



# North American Energy Resilience Model (NAERM) Program

Ali Ghassemian (DOE Office of Electricity), John Grosh (Lawrence Livermore National Laboratory), JP Watson (Lawrence Livermore National Laboratory), Russell Bent (Los Alamos National Laboratory)

February 15, 2023

# Agenda

⇒ Introduction to NAERM (Ali Ghassemian – DOE OE)

Current State of NAERM (John Grosh – LLNL)

Wildfire Use Case (JP Watson – LLNL)

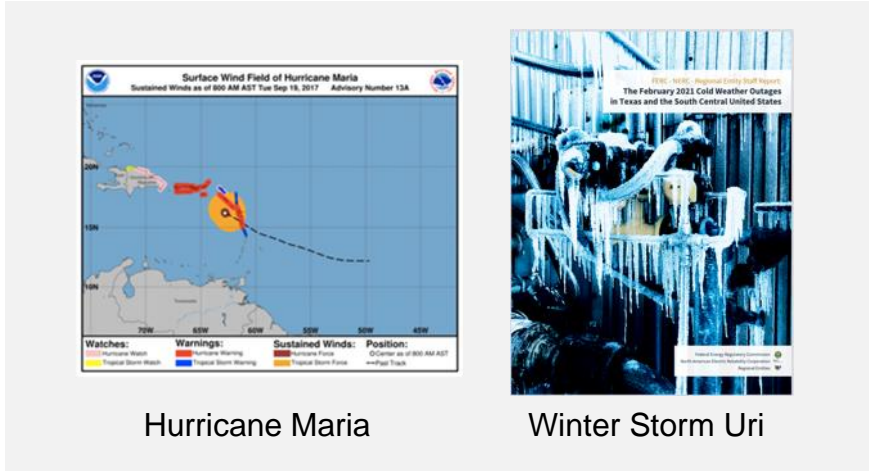
Cold Wave Use Case (Russell Bent – LANL)

Q&A



# The U.S. energy infrastructure faces many threats

Extreme Weather



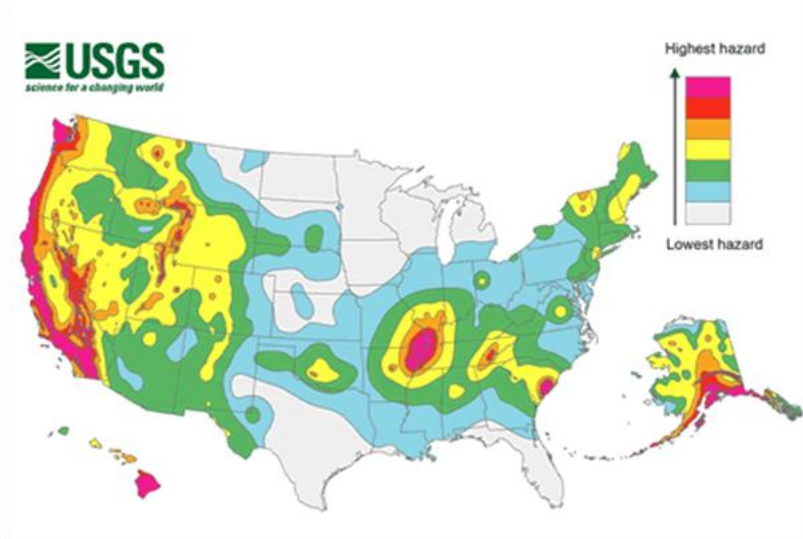
Hurricane Maria

Winter Storm Uri

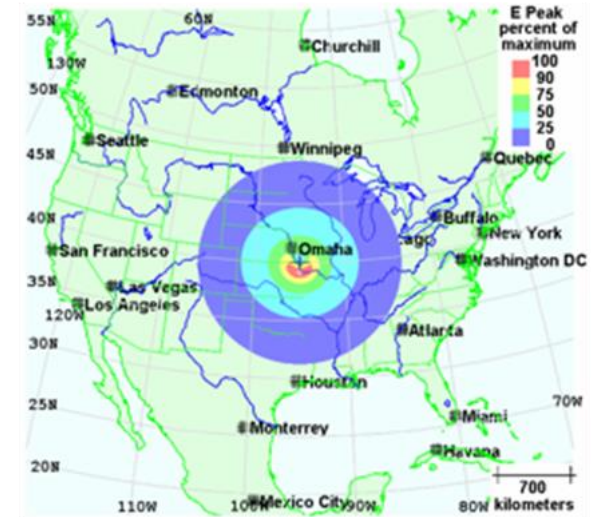
Cyber Attack



Earthquakes



EMP



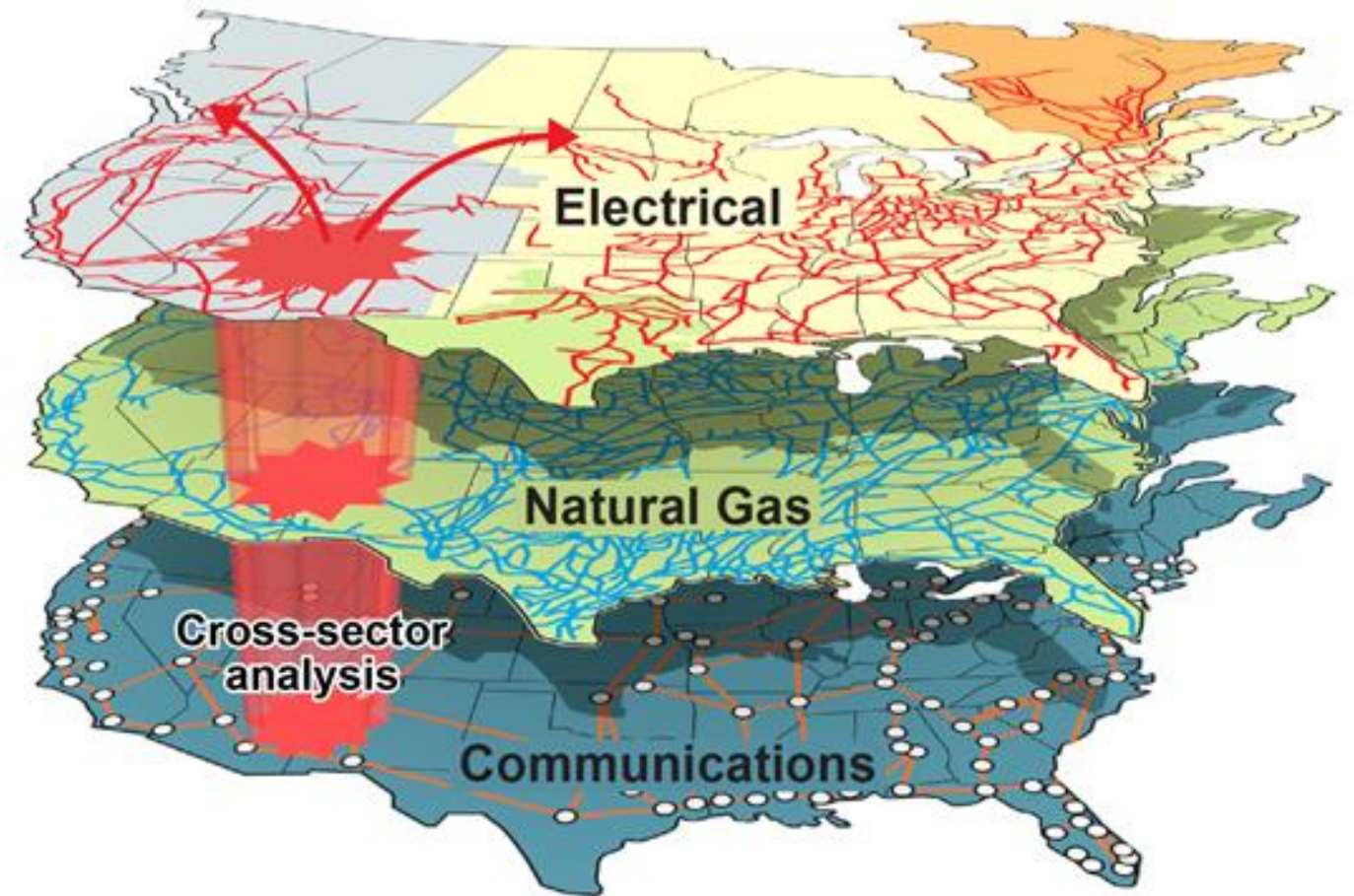


# North American Energy Resilience Model (NAERM)

**Vision:** Rapidly predict energy system interdependencies, consequences, and responses to reduce risk of extreme events at a national scale

**Mission:** Develop and deploy engineering-class modeling system for planning and near real-time resilience analysis

**Key Objective:** Catalyze partnerships with industry, national labs, states/communities, and other federal agencies to enhance coordination to support energy resilience



Team: DOE, LLNL, PNNL, ORNL, LANL, ANL, SNL, NREL, INL



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# National Labs Contributing to NAERM



# Agenda

**Introduction to NAERM (Ali Ghassemian – DOE OE)**

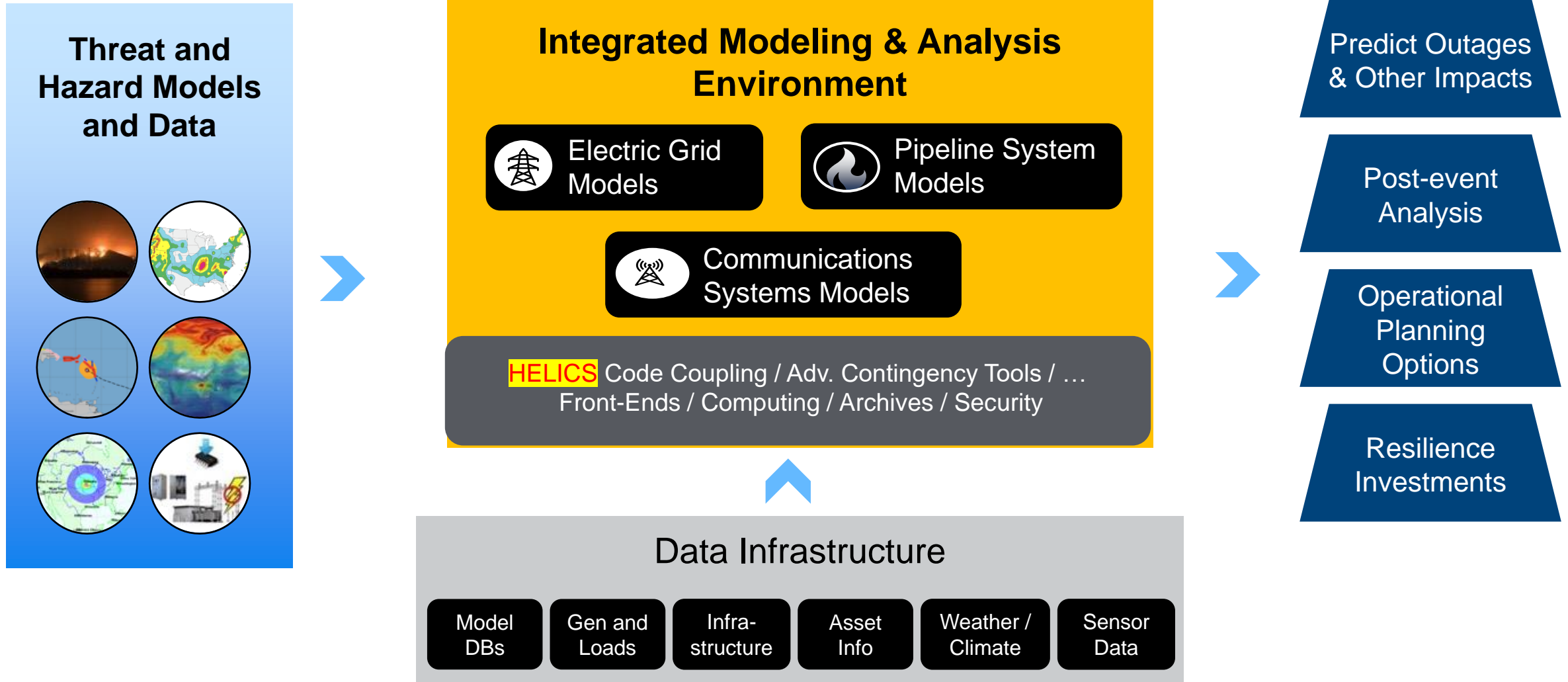
⇒ **Current State of NAERM (John Grosh – LLNL)**

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# NAERM workflow



# NAERM is organized around three major capabilities

## Multi-Infrastructure Planning Modeling

Analyze options to affect energy resilience, improve rapid restoration and recovery, and enable risk-informed planning and coordination to mitigate large-scale energy disruptions (e.g. earthquakes, wildfires).

## Data and Analytics

Store and analyze wide range of data to support resilience analysis. Data layers include modeling databases for bulk electric system, generation, natural gas pipelines; cell, fiber communications; weather forecasts, icing; hospitals, roads. Analytics include graph analysis and machine learning (ML).

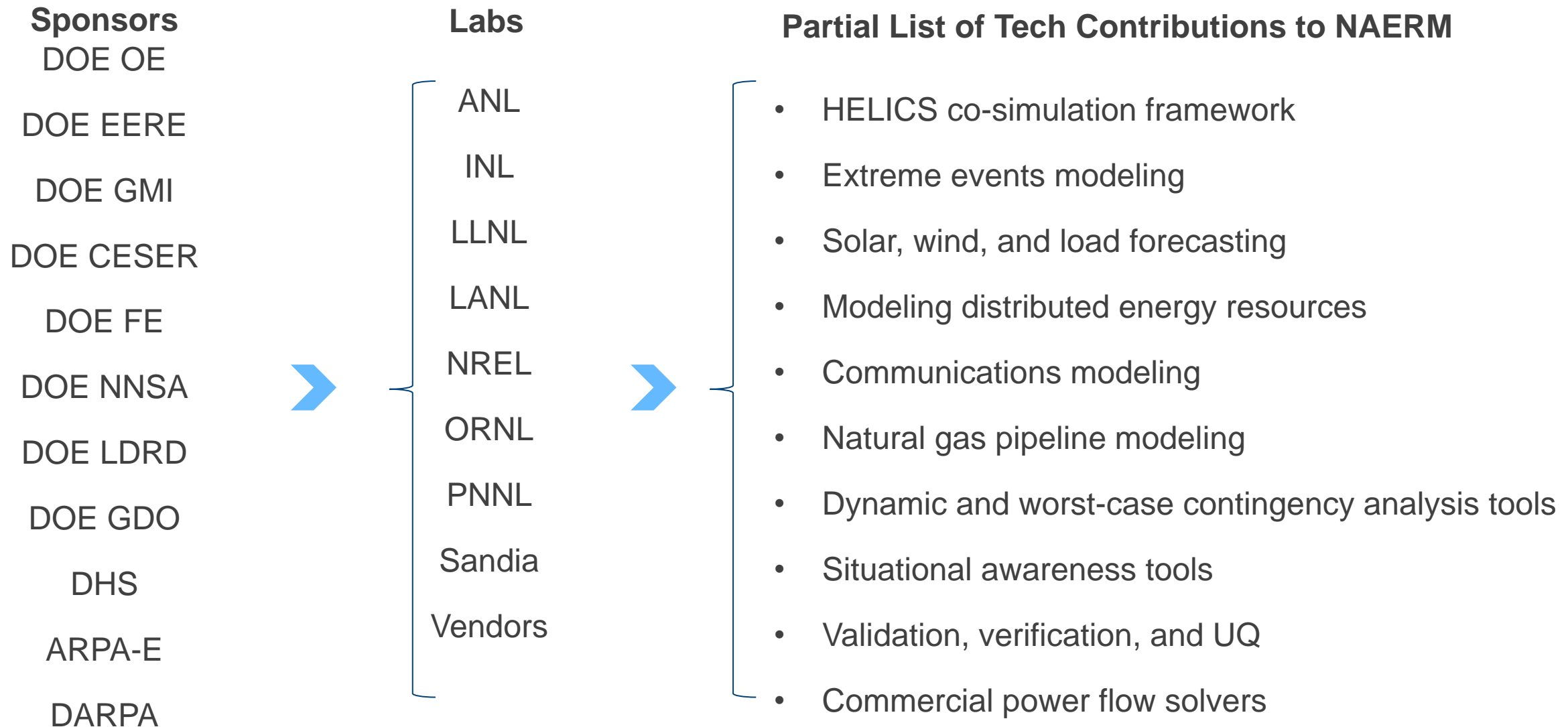
## Software and Computing Architecture

Enable a complex, multi-component software system focused on security, integration, scalability, and open architecture that leverages existing commercial and open-source software and commercial and government cloud services.



