

# Limitations in reduction of wind power intermittency with storage technologies

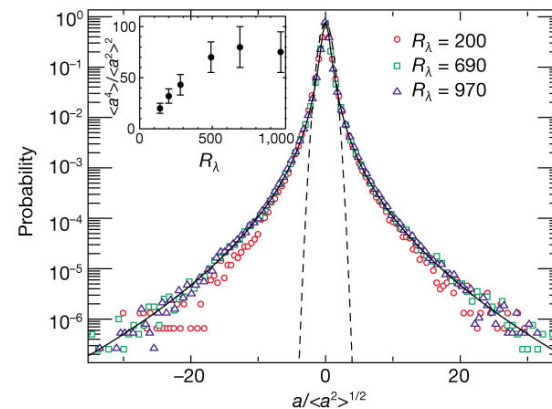
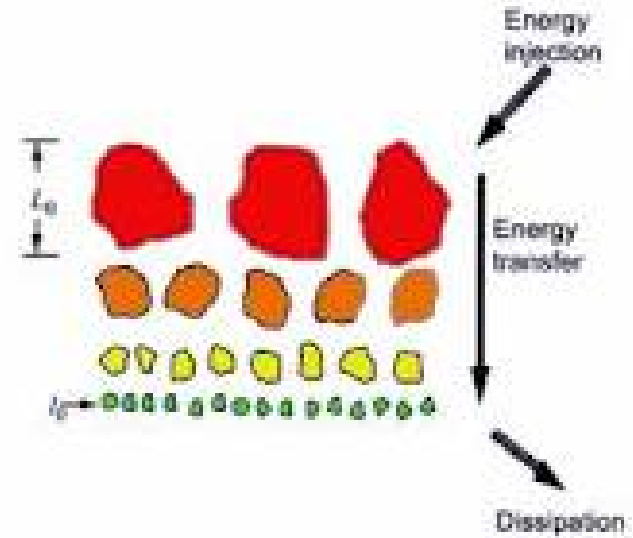
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# Turbulence

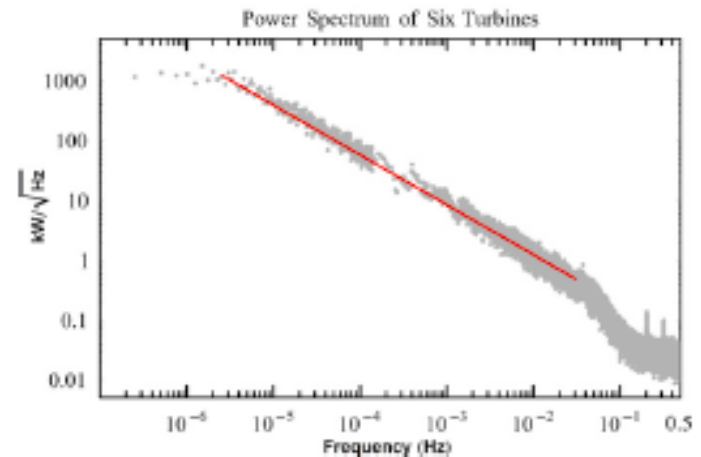
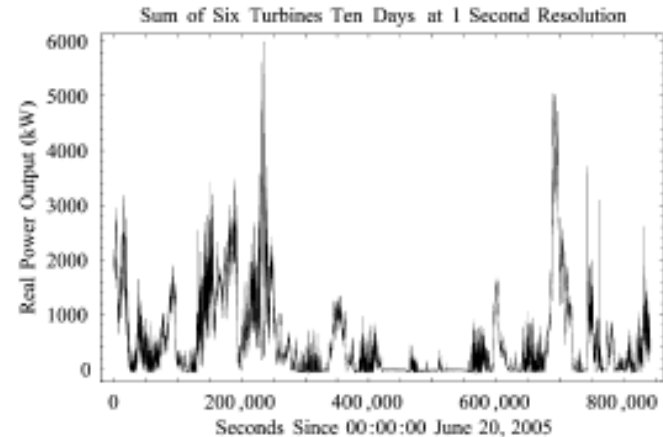
- “Turbulence is the greatest unsolved problem of classical physics.” R. Feynman
- Self-similar structure leads to broad range of scales involved
- Anomalous fluctuations: enhanced probability of rare events
- Conventional large deviation theory does not apply: fluctuations are weakly suppressed by spatial/temporal averaging
- **Universality: statistics in inertial range is the same for all turbulent flows**



