

# The Importance of Turbulence in Wind Energy



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# Outline

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## ■ Background

- Importance of understanding the interaction among turbines & Atmospheric Boundary Layers in Wakes Modeling
- Importance of Turbulence on Wind Energy & Optimization Design

## ■ Motivation & Objectives

- Improve understanding of the vertical transport of momentum & K.E.
- Use Experimental data for Analysis & Global Optimization of Wind Farms.
- Reduce the cost by layout optimization

## ■ Wind Tunnel Experiments

## ■ Wind Farm Power Model: Optimization Design (Layout)

## ■ Economic Model: Cost of Energy Optimization

## ■ Conclusion

# Background

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- Wind turbines well studied from a **blade aerodynamics perspective**.
- **Wind turbines within an array display power generation loss of up to 40%**, when compared to a freestanding wind turbine, Crespo et al. (1999).
- Wind Array: Important to understand such interactions **to optimize wind farm layout**.
  - **Analytical methods**, not CFD tools, commonly used to design wind farm layouts.
- Wind energy is planned to account for 20% of the U.S. electricity consumption by 2030.
- Efficient planning and resource management is the key to the success of an energy project.
  - Accurate (**flexible to local market changes**) cost models of wind projects would allow investors to better plan their projects.
  - Investors can provide valuable insight into the areas that require further development to **improve the overall economics** of wind energy.

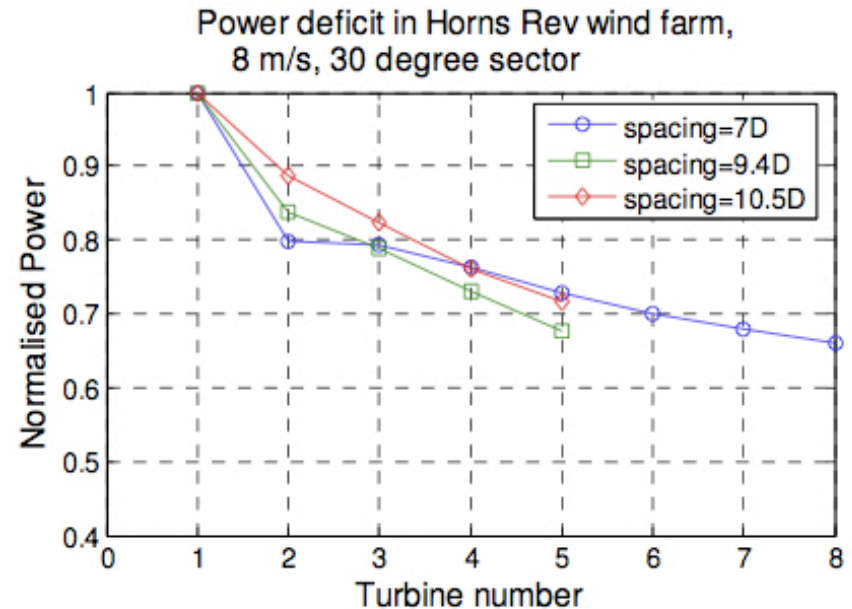
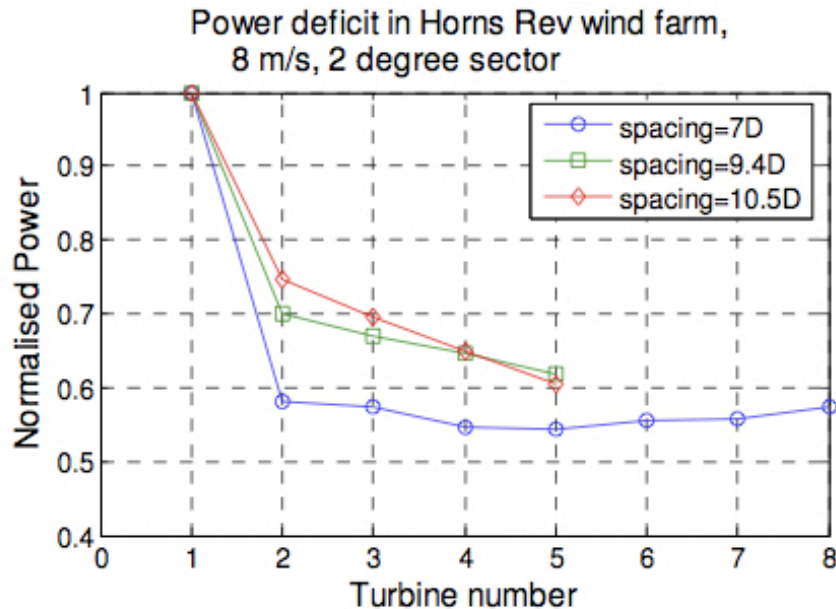
## Background: Long Downstream Effect

