



DYNAMIC DATA RECONCILIATION AND OPTIMIZATION

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Overview

- PRISM Group Overview
- Monitoring / Intelli-Fields
 - Unmanned Aerial Vehicles
 - Oil and Gas Exploration and Production
- Uncertainty Analysis
 - Investment Planning Under Uncertainty
 - Energy Storage and the Smart Grid
- Next Generation Simulation with Optimization
 - Solid Oxide Fuel Cells
 - Systems Biology

PRISM Group Overview

- PRISM: **P**rocess **R**esearch and **I**ntelligent **S**ystems **M**odeling
- Methods
 - Mixed Integer Nonlinear Programming (MINLP)
 - Dynamic Planning and Optimization
 - Uncertain, Forecasted, Complex Systems

- Fit Systems into Standard Problem Formulation

$$\begin{aligned} &\max f(x) \\ &\text{subject to } g\left(\frac{\partial x}{\partial t}, x, u, p\right) = 0 \\ &\quad h(x, u, p) \leq 0 \end{aligned}$$

- Solver development: Large-scale MINLP (100,000+ variables)

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UAV Platform

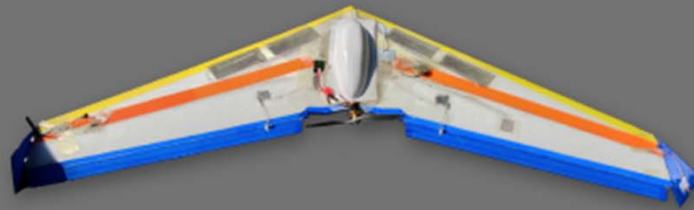
Platform One:

Ritewing 81" ZXL

Sensor: GoPro Hero 3 Camera

Control: RC/FPV

Flight Time: 25 minutes



Platform Two:

Procerus 72" Unicorn

Sensor: Gimbaled Camera

Control: Kestral Autopilot v2.2

Flight Time: 40 minutes

Sensors



GoPro Hero 3 Black Edition

Resolution: 1440x1990

Frame Rate: 48 fps

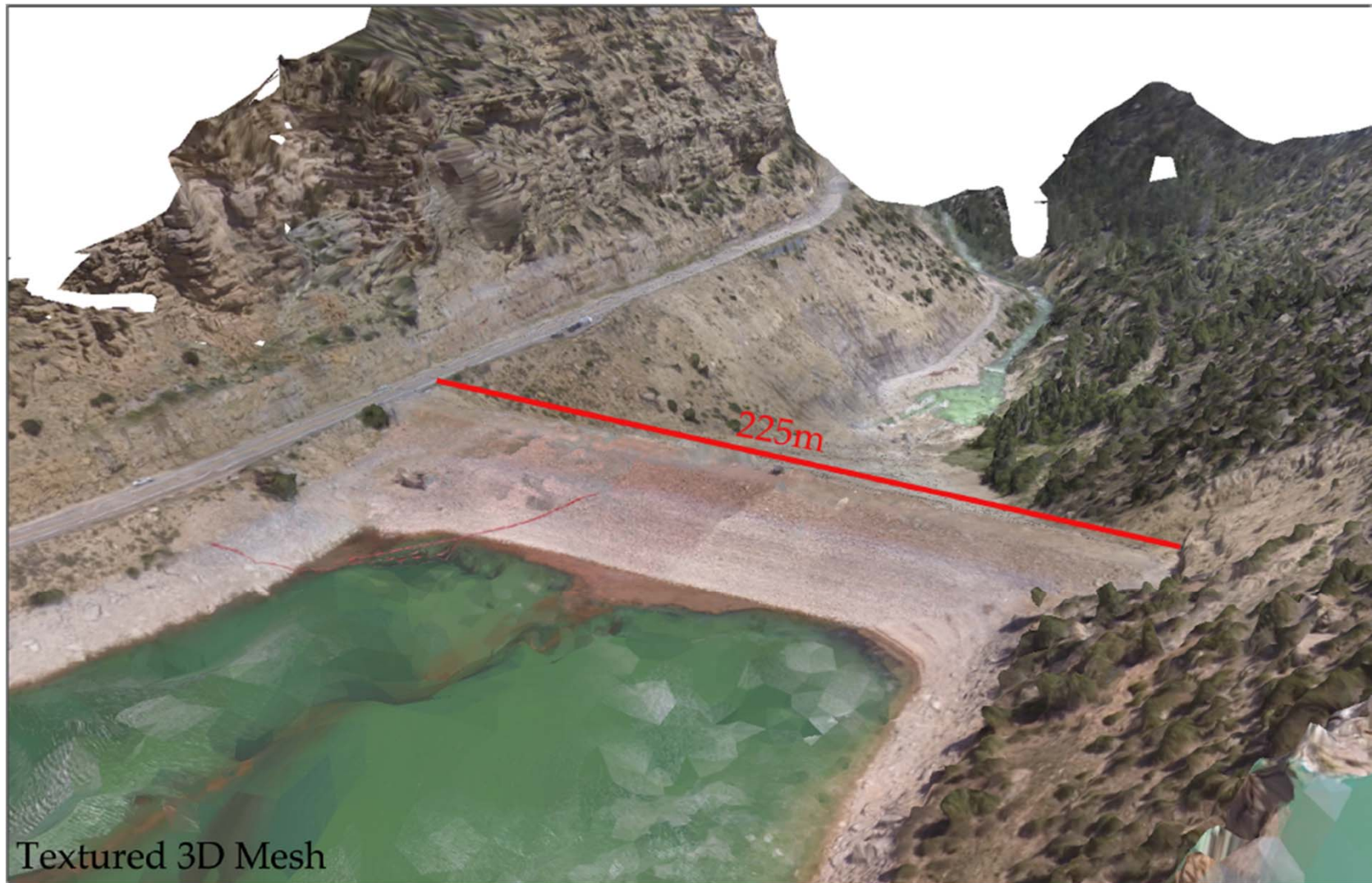


Sony FCB IX11A Block Camera

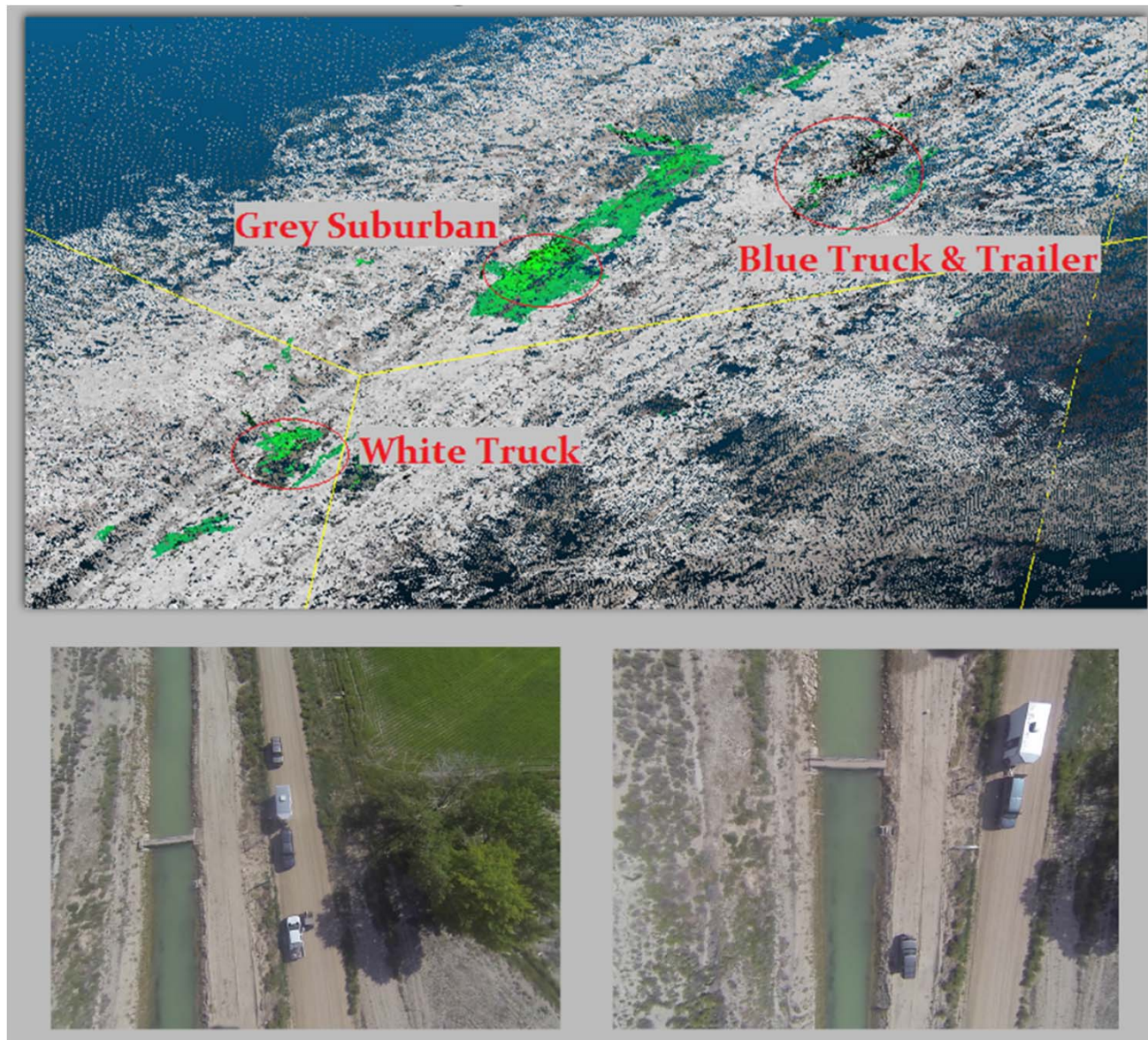
Resolution: 640x480

Frame Rate: 15 fps

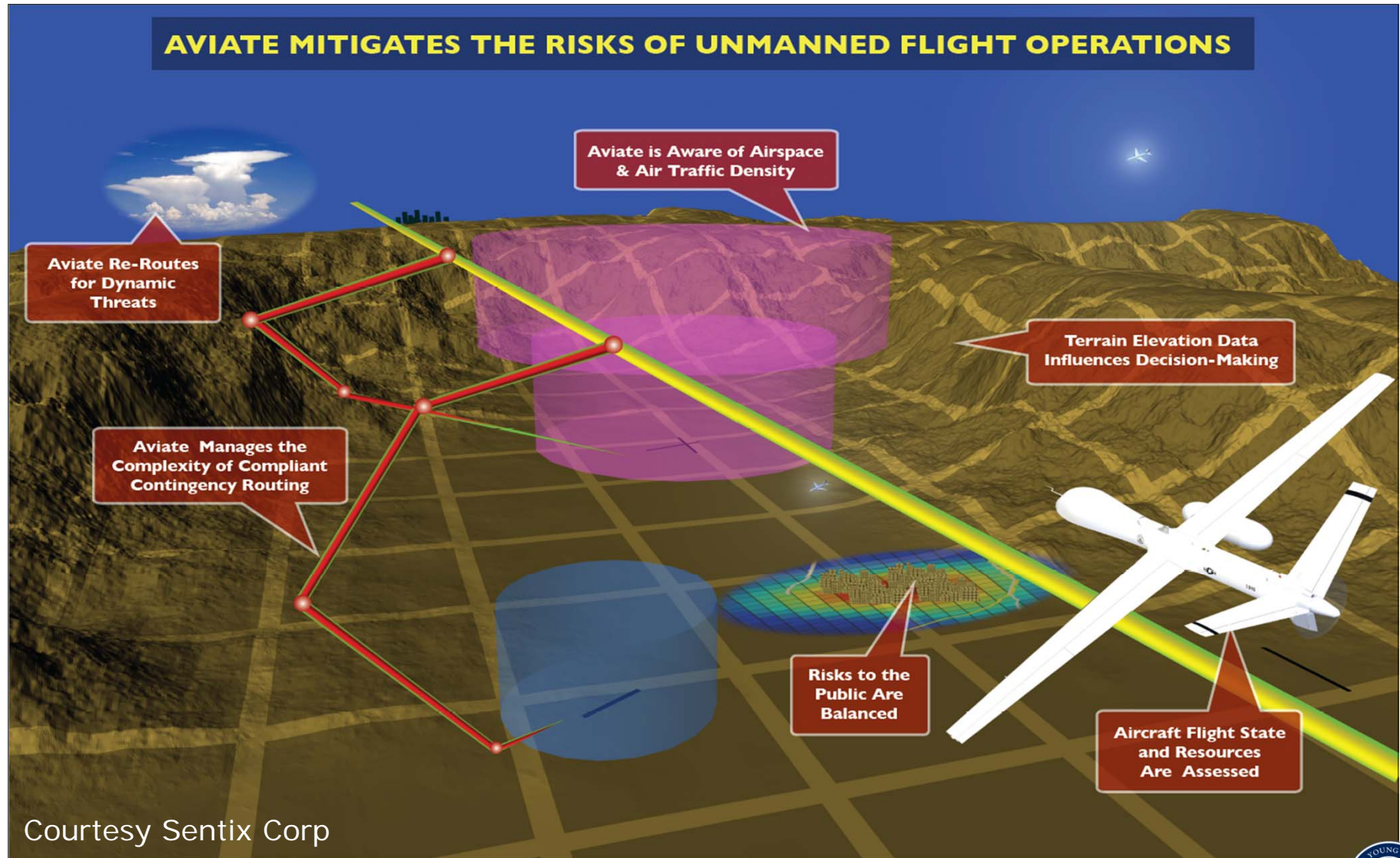
Monitor Infrastructure



Canal – Change Detection



Dynamic Optimization with UAVs



Information Sources

Multiple Sources of Information Can Be Utilized

Population Density

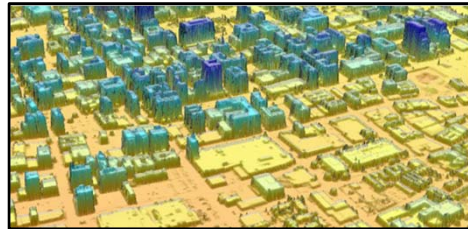


Controlled Airspace

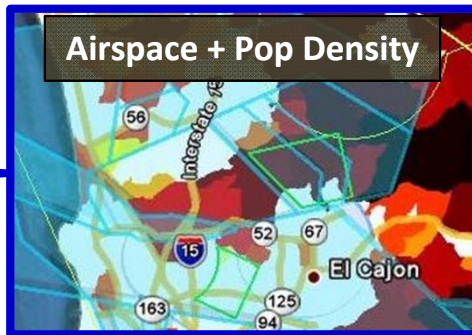


**Safety
Thresholds**

Geospatial / Urban Dev

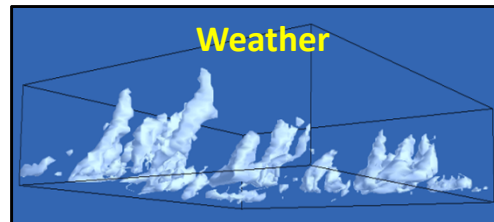
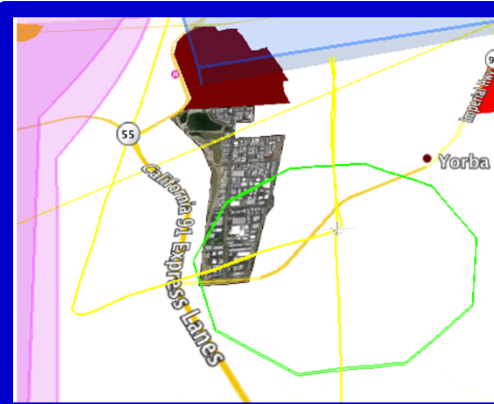
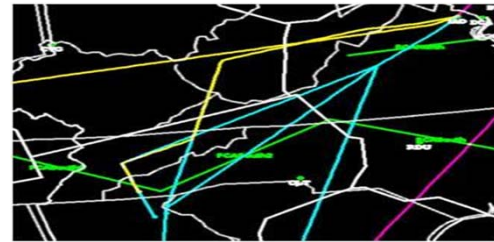


Airspace + Pop Density



Aircraft Performance Model

Air Traffic Density



Functions

**Define
Risk**

**Compute
Risk**

**Minimize
Risk**

Courtesy Sentix Corp

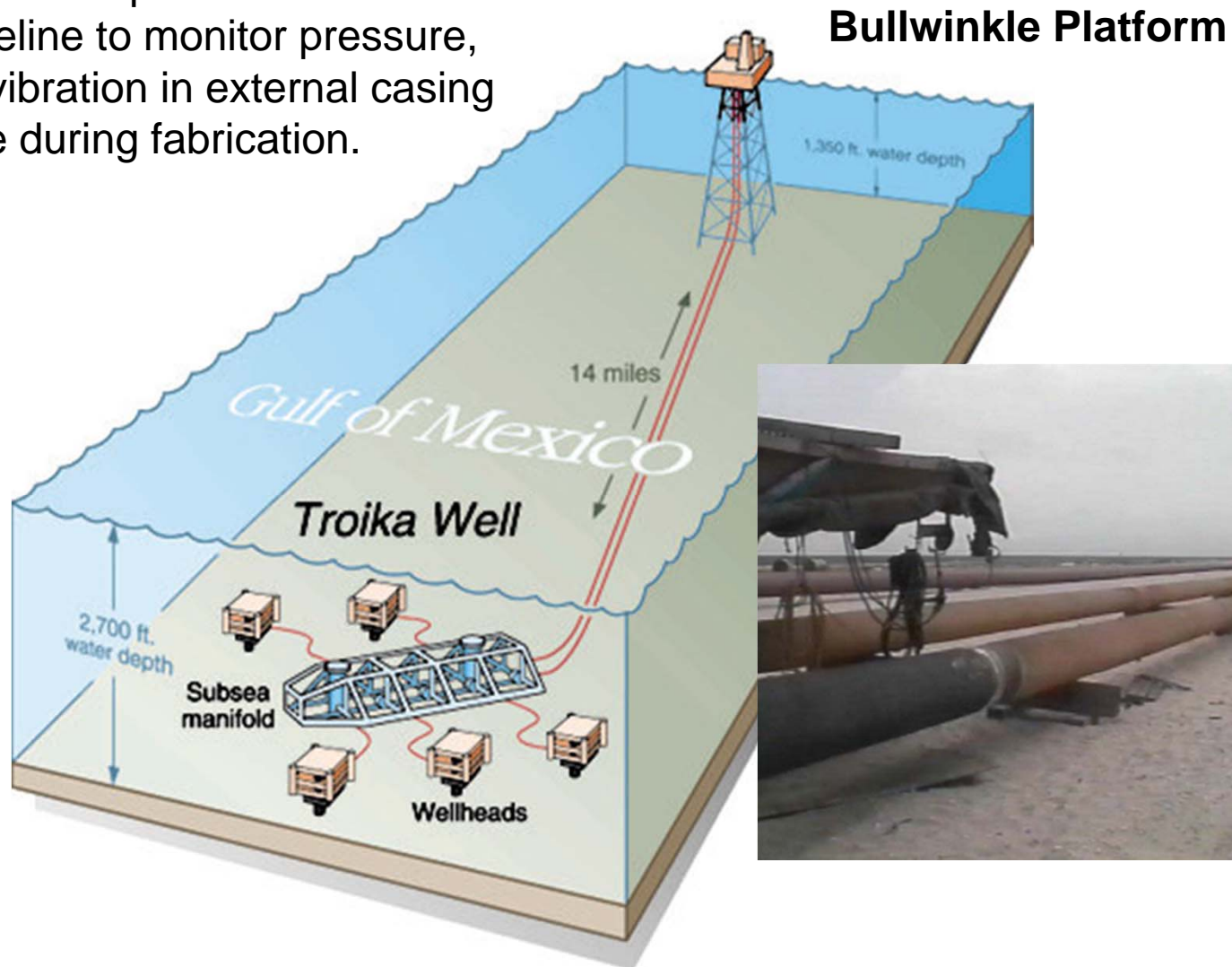
Failures to Monitor and Predict



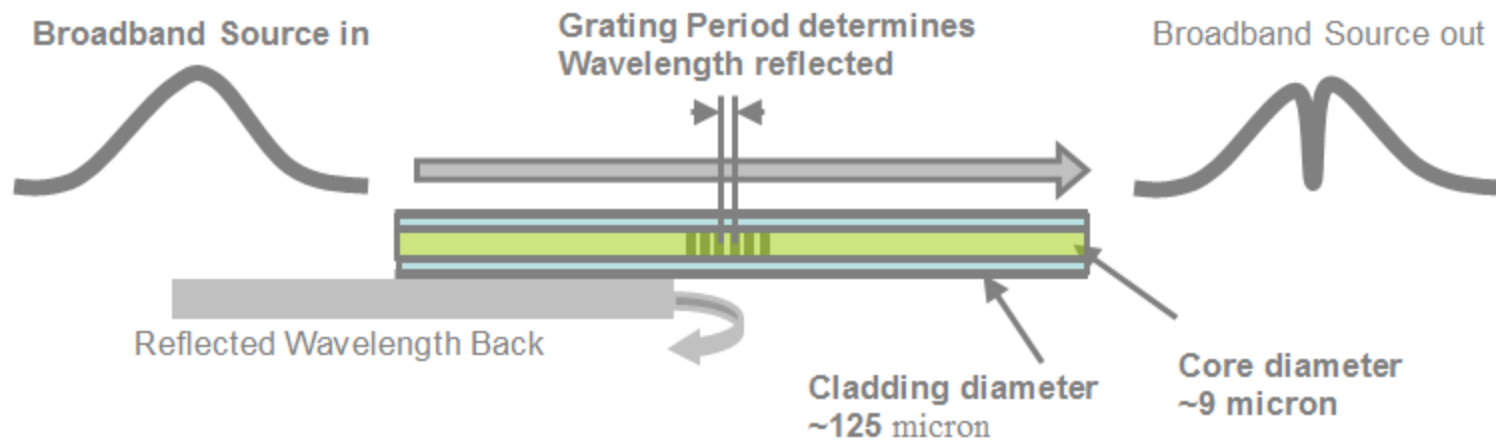
- Detect early warning signs
- Automate monitoring of critical systems
- Give critical data to key decision makers

Troika - Gulf of Mexico

First use of fiber optic sensors on a subsea pipeline to monitor pressure, strain and vibration in external casing pipe bundle during fabrication.



