



**EPRI**

ELECTRIC POWER  
RESEARCH INSTITUTE

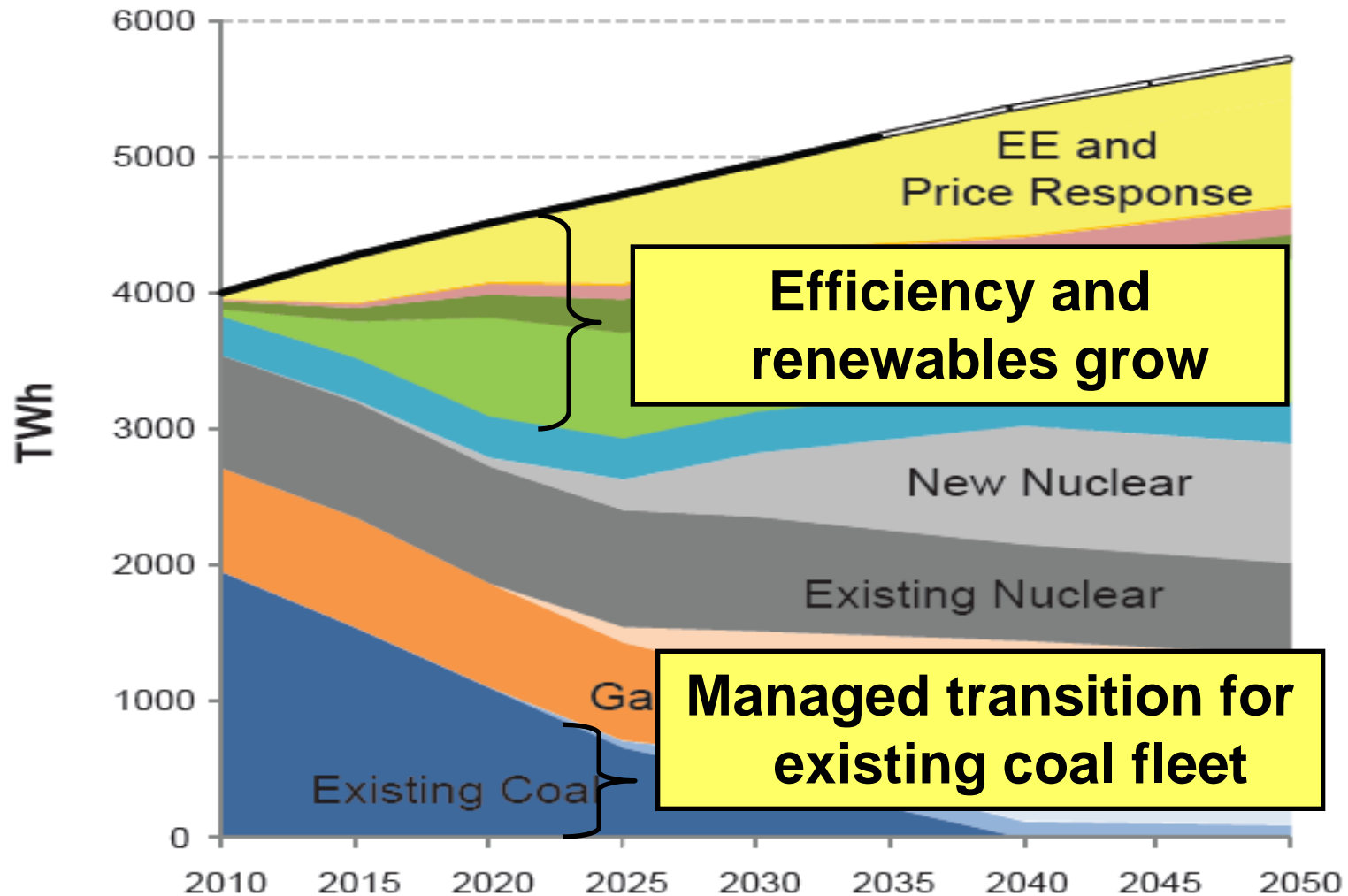
## **Risk Limiting Dispatch**

**EPCC, May 22-25, 2011  
Altea, Spain**

Pravin Varaiya (Berkeley), Felix Wu (HKU),  
Janusz Bialek, Chris Dent (Durham), Ram  
Rajagopal (Stanford), Robert Entriken  
(EPRI)