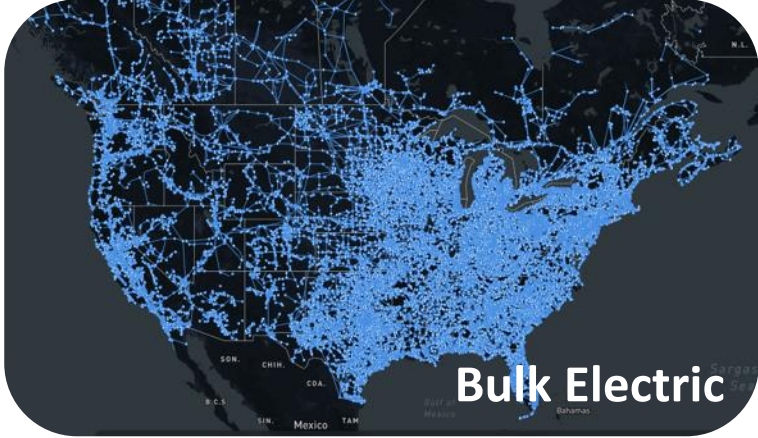


# NAERM builds on 50+ projects / technologies from DOE, government agencies, and industry



# Infrastructure Modeling

Integrated



Under  
Development







# Bulk Electric System Modeling

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## Commercial and lab tools:

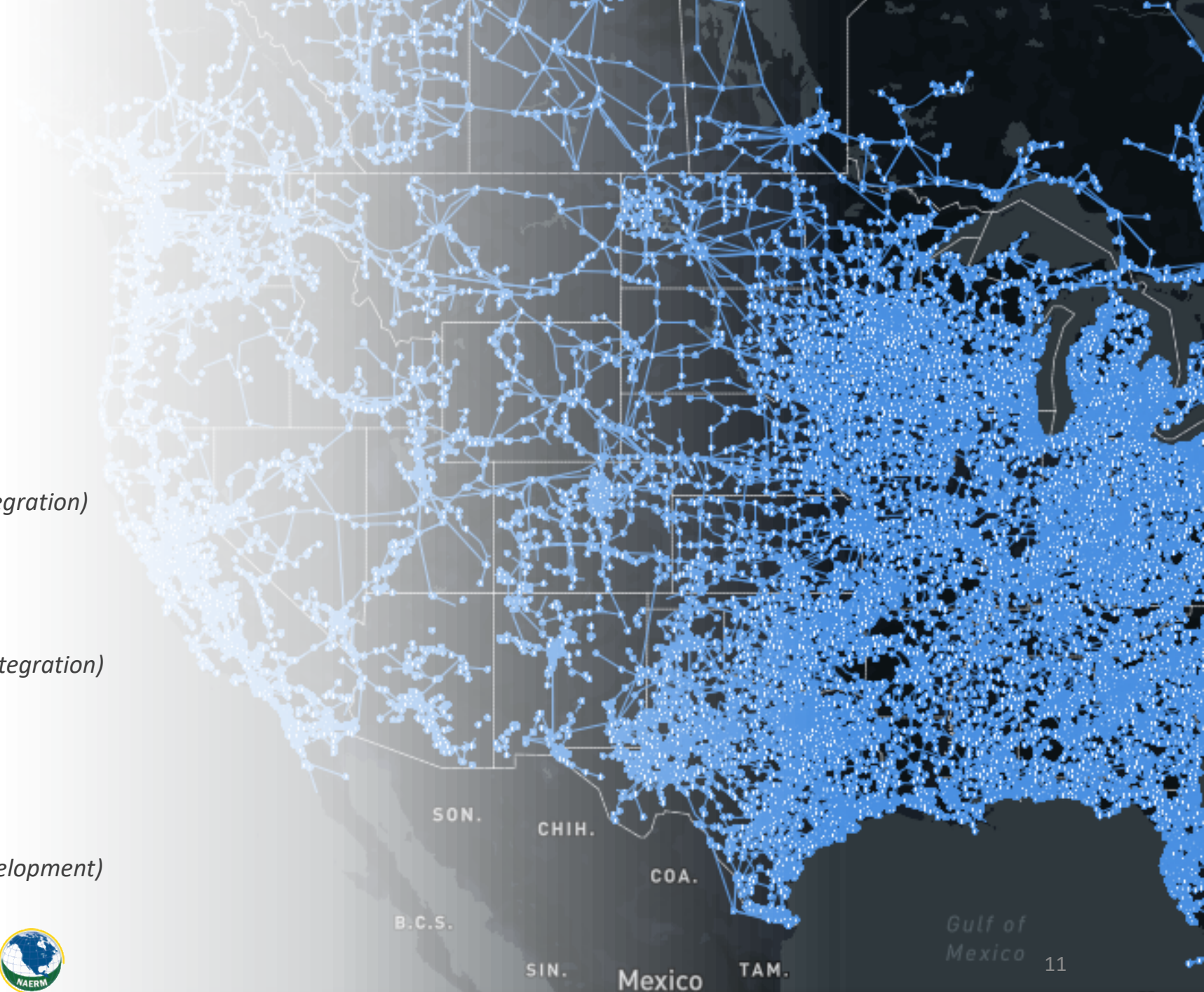
- PowerWorld
- PSS/E
- Dynamic Contingency Analysis Tool (*initial integration*)

## Modeling capabilities:

- Steady-state
- Transient (*for limited use cases*)
- Commitment and dispatch modeling (*initial integration*)
- High-k N-k contingency analysis (*prototype*)
- AGC (*prototype*)

## Example of Data Layers Used:

- WECC, ERAG, and ERCOT planning models
- Real-time EMS and telemetry data (*under development*)





# Natural Gas Modeling

## Lab Modeling Tools:

- NGFast
- NGTransient
- GasModels

## Modeling Capabilities:

- National Steady-state models
- Regional Transient models

## Example of Data Layers Used:

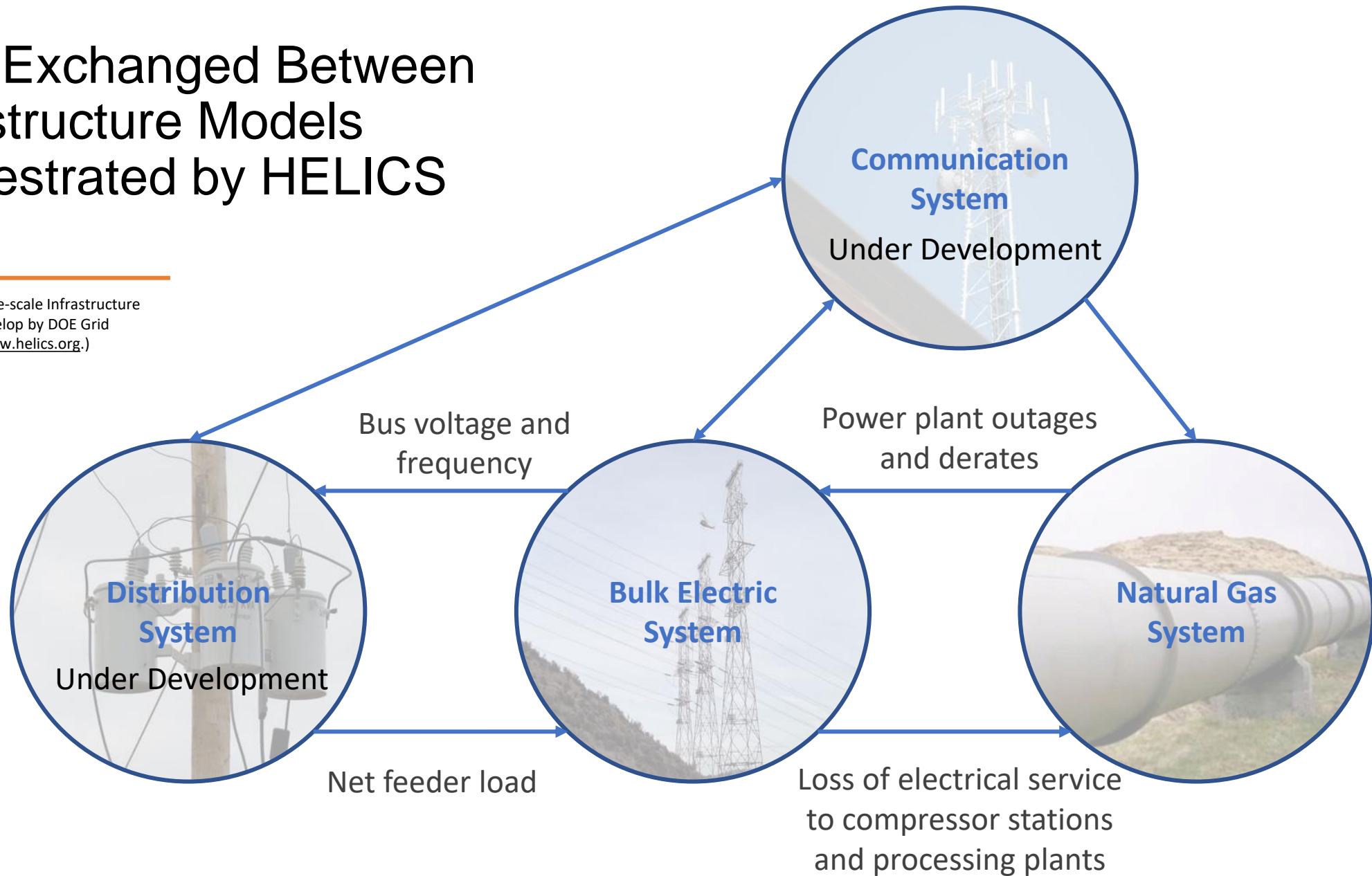
- DHS HIFLD
- Genscape





# Data Exchanged Between Infrastructure Models Orchestrated by HELICS

Hierarchical Engine for Large-scale Infrastructure Co-Simulation (HELICS) develop by DOE Grid Laboratory Consortium ([www.helics.org](http://www.helics.org).)



# Datasets

## Electric System

- Bus
- Branch
- Generator
- DC Transmission Lines
- HIFLD Substations
- HIFLD Power Plants
- HIFLD Transmission Lines
- HIFLD Electric Service Areas
- Balancing Authorities
- Load/Generation By BA
- Forecasted Load
- Forecasted Solar Generation
- Forecasted Wind Generation

## Natural Gas

- Natural Gas Model
- NGFAST
- Power Plants
  - Compressor Stations
  - Processing Plants
  - Border Points
  - Underground Storage
  - Interstate Pipelines
  - Receipt Delivery Points
  - HIFLD Natural Gas Receipt Delivery Points

## Communications

- Communication Model
- NAESCCM
- Cellular Sites
  - Central Offices
  - Microwave Sites
  - Control Centers
  - Fiber Regen
  - Fiber
  - Fiber Routes

## Weather / Natural Hazards

- NIFC Active Wildfires
- Pyregence Forecasted Wildfires
- USGS Earthquakes
- USFS Fire Potential Index
- NWS Flood Monitor
- NWS Storm Surge
- NWS Ice Accumulation
- NWS Drought Monitor
- NWS Radar Precipitation
- NWS Day 1 Convective Outlook
- NWS Temperature
- NWS Weather Warnings
- NWS Windspeed
- NWS Tornado
- NASA FIRMS Wildfires
- NWS 5-Day Outlook

- NOAA GOES-16
- NWS Cyclone Tracks
- EPA Smoke
- SPIA
- SPIA Ice Accumulation
- SPIA Precipitation
- SPIA Snowfall
- SPIA Temperature
- SPIA Wind Direction
- SPIA Wind Speed

## Reference

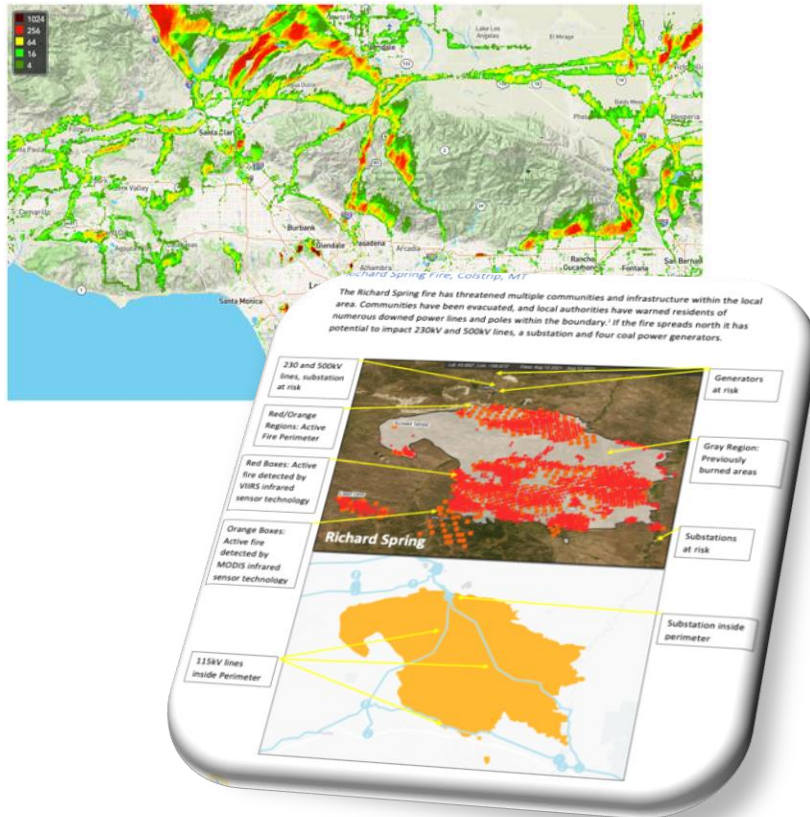
- Roads
- Rails
- Hurricane Evacuation Routes
- Protected Areas: Designation
- Protected Areas: Easement
- Protected Areas: Fee
- Protected Areas: Marine
- Protected Areas: Proclamation
- Ethanol Plants
- FDIC Insured Banks
- Fire Stations
- Hospitals
- Law Enforcement Locations
- Military Bases
- NCUA Insured Credit Unions
- Oil Refineries
- Petroleum Terminals
- Wastewater Treatment Plants

