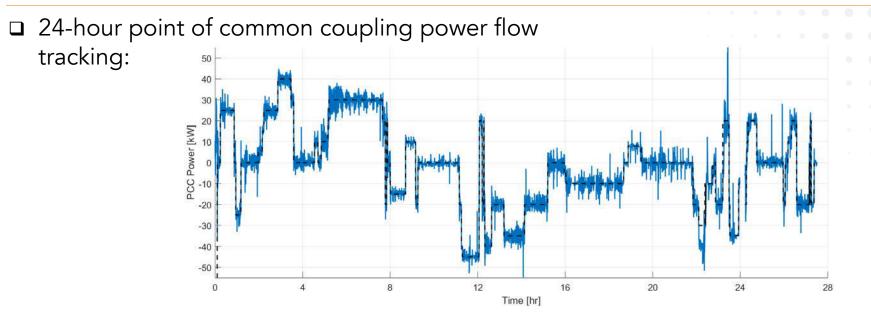




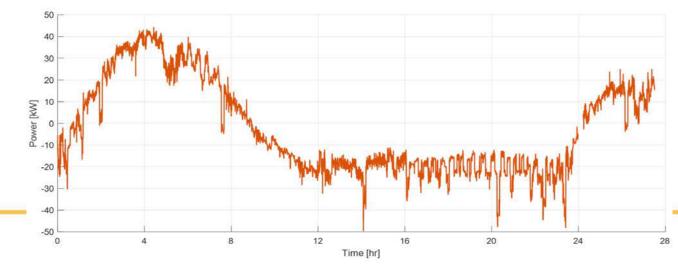




# Stone Edge Farm Demonstration



□ 24-hour point of common coupling power flow without control:







### Stone Edge Farm Demonstration

#### □ Voltage regulation



Figure 11. Average line-neutral voltage at nodes in the microgrid





### **Basalt Vista Affordable Housing Project**

- Habitat for Humanity, Pitkin County, Basalt School District
- 27 homes for teachers and local workforces.
- Designed to ZNE building with all electric construction
- Adjacent to Basalt High School
- 4 selected for HCE's field deployment

#### Home Equipped with Controllable Loads

- Rooftop solar
- Energy storage
- Mobility charging (EVSE)
- Comfort (Hot Water + HVAC)



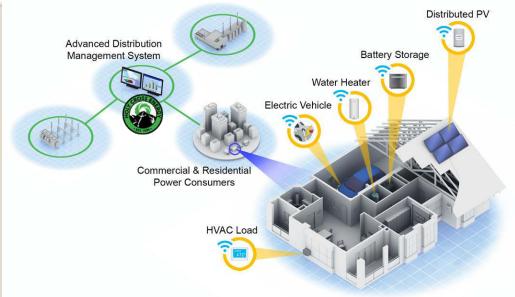




### Basalt Vista Case Study

Project Goal: Demonstrate the ability for a distribution utility to control and dispatch Distributed Energy Resources (DERs) to provide value to the grid as well as to the individual consumer.

- Microgrid controllers coupled with DER
  - Flexible
  - VPP at All Levels
    - Feeder, Community or Individual Buildings
- ADMS: Simple Management and Visibility of DER
- Studied High Penetration of DERs
- Interoperability of different "Systems"
- Resilient Soft Microgrid







#### Advanced Distribution Management System (ADMS)

Fully integrated:

- Supervisory Control And Data Acquisition (SCADA)
- Outage Management System (OMS)
- Distribution Energy Resource Management System (DERMS)

Enhanced Situational Awareness for:

- Load Flow and State Estimation
- Vehicle Location
- Switching Validation
- Outage and Restoration Information from AMI
- Also runs applications, including:
  - CVR conservation voltage reduction
  - VVO volt/var optimization
  - FLISR fault location, isolation and service restoration

One easy-to-use graphical interface provided by Survalent (existing HCE partner)

### **Distributed Control of DERs**





#### Basalt Vista

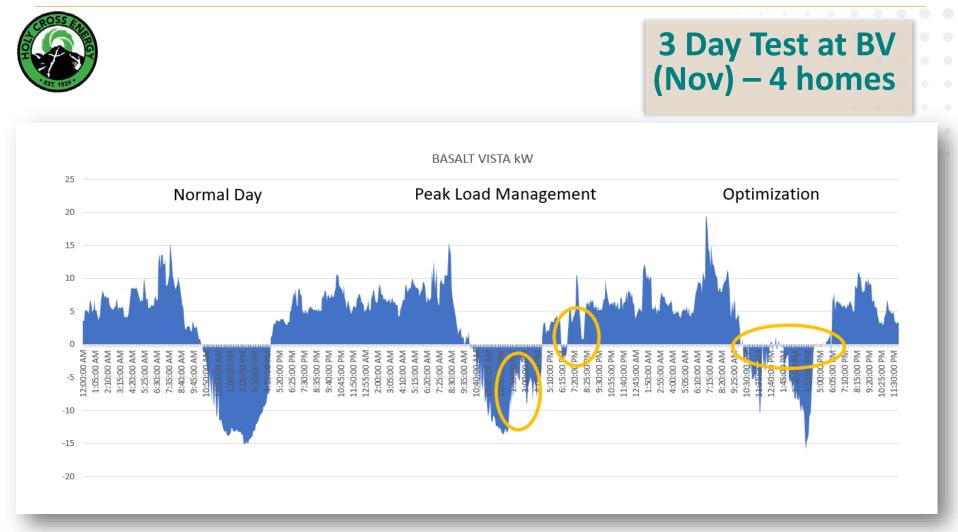
#### Analog Points at HCE Transformer 240.61 Voltage Y ph 36.02 Amps -8.71 kW -0.99 Power Factor -0.52 Vars 176.54 Phase Angle