**Liang Min (EPRI)**

# Prism “Test Drive” Insights



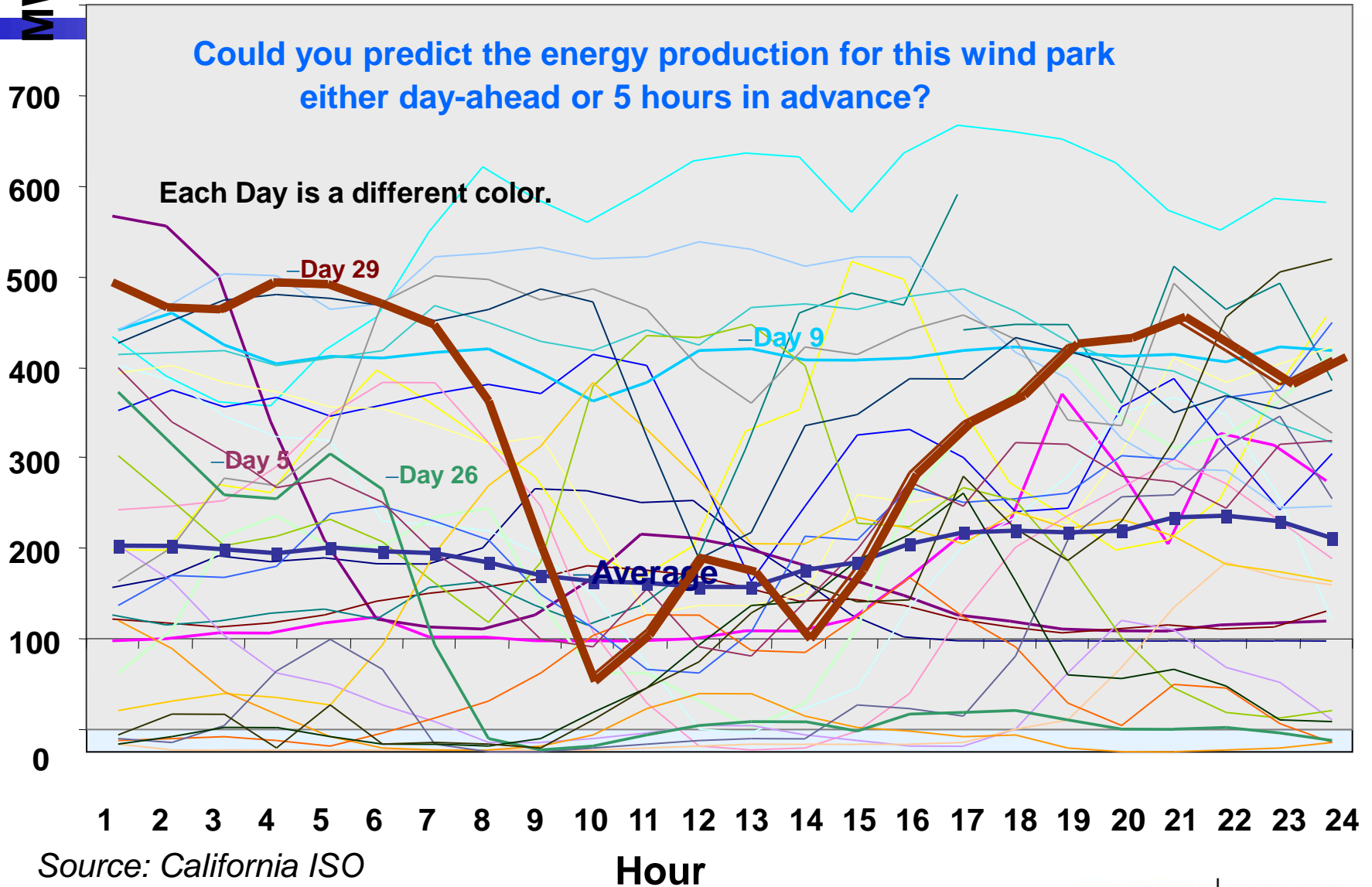
Source: EPRI Prism 2.0 Study

# What We Are Seeing...

- **Near term response to high CO2 price likely dominated by renewables, efficiency and natural gas**
  - Coal retirements offset by new renewables, efficiency
  - Natural gas fills any remaining demand
- **Wind integration costs significant at high penetration**
  - New balancing resources required (transmission, storage, smart grid, PHEVs)
  - Cycling impacts on thermal fleet -> increased O&M
- **Longer term, nuclear and CCS will be important**
  - Without them, rely on more costly renewables, efficiency