Fiber Bragg Gratings



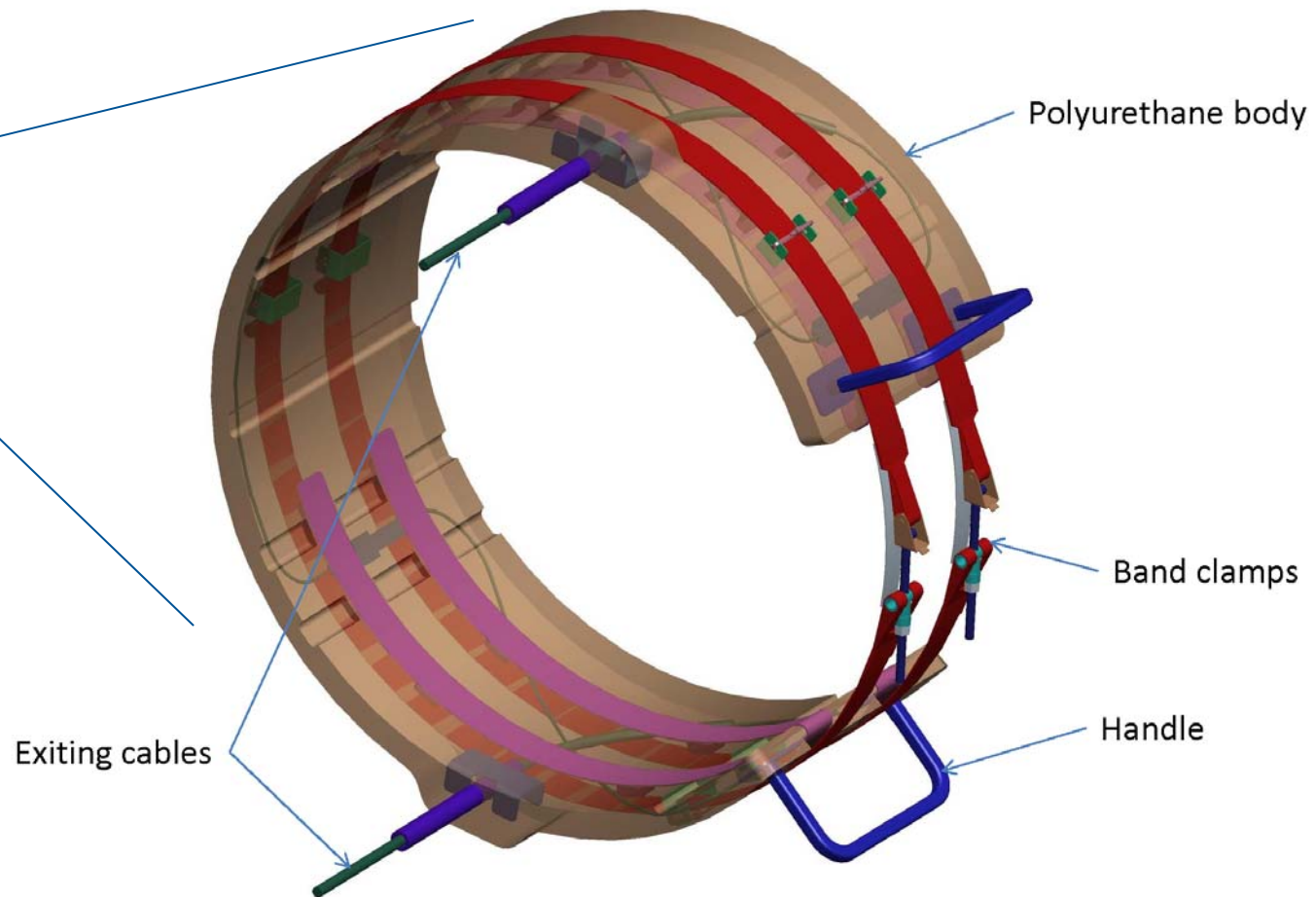
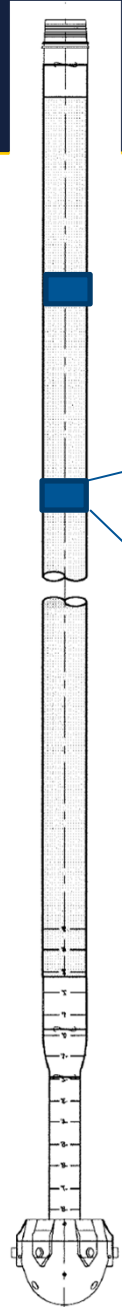
Relationship between Strain (ϵ) and Change in Wavelength ($\Delta\lambda_b$)

$\Delta\lambda_b / \lambda_b = (1-p_e)\epsilon$, where p_e is the photoelastic constant for glass and λ_b is the base wavelength

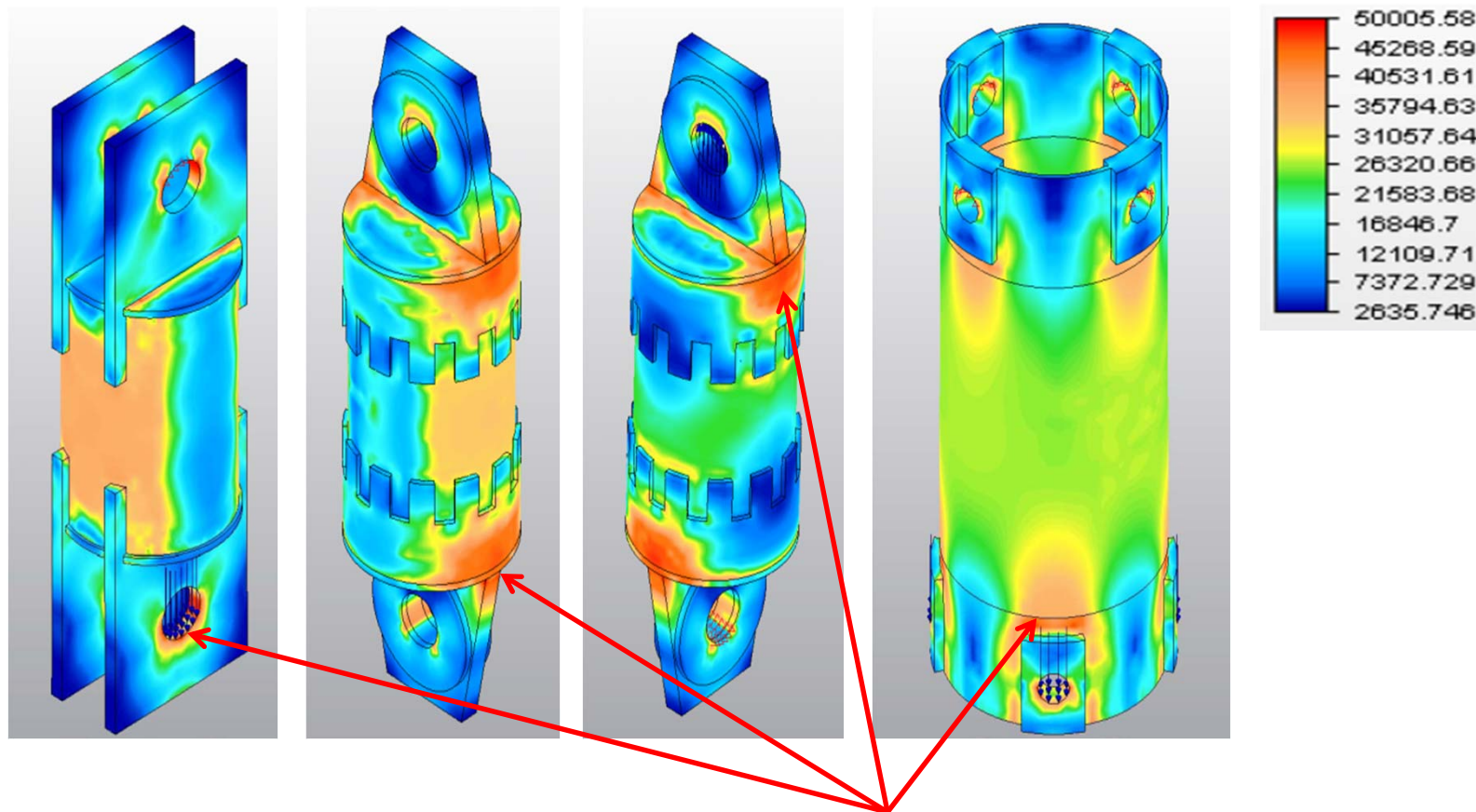
Multiple Gratings (sensors) can be placed on a single fiber, enabling high sensor count per fiber channel.