# NAERM team is developing capabilities at the National Level

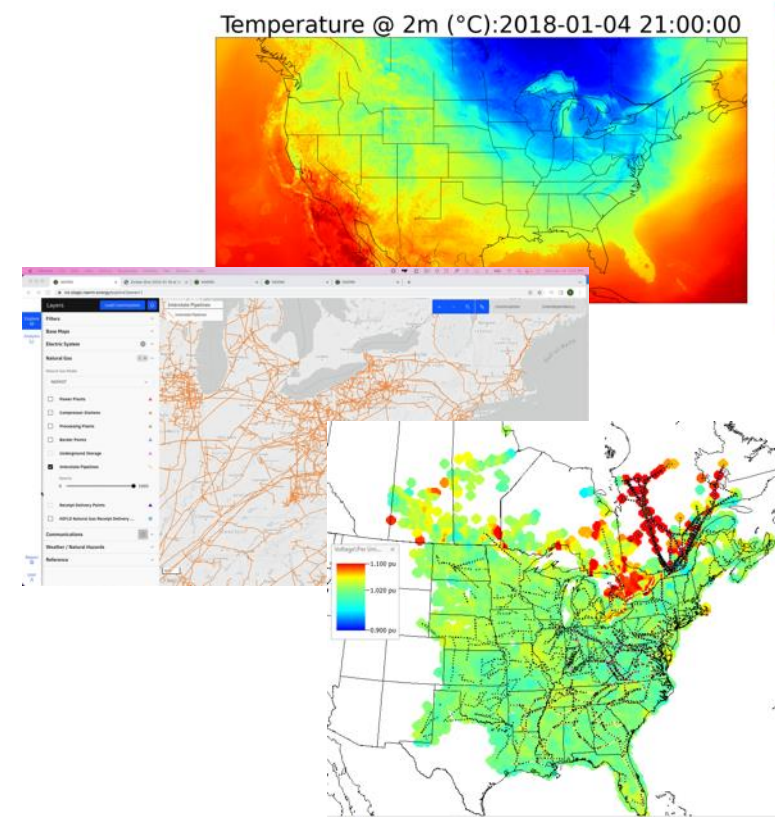
- Demonstrate how modeling and analytics can be used to support transformational resilience investments
- Rapidly demonstrate the type of studies, metrics, and threats that can be analyzed, then engage stakeholders to improve outcomes
- Focus on regional use cases that can be extended to other parts of the country
- Coordinate with other DOE R&D to extend analysis capabilities (e.g., energy equity)



# Technical assistance use cases briefed today



**Western Wildfire**  
JP Watson, LLNL  
Kaarthik Sundar, LANL



**Northeastern Cold Wave**  
Greg Brinkman, NREL  
Russell Bent, LANL



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**Q&A**

# Wildfire Threat Analytics: Impacts Projection and Mitigation

## Approach:

- Wildfires are amplifying in intensity, frequency, and extent of wildfires in the US
- Changes in the above metrics will impact the benefits associated with various proposed mitigation options
- Critical to focus on how wildfire threats are *going to* manifest, rather than how they manifest presently
- Climate-impacted (future) weather data is required for high-fidelity modeling

## Benefits:

- Quantification of future wildfire impacts on Western Interconnect infrastructure
- Maximize resilience benefit of hardening investments and other mitigation options

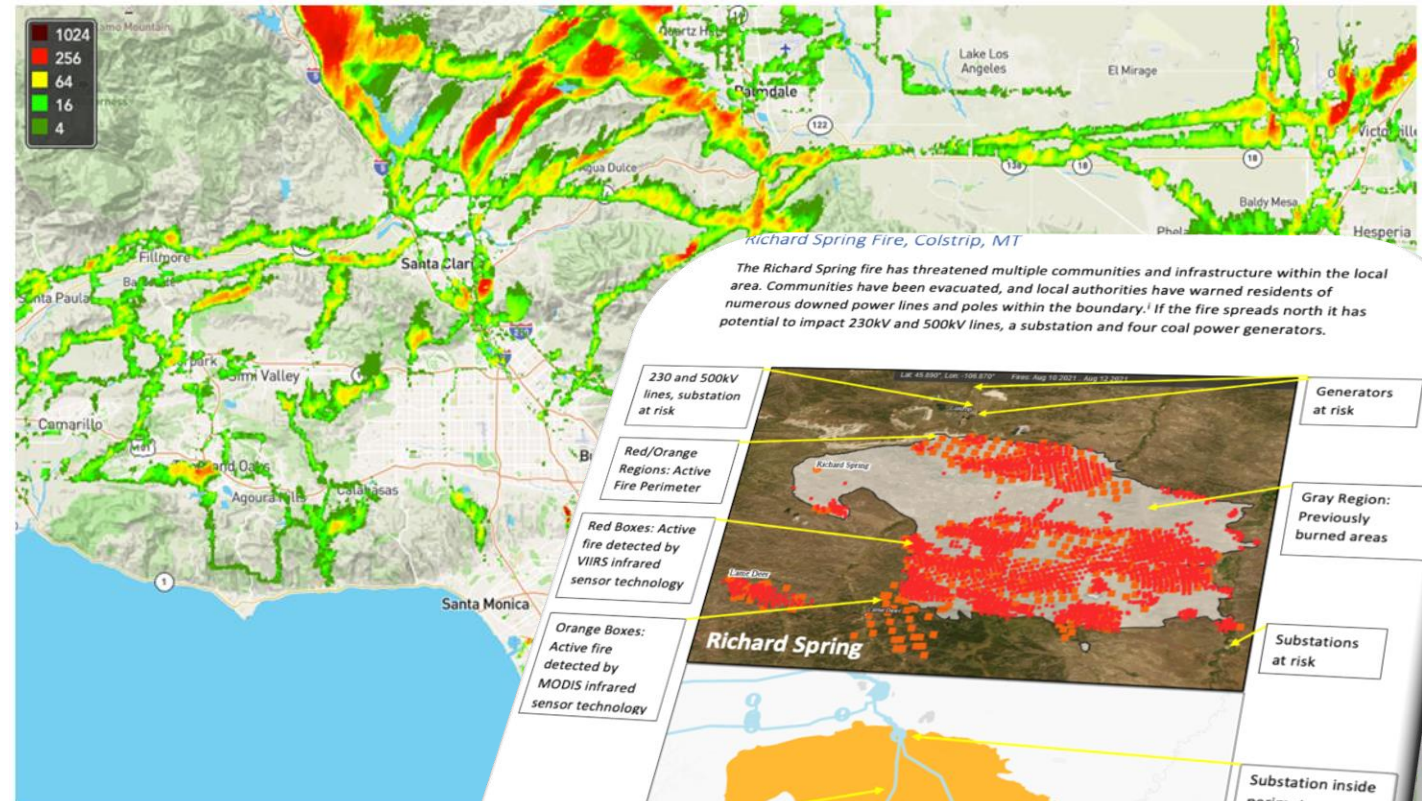
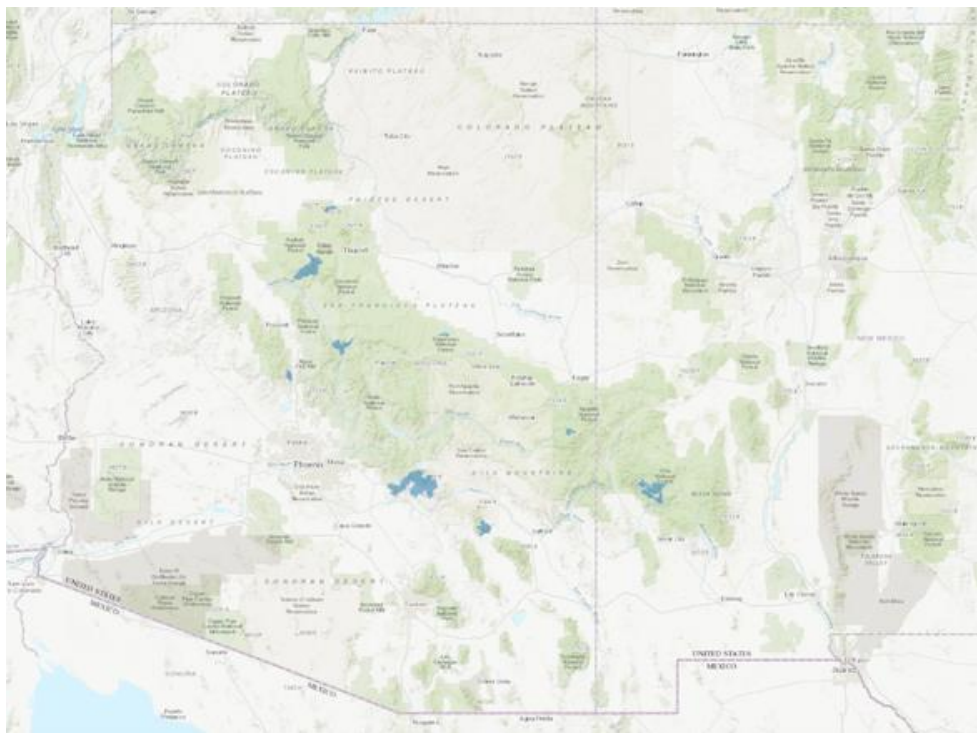


Figure 1b: Pyregence risk forecast for equipment failure (Southern California ignition).

# Background: Short-Term Predictive Wildfire Impacts Analysis with NAERM (1)

Snapshot from NAERM UI, visualizing NIFC data

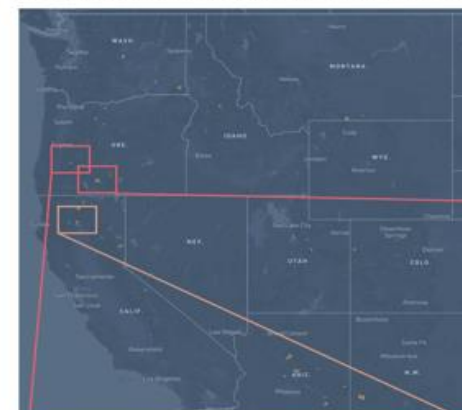


Active wildfire perimeters in the southwestern US on July 7, 2021

NAERM leveraged active wildfire perimeters from NIFC and growth projections from Pyregence to identify infrastructure at risk and estimate impacts

## Active Wildfire Hot-Spots

Overall situation: due to heatwave conditions in previous weeks, a rapid increase in the number of fires can be observed, as well as expansion of existing ones. NAERM has identified at least three fires that should be monitored for existing (or potential) impact on US energy infrastructure.



Hotspots in California, Arizona, Oregon, Washington **NEW**

8 new large fires since yesterday

Hot and dry conditions continue and fires are expected to increase in number

**Bootleg fire**  
Foreman-Winters National Forest, OR  
Containment: ~%  
Risk\*: High  
Asset overlap: 500KV lines

**Jack fire**  
Umpqua National Forest, OR  
Containment: ~%  
Risk\*: High  
Asset overlap: [BES] two 115KV lines, 150 MW of generation

**Salt fire**  
Redding, CA  
Containment: 35%  
Risk\*: Moderate  
Asset overlap: [BES] two 115KV lines, [COMMS] Optical fiber route



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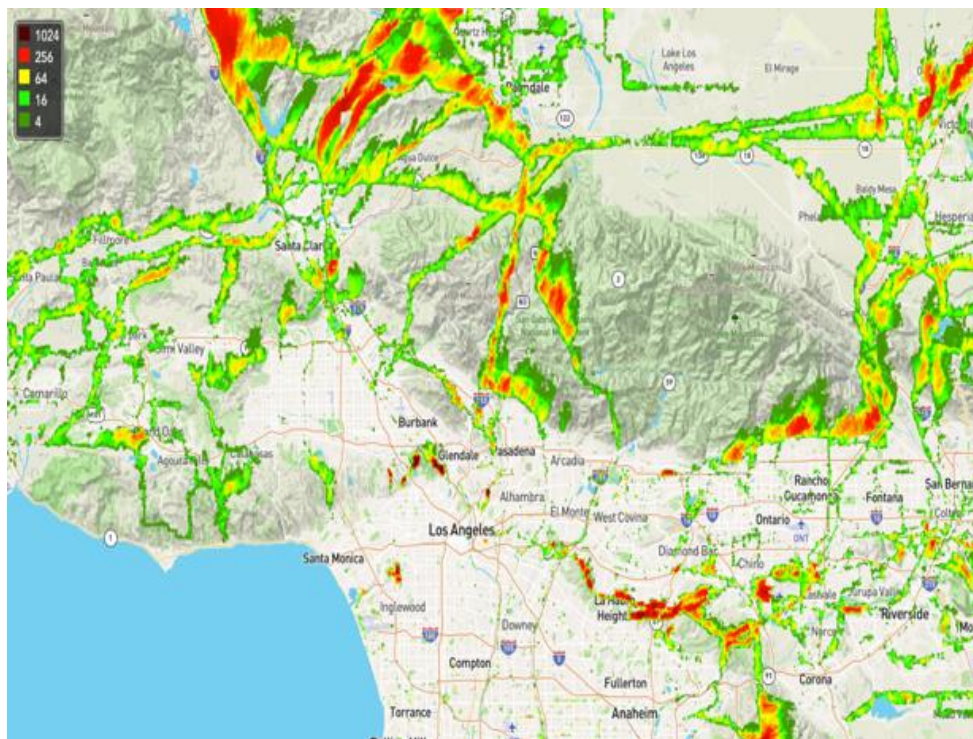
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# Background: Short-Term Predictive Wildfire Impacts Analysis with NAERM (2)

Snapshot from <https://pyregence.org>

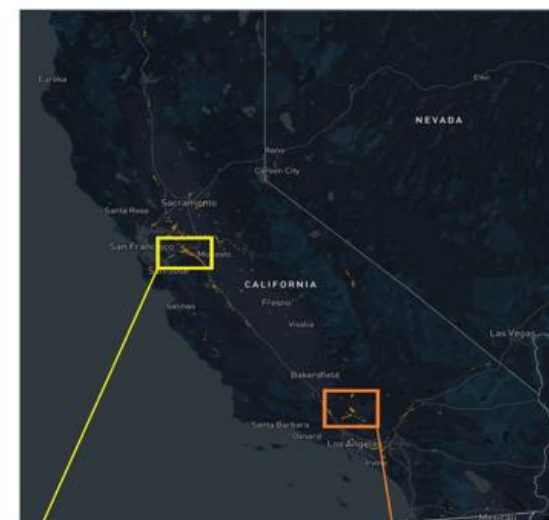


Pyregence risk forecast on 06/17/2021 UTC 20:00 for wildfires due to bulk transmission equipment (Southern California)

*Identical impacts quantification tools were leveraged by NAERM team to identify infrastructure at risk from and impacts associated with potential wildfires*

## Forecasted Wildfires Hotspots California

Overall situation: Provided transmission fault caused fire risk forecast is for 6<sup>th</sup> of July and covers the state of California. With the dry conditions the risk of ignition continues to rise. NAERM has identified potential high-impact regions from energy infrastructure perspective.