# Tehachapi Wind Generation in April – 2005

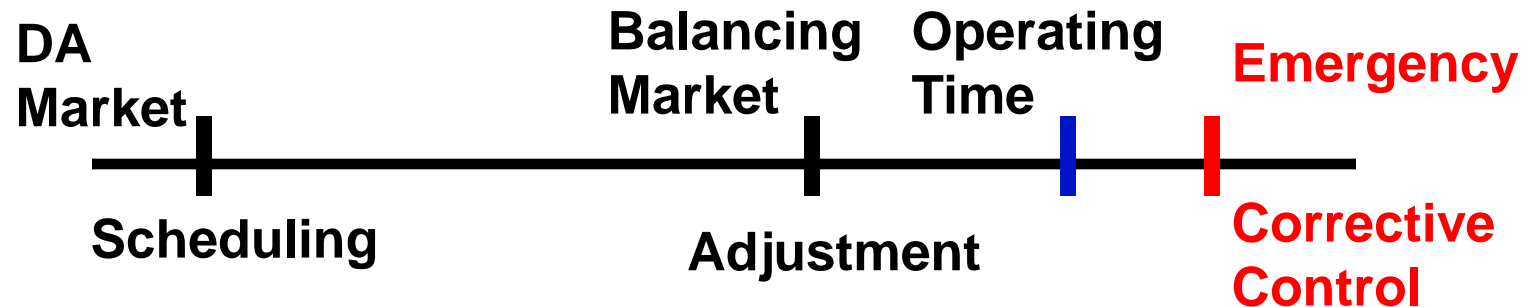
MW



Source: California ISO

Hour

# Worst-case Dispatch



## Constraints

- Power balance
- Operating limits
- (N-1) Contingencies

## Objective

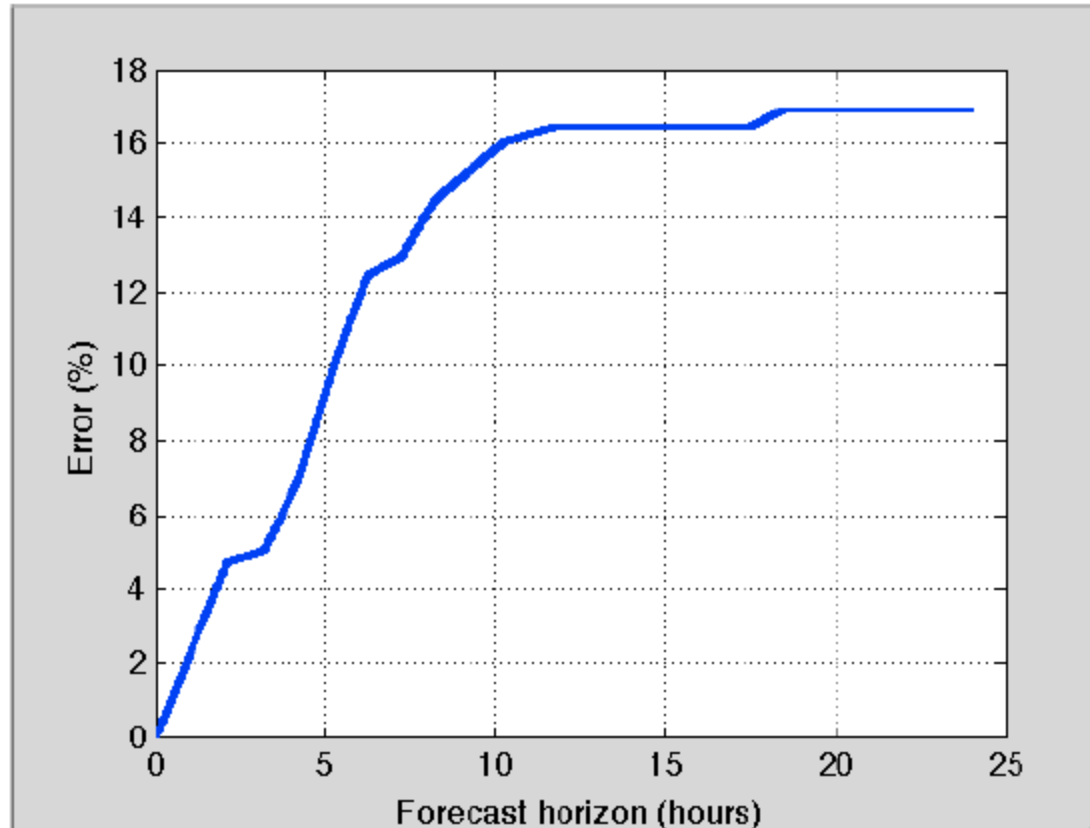
- Min. cost  
st. constraints

## Uncertainties:

- Load Forecasting
- Forced outage of equipment
- Increasing amounts of **Wind** and solar power present additional **HUGE** uncertainties for grid integration