### *Modeling and measurements of wakes in large wind farms*

*Barthelemie, Rathmann, Frandsen, Hansen et al...*

*J. Physics Conf. Series 75 (2007), 012049*

### *Power extraction at Horns Rev wind farm:*

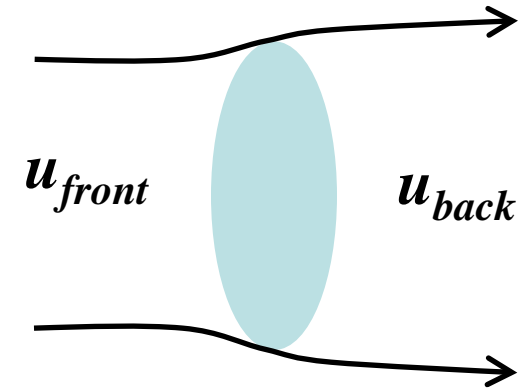


**Wake model used for optimization by Elkinton et al.( 2006).  
Study showed the biggest uncertainty (~25%) in the cost estimation of a  
wind farm is due to the flawed wake modeling.**

# The Wake Profile: Layout Optimization and Energy Output

## 1. Induction factor for wind turbines

$$a = \frac{1}{2} \left( 1 - \frac{U_{back}}{U_{front}} \right)$$



is used in wake models, e.g. for;

*a. Output power prediction, and maximize energy extraction*

*b. Wind turbines placement (layouts) optimization*

## 2. PARK model for wake velocity reduction (wake loss), Jensen (1983).

$$U(x) = U_0 \left[ 1 - a \left( \frac{1}{1 + \theta(x/D)} \right)^2 \right]$$

Assumptions:

velocity inside wake → **assumed to be axi-symmetric and uniform**

free-stream velocity → **assumed to be uniform**

entrainment parameter,  $\theta$ , → **empirical value assigned**

*$\theta$  and  $a$  both depend on turbulence structure and are input parameters!*

# The WTABL and the Kinetic Energy:

+ horizontal averaging for simple vertical structure (Frandsen 1992)  
("Wind speed reduction..." J. Wind Eng & IndAppl **39**, 1992)

• **Multiplying the momentum by the mean velocity leads to the mechanical energy describing the kinetic energy.**

$$\langle \bar{u} \rangle \frac{\partial \frac{1}{2} \langle \bar{u} \rangle^2}{\partial x} + \langle \bar{v} \rangle \frac{\partial \frac{1}{2} \langle \bar{u} \rangle^2}{\partial y} =$$
$$-\frac{1}{\rho} \langle \bar{u} \rangle \frac{dp_\infty}{dx} - \frac{\partial}{\partial y} (\langle \bar{u}'v' \rangle \langle \bar{u} \rangle + \langle \bar{u}''v'' \rangle \langle \bar{u} \rangle) + \langle \bar{u}'v' \rangle \frac{\partial \langle \bar{u} \rangle}{\partial y} + \langle \bar{u}''v'' \rangle \frac{\partial \langle \bar{u} \rangle}{\partial y} - \mathcal{P}(y),$$

• In the inner region, the following terms are dominant:

$$-\frac{\partial}{\partial y} (\langle \bar{u}'v' \rangle \langle \bar{u} \rangle + \langle \bar{u}''v'' \rangle \langle \bar{u} \rangle) + \langle \bar{u}'v' \rangle \frac{\partial \langle \bar{u} \rangle}{\partial y} + \langle \bar{u}''v'' \rangle \frac{\partial \langle \bar{u} \rangle}{\partial y} - \mathcal{P}(y) \approx 0$$