La Porta et.al., *Nature* **409**, 1017 (2001)

# Wind intermittency

- Intermittency of wind fluctuations:
  - Reasonably well understood for instant velocity distribution  $P(v)$
  - Much less is known about short time variability
- Kolmogorov spectrum:
  - $P(f) = C f^{-5/3}$
  - Valid in broad range of scales
  - Universal: details of the system do not matter

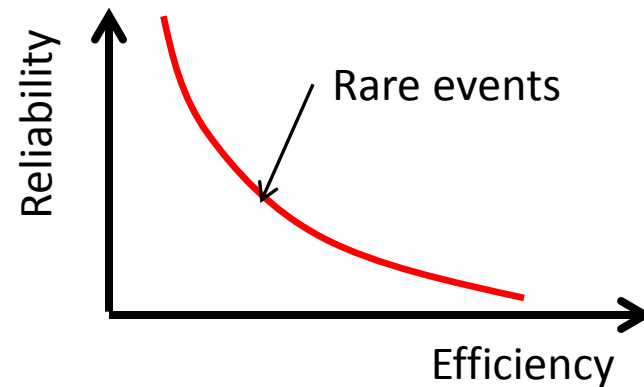
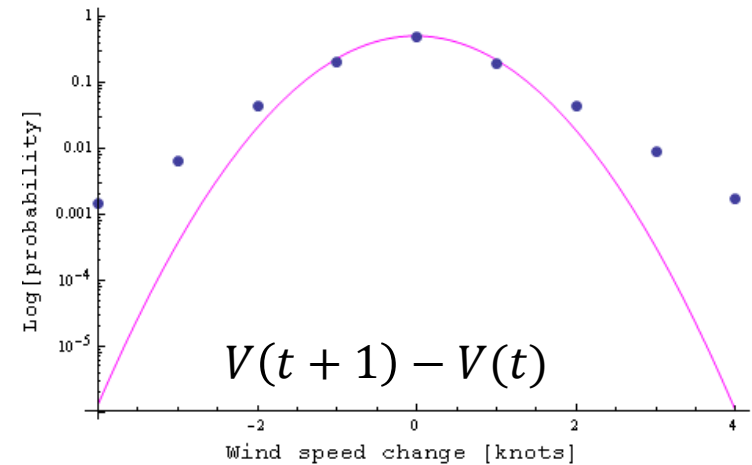