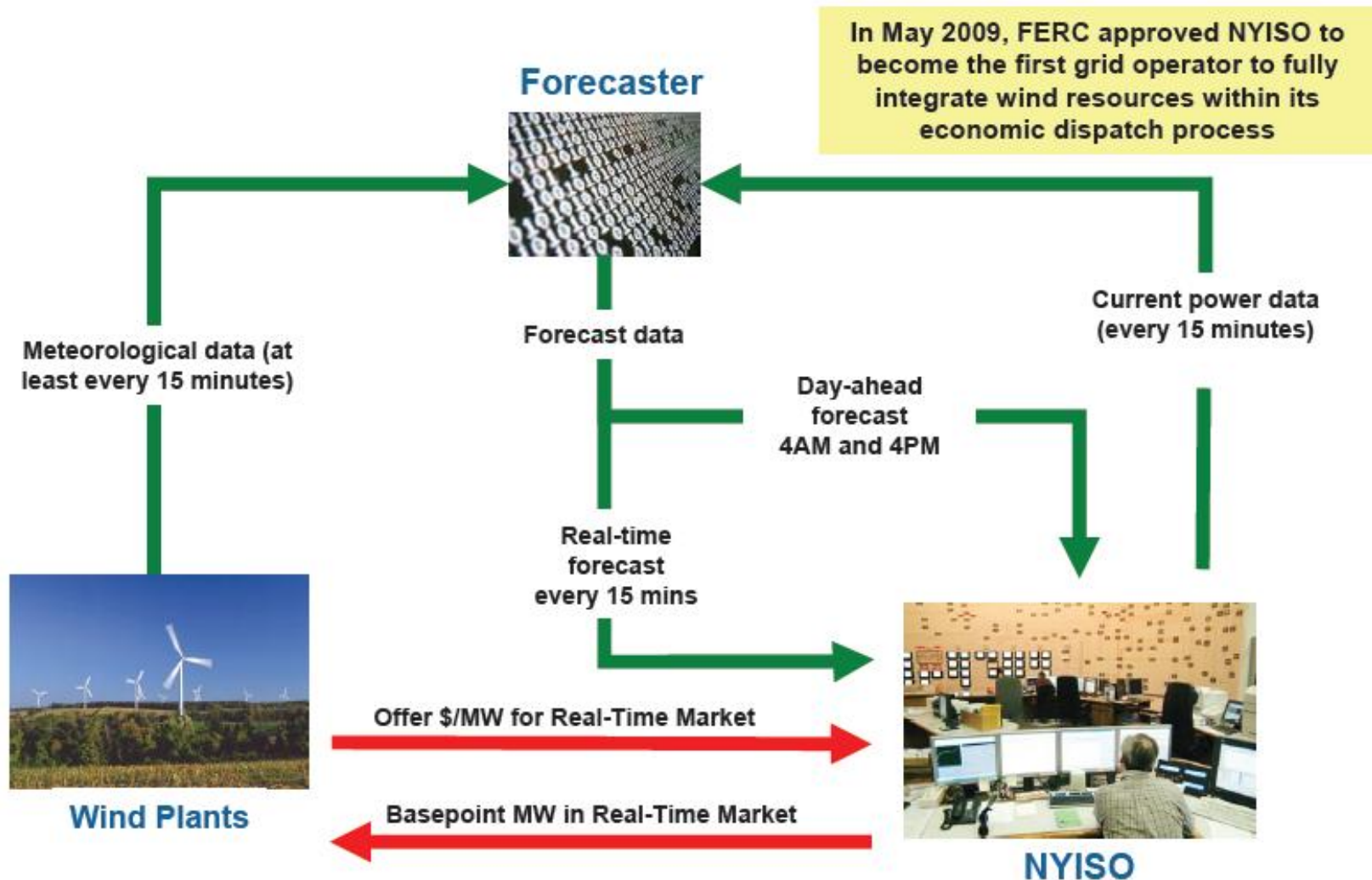
Source: from Janusz, Pravin, and Felix's presentations

# Forecast Error vs. Forecast Horizon



*Source: this plot is taken from Iberdrola Renewables*

# Pioneering Wind Dispatch (NYISO)



Source: Rana Mukerji's presentation at EPRI's Summer Seminar, August 2010

# Dispatch Dilemma Facing CAISO

- The California ISO (CAISO) must purchase sufficient reserve capacity to meet the worst-case uncertainty in supply
- 2000-2010 reserve capacity averaged 5% of 50GW peak, or 2.5GW
- Errors in 24-hour forecasts of wind regarded by CAISO as “uncertain”
- Since all forecasts of wind >6 hours are unreliable, CAISO must treat all intermittent power as statistically unpredictable
- The result – Planned wind expansion to 25GW in 2020 will require 5-10GW of reserves
- The cost of the reserve becomes a subsidy to wind that is unsupportable
- Planned wind expansion will require alternative dispatch procedures