Tendon Tension Monitoring

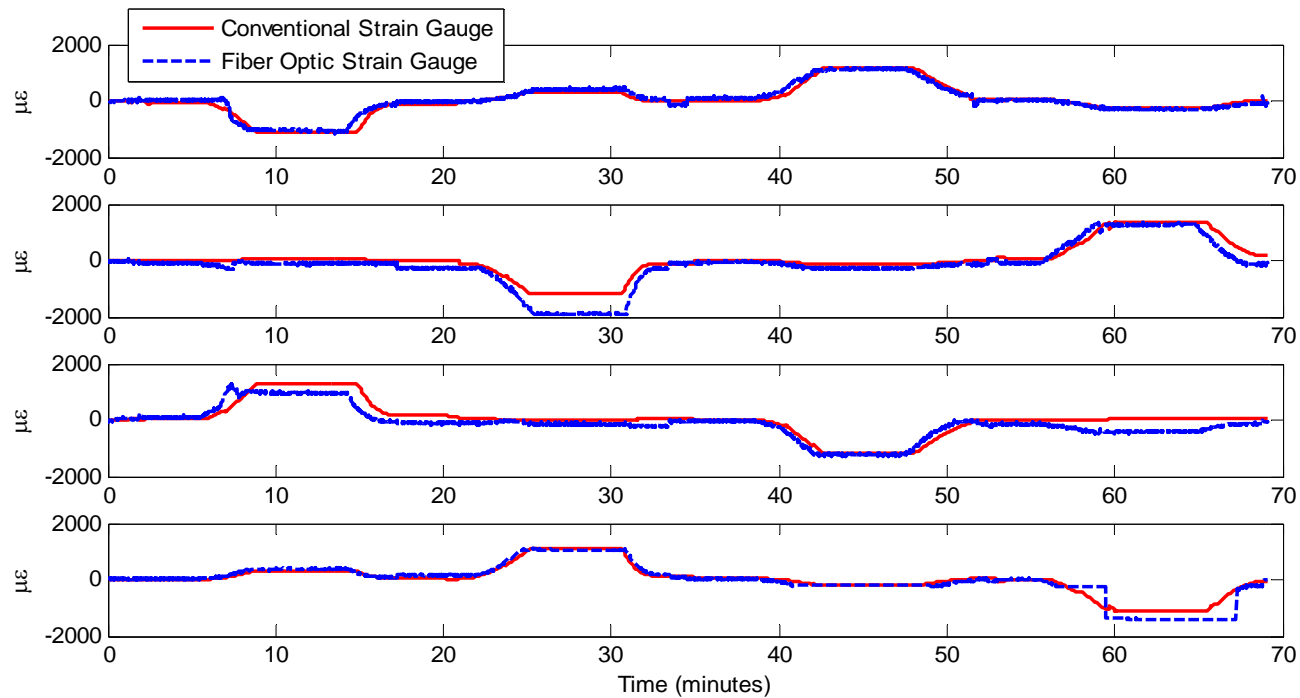
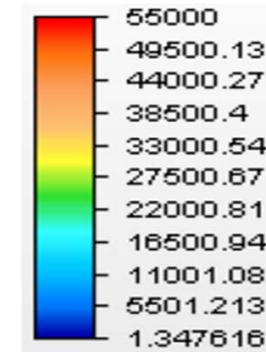
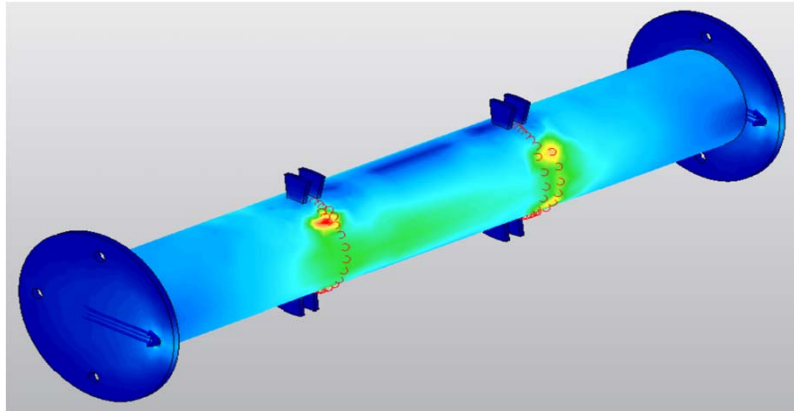


Adhesion Testing for Subsea Installation



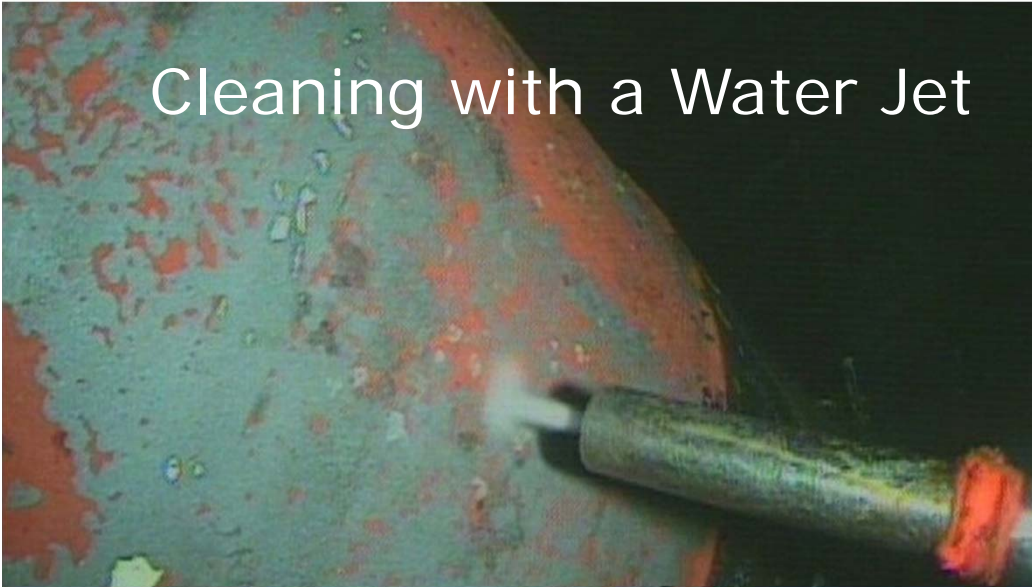
FEA Test Article Pipe for Tension Testing
Avoid Local Areas of Inelastic Deformation (>50 ksi)

Uniform Loading in 4 Point Bending



Tendon Band Preparation

Cleaning with a Water Jet



Polishing to Bare Metal



Marine Growth (Before)



Clean Band (After)



Diver Installation

Diver with Clamp



Riser Preparation



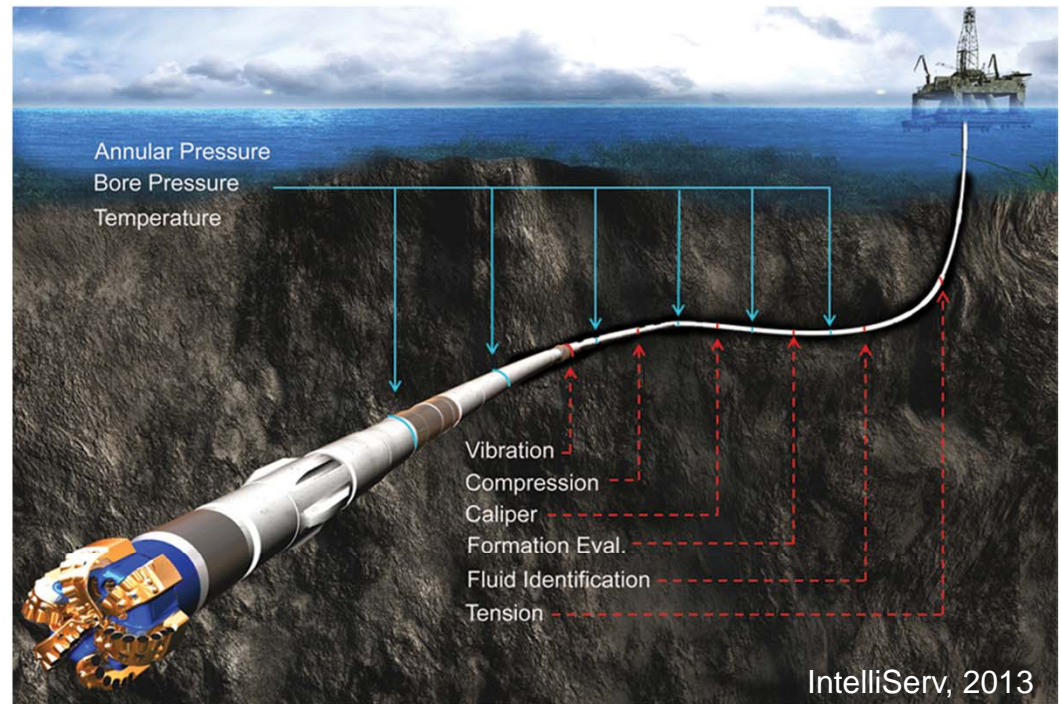
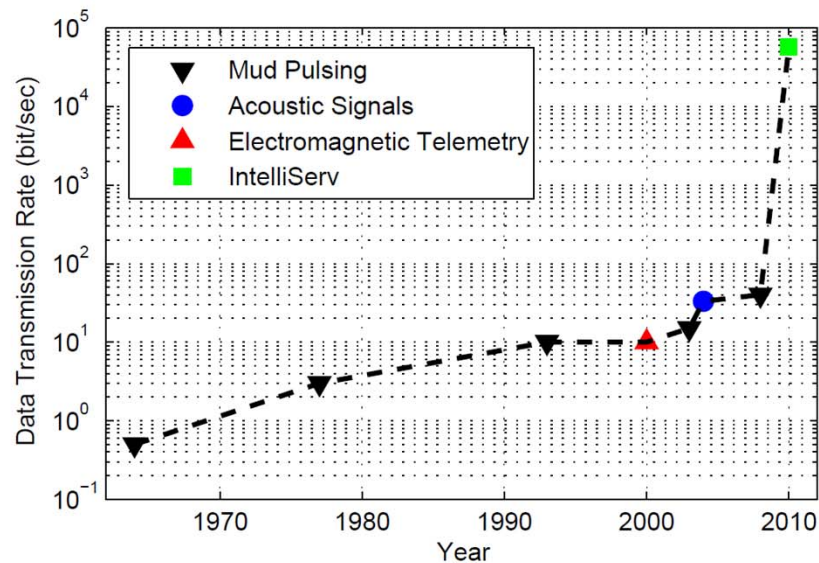
Clamp Installation



Clamp Inspection



Drilling and Production

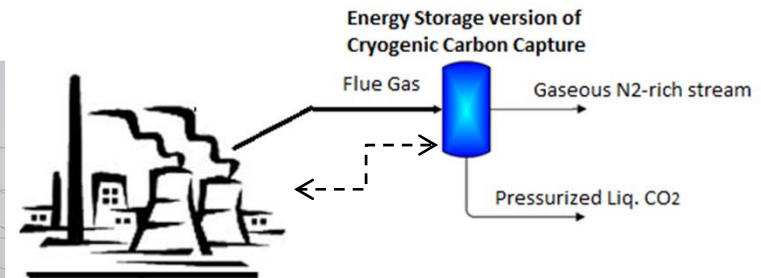
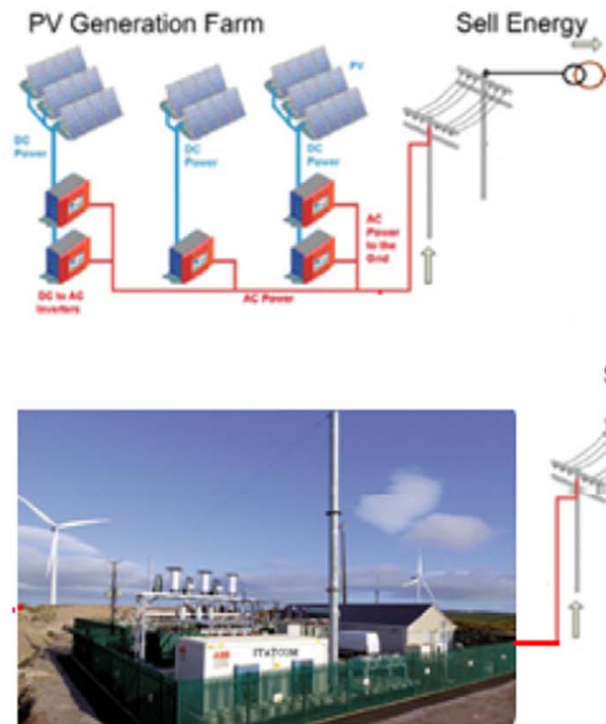