J. Apt, Journal of Power Sources 169 (2007) 369–37

# Anomalous fluctuations

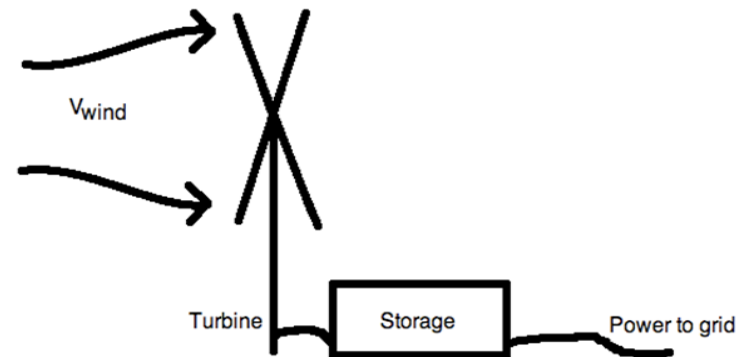
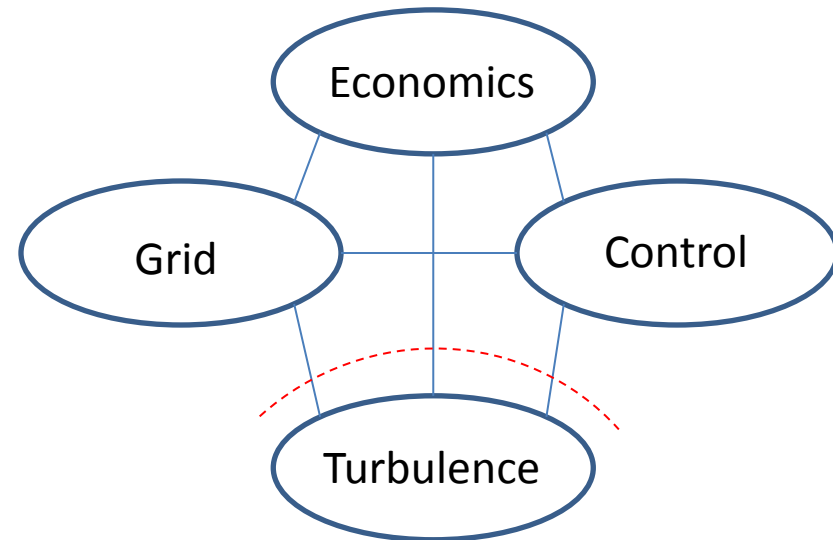
- Gaussian model underestimates the probability of rare velocity fluctuations: presumably once a year events happen once a week!
- Can we mitigate this intermittency with storage: real or virtual ?
- How can we quantify the reliability ?
- Universality can help, but only if the right questions are asked.

PDF of wind speed changes over one minute



# Mitigation of intermittency

- Complex interdisciplinary problem: interplay of constraints from grid (contingency), economics (costs), control (stability, predictability).
- Turbulence simulations for every specific grid: not realistic
- Data analysis has limited applications in the analysis of rare events for reliability
- We need to reduce the model: Encapsulate all the nonlinear hydrodynamics in some statistical characteristics relevant for the grid



# Model

- Model:
  - Single 2 MW turbine with peak following speed control
  - NOAA ASOS wind data: 1 min resolution
- Variations on 5-30 min time-scale:
  - Inter-dispatch to ED timescale
  - Inside inertial range of turbulence (universal)
- Assume perfect forecast:
  - Sets the limits on achievable
  - Does not tell how to achieve it

| Parameter                  | Value                   |
|----------------------------|-------------------------|
| Maximum rated power        | 2 MW                    |
| Blade Radius               | 35 m                    |
| Coefficient of performance | 0.48                    |
| Cut in speed               | 3.5 m/s                 |
| Air density                | 1.225 kg/m <sup>3</sup> |

$$P_{in} = \frac{1}{2} \pi R_{blade}^2 \rho_{air} c_p v_{wind}^3$$

$$v_{min} < v_{wind} < v_{max}$$

# Mathematical model

$$P_{out}(t) = P_{in}(t) + u(t - 1) - u(t)$$

$t = 1 \dots T$  : time (with 1 min resolution)

$P_{in}(t)$ : input power (from wind turbine model)

$u(t)$ : stored energy

$P_{out}(t)$ : output power

$$\min_u \|P_{out}(t) - \overline{P_{out}}\|_2 \text{ s.t.}$$

$0 \leq u(t) \leq S$ : Storage capacity

Convex!