# Objective

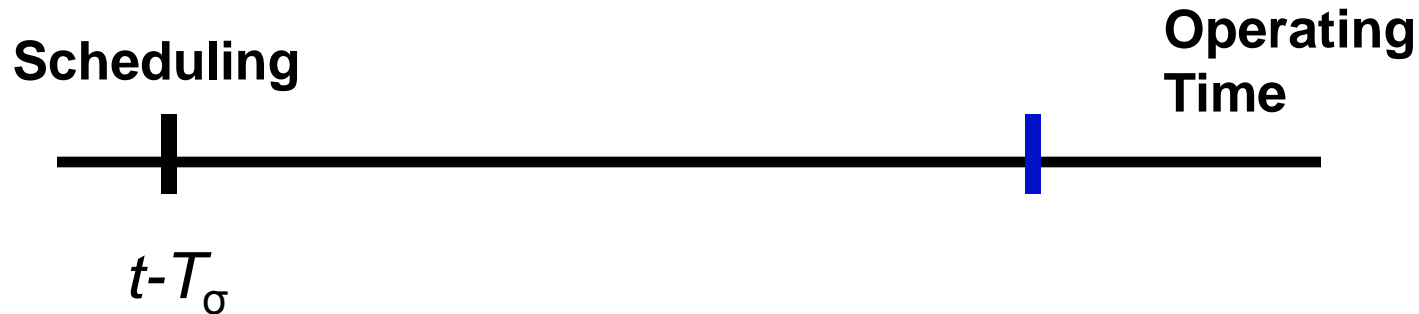
## Risk-Limiting Dispatch

- Modify dispatch procedures used today in many power systems that:
- Combine intermittent power generators – wind, solar – with reserves of different types, such as storage, demand-management, fast gas plants and EV, with different time scales of response
- Creates a new portfolio that is as reliable as thermal generators
- Reduces cost (subsidy) of reserves to support wind
- Requires smart grid infrastructure to handle data from expanded sensor network

# Alternative Dispatch Procedures Require

- Availability of sensors for more accurate prediction over shorter time periods
- Stochastic models that enable reliability assessment and efficient scheduling
- Risk analysis of the random characterization of new technologies
  - Renewables
  - Storage
  - Demand-response

# Risk-Limiting Dispatch



## Scheduling:

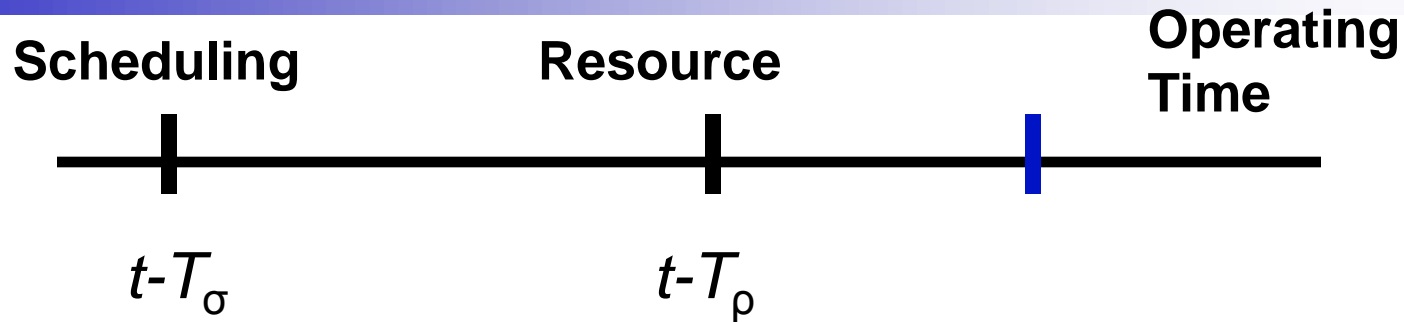
- Decision  $u_\sigma$ : Generation and demand
- Max objective such that the **RISK** of not meeting operating constraints is less than  $(1-p^*)$  based on information  $y_{t-T_\sigma}$  available at scheduling time

$$\min E(\text{cost})$$

$$\Pr\{g(x(t), u_\sigma) = 0, h(x(t), u_\sigma) \leq 0 | y_{t-T_\sigma}\} \geq p^*$$