- Hotspots around San Francisco and Los Angeles
- Highest risk 3-6PM
- Expected to increase as dry and hot conditions continue (100+°F during the weekend in California)

**Midway, CA**

**Potential Impact:**

- 815 (Three Rivers) substation, 815 (SF) 138KV Bus, 67 branches
- No Electric Lake Drive and Tracy combined with power plants
- 100MWs being used for more than 100MWs being used

**Impact risk: Low**  
**Ignition risk: Moderate**

**Hungry Valley, CA**

**Potential Impact:**

- 815 (Two Rivers) 138KV Bus, 100MWs being used for 100MWs being used
- 100MWs being used for more than 100MWs being used

**Impact risk: Moderate**  
**Ignition risk: Moderate**



## Enabling Capabilities

- Ingestion of wildfire risk sources
  - Historical, forecasted, climate-impacted
  - Vegetation density
- High-impact contingency identification within high-risk areas
- Co-simulation (time-stepped) of BES and NG to determine cascades and quantify impacts
- Customizable Jupyter notebooks leveraging extensive NAERM back-end

## Analytic Outputs

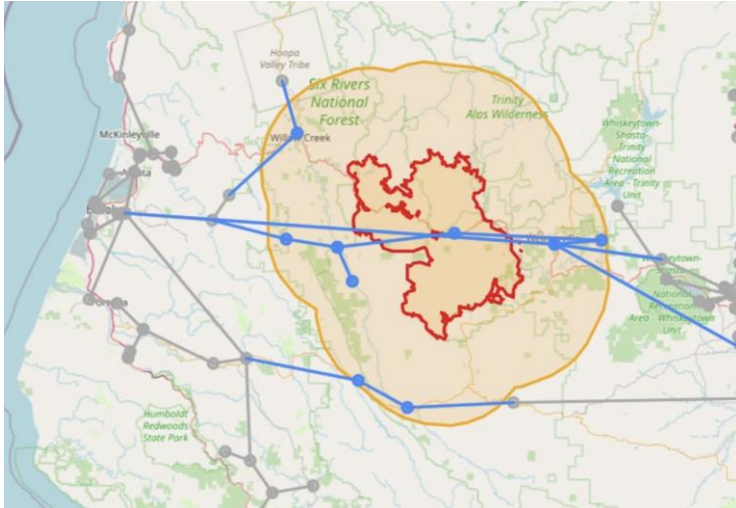
- Impact metrics
  - Load lost
  - Voltage violation
  - Transmission rating violation
  - Generator trips / re-dispatch
  - Generation headroom
- Investment recommendations
  - Optimal allocation of limited resources for hardening, e.g., lines to underground
  - Characterization of cost vs. impact-reduction trade-off curve

*Risk = Relative Likelihood of Event Occurrence*



# Capability Demonstration: Monument Wildfire (1)

*Identification and analysis of high-impact contingencies associated with wildfires ultimately supports optimal allocation of infrastructure hardening budgets*

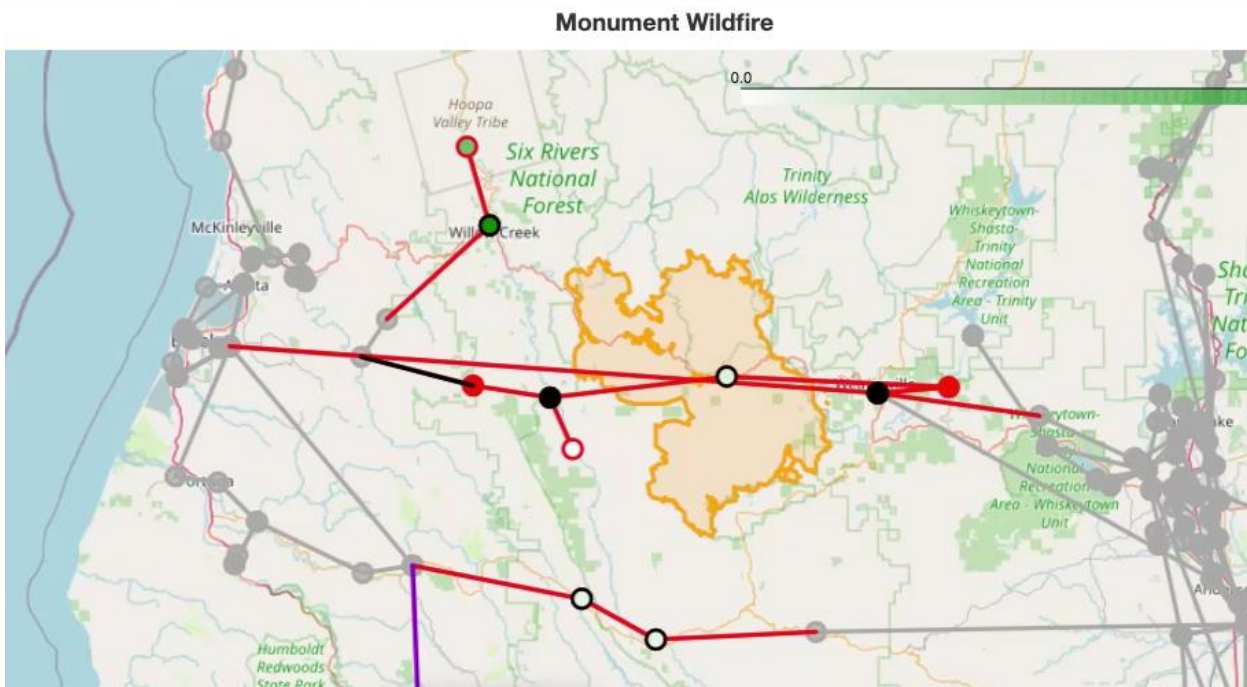


- *Limited impacts on BES and NG infrastructure...*
- *... but exhibits full spectrum of impacts*
- *Enable straightforward verification and validation*

Monument is a wildfire in Northern California, started in July 30 2021 (due to lightning strike)



# Capability Demonstration: Monument Wildfire (2)

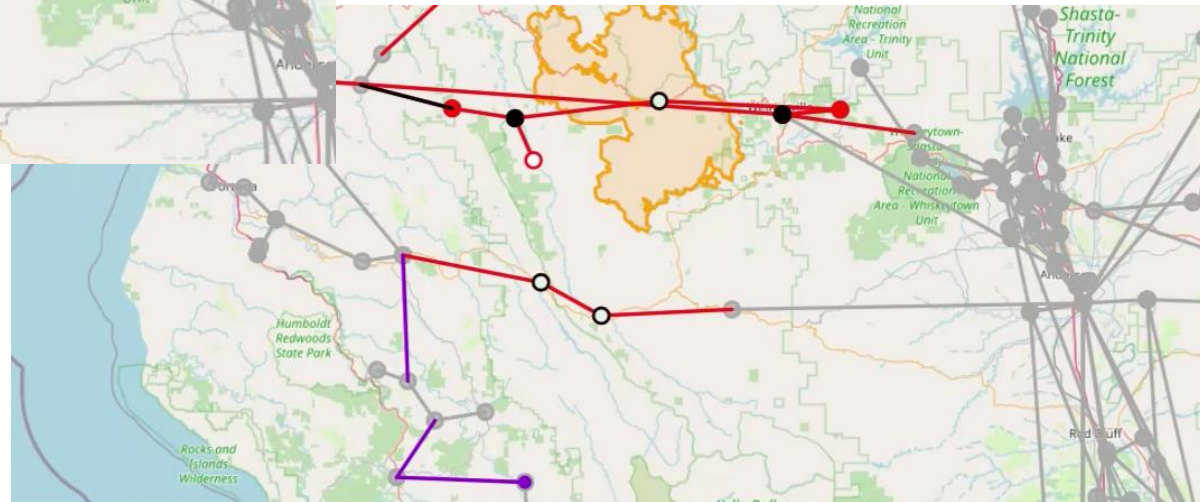


NAERM focuses on analysis of extreme events, which yield contingencies with high "k"

*Ensures simulation in contexts with  $k \gg 10$  outaged components*

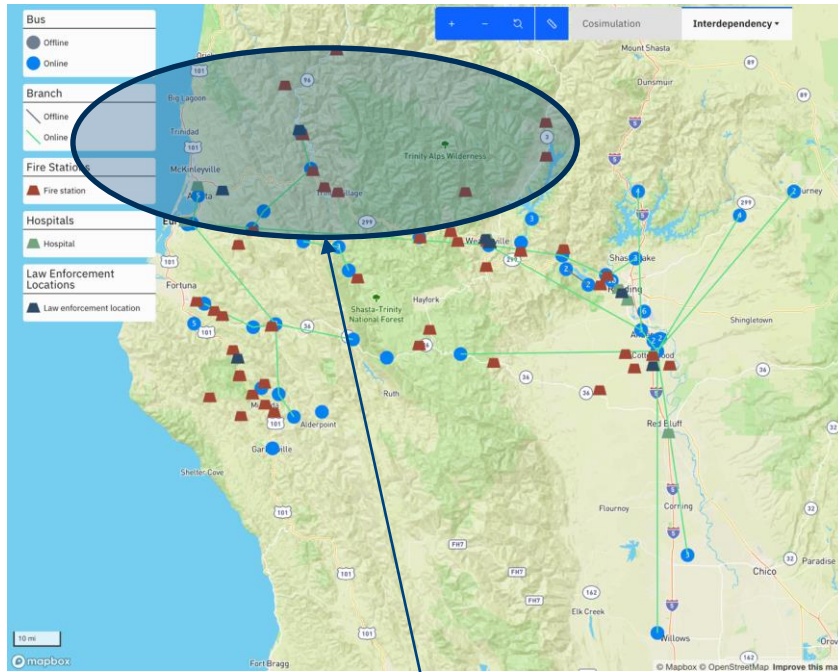
Legend:

- Black: direct outage
- Red: cascade outage
- Green: load lost
- Purple: violations

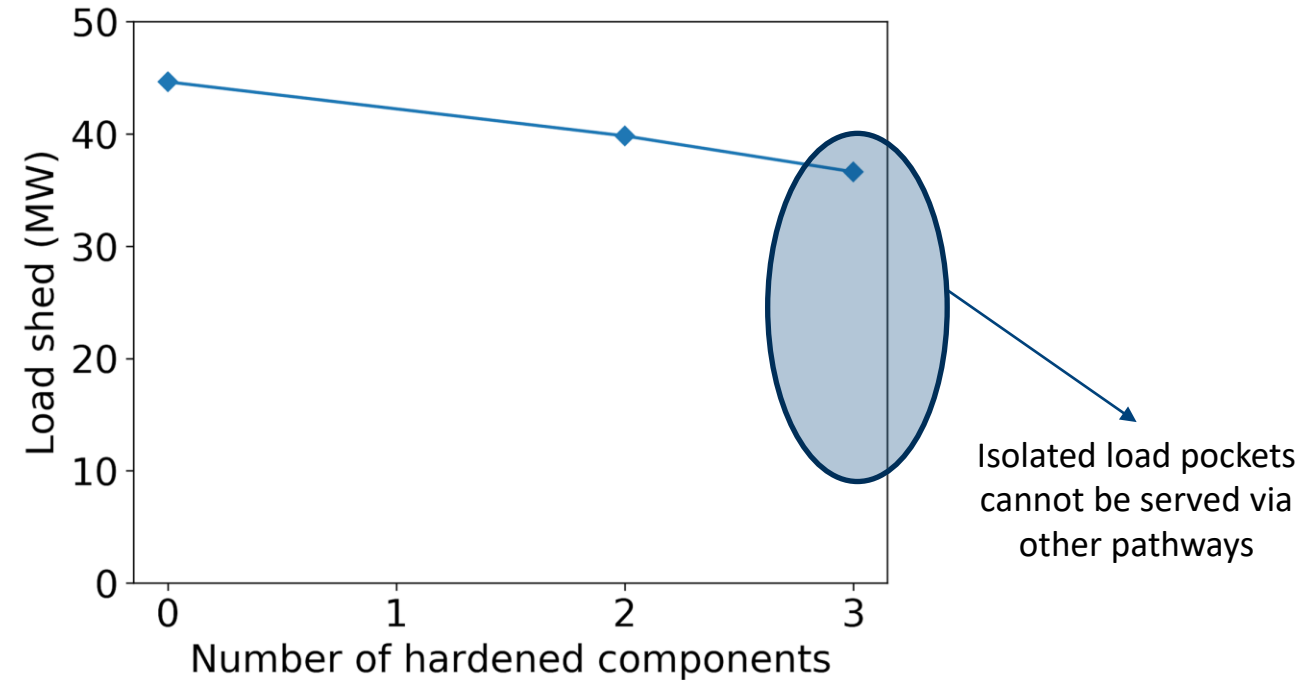




# Capability Demonstration: Monument Wildfire (3)



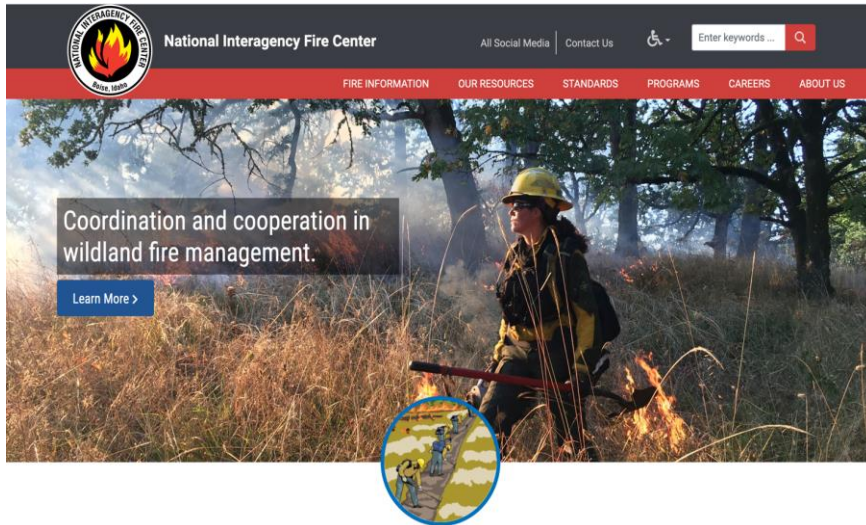
Significant fire and emergency facilities directly impacted by the wildfire, and many potentially impacted in surrounding area



Investment optimization algorithms indicate a limit to benefits of hardening existing assets

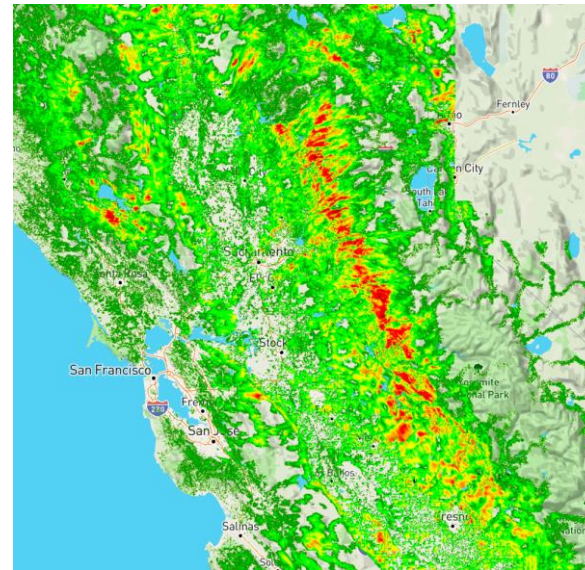
# Key Wildfire Data Sources

<https://www.nifc.gov>



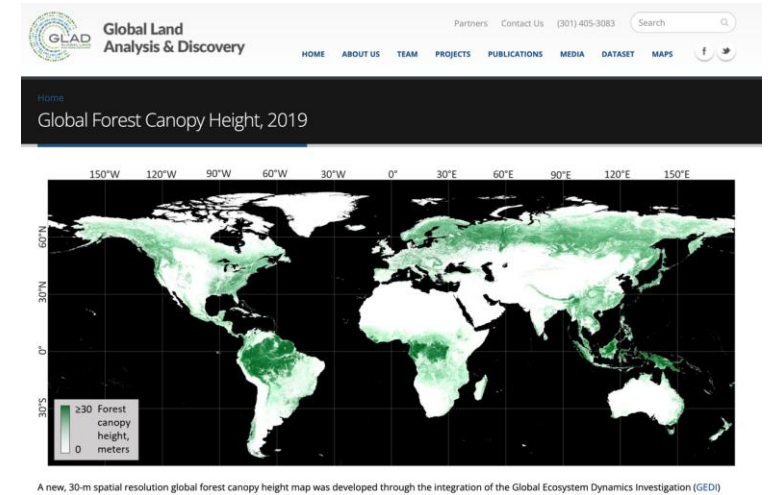
NIFC – historical wildfire perimeter archive

<https://pyrecast.org>



Forecasted wildfire risk sources (USGS, Pyregence, and numerous others)