Kinetic energy flux

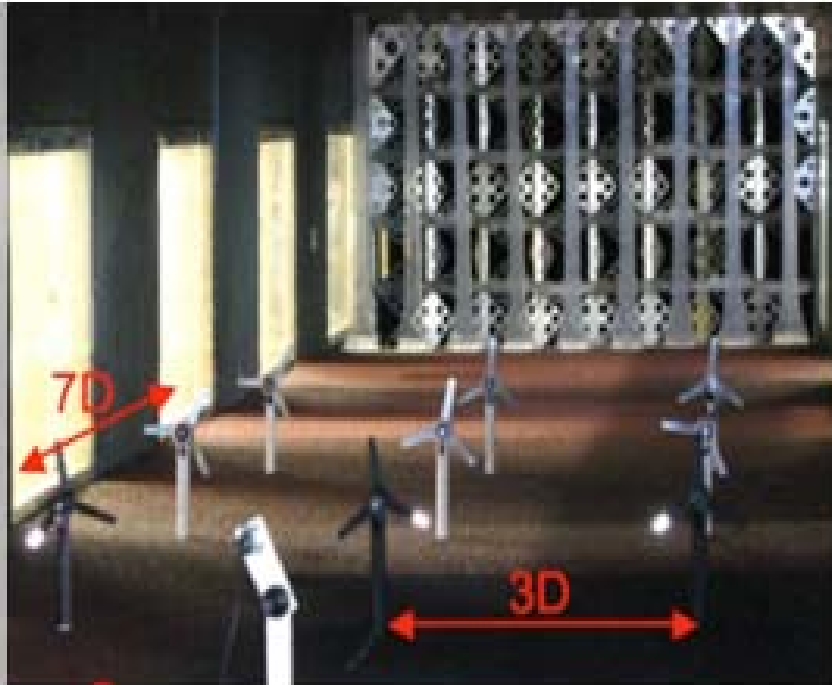
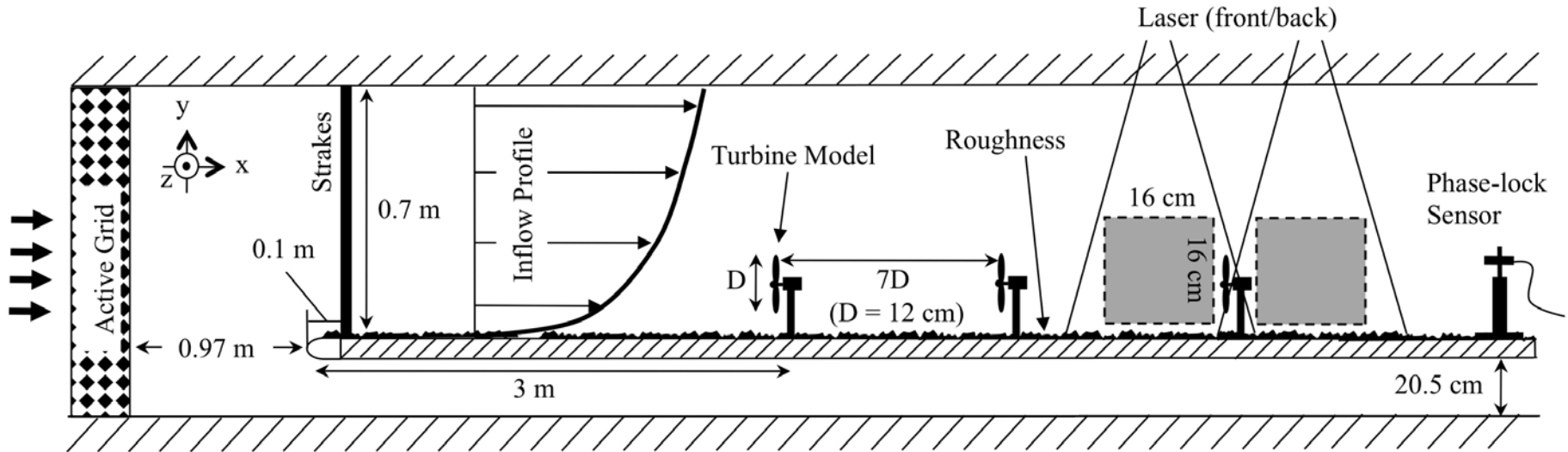
Dispersive flux due to spatial average

