



CMU - FUTURE ENERGY SYSTEMS: EFFICIENCY, SECURITY, CONTROL

# **Incorporating Wind into a Natural-gas Turbine Baseload Power System Increases NO<sub>x</sub> and CO<sub>2</sub> Emissions from the Gas Turbines**

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# Today I will discuss

- Background and Motivation
- Research Question
- Approach
  - Actual wind data
  - Actual emissions data from two types of natural-gas turbines
- Model Construction
  - General Electric LM6000 turbine
  - Siemens-Westinghouse 501FD turbine
- Results
- Implications

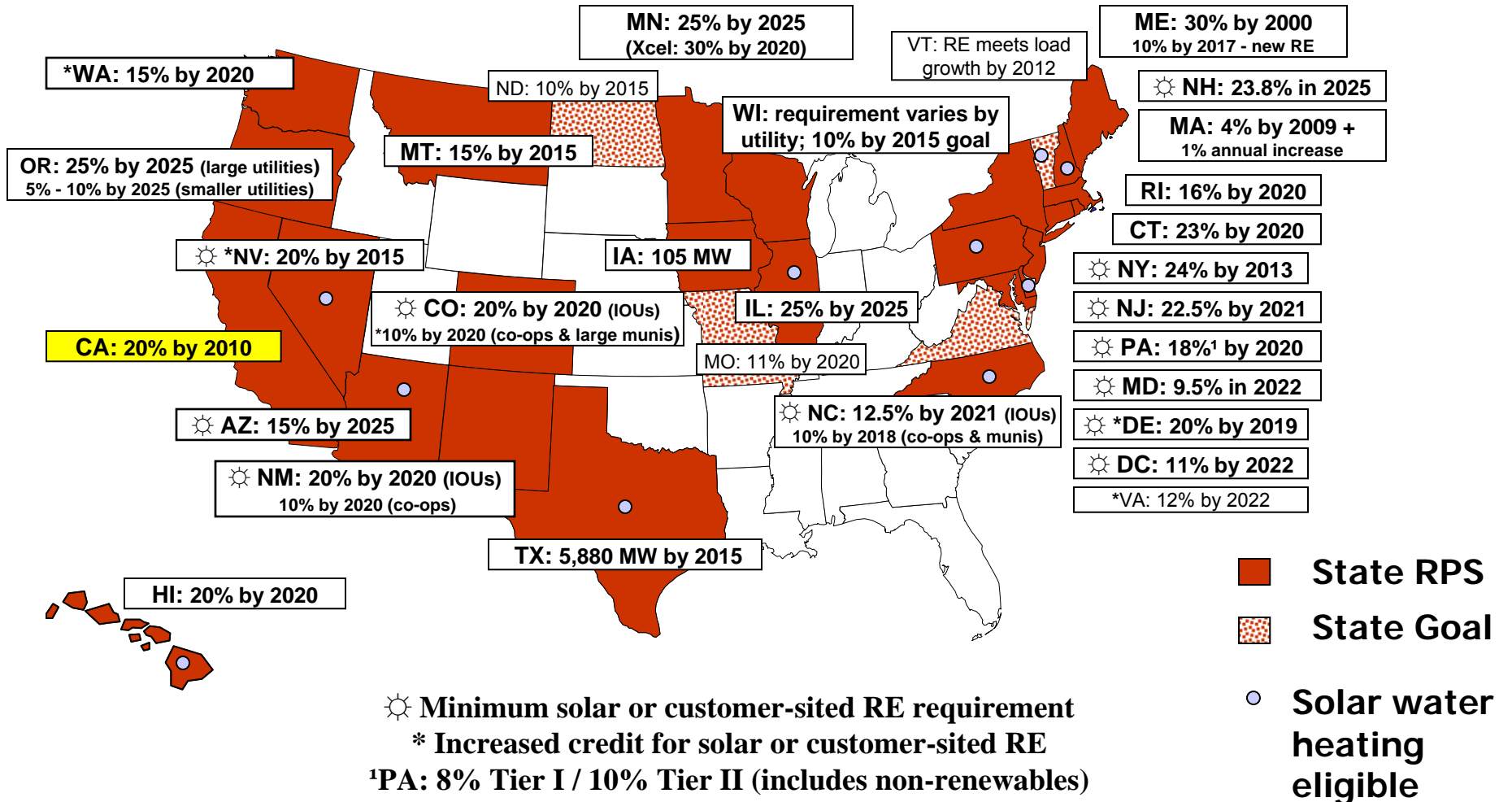




# Renewables Portfolio Standards

DSIRE: [www.dsireusa.org](http://www.dsireusa.org)

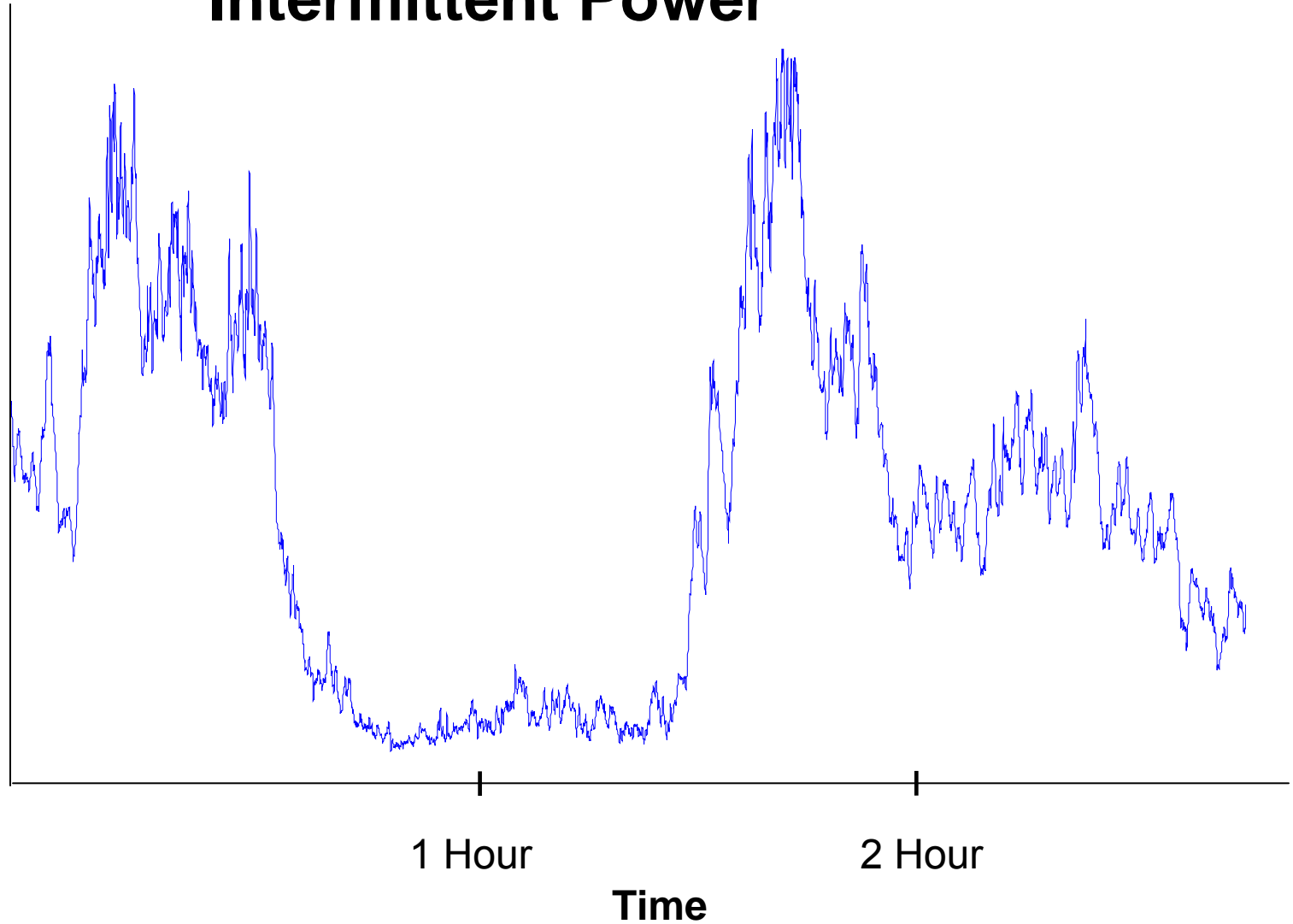
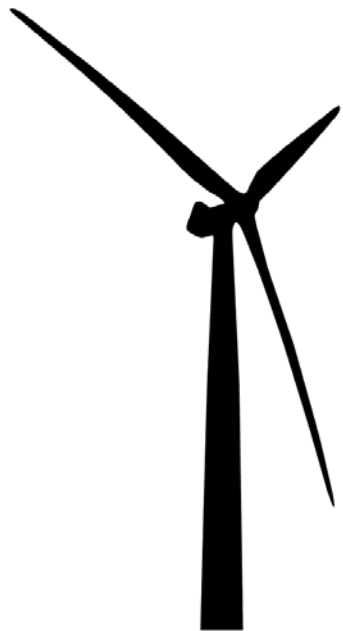
September 2007