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Smart Grid Optimization

Smart grid integration with solar, wind, coal, biomass, natural gas, and energy storage



Sell Energy

Sell Energy Buy Energy

Sell Energy

Sell Energy

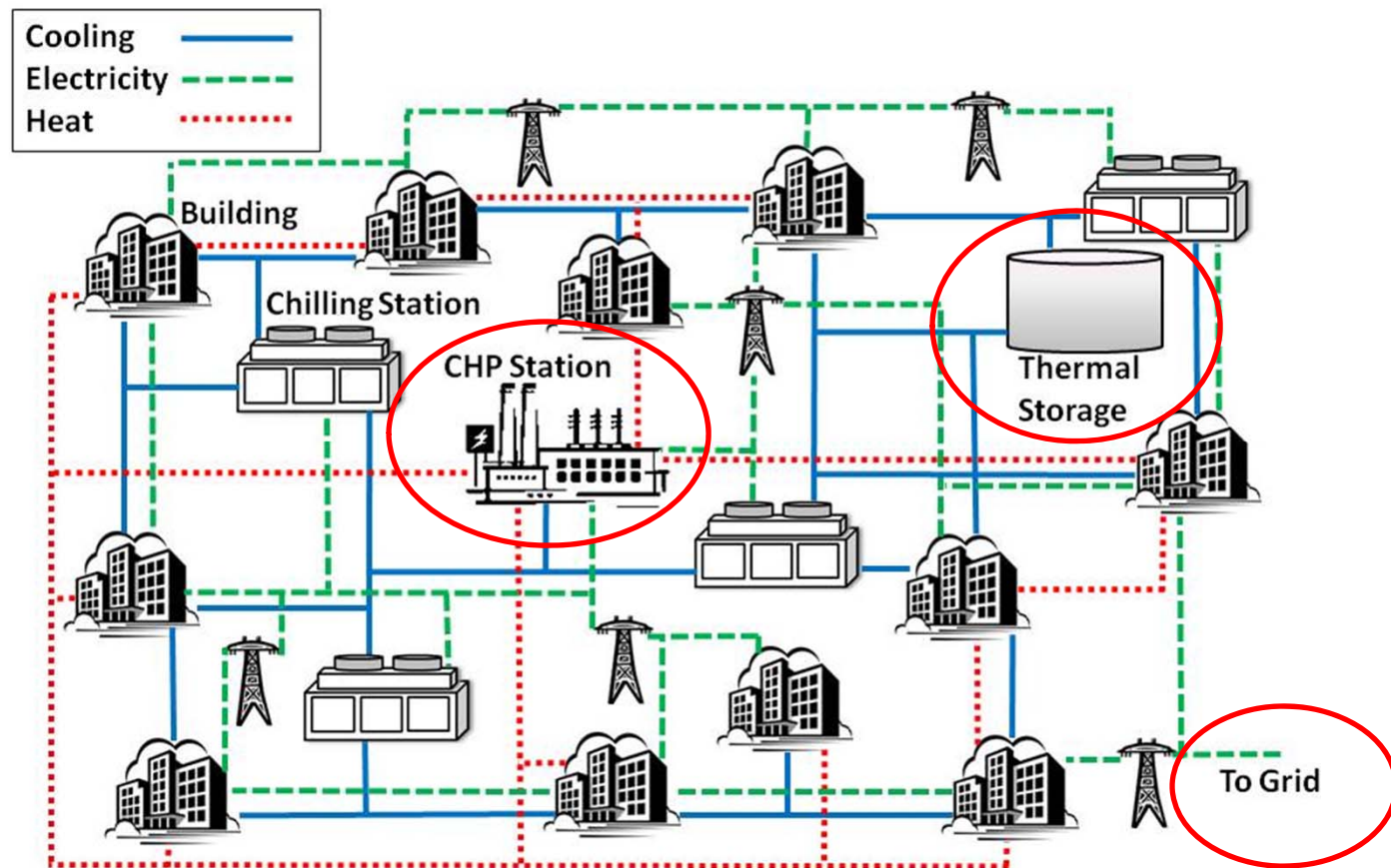
Local Transmission Grid

Residential Network

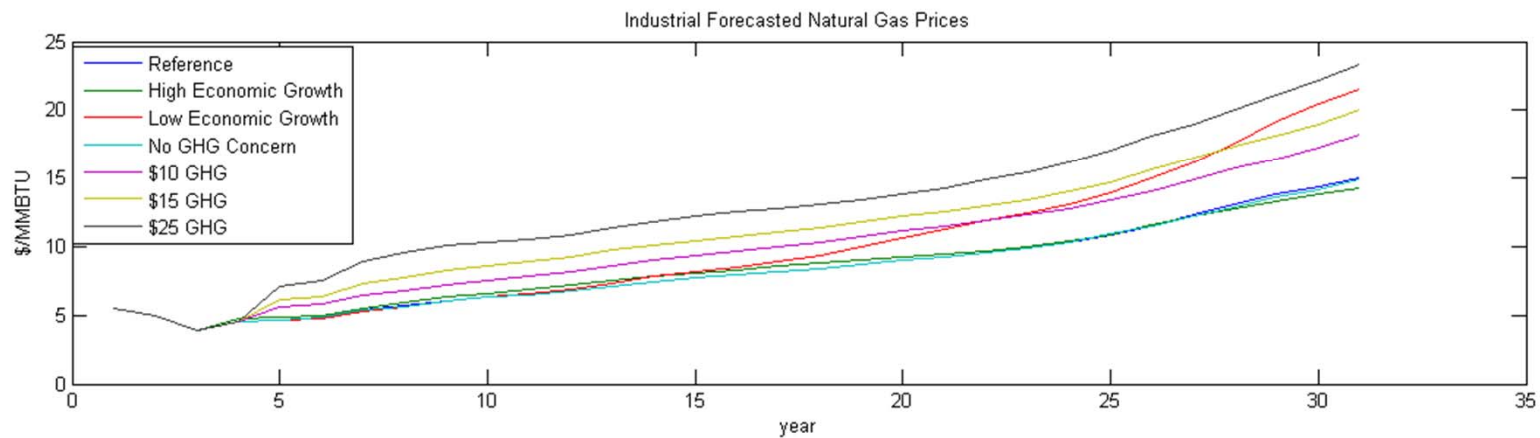
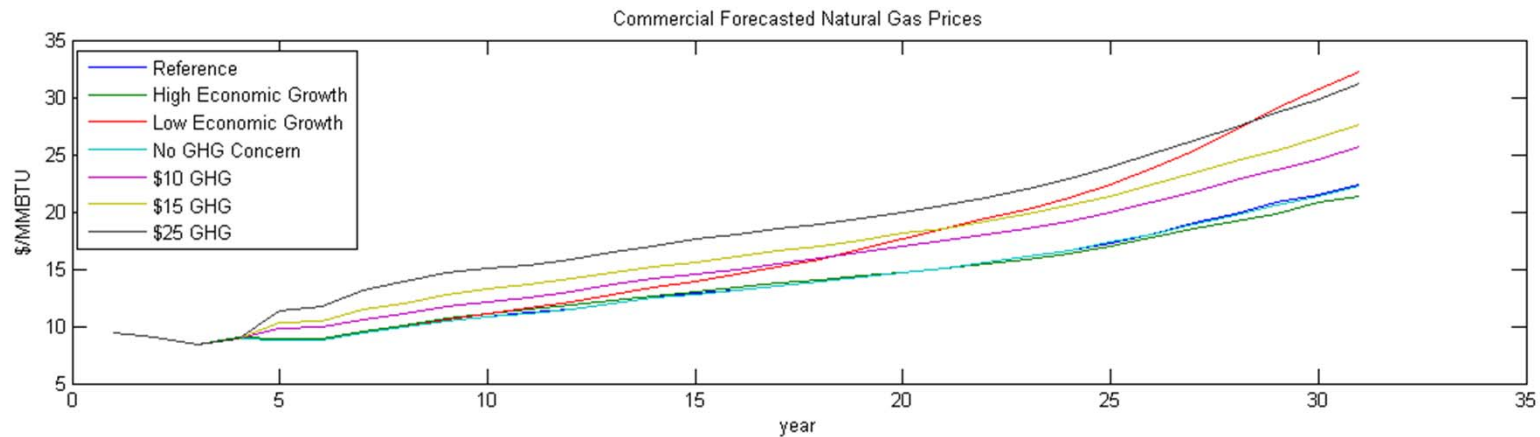
Nuclear integration with petrochemical production, processing, and distribution