Source: from Janusz, Pravin, and Felix's presentations

# Risk-Limiting Dispatch



## Resource:

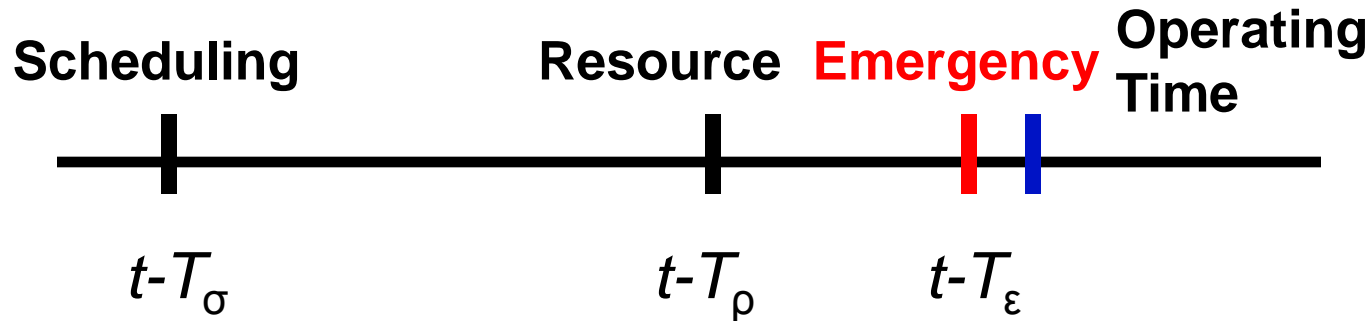
- Decision  $u_\rho$ : Generation, storage, and demand response
- Max objective such that the **RISK** of not meeting operating constraints is less than  $(1-p^*)$  based on information  $y_{t-T_\rho}$  available at scheduling time

$$\min E(\text{cost})$$

$$\Pr\{g(x(t), u_\sigma, u_\rho) = 0, h(x(t), u_\sigma, u_\rho) \leq 0 | y_{t-T_\rho}\} \geq p^*$$

Source: from Janusz, Pravin, and Felix's presentations

# Risk-Limiting Dispatch



## Emergency:

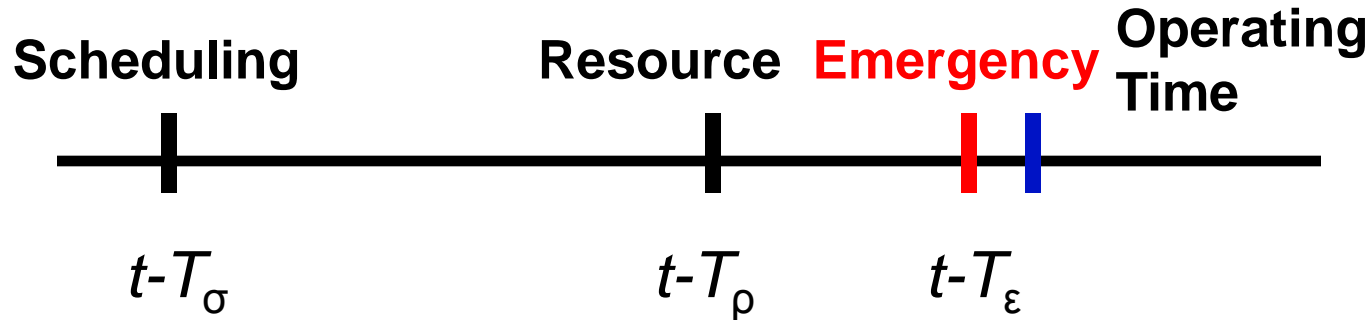
- Decision  $u_\epsilon$ : Generation, storage, and interruptible load
- The operating constraints must be satisfied.

$$\min E(\text{cost})$$

$$\Pr\{g(x(t), u_\sigma, u_\rho, u_\epsilon) = 0, h(x(t), u_\sigma, u_\rho, u_\epsilon) \leq 0 | y_{t-T_\rho}\} = 1$$