# Intermittent Power

Power





## Research Question

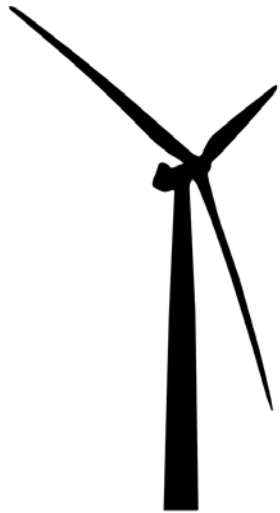
Does operating one or more gas turbines to fill in intermittent wind power result in increased  $\text{NO}_x$  and  $\text{CO}_2$  emissions compared to full-power steady-state operation of natural-gas turbines?





# Approach

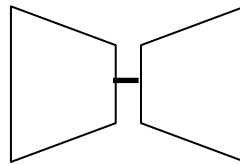
Variable Power



+

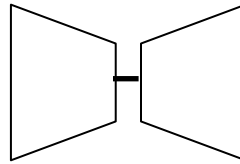
Compensating Power

1



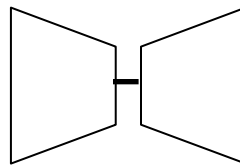
+

2



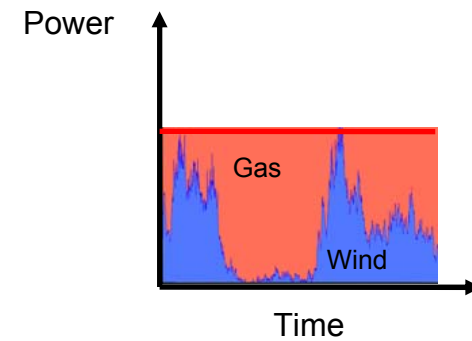
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n

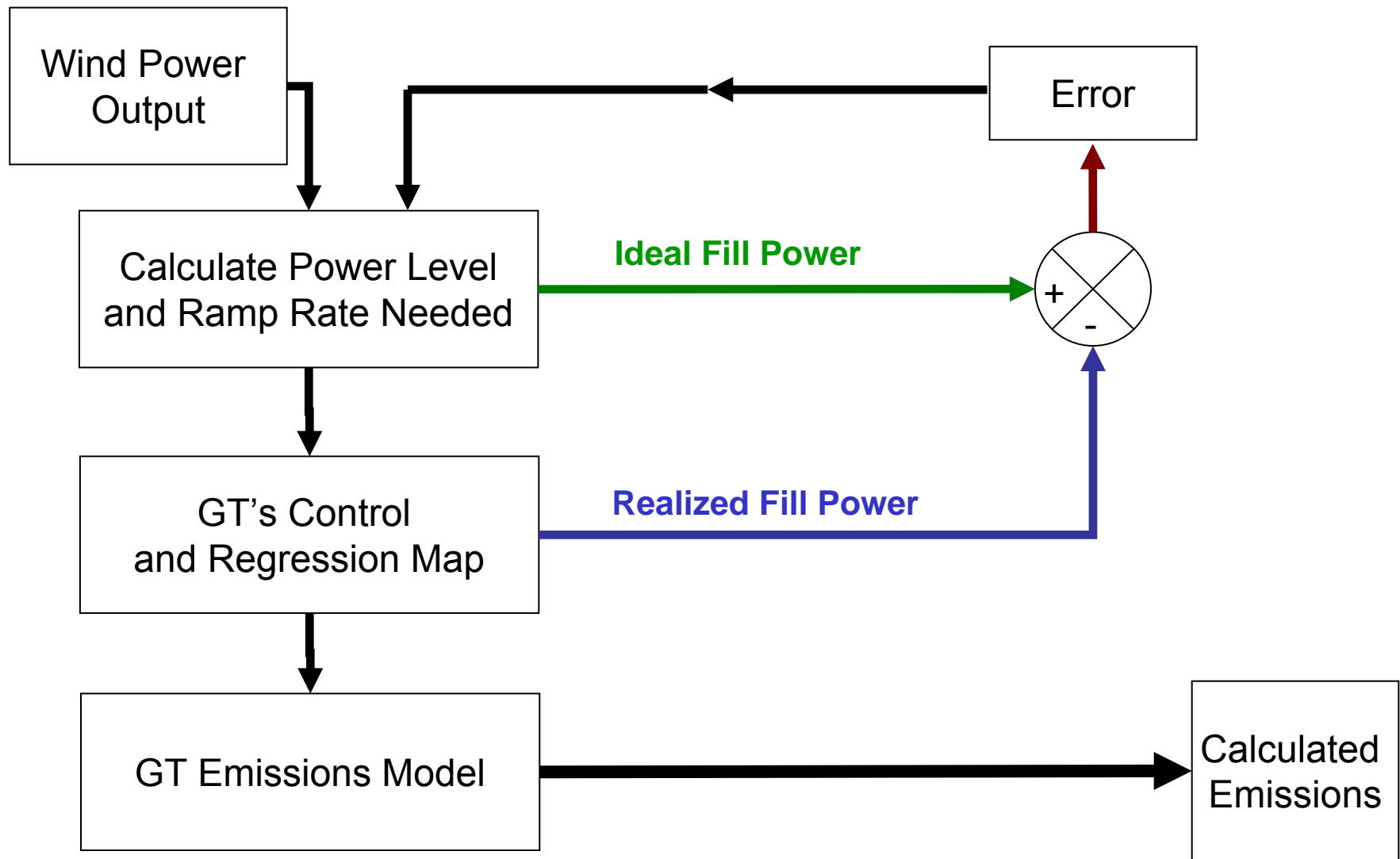


=

Firm Power



# Approach





# Objective Function for Baseload Plant

$$\text{Min } \varepsilon_{\text{Total Power},i} = \text{Min } \left| P_{\text{Total},i} - P_{\text{Target},i} - \varepsilon_{\text{Total Power},i-1} \right| \quad (1)$$

where:

$$\varepsilon_{\text{Total Power},i} \equiv \text{Error in Power Plant Output}$$

$$P_{\text{Target},i} \equiv \text{Expected Power Plant Output} \quad (2)$$

$$\begin{aligned} P_{\text{Total},i} &\equiv P_{\text{Wind},i} + n \cdot P_{\text{GasTurbine},i} \\ &\equiv \text{Total Power Generated} \end{aligned} \quad (3)$$

$$i \equiv \text{time index} \quad (4)$$

$$n \equiv \text{Number of Gas Turbines}$$

$$\dot{P}_{\text{GasTurbine}} \equiv \frac{dP_{\text{GasTurbine}}}{dt} \equiv \text{Ramp rate} \quad (5)$$

subject to:

$$P_{\text{Total}} = \text{Constant} \quad (6)$$

$$P_{\text{Wind Max}} = n \cdot P_{\text{GasTurbine Max}} \quad (7)$$

$$0 < P_{\text{GasTurbine}} \leq P_{\text{Max}} \quad (8)$$

$$\dot{P}_{\text{Min}} \leq \dot{P}_{\text{GasTurbine}} \leq \dot{P}_{\text{Max}} \quad (9)$$