<https://glad.umd.edu/dataset/gedi/>

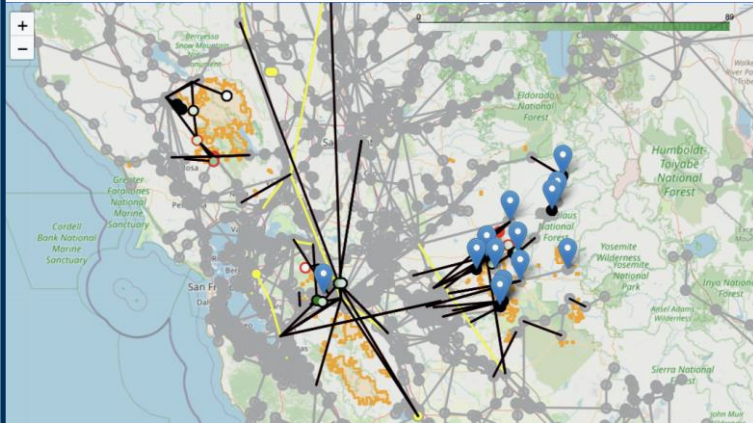


Vegetation density layers to inform fragility curve development (NASA/GEDI)



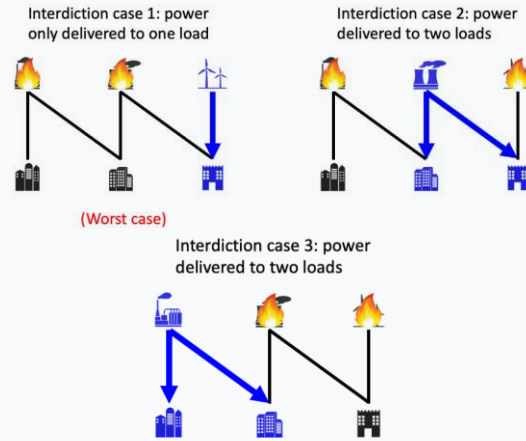
# High-Impact Contingency Identification Analytics

Number of BES and NG components in high-risk wildfire regions is significant



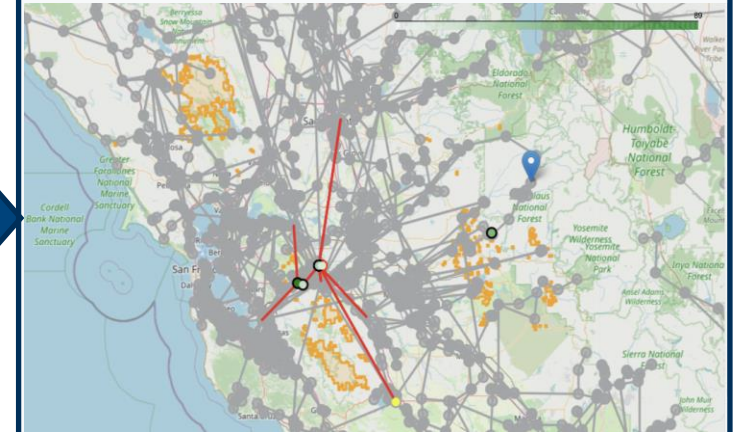
Hardening everything in a high-risk region is cost-prohibitive

Use rigorous optimization analytics to identify subsets of *critical* components



Combinatorics prevents naïve critical component identification approaches from working

Outaging a small subset of components in a high-risk region often leads to large-scale impacts

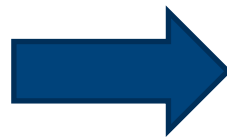
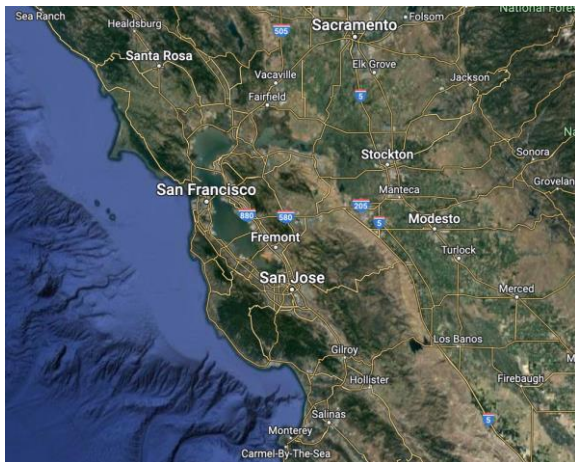
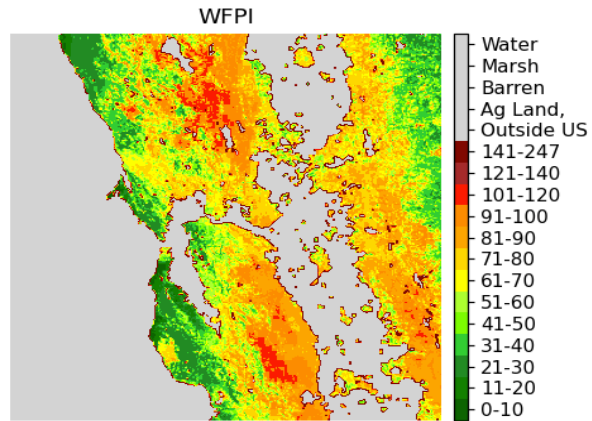


Critical component identification forms the basis for optimal investment / hardening



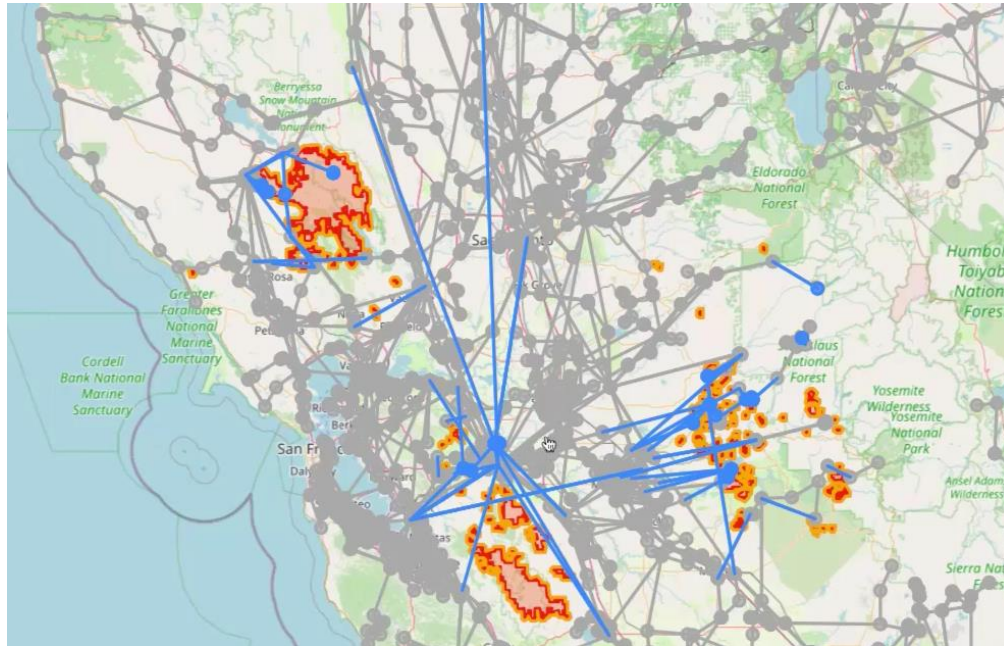
# Capability Demonstration: Bay Area (1)

*Consideration of wildfire risk maps in impacts analytics enables (1) consideration of larger high-risk wildfire regions and (2) inclusion of climate impacts*



- *Demonstrates use of wildfire risk maps...*
- *... as opposed to historical impacts*
- *Broader impacts on BES and NG infrastructure*

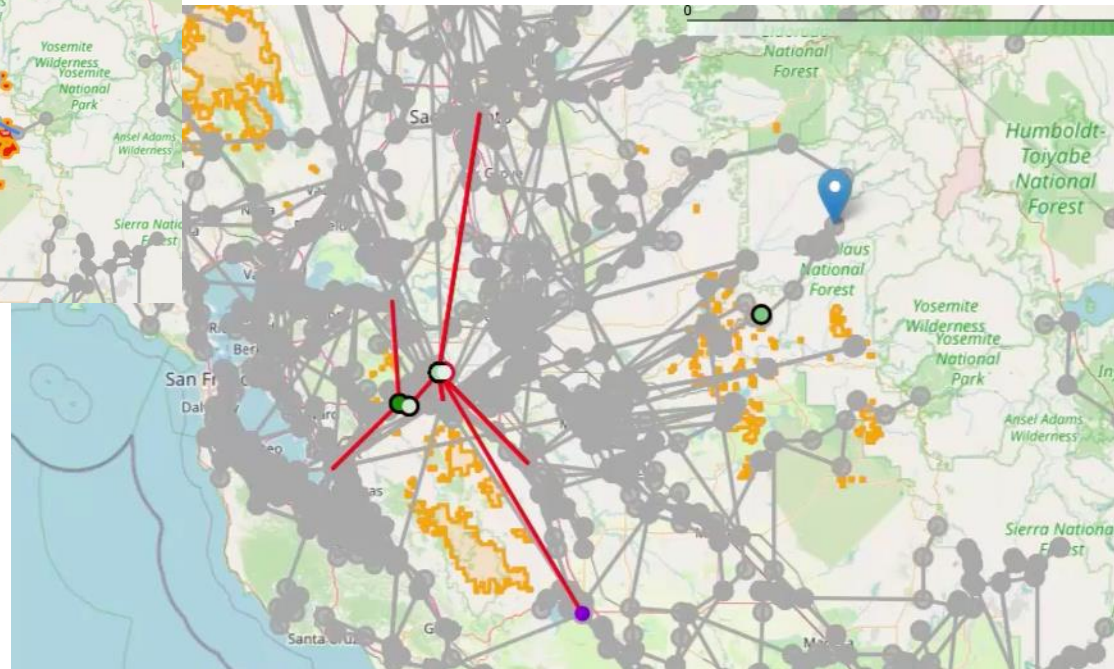
# Capability Demonstration: Bay Area (2)



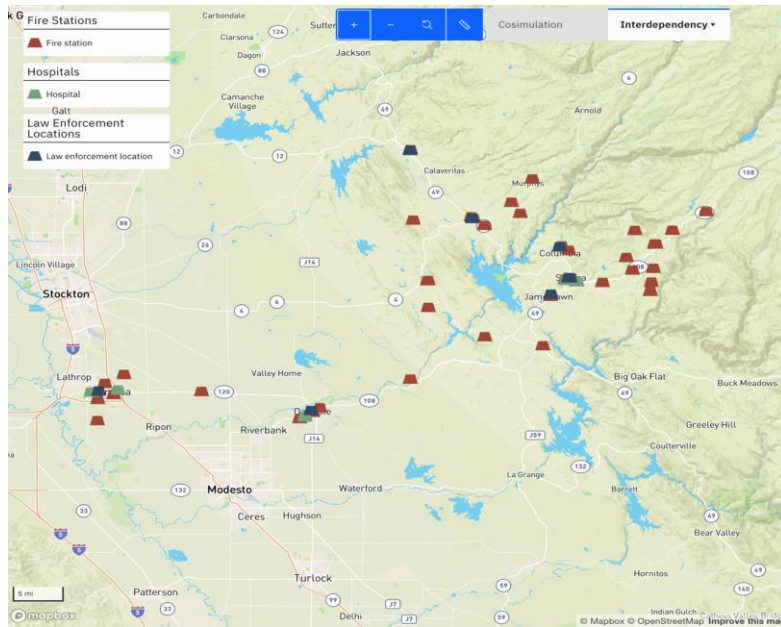
Significant infrastructure in the bay area is at high risk from potential wildfires

- Legend:
- Black: direct outage
  - Red: cascade outage
  - Green: load lost
  - Purple: violations

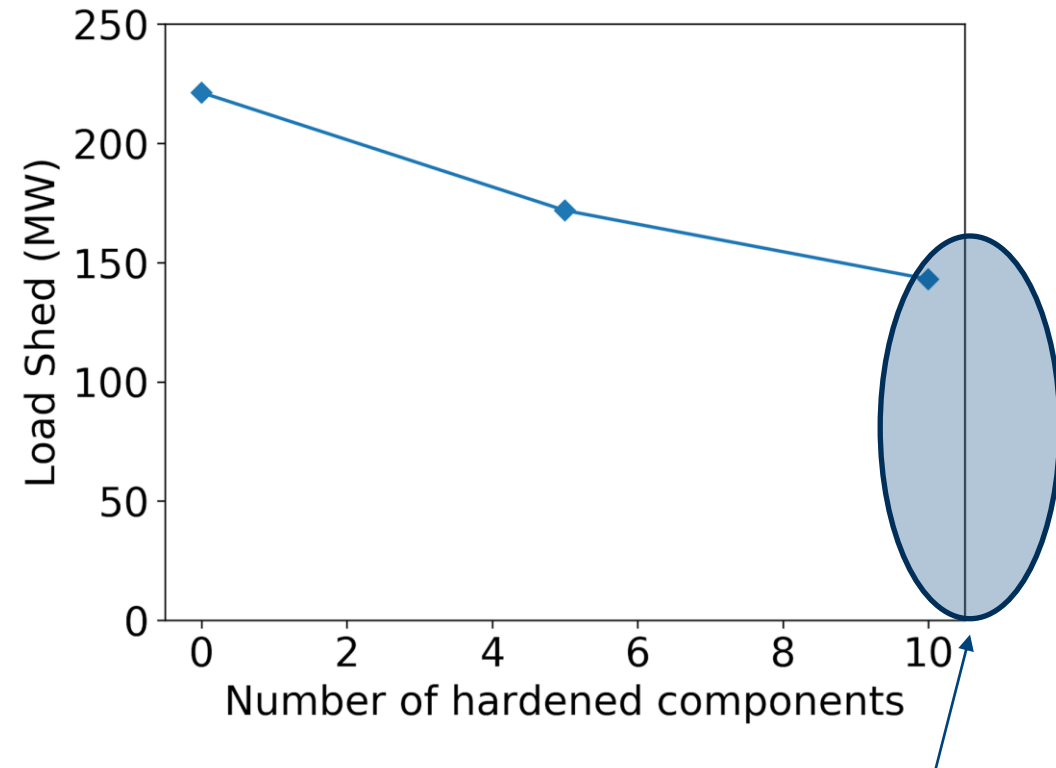
But a handful of components dictate the overall impact



# Capability Demonstration: Bay Area (3)



Interdependency analysis provides a “picture beyond MW demand” relating to what functionality may be lost during a contingency

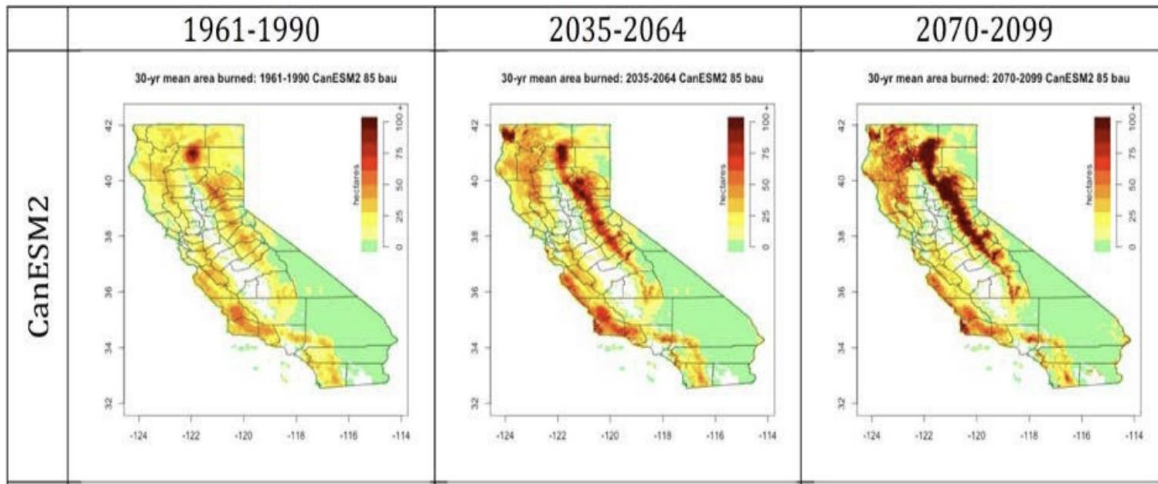


Hardening a modest number of components yields significant reductions in impacts – but tens of components must be hardened to mitigate all impacts