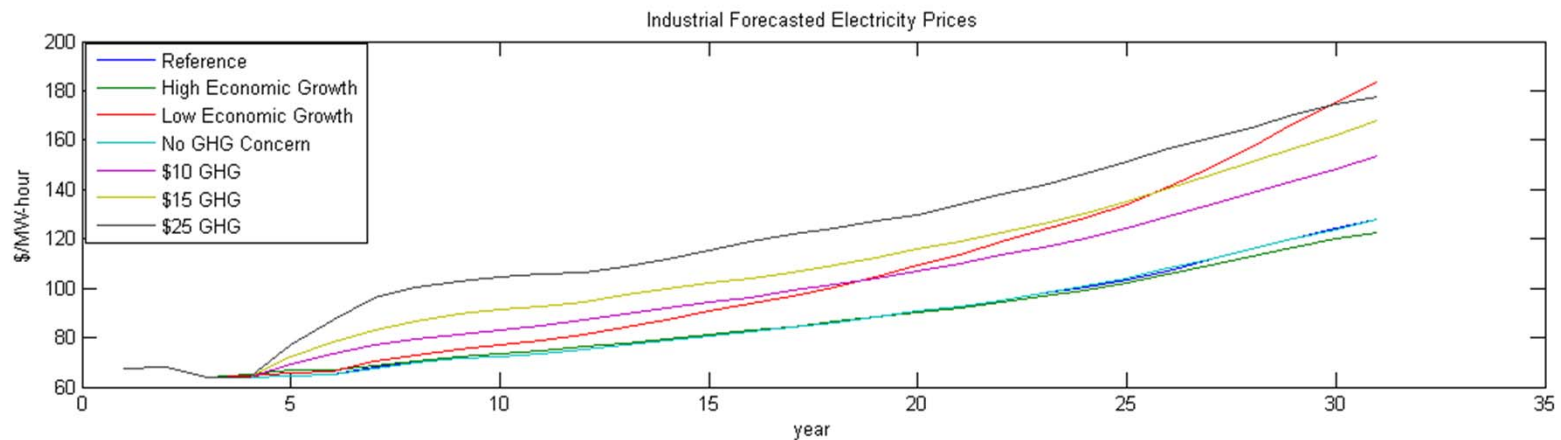
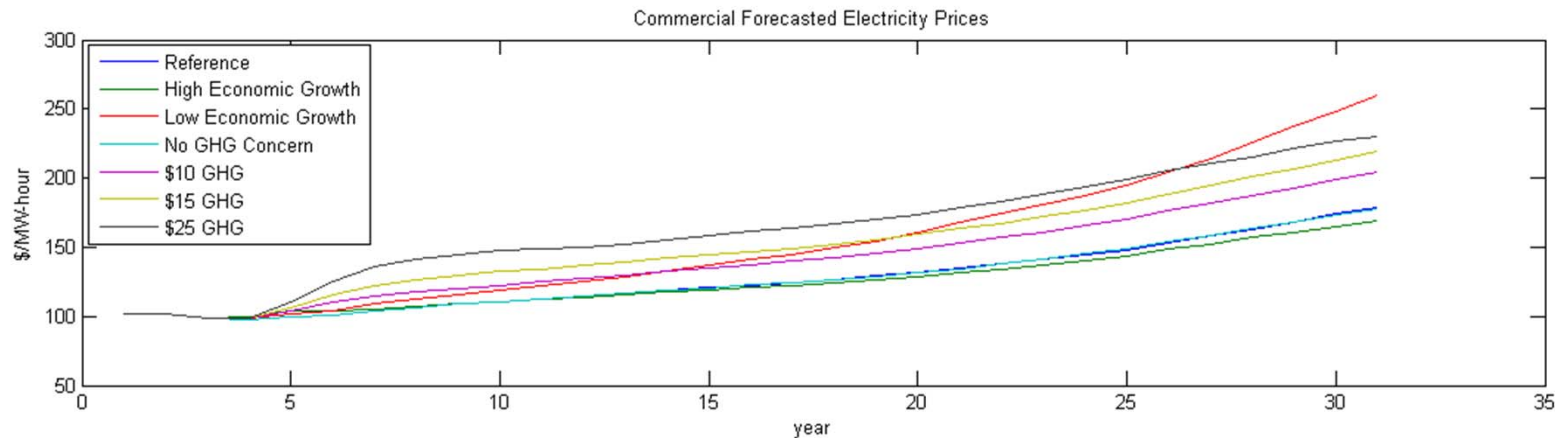
District Heating and Cooling