# Calculating Pollutant Mass Emissions of Baseload Plant

$$M_{Total} = \sum_{i=1}^k \frac{dM_i}{dt} \Delta t \quad (10)$$

where:

$$M_{Total} = \text{Total Mass of Pollutant Emitted} \quad (11)$$

$$\frac{dM_i}{dt} = f(P_{GasTurbine,i}, \dot{P}_{GasTurbine,i}) \quad (12)$$

= Mass Emission Rate of Gas Turbine for Time Period  $i$

$$\Delta t = \text{Time Interval of Data Set} \quad (13)$$

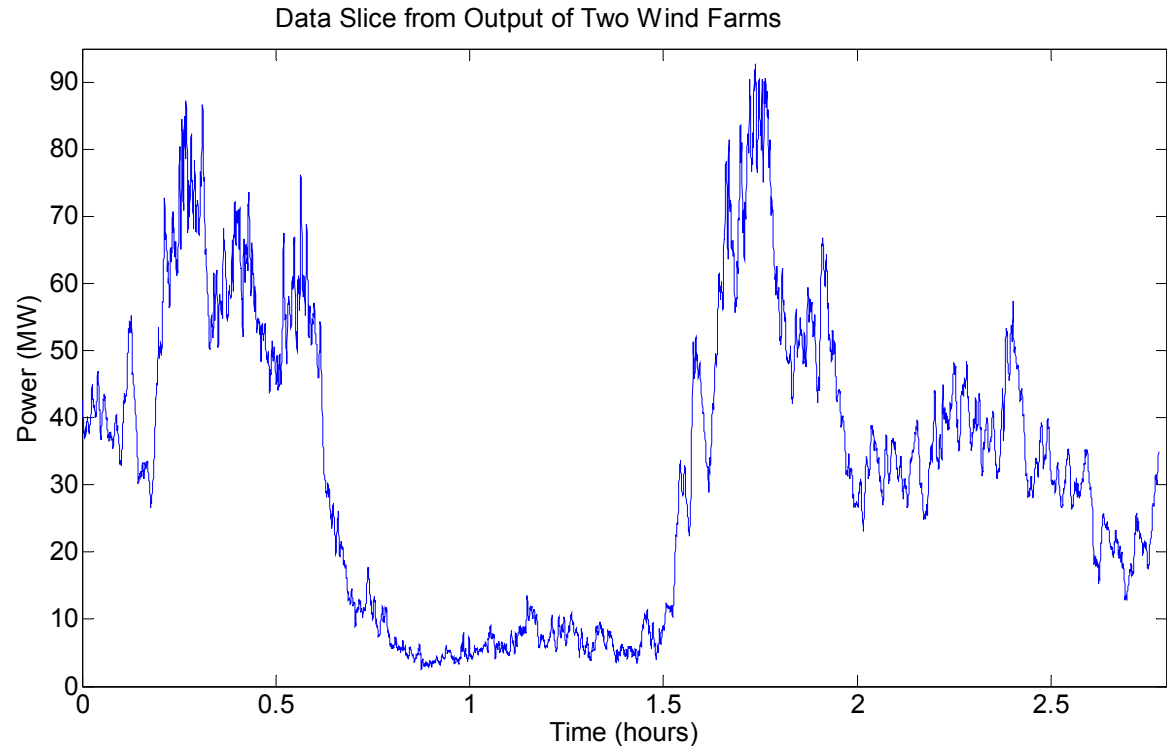
$$k = \text{Time Length of Data Set} \quad (14)$$





# Wind Data Obtained

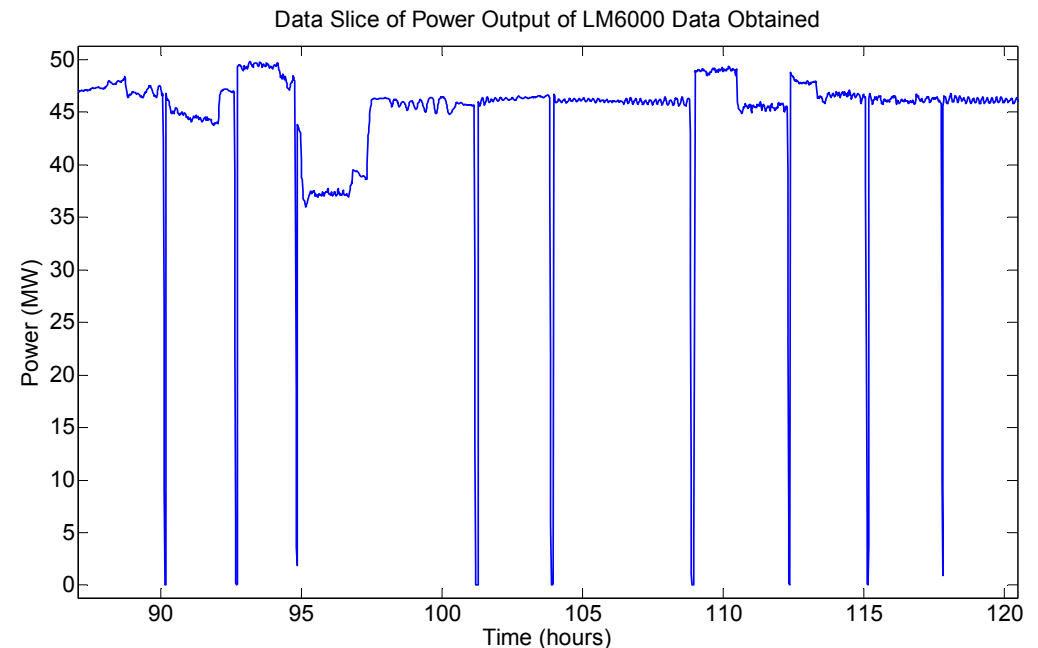
- Wind Data
  - Output of 3 existing wind farms
    - *Eastern*
    - *Southern Great Plains*
    - *Central Great Plains*
  - 1 to 10 seconds resolution
  - 32 total days of data
  - From anonymous source





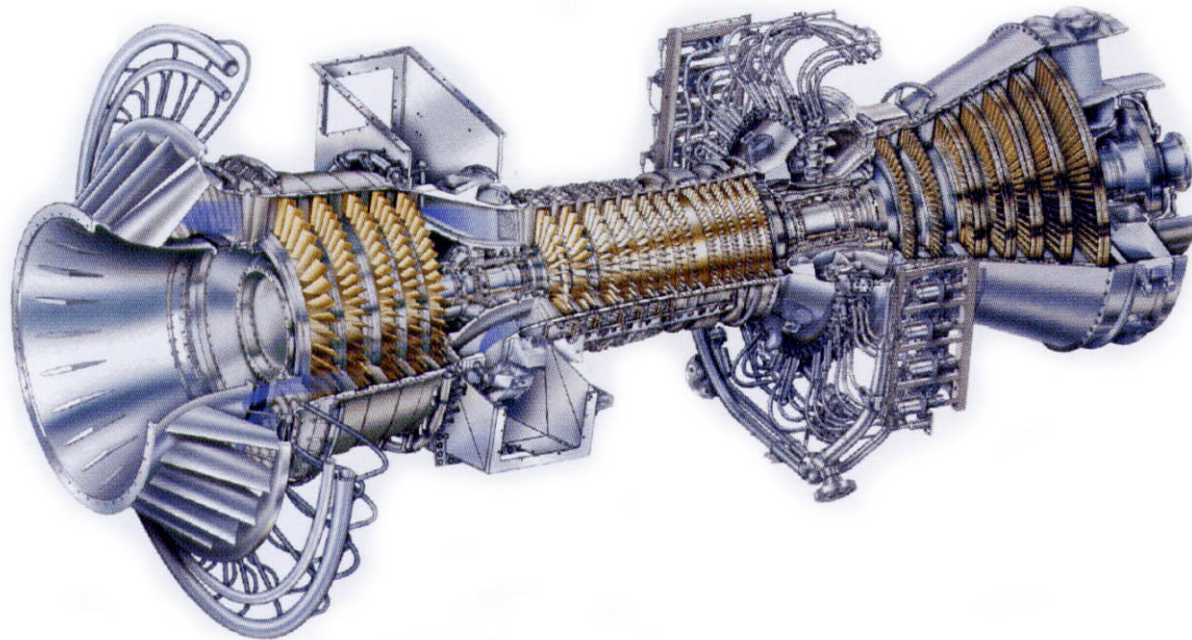
# Gas Turbine Data Obtained

- NO<sub>x</sub> emissions & heat rate for 7 CTs & 1 NGCC
  - 1 minute resolution
  - Ranges from 38 days of data to 135 days of data
  - CTs are LM6000s
  - Have
    - Gas flow (HSCFH)
    - Load (MW)
    - NO<sub>x</sub> ppm and lbs
    - NO<sub>x</sub> ppm corrected to 15% O<sub>2</sub>
    - O<sub>2</sub> %
    - Heat rate (mBtu/hr)
  - From anonymous source