Turbulent dissipation  
dispersive dissipations

Product of the spatially averaged velocity and the averaged thrust force

**What is the role of turbulent momentum & KE flux in energy?**

# Wind-tunnel experiment set up

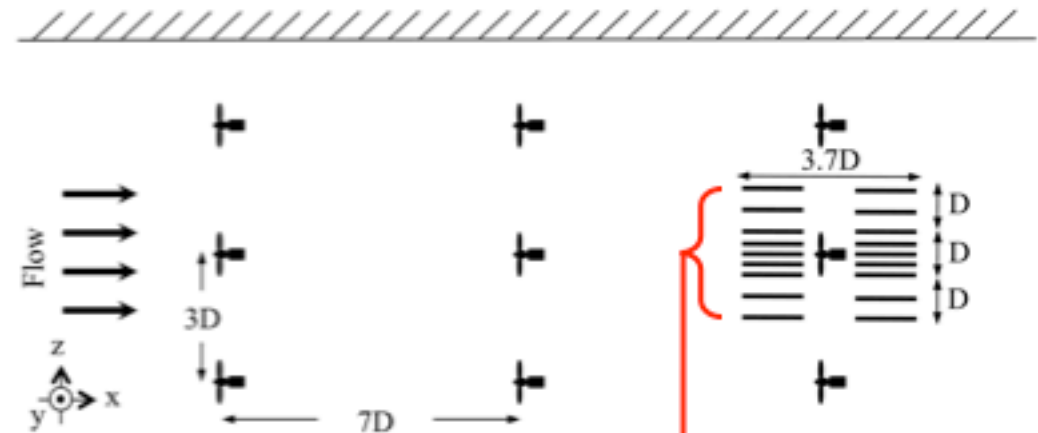


Photograph from the downstream area of the wind tunnel experiment, looking towards upstream direction. *Cal et al. 2010.*

# S-PIV: Contours of the Mean Streamwise Velocity

**Time-averaged mean velocity for 18 planes** surrounding the target wind turbine.

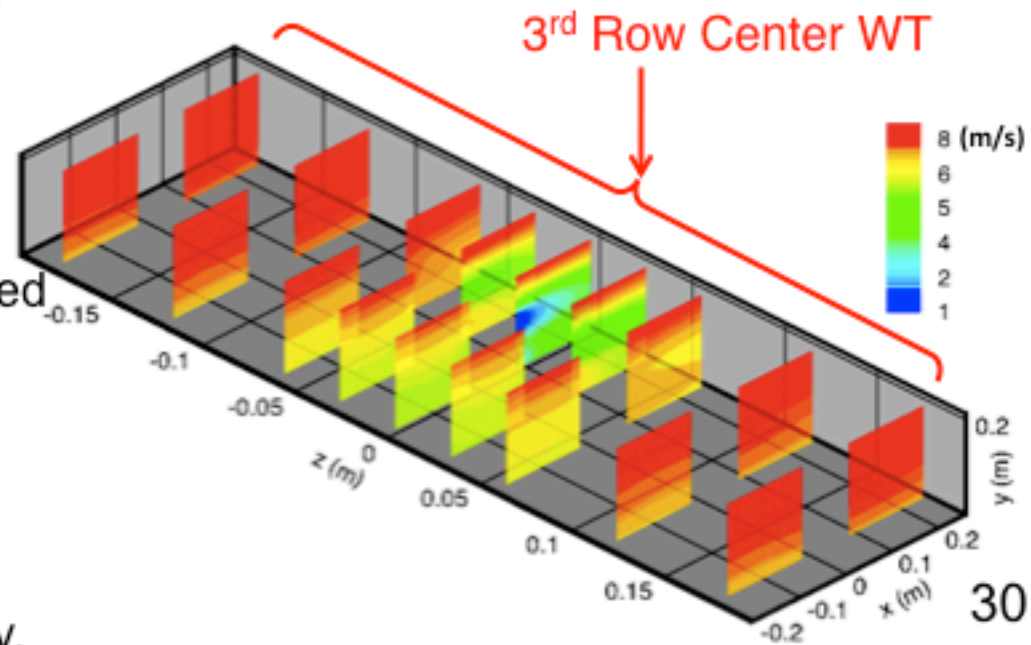
9 planes in front  
9 planes in back



**The wake** of the preceding wind turbine is clearly visible as an overall lower velocity in the spanwise locations downstream of the turbines in the middle column.