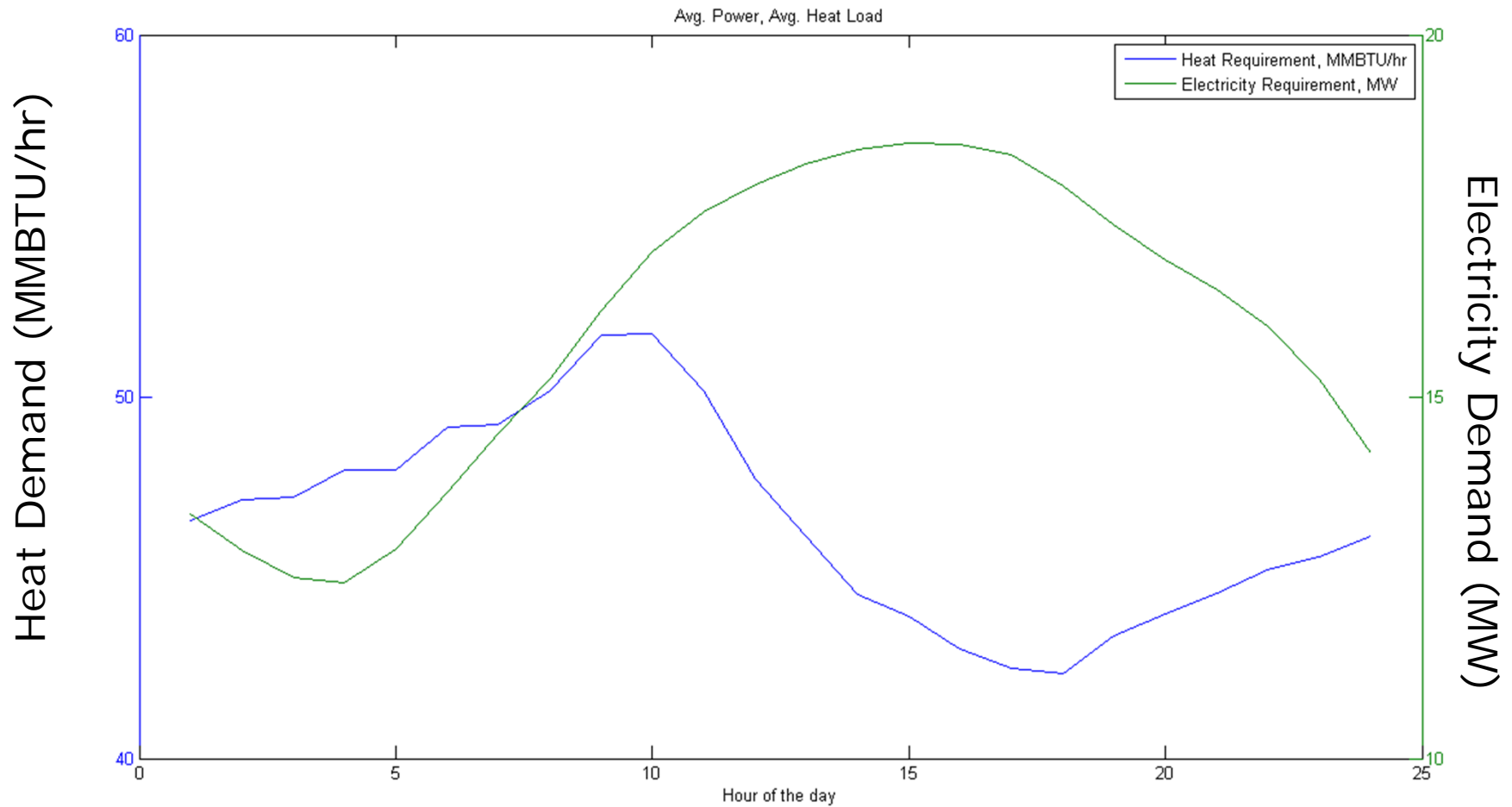
Uncertainty in Natural Gas Prices



Uncertainty in Electricity Prices

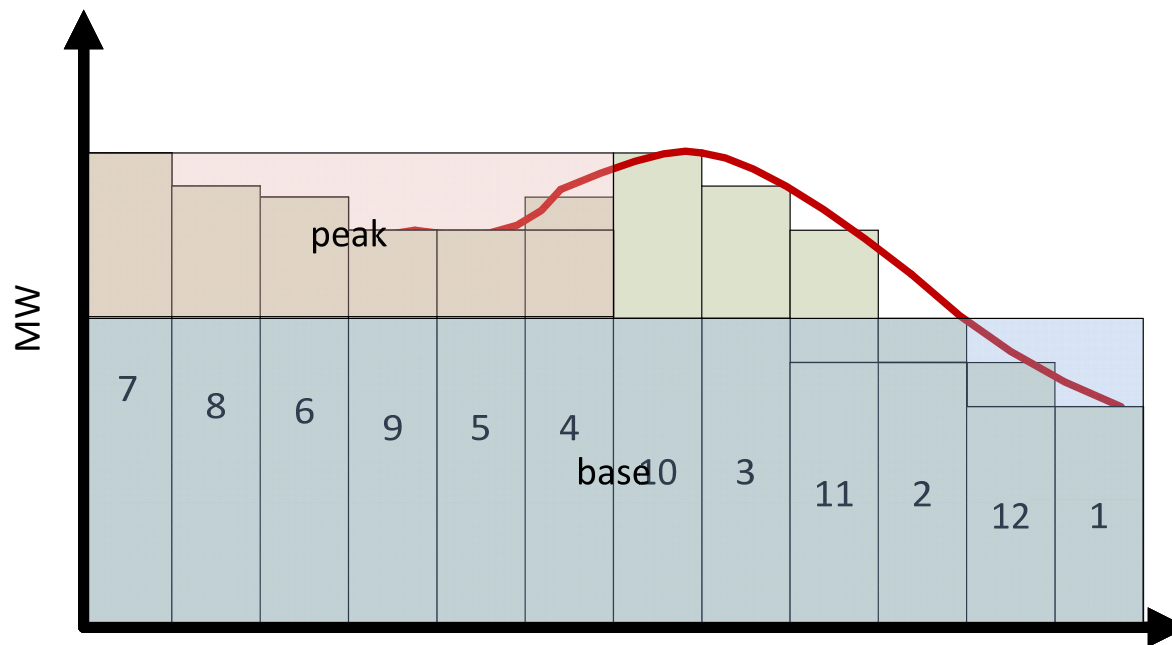


Dynamic Model for Dynamic System

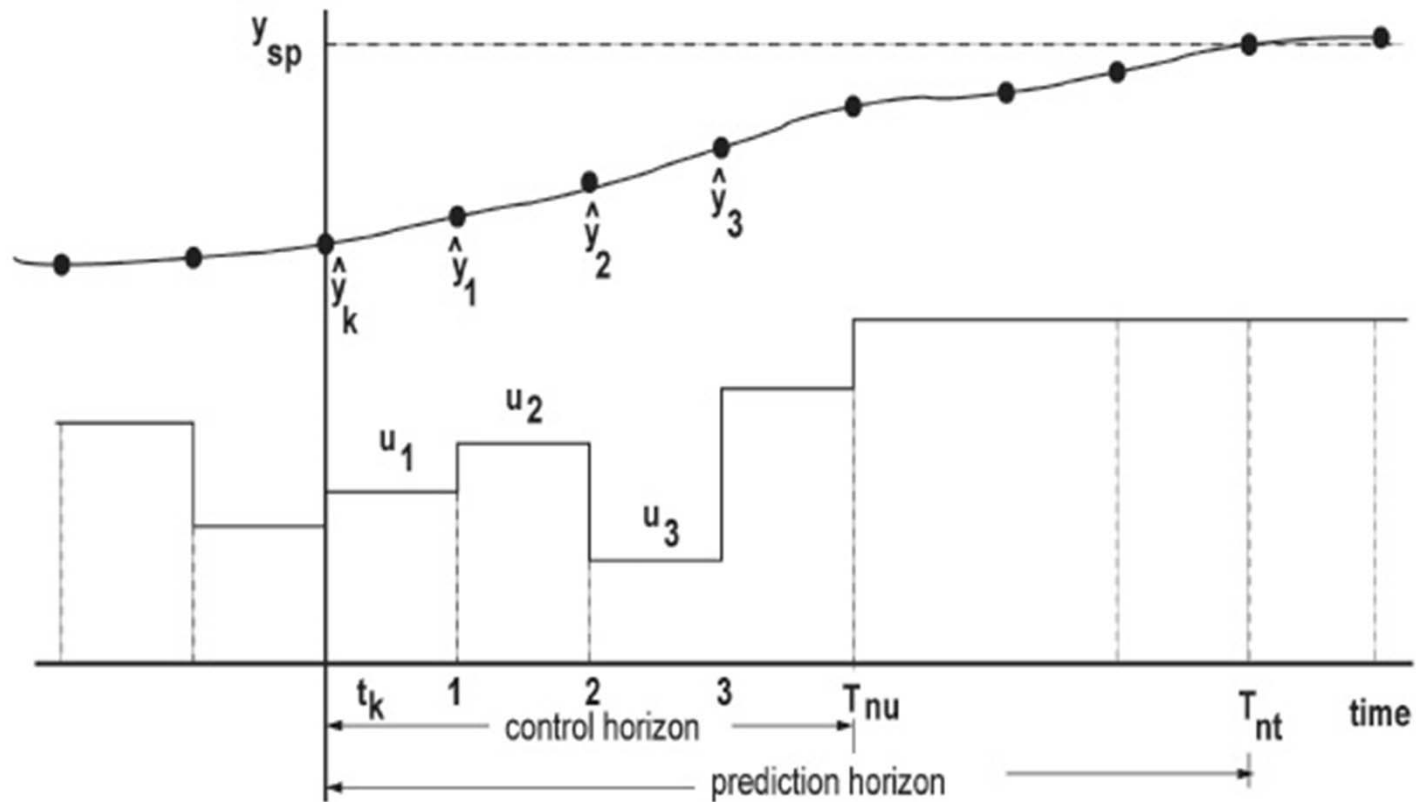


Simplifying System

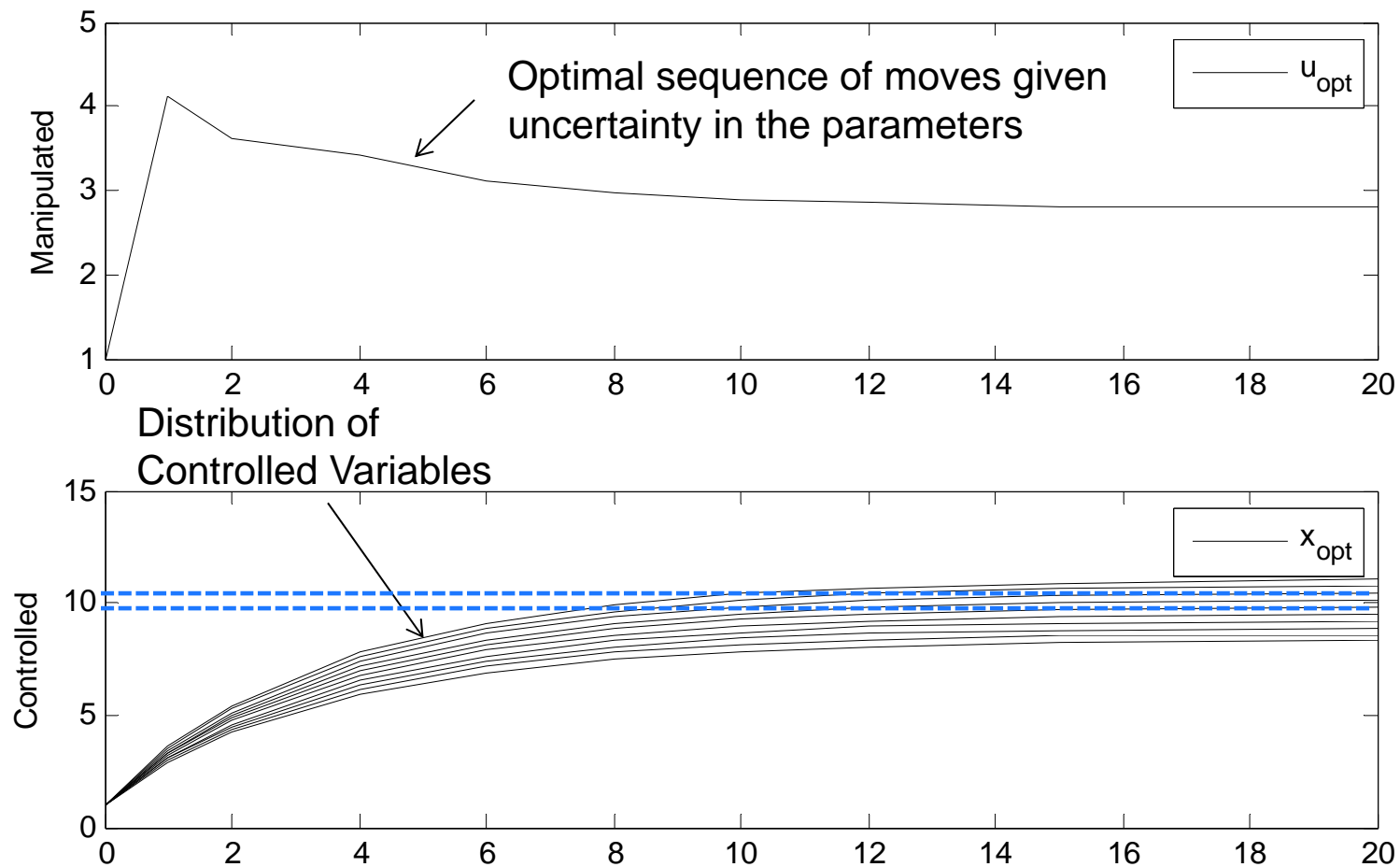
- Create Model:
- Electric and Heating Demand Model (winter and summer)



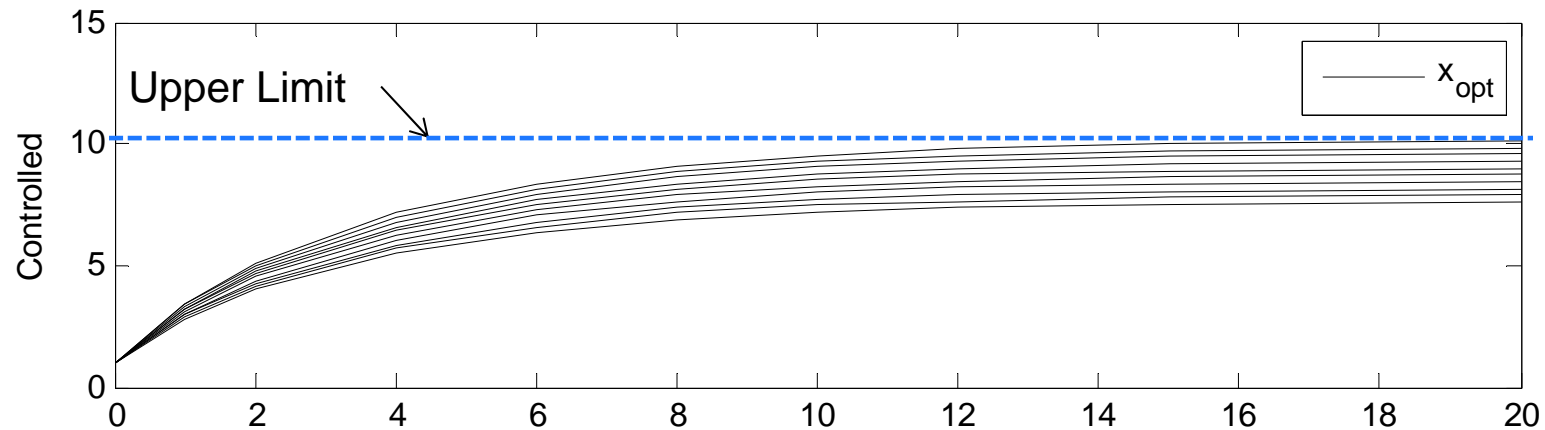
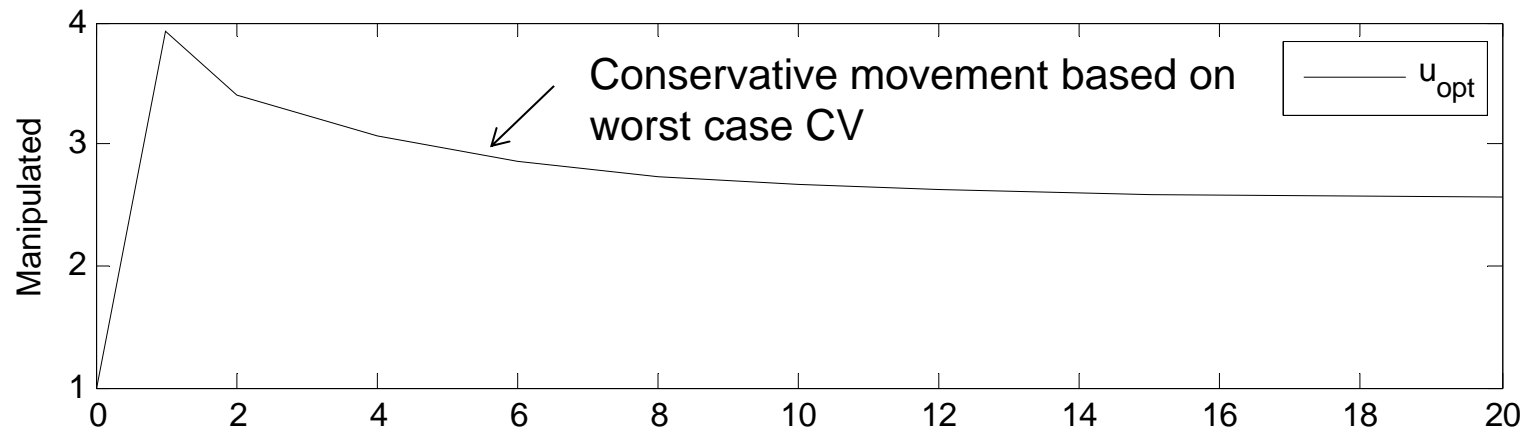
Model Predictive Control Approach



Optimize to a Target Range



Optimize to a Limit

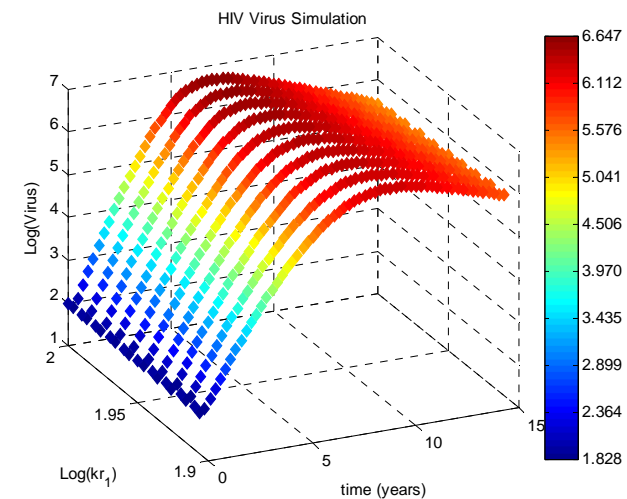
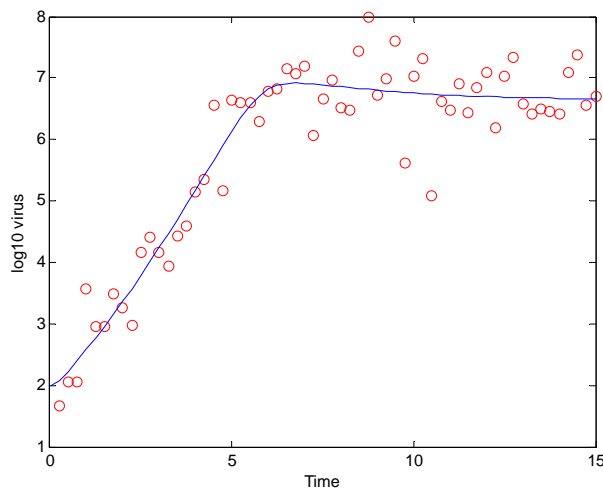