## GE LM6000 – Rated 40-45MW



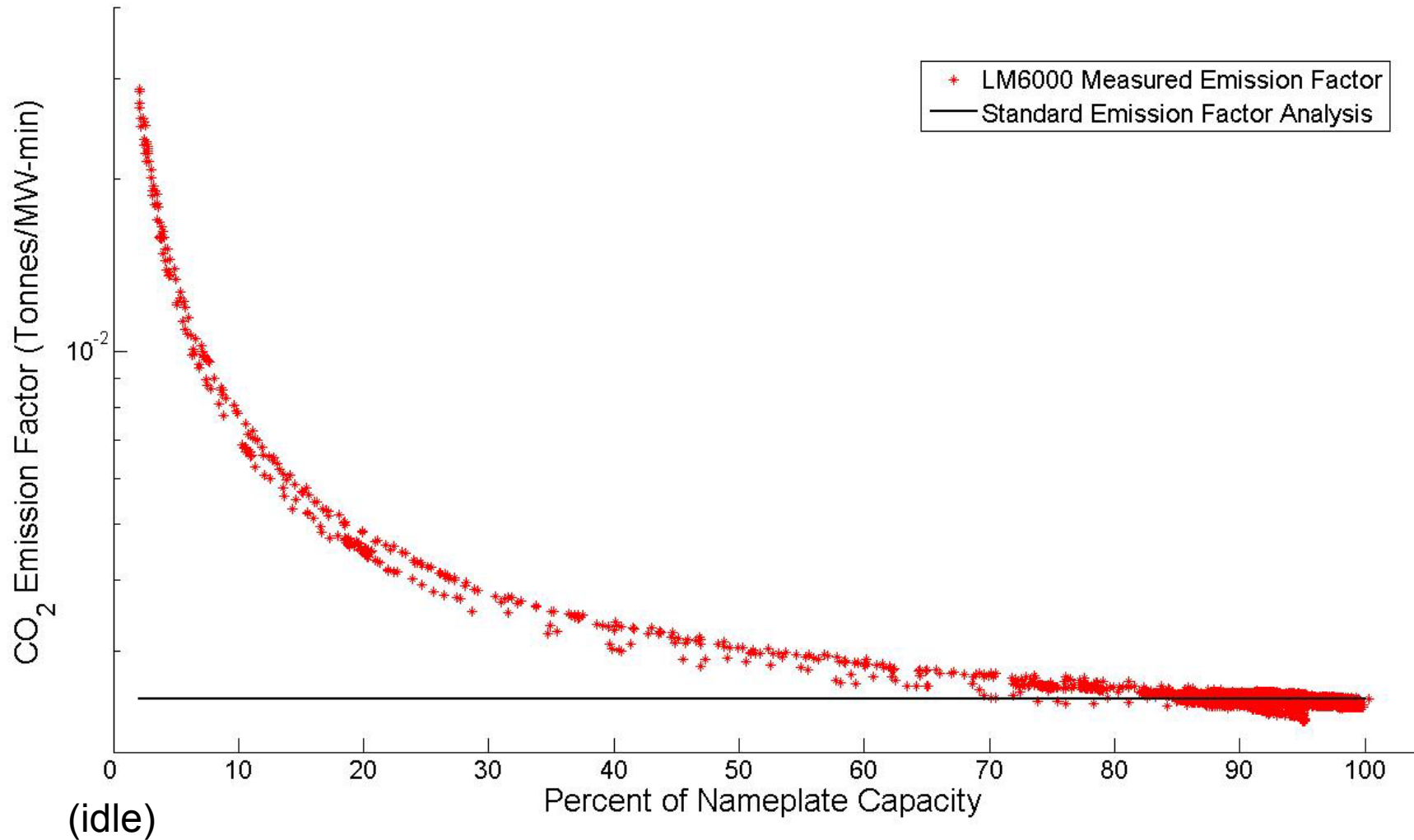
Source: [www.sealegacy.com](http://www.sealegacy.com) Oct. 4<sup>th</sup>, 2007





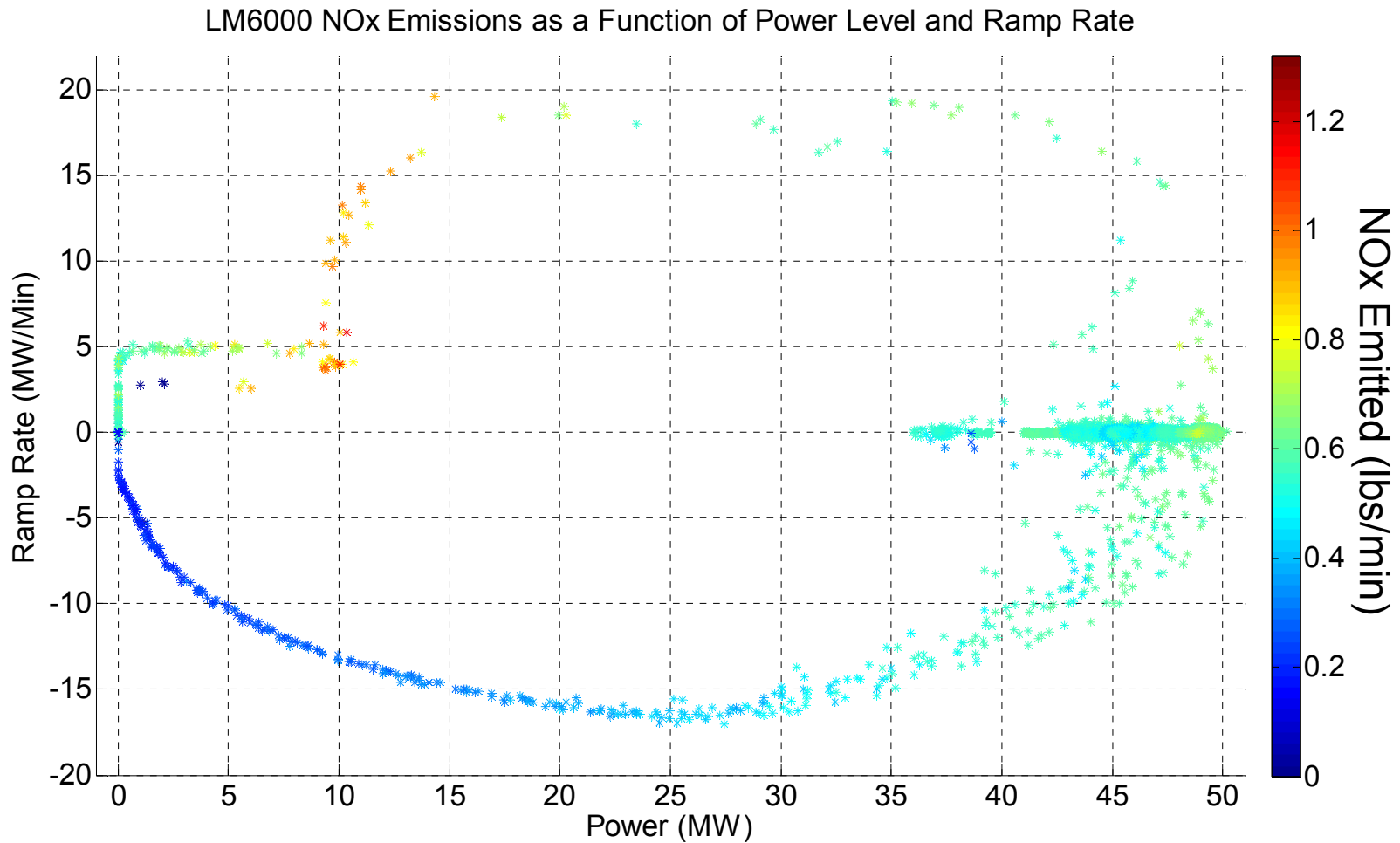
# CO<sub>2</sub> Emissions vs Power for LM6000