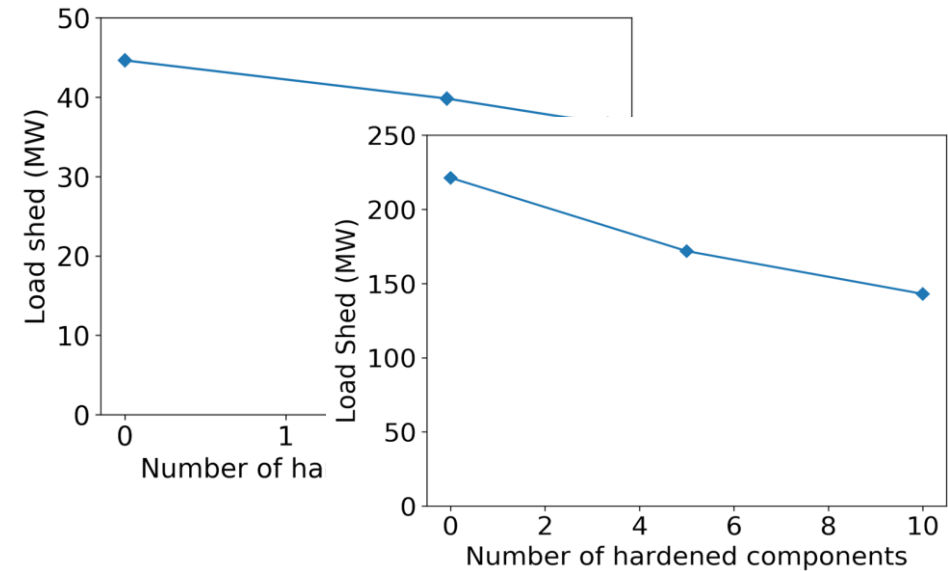
# In-Progress: Climate Impacts and Hardening Recommendations

Climate is projected to significantly impact wildfire risk – due to shifts in both intensity and location



Through the Pyregence consortium, we will be acquiring and analyzing climate-impacted wildfire risk maps for 2030 and beyond

Investment planning is driven by understanding and analysis of cost-versus-risk tradeoffs



Algorithms underlying NAERM high-impact contingency identification analytics will provide recommendations for hardening investments

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**Q&A**

# New England Cold Wave

## Co-simulation of Electric Power and Natural Gas

### Need:

- New England has experienced several cold weather events over the last decade that have caused tight generation and gas supplies
- Assess the resilience (N-k) of combined electric power and natural gas systems during extreme cold weather
- Evaluate the resilience benefits of mitigation and investment options

### Benefits:

- Inform energy planners on compounding risk of cold weather impacts to generation infrastructure, increased demand, and guide mitigation strategies for these scenarios

### Approach:

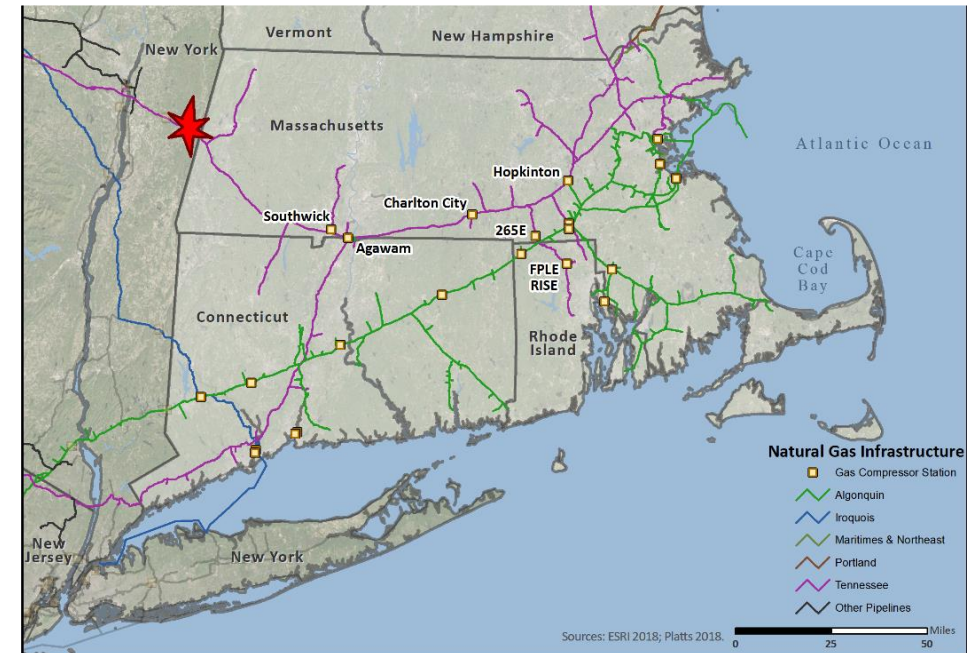
- Regional focus on Northeastern United States
  - Generalize to other parts of the country
- Identify cold weather events over the last decade that have impacted actual system
- Identify candidate N-k contingencies that would have exacerbated capacity limitations during the collected cold weather events
- Perform co-simulation of the electric power and natural gas system
- Work with stakeholders to assess proposed mitigation investments, inclusive of:
  - Dual fuel units
  - Wind turbine winterization
  - Increased LNG capacity
  - Electrification and demand flexibility



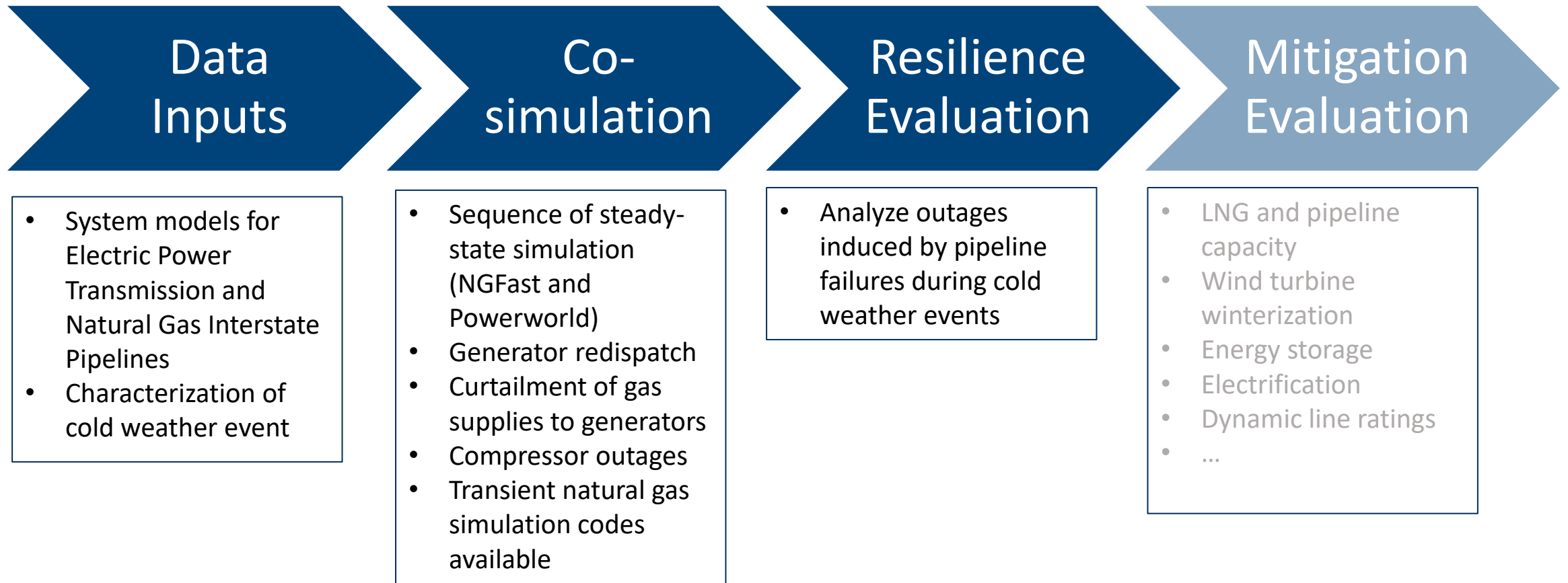


# Use Case Summary

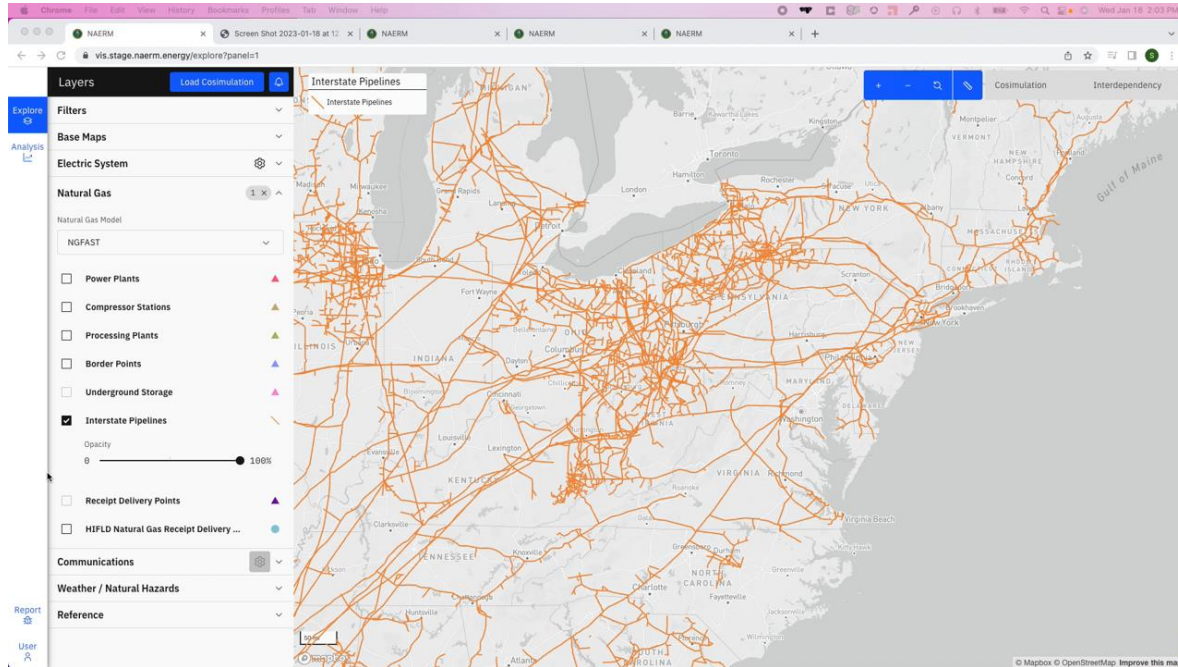
- Cold Weather Event: Winter Storm Grayson (early January 2018)
- Co-simulate what could have happened during Grayson had additional failures occurred
  - Natural gas pipeline failure scenarios
  - Scenarios of power plant outages due to winter weather and gas unavailability
- Use case highlights how NAERM's natural gas pipeline and bulk electric system co-simulation capabilities can be used
- In progress: Evaluation of mitigation options.
- Talk Focus: Underlying technical approach to support such analysis with specific results omitted