| W   | atts   | 'n | a | Вох |    |
|-----|--------|----|---|-----|----|
|     | watts  |    |   | ]   |    |
|     |        |    |   |     |    |
| CC. | ALC: N |    |   |     | C+ |

- Optimization Status
- OFF Peak Time Mgmt
- OFF Storm Watch

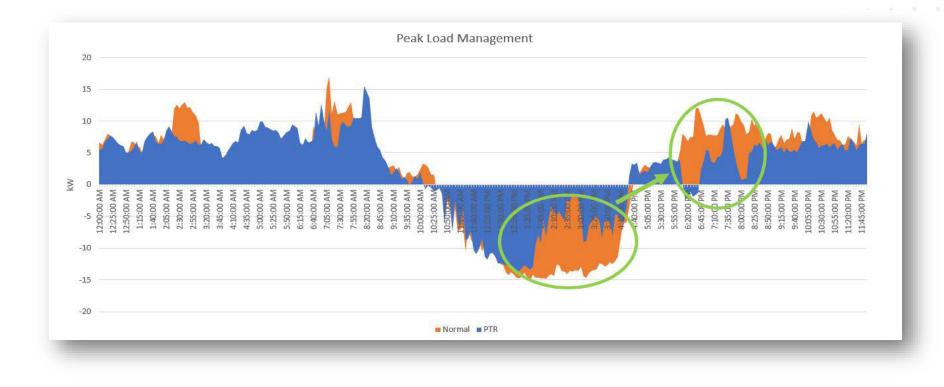








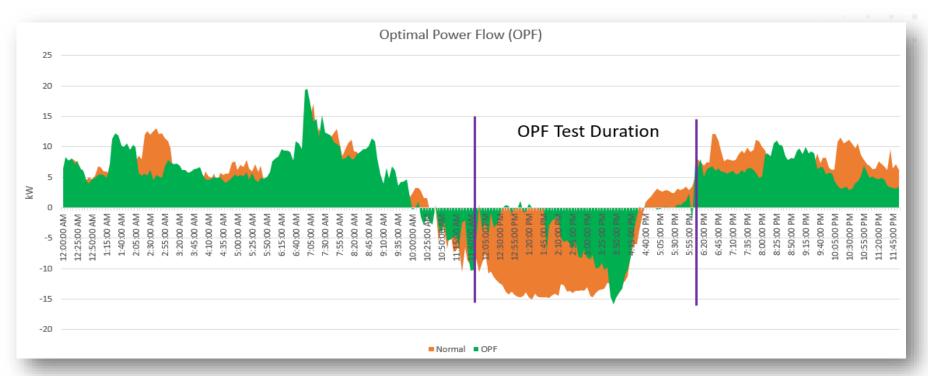
#### 3 Day Test at BV Peak Load Management







### 3 Day Test at BV Optimal Power Flow



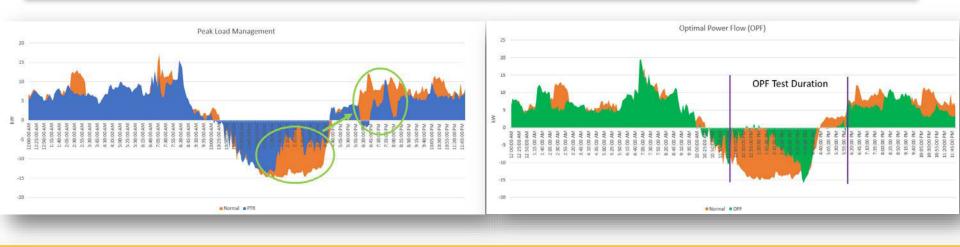
Power at Transformer set to 0 Watts throughput. System set to aggregated optimization. PV set to charge batteries than to grid. Option to curtail PV to create a true 0 Watts load profile.