LM6000 - Measured CO<sub>2</sub> Emission Factor Versus Power Output Range



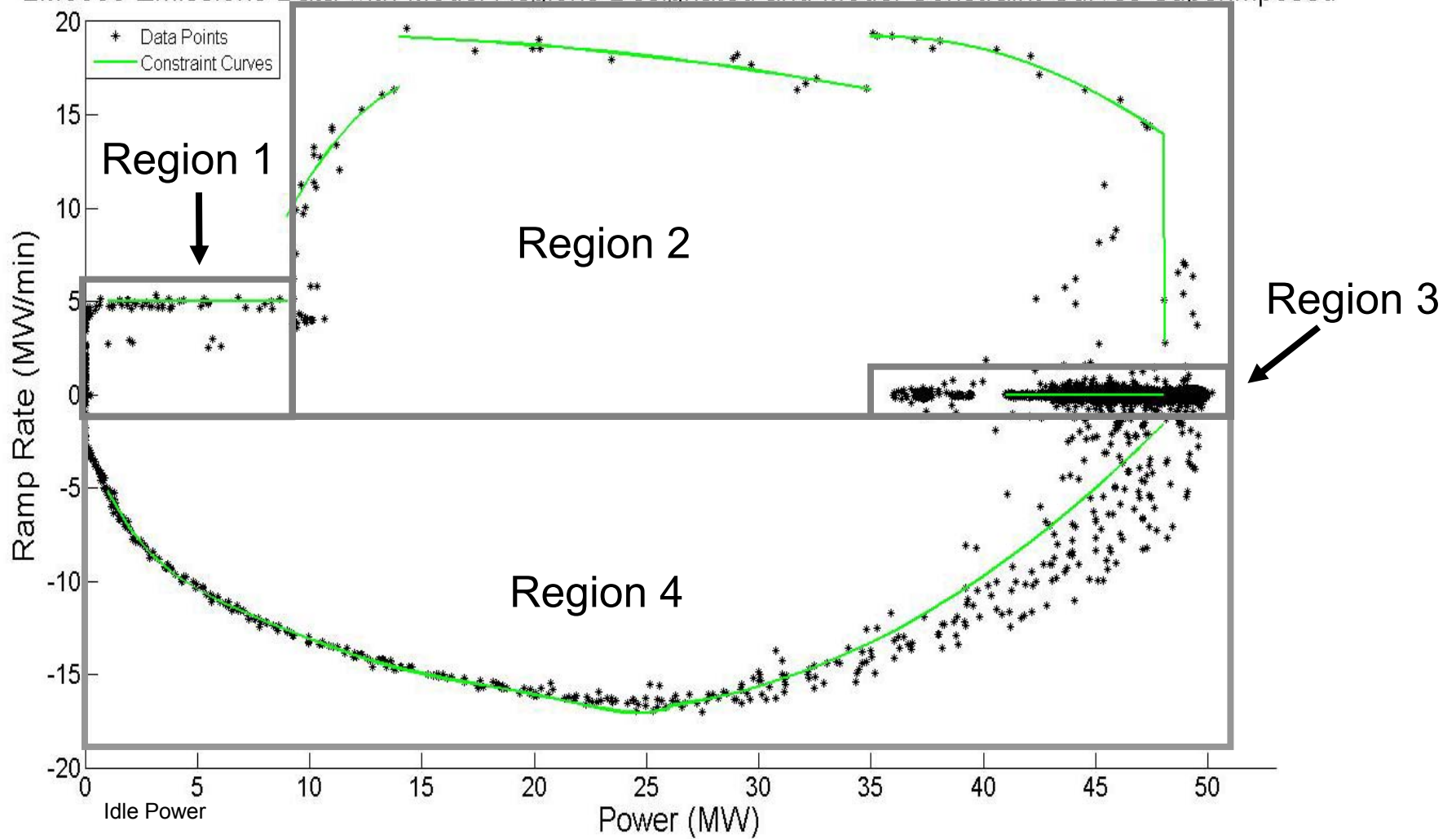


# Model Construction - Regression Analysis





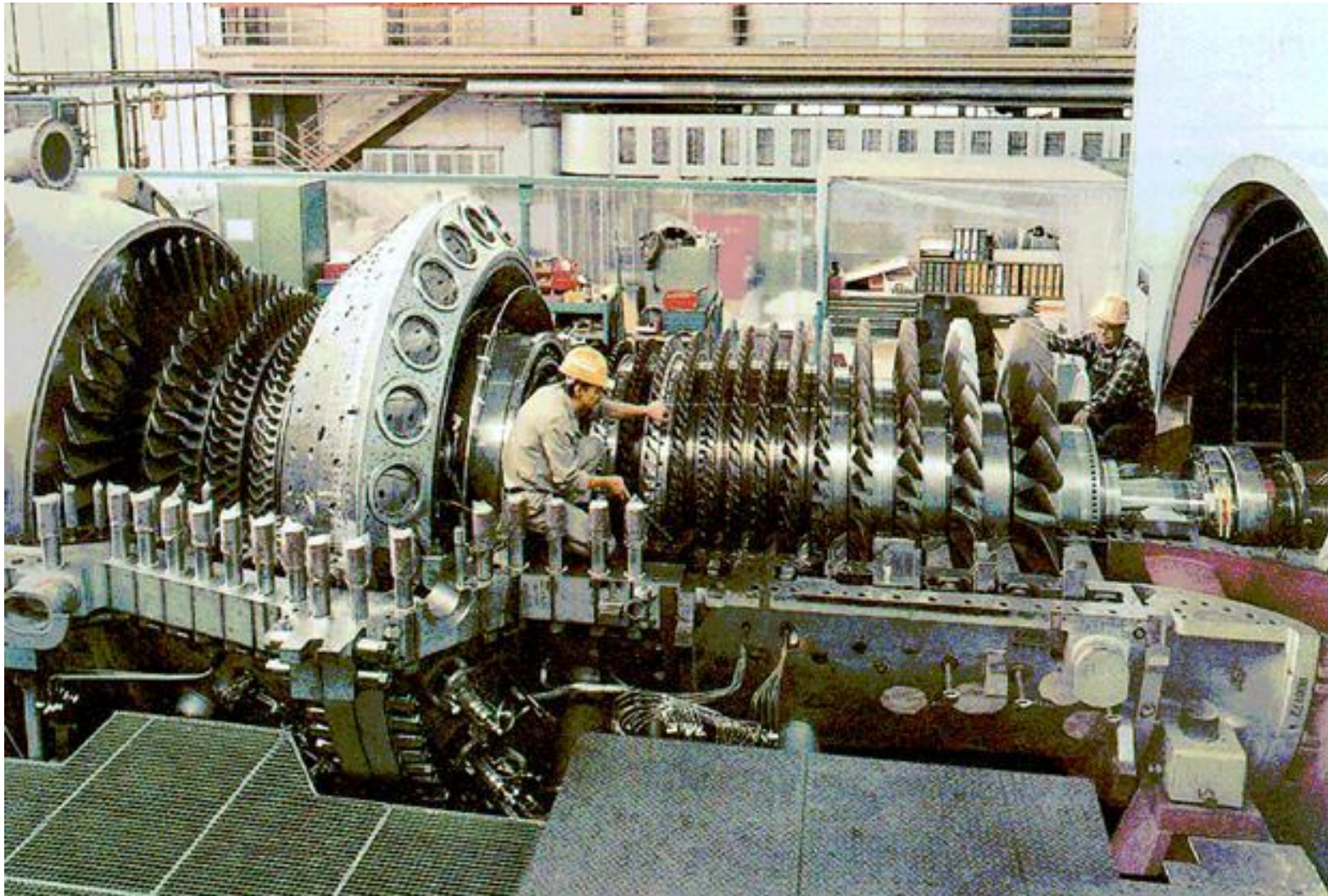
LM6000 Emissions Data with Model Regions Designated and Model Constraint Curves Superimposed