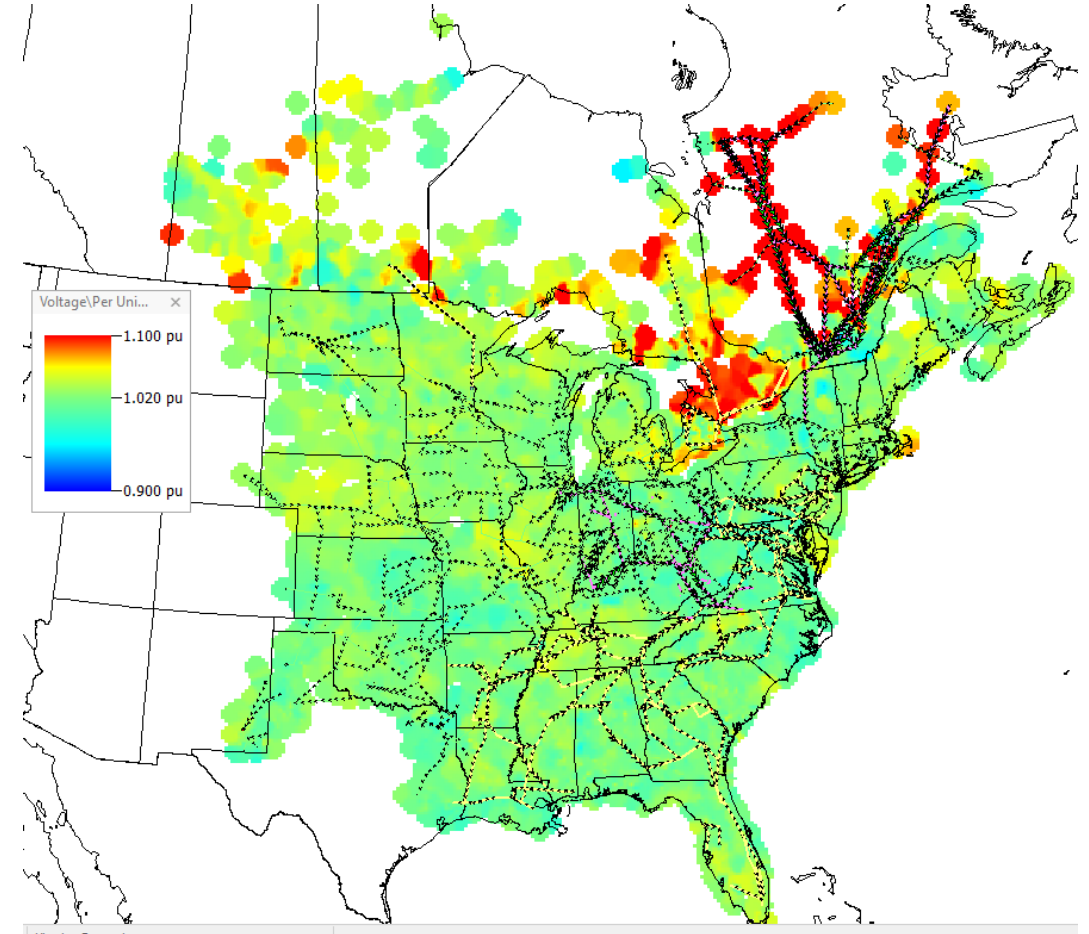
# Analysis Workflow



# Data Inputs: Natural Gas and Electric Power System Models



Interstate Pipelines



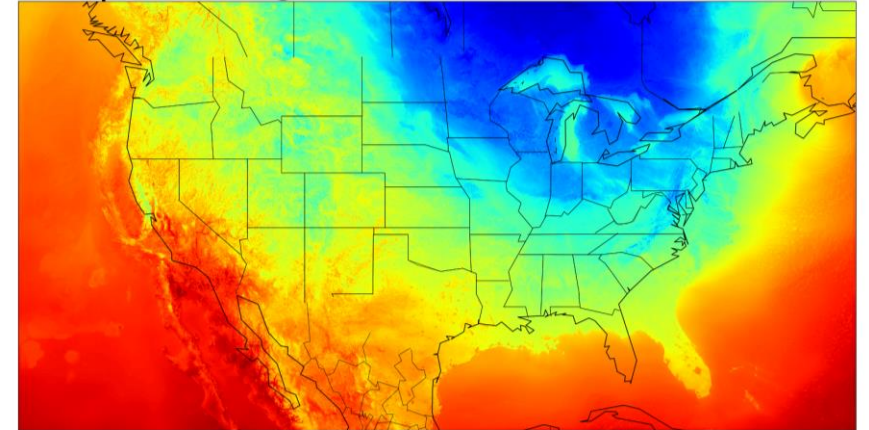
Transmission Planning Models



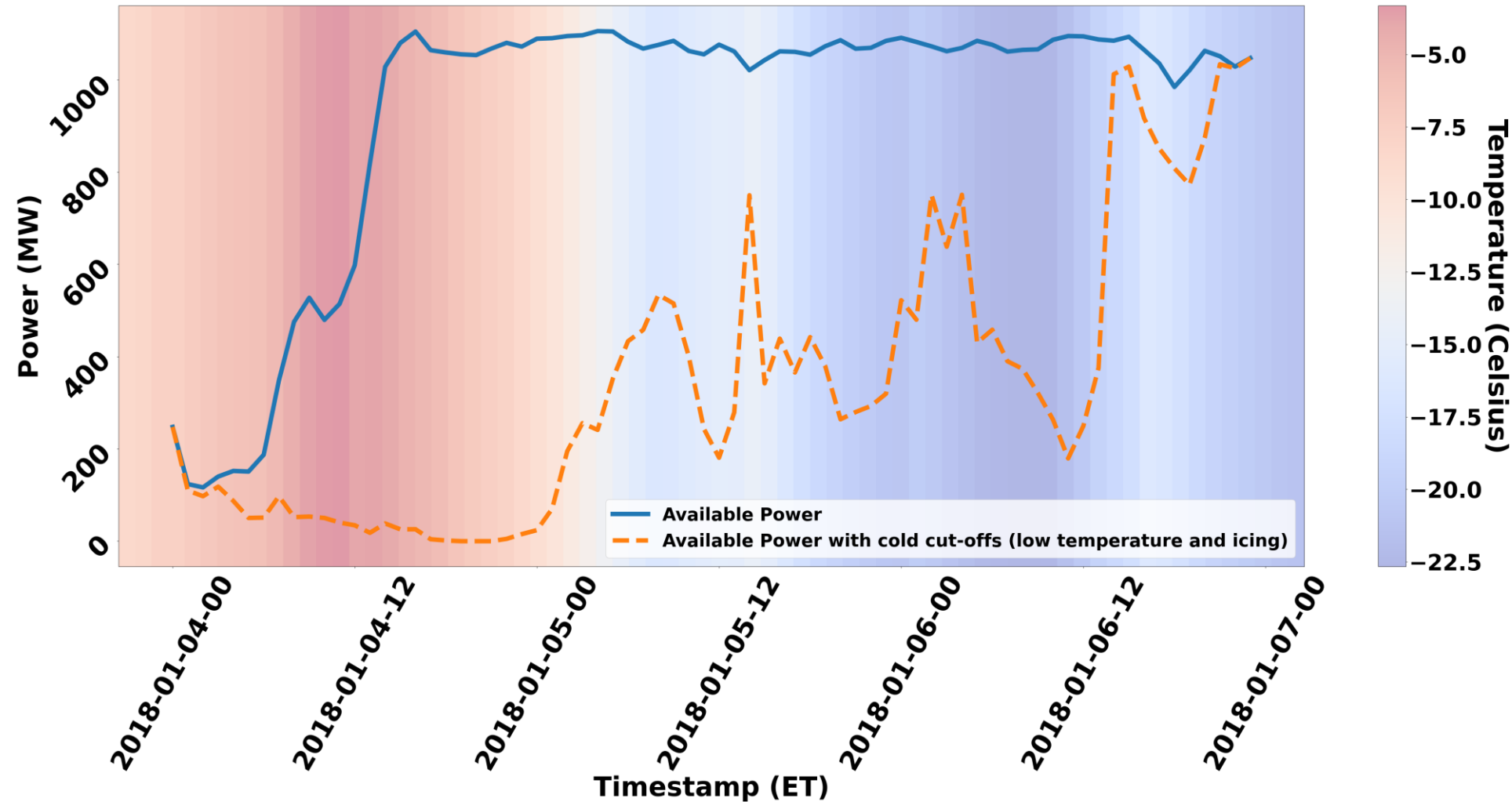
# Data Inputs: Cold Weather Characterization

- Select cold weather event
  - Winter Storm Grayson (early January 2018)
- NAERM utilizes wind, solar, demand, and meteorological data from the event
  - Temperature, icing, snow
- NAERM uses actual generator outages from the event OR hypothetical cold weather outages generated from fragility curves

Temperature @ 2m (°C):2018-01-04 21:00:00



# Data Inputs: Cold Weather Characterization



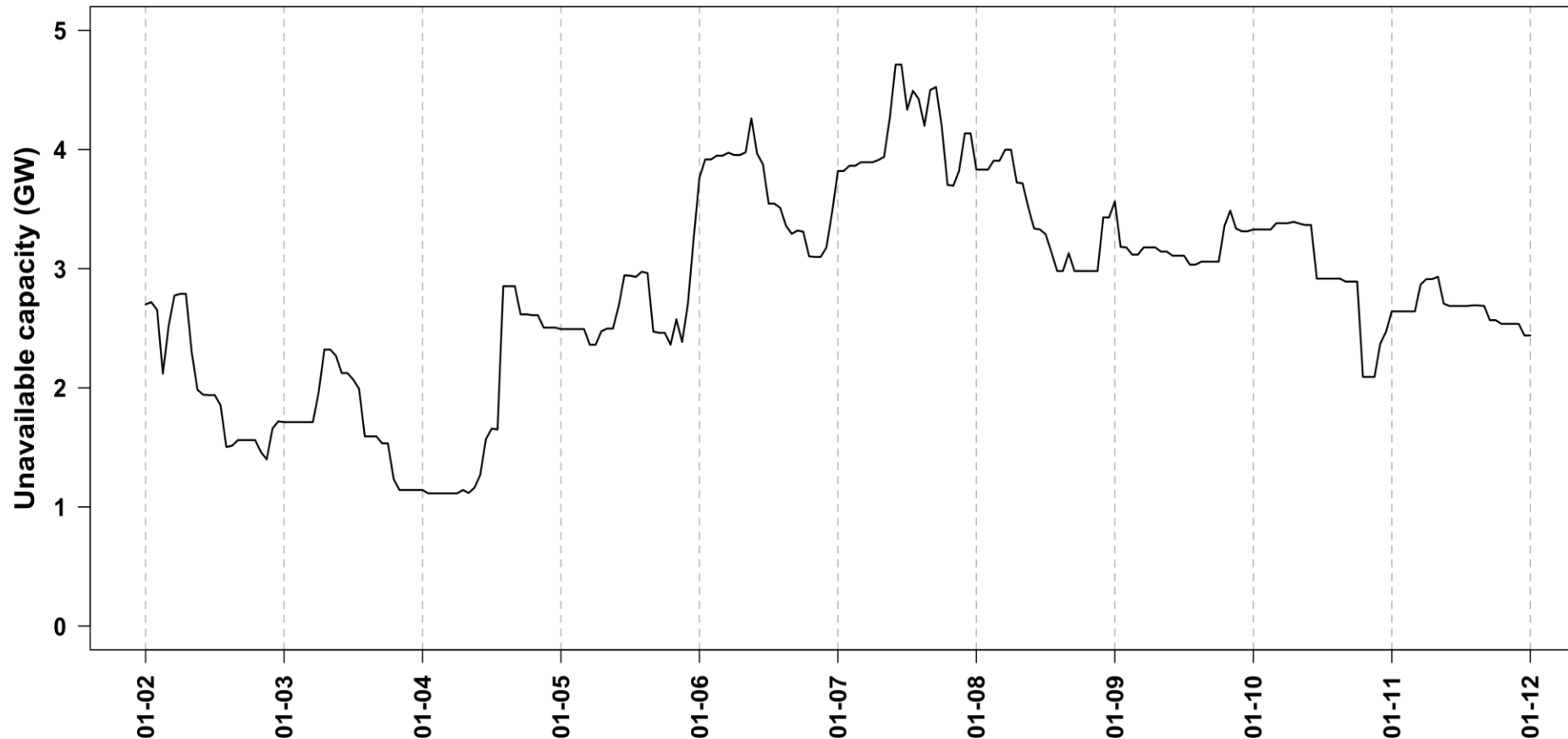
## Example: Wind Generation Profiles

Comparison of available capacity and reduced capacity due to cold temperature cutoffs

Mitigation Teaser: Basis for evaluated the potential benefits of winterizing turbines

# Data Inputs: Cold Weather Characterization

Unavailable capacity from unscheduled events, New England  
Grayson Event, January 2018 (localized to eastern time)



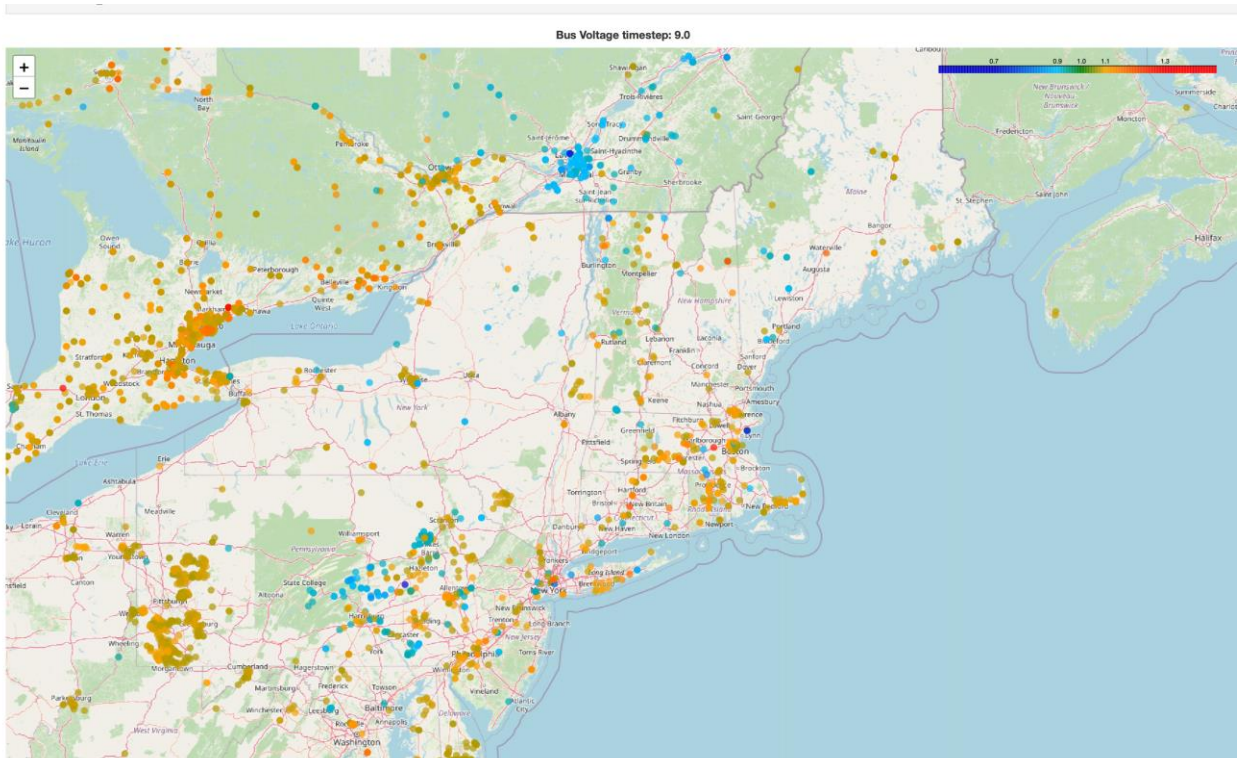
## Example: Available generator capacity

Capacity that was unavailable due to cold weather

Mitigation Teaser: Utilize winter weather fragility curves to explore benefits of hardening technologies

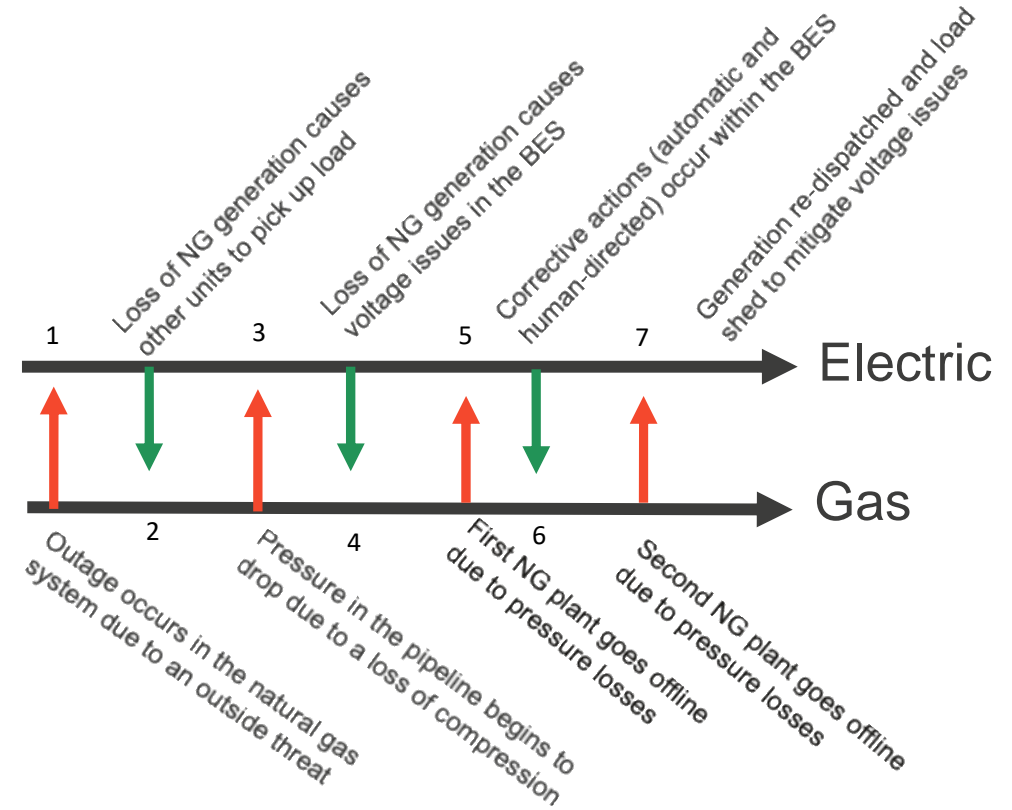


# Co-Simulation: Procedure



Bus voltage violation change map

NAERM Interface



Simulation Schematic

# Co-Simulation: Power Flow Modeling

Power flow software:  
Powerworld, PSLF, PSEE

NAERM developed (semi)  
automated redispatch and  
load shedding

```
timestep: 49.0
      voltage      category counts
0      BusPUVolt < .9 severe violation 65
1      .9 <= BusPUVolt < .95 violation 591
2      .95 <= BusPUVolt < 1.05 nominal 77036
3      1.05 <= BusPUVolt < 1.1 violation 4022
4      1.1 <= BusPUVolt severe violation 710
```

```
timestep: 59.0
      voltage      category counts
0      BusPUVolt < .9 severe violation 67
1      .9 <= BusPUVolt < .95 violation 599
2      .95 <= BusPUVolt < 1.05 nominal 77008
3      1.05 <= BusPUVolt < 1.1 violation 4041
4      1.1 <= BusPUVolt severe violation 710
```