Source: from Janusz, Pravin, and Felix's presentations

# Risk-Limiting Dispatch



**The overall optimization problem for system operations:**

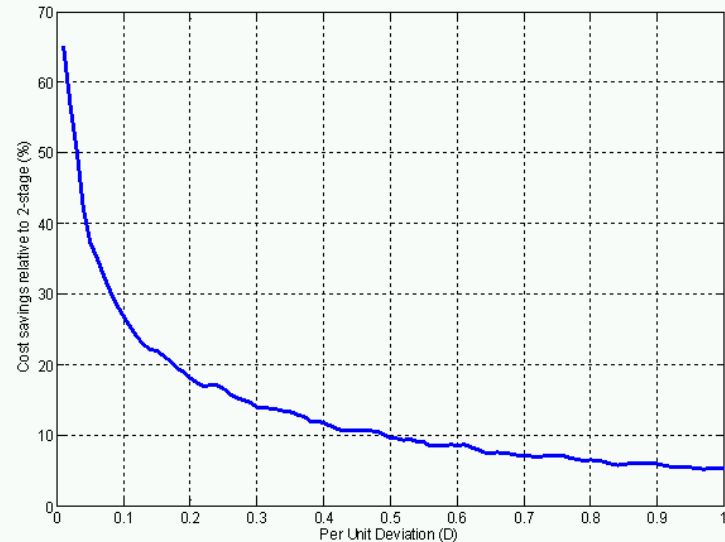
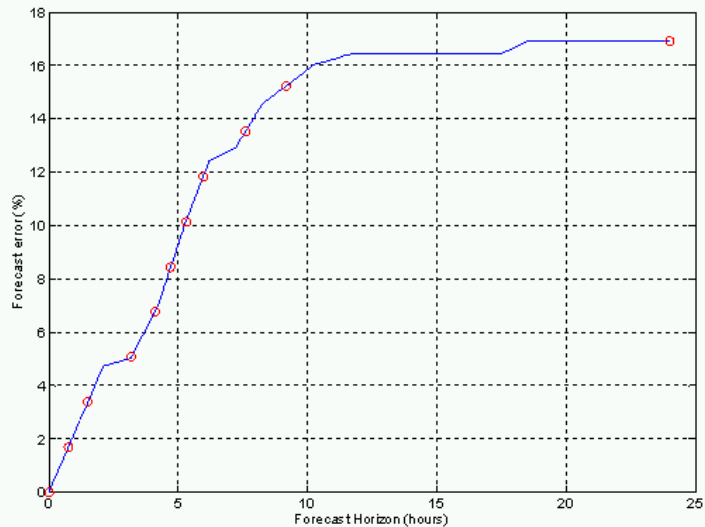
$$\min E f(x(t), u_\sigma, u_\rho, u_\epsilon)$$

$$\begin{array}{lll} P\{g(x(t), u_\sigma) = 0, & h(x(t), u_\sigma) \leq 0 & |y_{t-T_\sigma}\} \geq p^* \\ P\{g(x(t), u_\sigma, u_\rho) = 0, & h(x(t), u_\sigma, u_\rho) \leq 0 & |y_{t-T_\rho}\} \geq p^* \\ P\{g(x(t), u_\sigma, u_\rho, u_\epsilon) = 0, & h(x(t), u_\sigma, u_\rho, u_\epsilon) \leq 0 & |y_{t-T_\epsilon}\} = 1 \end{array}$$

Source: from Janusz, Pravin, and Felix's presentations

# Increasing the Opportunities to Adjust

## Relative savings of 10-stage vs 2-stage strategy



**$(2\text{-stage cost} - 10\text{-stage cost})/10\text{-stage cost}$**

Three strategies are compared:

1. 2-stages: one can purchase only in stages 1 (24-ahead) and 10 (real-time);
2. 10-stages: one can purchase at all of 10 stages;

# Increasing the Opportunities to Adjust

- System flexibility is the key attribute needed to respond to uncertainties
- The more opportunities system operators have to adjust supply and demand resources the greater the financial benefits
- The key is finding the optimal frequency and timing of resource adjustments
- Benefits can be quantified
- The frequency and timing of iterative adjustments be brought increasingly closer to the scenario arising from “perfect information

# Summary

- Current practice of worst-case dispatch requires subsidies for renewable sources and demand response
- Better wind forecasting
- More refined control suggest shift to risk-limiting dispatch
- Rapid coordination (both preventive and corrective) with demand response and energy storage