$\|P_{out} - P_{in}\|_\infty \leq R$ : Ramping rate

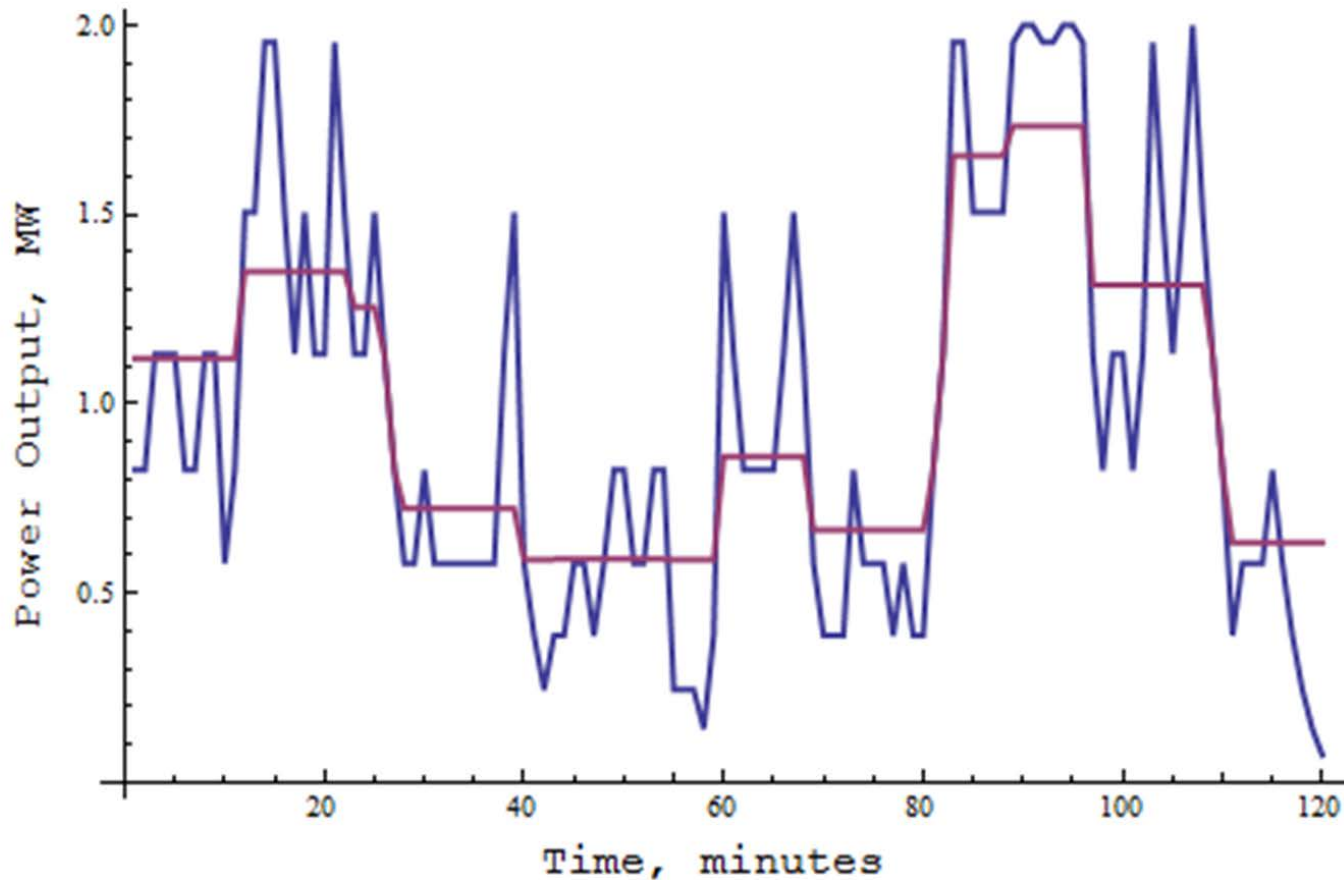
$\|P_{out} - P_{in}\|_1 \leq C$  : Lifetime (number of cycles)