Before redispatch: Many severe  
violations at 109 minutes,  
diverging powerflow after 109  
minutes

```
timestep: 109.0
      voltage      category counts
0      BusPUVolt < .9 severe violation 221
1      .9 <= BusPUVolt < .95 violation 772
2      .95 <= BusPUVolt < 1.05 nominal 76889
3      1.05 <= BusPUVolt < 1.1 violation 3848
4      1.1 <= BusPUVolt severe violation 694
```

```
timestep: -99999
      voltage      category counts
0      BusPUVolt < .9 severe violation 0
1      .9 <= BusPUVolt < .95 violation 0
2      .95 <= BusPUVolt < 1.05 nominal 20
3      1.05 <= BusPUVolt < 1.1 violation 1
4      1.1 <= BusPUVolt severe violation 0
```

```
1      .9 <= BusPUVolt < .95 violation 554
2      .95 <= BusPUVolt < 1.05 nominal 76814
3      1.05 <= BusPUVolt < 1.1 violation 4268
4      1.1 <= BusPUVolt severe violation 719
```

```
timestep: 59.0
      voltage      category counts
0      BusPUVolt < .9 severe violation 68
```

Before redispatch: Converging  
powerflow through the  
simulation, with voltage  
violations similar to beginning of  
simulation.

```
timestep: 109.0
      voltage      category counts
0      BusPUVolt < .9 severe violation 66
1      .9 <= BusPUVolt < .95 violation 554
2      .95 <= BusPUVolt < 1.05 nominal 76998
3      1.05 <= BusPUVolt < 1.1 violation 4092
4      1.1 <= BusPUVolt severe violation 714
```

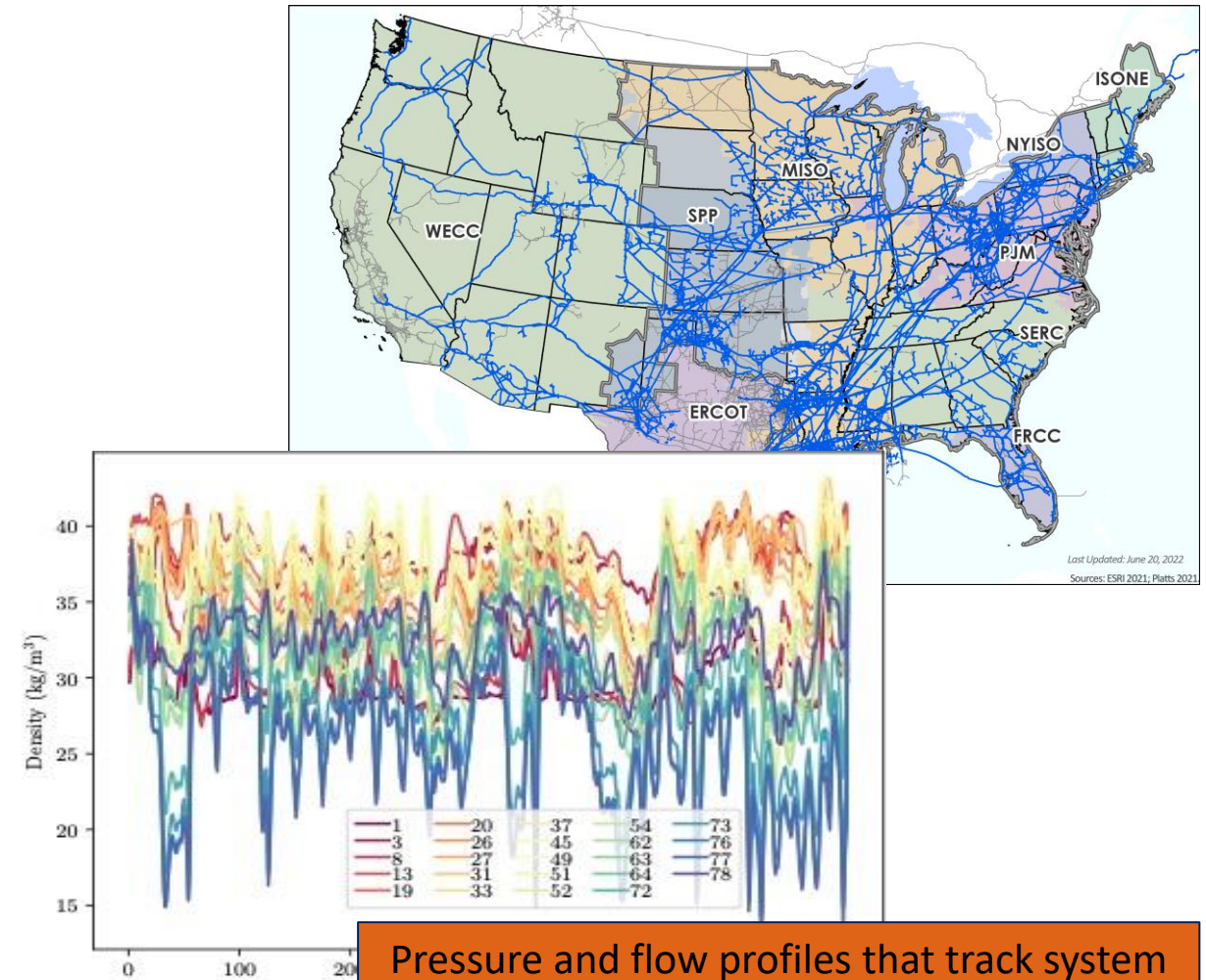
```
timestep: 119.0
      voltage      category counts
0      BusPUVolt < .9 severe violation 66
1      .9 <= BusPUVolt < .95 violation 584
2      .95 <= BusPUVolt < 1.05 nominal 77030
3      1.05 <= BusPUVolt < 1.1 violation 4033
4      1.1 <= BusPUVolt severe violation 711
```

```
timestep: 120.0
      voltage      category counts
0      BusPUVolt < .9 severe violation 66
1      .9 <= BusPUVolt < .95 violation 584
2      .95 <= BusPUVolt < 1.05 nominal 77030
3      1.05 <= BusPUVolt < 1.1 violation 4033
4      1.1 <= BusPUVolt severe violation 711
```

# Co-Simulation: Natural Gas Modeling

## Natural gas software: Lab developed software

- Steady-state (NG Fast)
  - National-scale, computationally efficient screening tool to identify events of interest and concern
- Transient-state (GasModels, NGTransient)
  - Physics-based, high fidelity model of the dynamics of gas flow in pipelines to calculate the spatio-temporal evolution of disruptions and key physical quantities like pipeline pressure



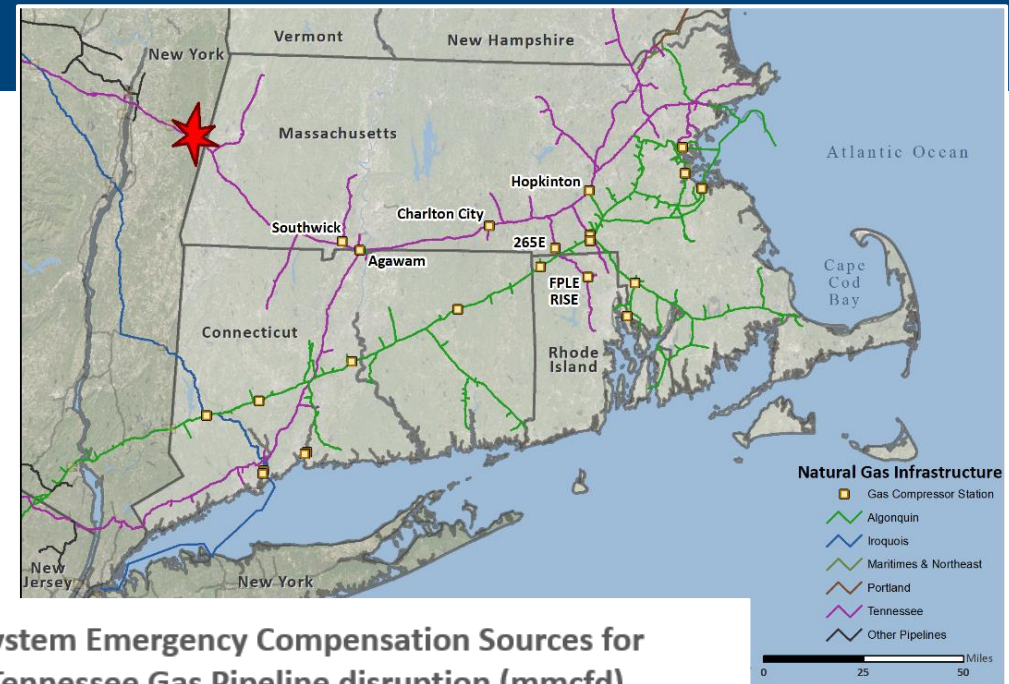
Pressure and flow profiles that track system evolution and impacts over time



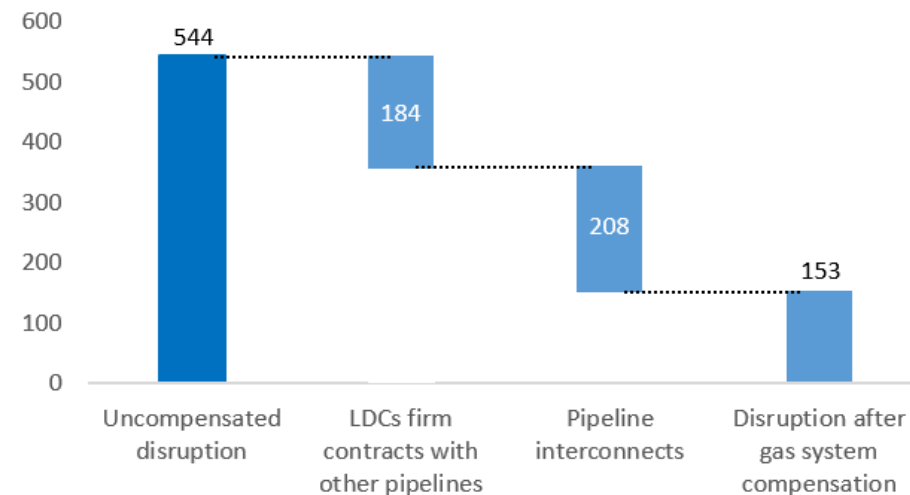
# Resilience Evaluation

## Develop contingency scenarios and evaluate impacts through co-simulation

- To-date, we have evaluated
  - Generator outages that occurred during Grayson with...
  - Two pipeline outage scenarios, one on the Tennessee pipeline and one on the Iroquois pipeline



Gas System Emergency Compensation Sources for the Tennessee Gas Pipeline disruption (mmcf/d)

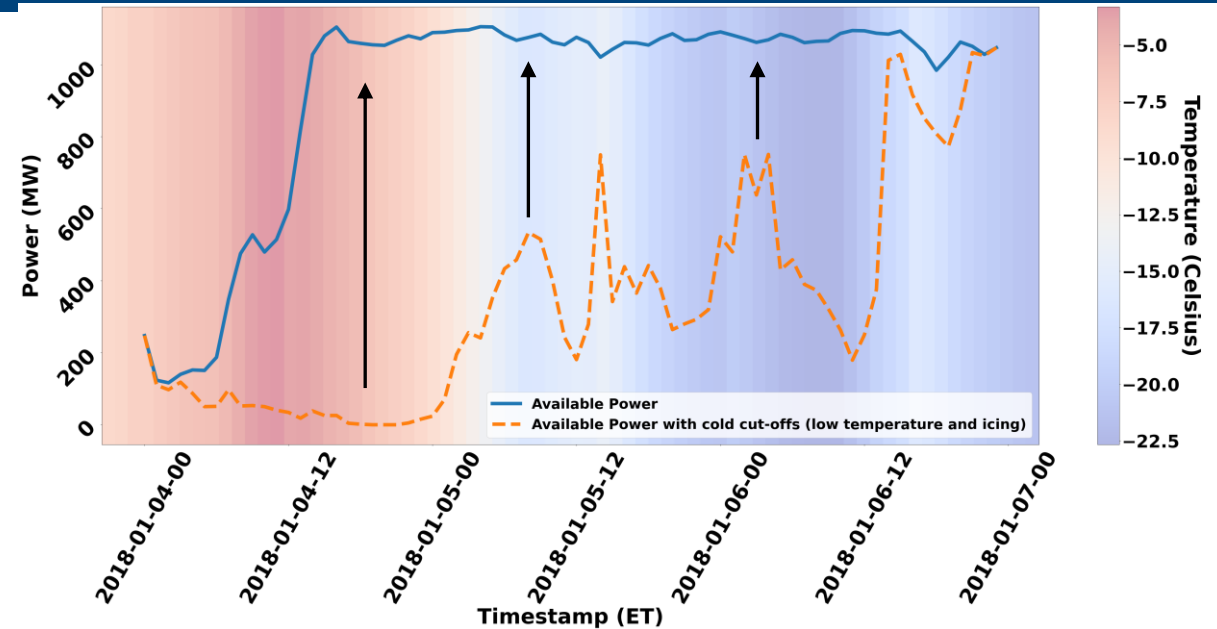


# Mitigation and Investment Evaluation

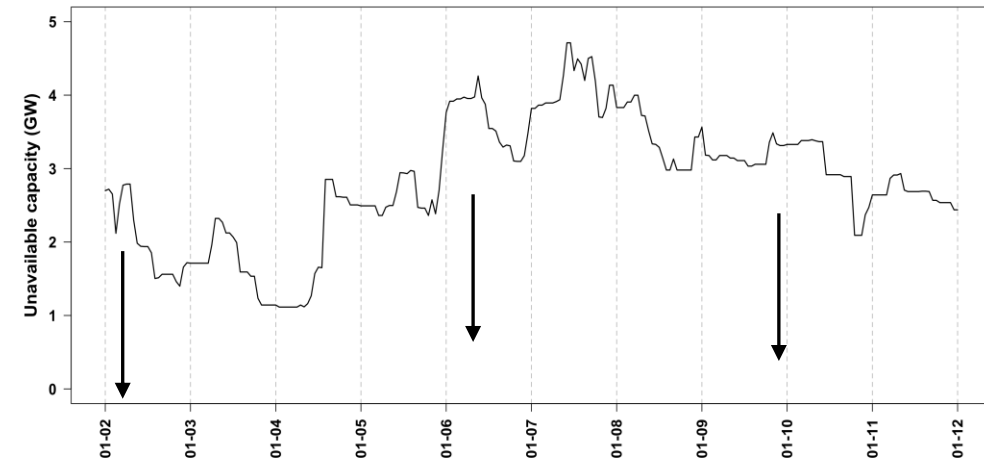
## Forthcoming...

In combination with plans for the future of energy delivery in New England

- Evaluate conversion to dual fuel units
- Evaluate wind turbine winterization
- Evaluate Increased LNG capacity
- Evaluate Electrification and demand flexibility
- Other stakeholder priorities...



Unavailable capacity from unscheduled events, New England  
Grayson Event, January 2018 (localized to eastern time)



# Agenda

**Introduction to NAERM (Ali Ghassemian – DOE OE)**

**Current State of NAERM (John Grosh – LLNL)**

**Wildfire Use Case (JP Watson – LLNL)**

**Cold Wave Use Case (Russell Bent – LANL)**

⇒ **Q&A**