### Learnings from the Grid Edge

- Stay focused on the Big 3 PV, EV, and BESS
  - Some members show willingness to allow utility control of DERs
  - Battery Storage may provide voltage and frequency support to a high penetration grid
  - Distributed resources can help manage overall cost of service for members
- DER will have a greater value if they work together in small groups to provide VPP and Microgrids
- Cost of capital can have a material impact on project viability



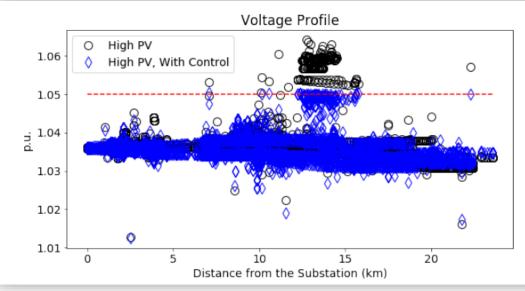




### **More Learnings**

- Only need to control a subset of DER in a high penetration system
- Coordination & Computations is best left at the grid edge
- There is a need for multiple and redundant communication systems









### List of Achievements

- □ More than 20 publications
- □ More than 20 presentations to conferences, universities, and industry
- □ Record of inventions, patent applications (one issued)

| Project name                             | Validation  | Core functions  |  |  |  |  |  |
|--|---|---|--|--|--|--|--|
| ARPA-E NODES                             | Lab demo: DERMS implemented in Beaglebone,<br>SCE feeder (51% PV penetration)   | Voltage regulation, VPP and frequency response            |  |  |  |  |  |
|  | Field demo: DERMS implemented in Heila Edge,<br>Stone Edge Farm (100% DER penetration)  | Voltage regulation and<br>VPP                             |  |  |  |  |  |
| Holy-Cross Energy High Impact<br>Project | Lab demo: DERMS implemented in Heila Edge,<br>HCE feeder (15.5% PV penetration)   | Voltage regulation and<br>Customer Bill Reduction         |  |  |  |  |  |
|  | Field demo: DERMS implemented in Heila Edge,<br>HCE community (100% DER penetration)  | Voltage regulation, VPP<br>and Customer Bill<br>Reduction |  |  |  |  |  |
| SETO ENERGISE ECO-IDEA                   | Lab demo: DERMS implemented in PC, Xcel<br>Energy feeders with 20,000 nodes (200% PV<br>penetration)                          | Voltage regulation  |  |  |  |  |  |
| SETO ENERGISE GO-Solar                   | Lab demo: DERMS implemented in PC, HECO feeders with 2,500 nodes (50% PV penetration)   | Voltage regulation  |  |  |  |  |  |
| SETO ENERGISE SolarExpert                | Lab demo: DERMS implemented in PC, IEEE 8,500 node system (45.4% PV penetration)  | Voltage regulation  |  |  |  |  |  |
| LDRD Autonomous Energy Systems           | Lab demo: DERMS implemented in PC, San<br>Francisco bay area synthetic model, > 100,000<br>nodes system (100% PV penetration) | Voltage regulation and<br>VPP                             |  |  |  |  |  |







- □ IPGroup sponsored participation to Energy I-Corps.
- □ Link: <u>https://energy.gov/eere/technology-to-market/energy-i-corps</u>.



Activities: "Comprehensive training and each conduct at least 100 customer discovery interviews with industry. Once they have completed the training, participants have secured the necessary industry connections and insights to ready their energy technologies for the market, and gained an industry engagement framework to apply to future research and share with fellow researchers."





#### Customer segments:

- □ Investor-owned utilities, cooperatives, and municipalities
- Microgrid operators
- Operators of soft microgrids.

Strategy:

LicensingStartup.





**Grub funding** was obtained via participation from **IP-Group**.

□ Techno-economic analysis performed under this funding.







California Independent System Operator PJM GE Grid Solutions Emobtech Schneider Electric SIEMENS Centrica E.On SunPower





### What's Next Today?

- Project presentations (Sairaj Dhople and Na Li)
- Technology commercialization opportunities (Erin Beaumont)
- □ Invited talks (Sonja Glavaski and Michael McMaster)
- □ PHIL demonstration at NREL (Blake Lundstrom).

### THANK YOU!

National Renewable Energy Laboratory Southern California Edison California Institute of Technology University of Minnesota Harvard University University of Colorado, Boulder





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#### NREL/PR-5D00-78742

This work was authored in part by the National Renewable Energy Laboratory, operated by Alliance for Sustainable Energy, LLC, for the U.S. Department of Energy (DOE) under Contract No. DE-AC36-08GO28308. Funding provided by the U.S. Department of Energy Advanced Research Projects Agency - Energy (ARPA-E). The views expressed in the article do not necessarily represent the views of the DOE or the U.S. Government. The U.S. Government retains and the publisher, by accepting the article for publication, acknowledges that the U.S. Government retains a nonexclusive, paid-up, irrevocable, worldwide license to publish or reproduce the published form of this work, or allow others to do so, for U.S. Government purposes.