Solution depends on sample: random process with **universal** distribution



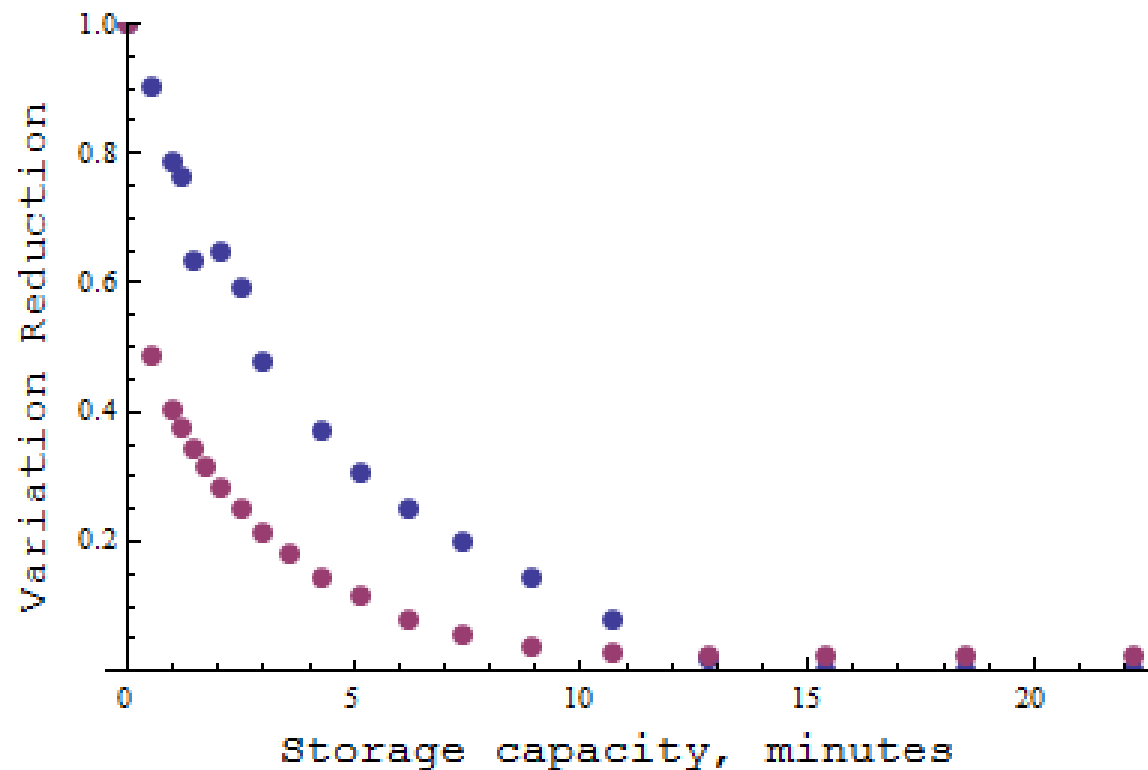
# Results: optimal solution

Variation reduction with two minutes of storage



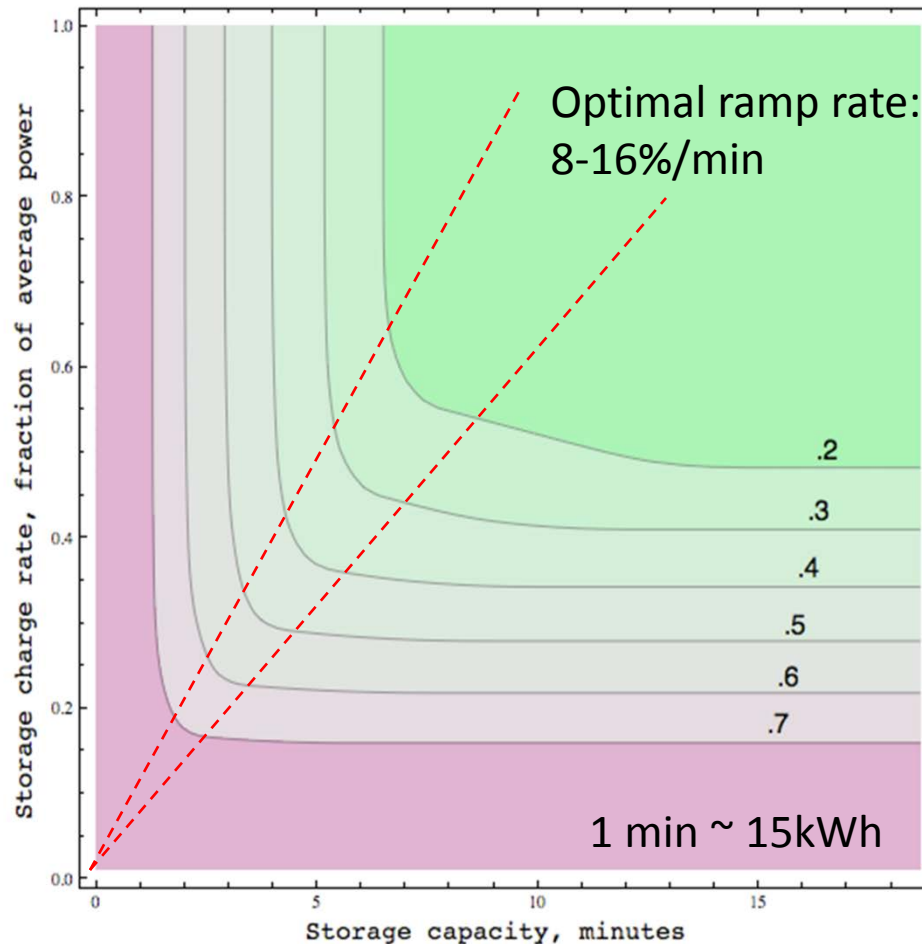
# Results: variation reduction

Variation reduction of power output