# Siemens-Westinghouse Combined-Cycle Turbine – Rated 200 MW

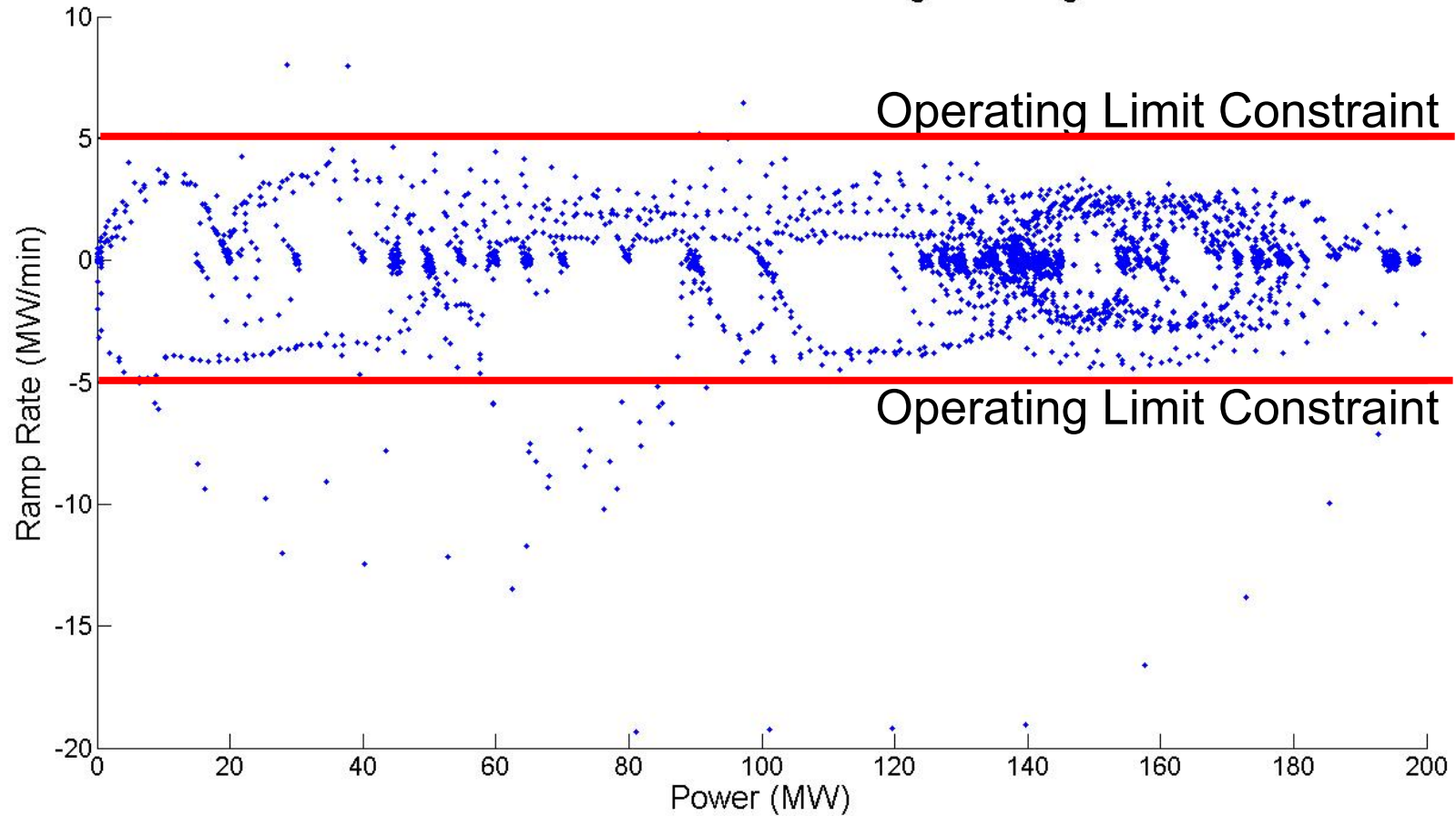


[www.summitvineyardllc.com](http://www.summitvineyardllc.com)





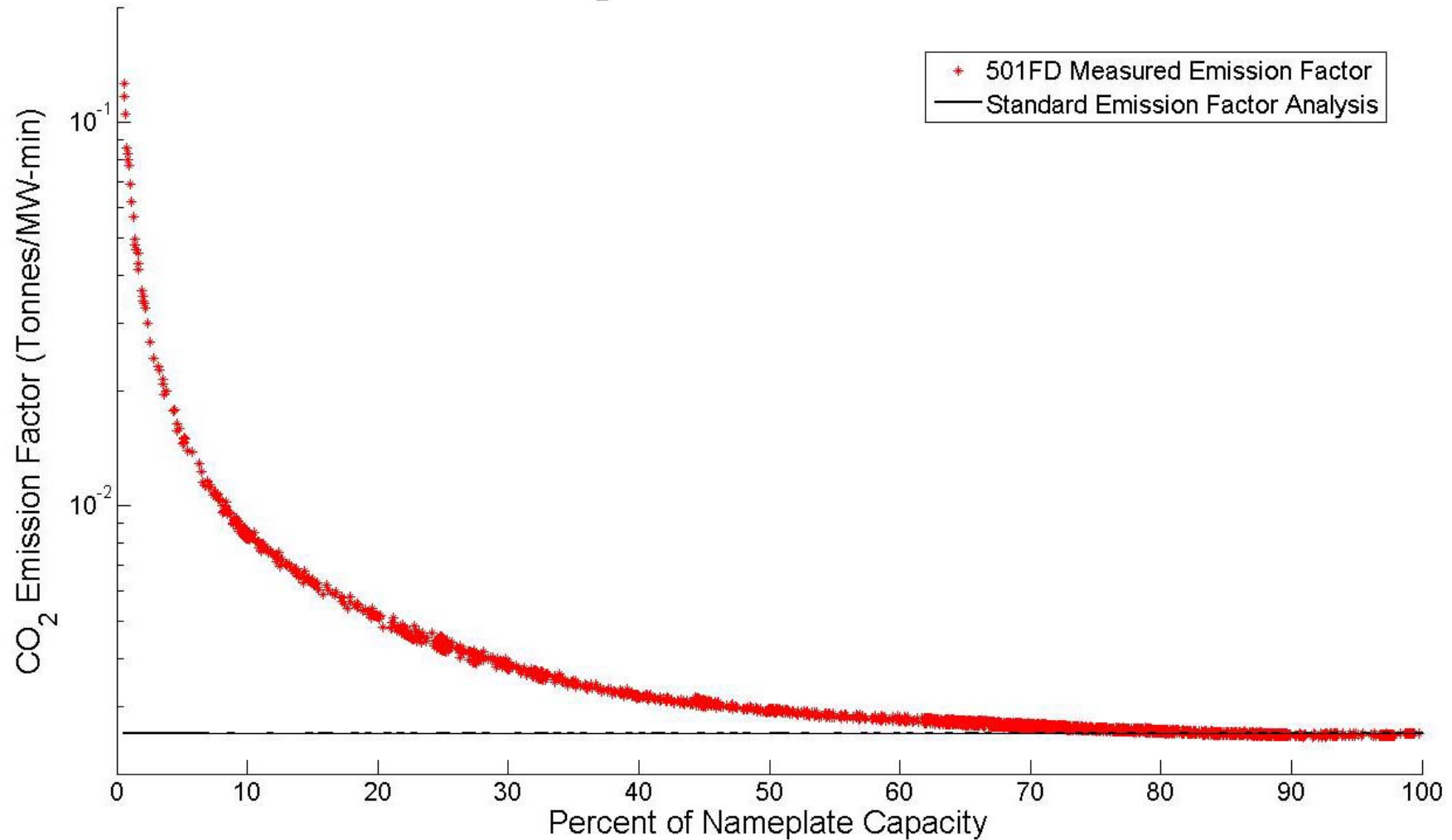
501FD Emissions Data with Model Regions Designated