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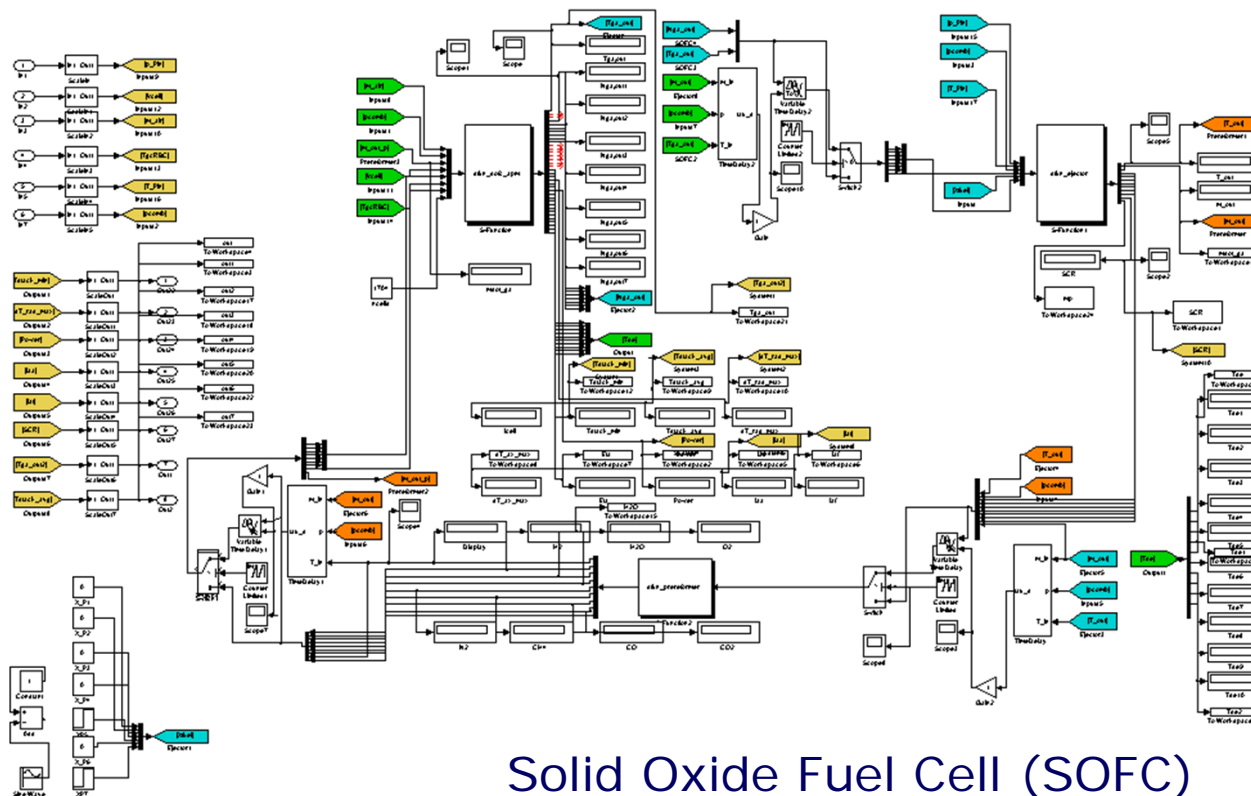
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Systems Biology

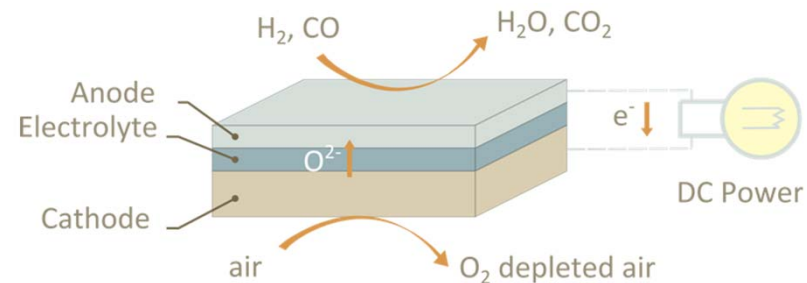
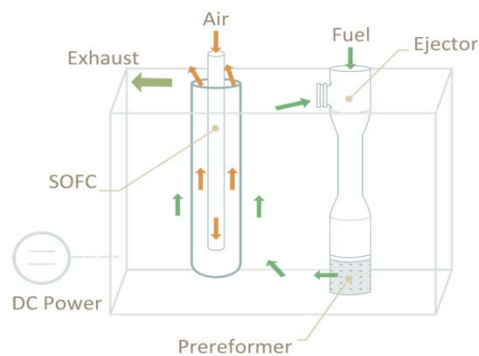
- Objective: Improve extraction of information from clinical trial data
- Dynamic data reconciliation
 - Dynamic pharmacokinetic models (large-scale)
 - Data sets over many patients (distributed)
 - Uncertain parameters (stochastic)



Dynamic Energy System Tools



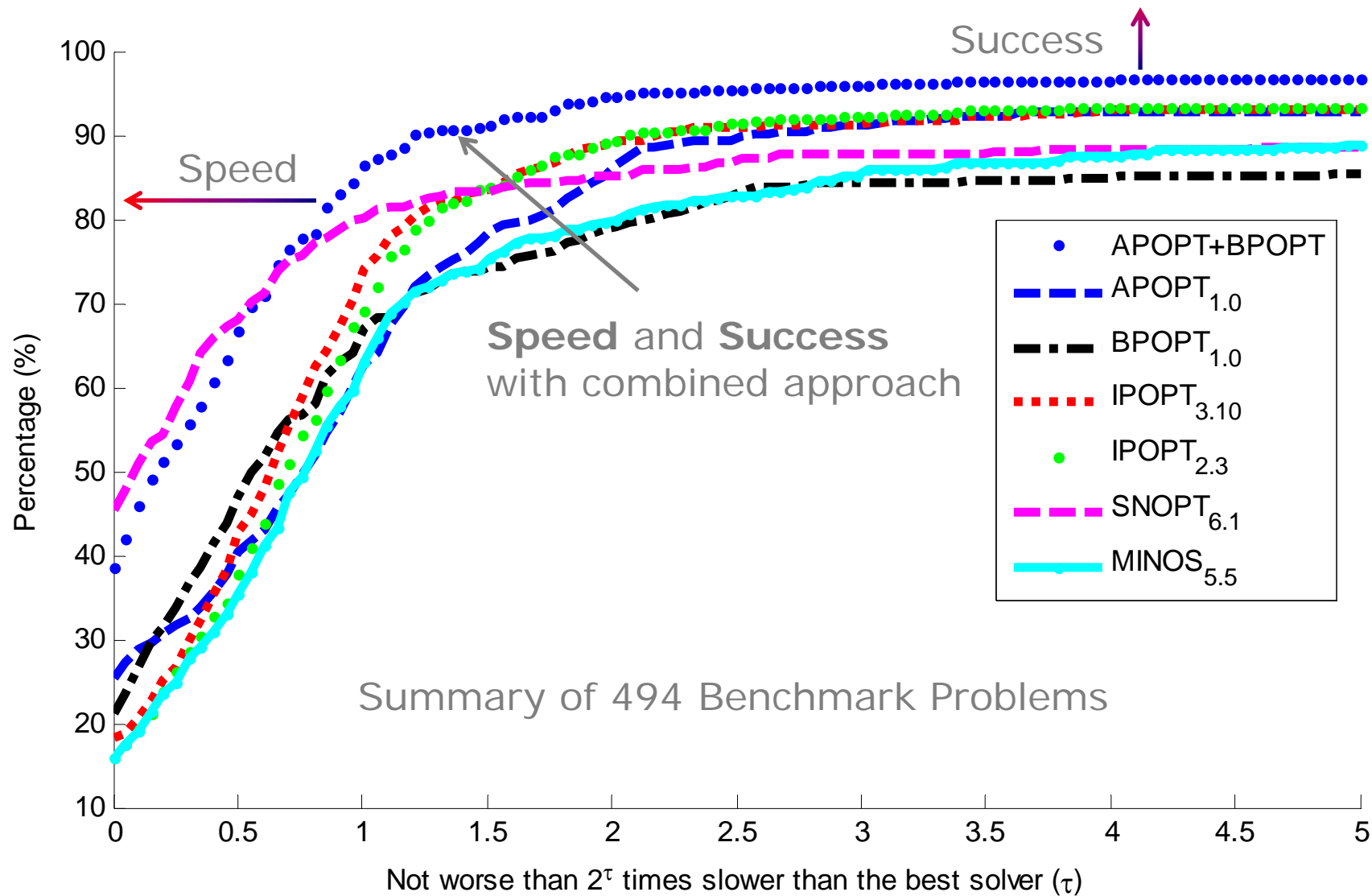
Solid Oxide Fuel Cell (SOFC)



Toolbox for Object Oriented Modeling in MATLAB, Simulink, and Python

Advanced tools are required for collaborative modeling and high performance computing

Optimization Benchmark



Survey of DAE Solvers

<u>Software Package</u>	<u>Max DAE Index</u>	<u>Form</u>	<u>Adaptive Time Step</u>	<u>Sparse</u>	<u>Partial-DAEs</u>	<u>Simultaneous Estimation / Optimization</u>
APMonitor	3+	Open	No	Yes	Yes	Yes
DASPK / CVODE / Jacobian	2	Open	Yes	No	No	No
gProms	1 (3+ with transforms)	Open	Yes	Yes	Yes	No
MATLAB	1	Semi-explicit	Yes	No	No	No
Modelica	1	Open	Yes	Yes	No	No

DAE = Differential and Algebraic Equation



Conclusions

- Powerful insights can be gained from modeling and data reconciliation over long periods of historical data
- When data, modeling, and optimization are combined, hidden savings are discovered through dynamic optimization
- Simulation and optimization can give realistic options to evaluate risks and rewards
- Simulation results can then be directly applied in practice to continuously monitor and optimize



Acknowledgments



Extra Slides