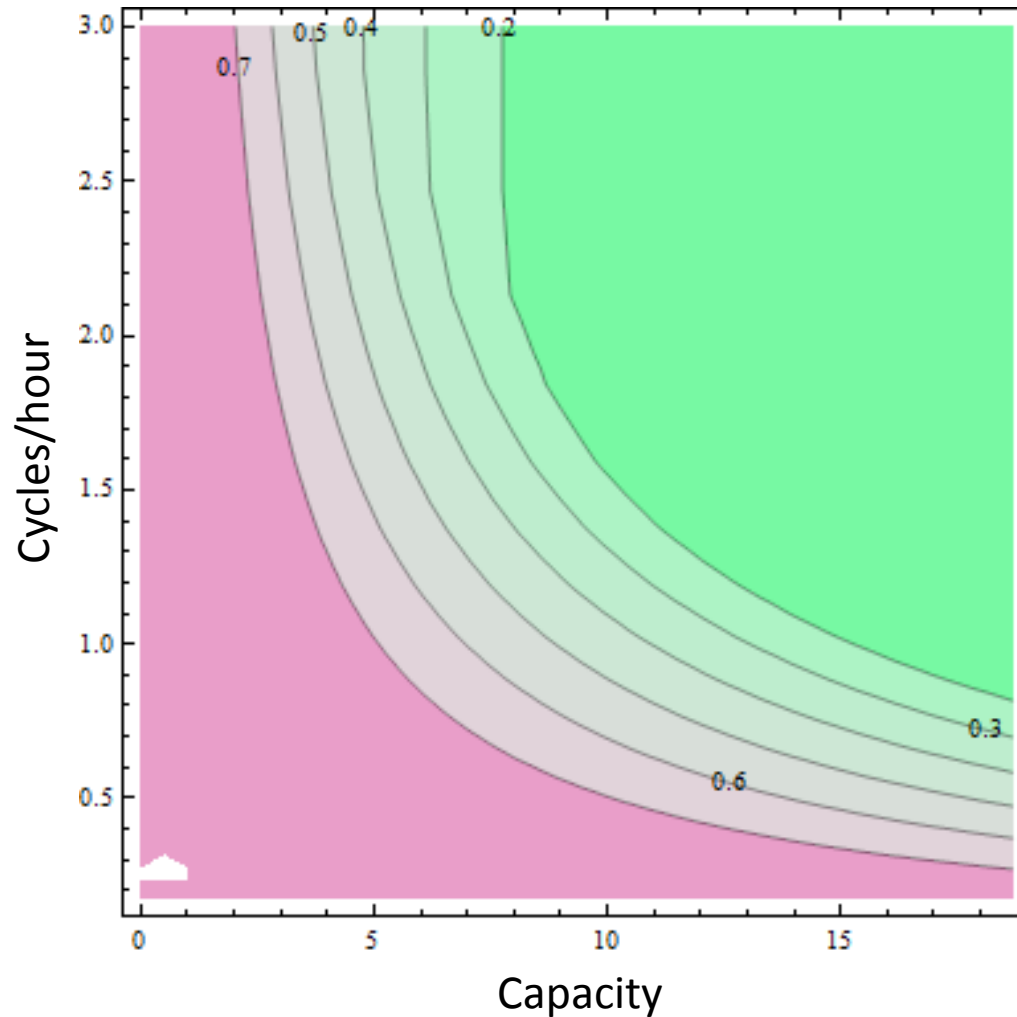


# Results: Capacity vs Rated power

Variation reduction vs storage capacity and charge rate

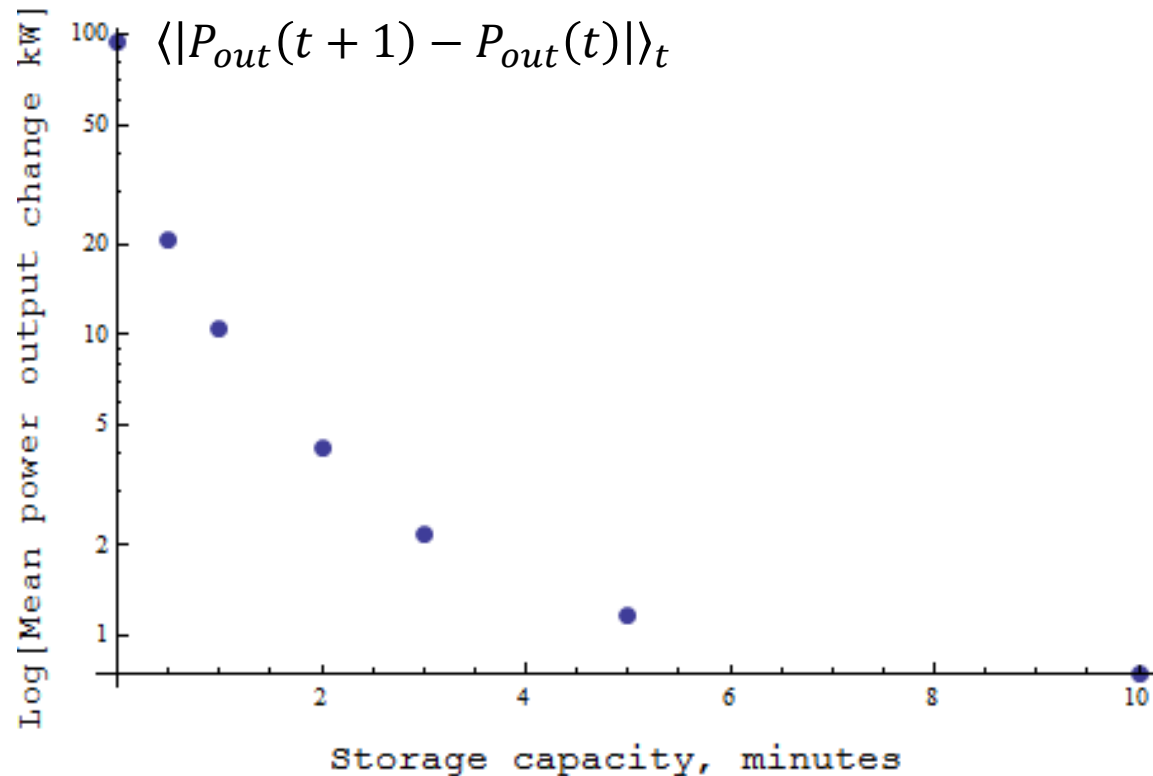


# Results: Capacity vs Lifetime



# Results: short-term variability reduction

Average power fluctuations with storage



# Future directions

- Better chosen objective function:

$$\int df H(f) |P_{out}(f)|^2$$

Target specific frequency band (say 2-10 minutes for inter-dispatch variability)

- Role and value of wind predictability
- Actual control techniques
- More refined constraints: shifting loads, opportunity costs
- Dynamic wind curtailment: better solution for frequency control ?