This confirms that there will be **considerable wake losses** in the modeled wind farm.

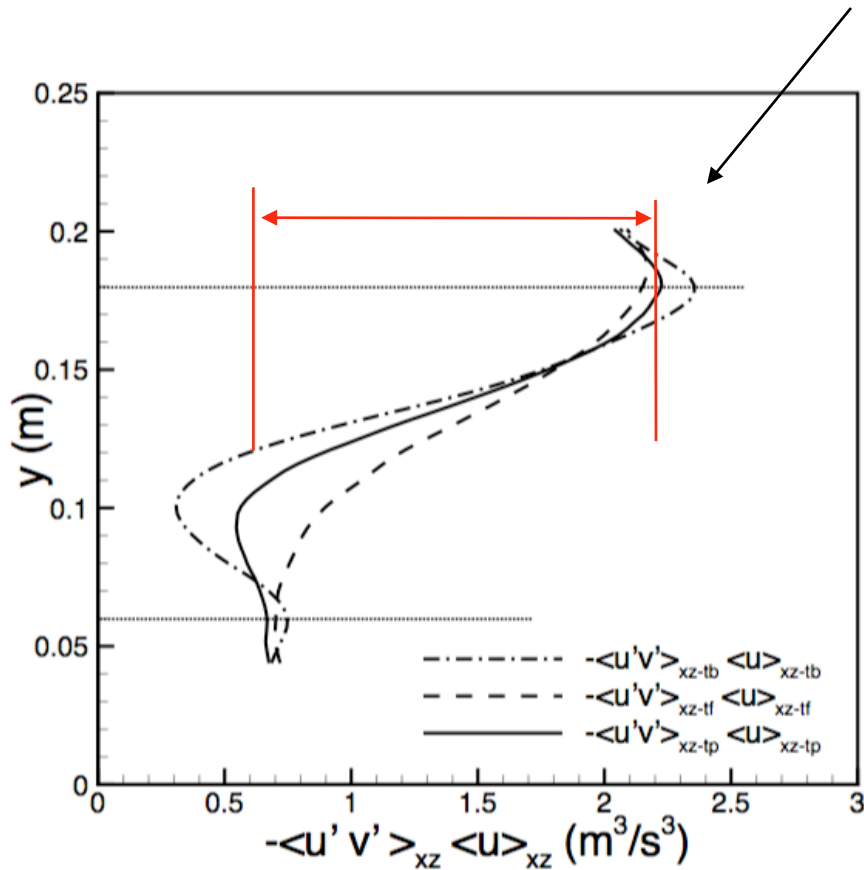
It can be observed that the **flow slows down upstream** as it approaches the **wind turbine rotor** in qualitative agreement with classic streamtube theory.



# Horizontally averaged profiles - kinetic energy terms:

Kinetic energy flux due to turbulent transport

$$\frac{d \frac{1}{2} \langle u \rangle_{xz}^2}{dt} = -\epsilon_{turb} - \epsilon_{conv} - \frac{d}{dy} \left( \langle u'v' \rangle_{xz} \langle u \rangle_{xz} + \langle \bar{u}''\bar{v}'' \rangle_{xz} \langle u \rangle_{xz} \right) - \langle u \rangle_{xz} \frac{1}{\rho} \frac{dp_{\infty}}{dx} - P_T(y)$$



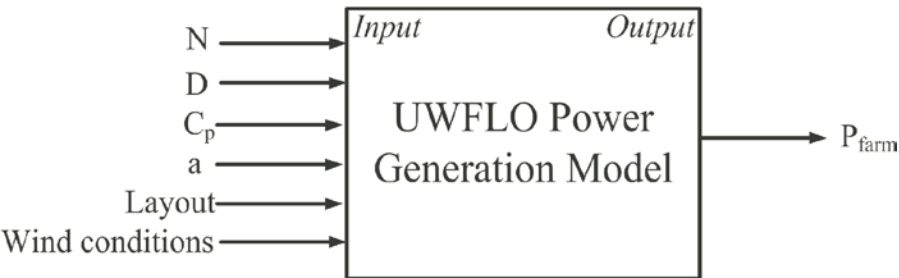
Integrate kinetic energy dissipation across rotor.