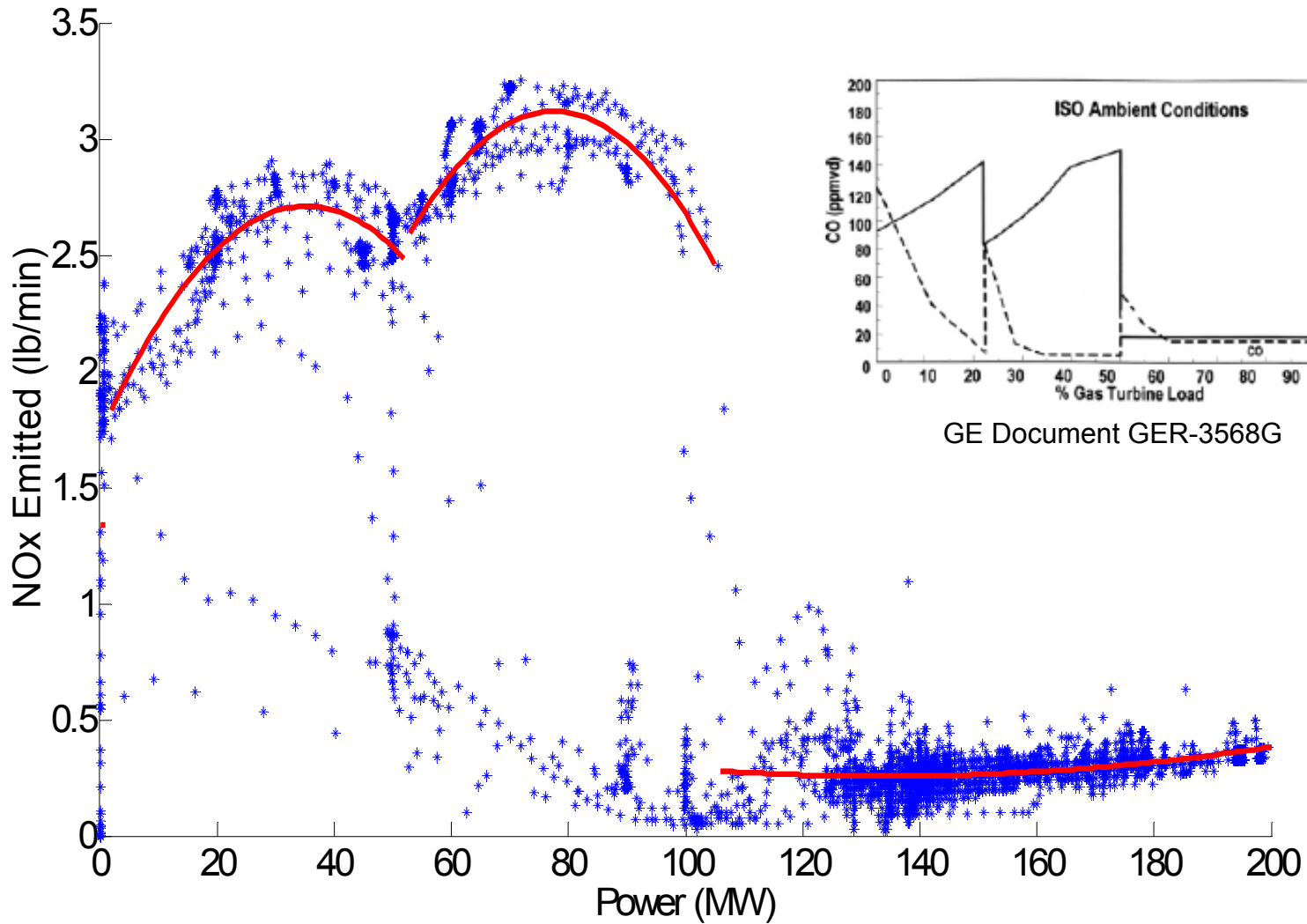
# CO<sub>2</sub> Emissions vs Power for SW 501FD

501FD - Measured CO<sub>2</sub> Emission Factor Versus Power Output Range





# Siemens-Westinghouse - Regression Analysis





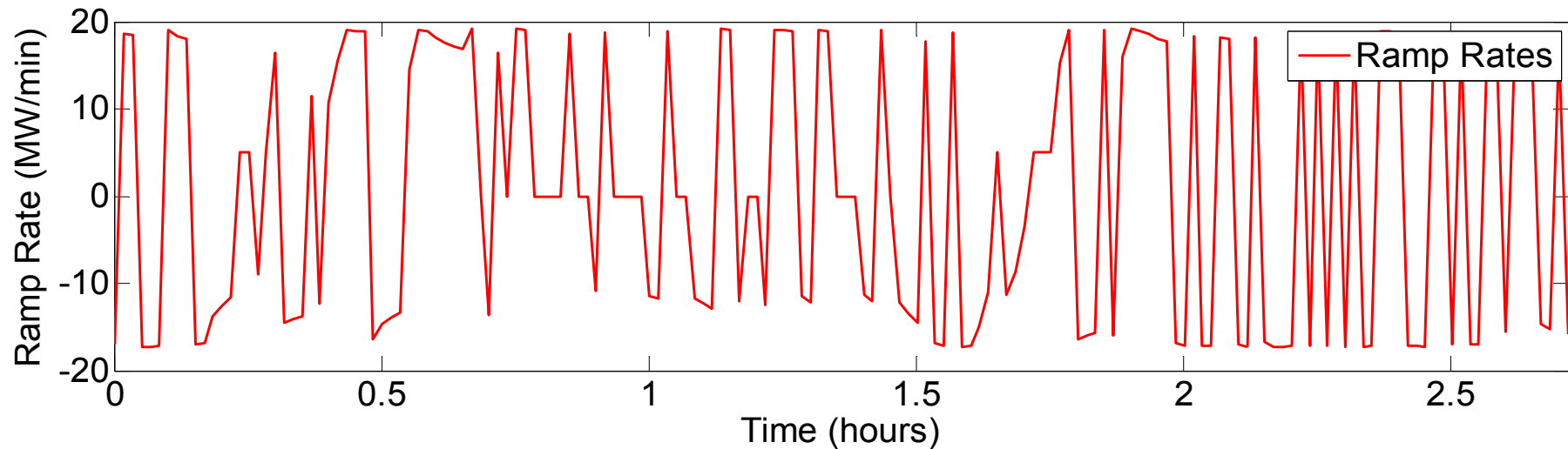
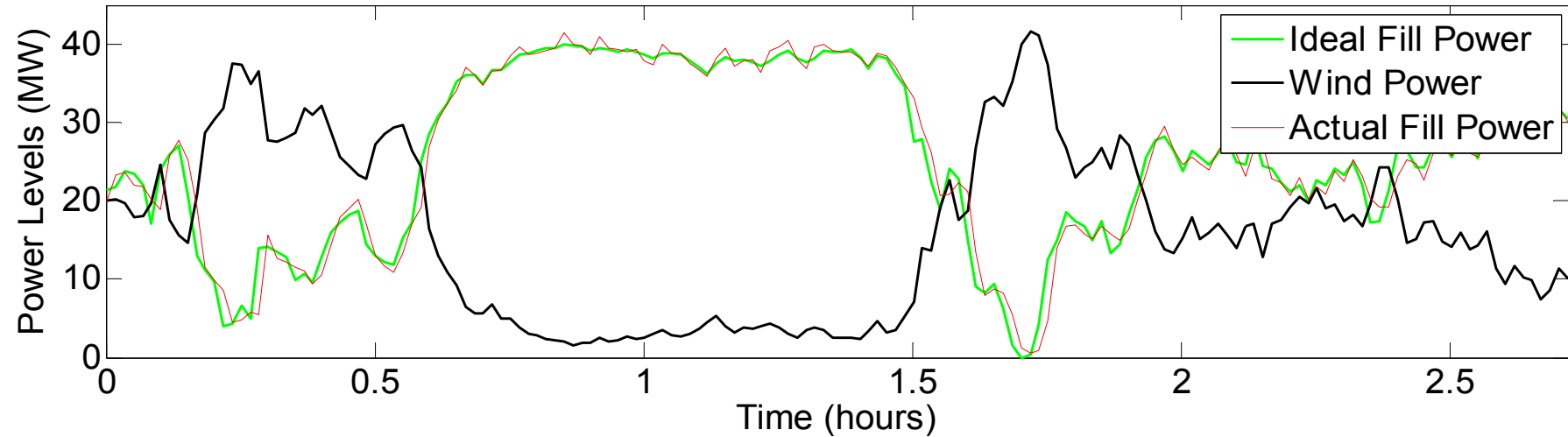
# Results





# Results (1) – LM6000

Wind + CT Operating Parameters





# Expected Emission Reductions Calculation

$$\text{Expected Emission Reduction} = 100 * \left[ \frac{M_{Total, Natural Gas} - M_{Total, Wind + Natural Gas}}{M_{Total, Natural Gas} * \text{Wind Penetration}} \right]$$

## Example Calculations

If *Wind Penetration* is 0.5, then expect  $M_{Total, Wind + Natural Gas} = 0.5 \cdot M_{Total, Natural Gas}$

$$\text{Expected Emission Reduction} = 100 * \left[ \frac{M_{Total, Natural Gas} (1 - 0.5)}{M_{Total, Natural Gas} * 0.5} \right] = 100\%$$

If *Wind Penetration* is 0.3, then expect  $M_{Total, Wind + Natural Gas} = 0.7 \cdot M_{Total, Natural Gas}$

$$\text{Expected Emission Reduction} = 100 * \left[ \frac{M_{Total, Natural Gas} (1 - 0.7)}{M_{Total, Natural Gas} * 0.3} \right] = 100\%$$





# Expected Emissions Reduction

## *Eastern Wind Farm*

<i>Turbine</i>	<i>Expected Emissions Reduction</i>	<i>Emissions Reduced</i>	<i>Mass Emitted by Wind + NG</i>
<b>LM6000 (CT)</b>			
NOx	<b>29%</b> <i>± 4%</i>	<b>290 lbs</b>	<b>8,300 lbs</b>
CO2	<b>80%</b> <i>± 1%</i>	<b>176 tons</b>	<b>1,595 tons</b>
<b>501FD (NGCC, DLN)</b>			
NOx	<b>-240%</b> <i>± 250%</i>	<b>1,500 lbs</b>	<b>6,400 lbs</b>
CO2	<b>76%</b> <i>± 1%</i>	<b>732 tons</b>	<b>6,968 tons</b>





# Expected Emissions Reduction

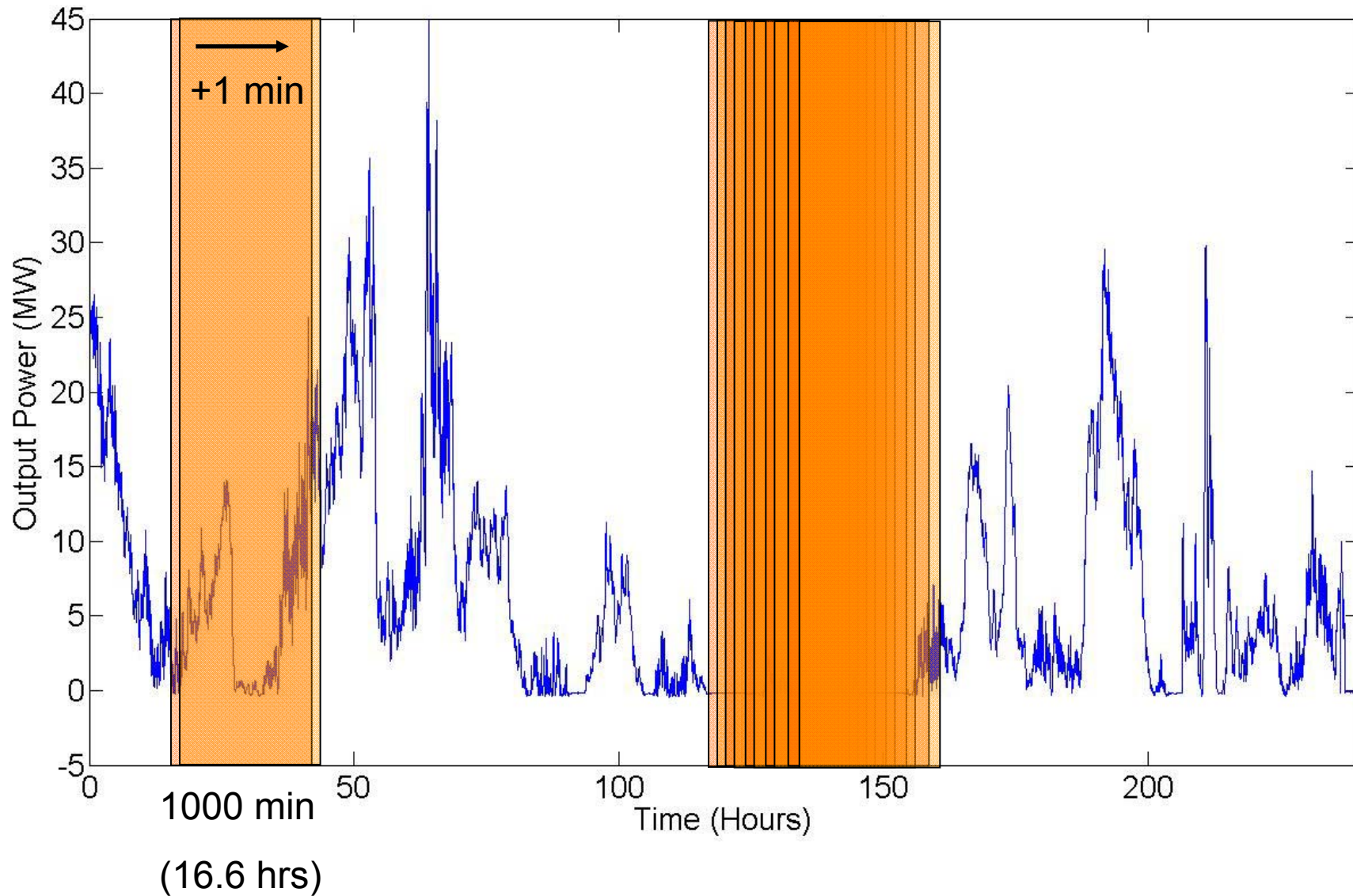
Wind Farm	Eastern	Southern Great Plains	Central Great Plains
<b>LM6000 (CT)</b>			
NOx	<b>29%</b> ± 4%	<b>21%</b> ± 3%	<b>31%</b> ± 4%
CO2	<b>80%</b> ± 1%	<b>77%</b> ± 1%	<b>77%</b> ± 1%
<b>501FD (NGCC, DLN)</b>			
NOx	<b>-240%</b> ± 250%	<b>-600%</b> + 100% -75%	<b>-530%</b> + 150% - 5%
CO2	<b>76%</b> ± 1%	<b>76.8%</b> ± .2%	<b>78.9%</b> ± 0.1%







# Generating Smaller Wind Data Sets





# Implications

- 1 MWh of wind energy **does not** eliminate 1 MWh of emissions
- Impacts
  - Clean Air Interstate Rule (CAIR)
    - Significant penetration of wind power will make it harder for CAIR to achieve emission reduction goals
  - Emission displacement studies
    - Overestimating the amount emissions are displaced by wind
  - Life Cycle Analyses
    - Don't account for wind's effect of decreasing emission efficiencies of conventional generators
  - Technology
    - Not all gas turbines are equally suitable for pairing with wind
    - R&D program to improve emissions of heavily cycled gas turbines





# Acknowledgements

Allen Robinson, Cliff Davidson, Lester Lave, Mitchell Small  
Anonymous resource for power plant emissions data,  
Anonymous resource for wind data

## Funding

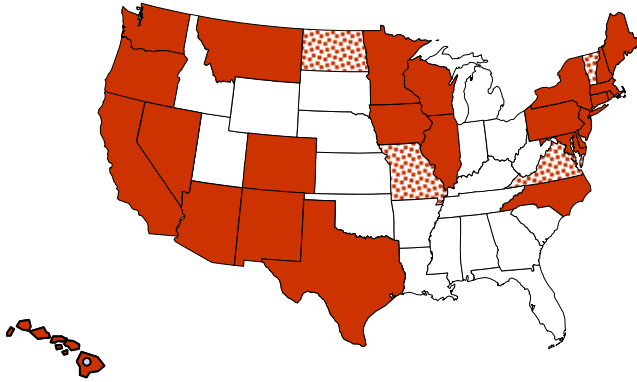
CEIC  
NETL  
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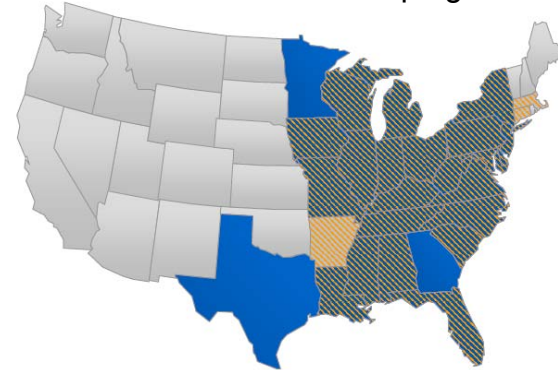




RPS [dsireusa.org](http://dsireusa.org)



C.A.I.R [epa.gov](http://epa.gov)



## Questions?



LA Smog Apt

Renewable Portfolio Standard which would require electric utilities to obtain 15 percent of their electricity from wind, solar, or biomass energy by 2020

– NYTimes June 15<sup>th</sup>, 2007