$$P_{loss} = \rho s_x s_z D^2 \int_{y_h - D/2}^{y_h + D/2} -\langle u'v' \rangle_{xz} \frac{\partial \langle \bar{u} \rangle_{xz}}{\partial y} dy \approx 0.094 \text{ W}$$

Analysis consistent with view that kinetic energy extracted by turbine **(0.34W)** \*\* is delivered vertically by turbulence fluxes (0.45W)

# Power Generation Model

- The Unrestricted Wind Farm Layout Optimization (UWFLO) Power Generation Model



## Optimizing Cost of Energy (COE)

- COE is measured by *Levelized Production Cost (LPC)*

$$COE = \frac{C_t \times P_0 \times N \times 1000}{AEP_{net}}$$

- $AEP_{net}$ : *Net Annual Energy Production*

$$AEP_{net} = 365 \times 24 \times P_{farm}$$

# Wind Farm Optimization Problem Formulation

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## Optimization Problem

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$$\min_V : f = \frac{C_t \times P_0 \times N \times 1000}{AEP_{net}(V)}$$
$$V = \{x_1, x_2, \dots, x_N, y_1, y_2, \dots, y_N\}$$

subject to

$$g_1(V) \leq 0$$

$$g_2(V) \leq 0$$

$$0 \leq x_i \leq x_{farm}$$

$$0 \leq y_i \leq y_{farm}$$

## Constraints

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### Minimum clearance

$$g_1(V) = \sum_{i=1}^N \sum_{\substack{j=1 \\ j \neq i}}^N \max((D_i + D_j + \Delta_{min} - d_{ij}), 0)$$

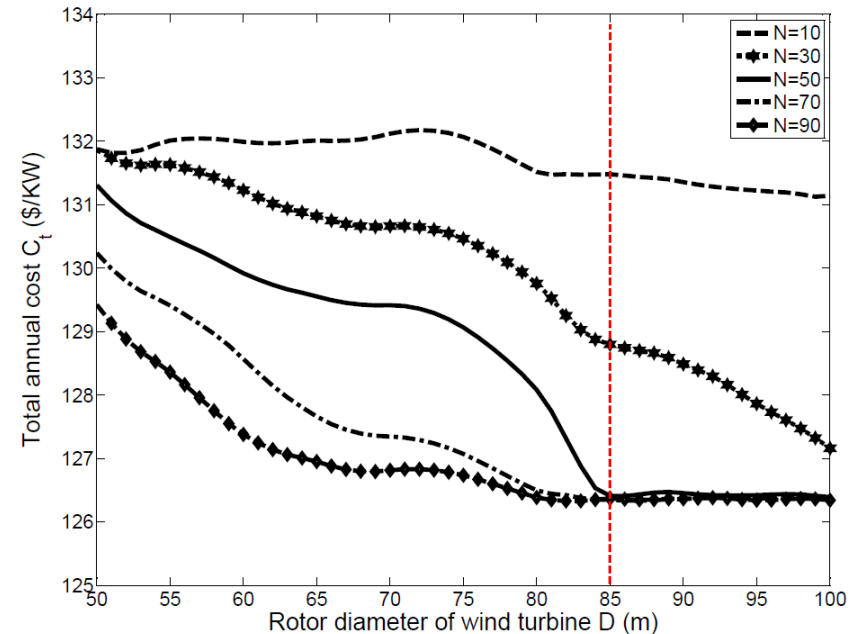
$$d_{ij} = \sqrt{\Delta x_{ij}^2 + \Delta y_{ij}^2}$$

### Ensure the location of wind turbines within the fixed size

$$g_2(V) = \frac{1}{2N} \left\{ \frac{1}{x_{farm}} \sum_{i=1}^N \max(-x_i, x_i - x_{farm}, 0) + \frac{1}{y_{farm}} \sum_{i=1}^N \max(-y_i, y_i - y_{farm}, 0) \right\}$$

# Total Annual Cost vs. The Input Factors

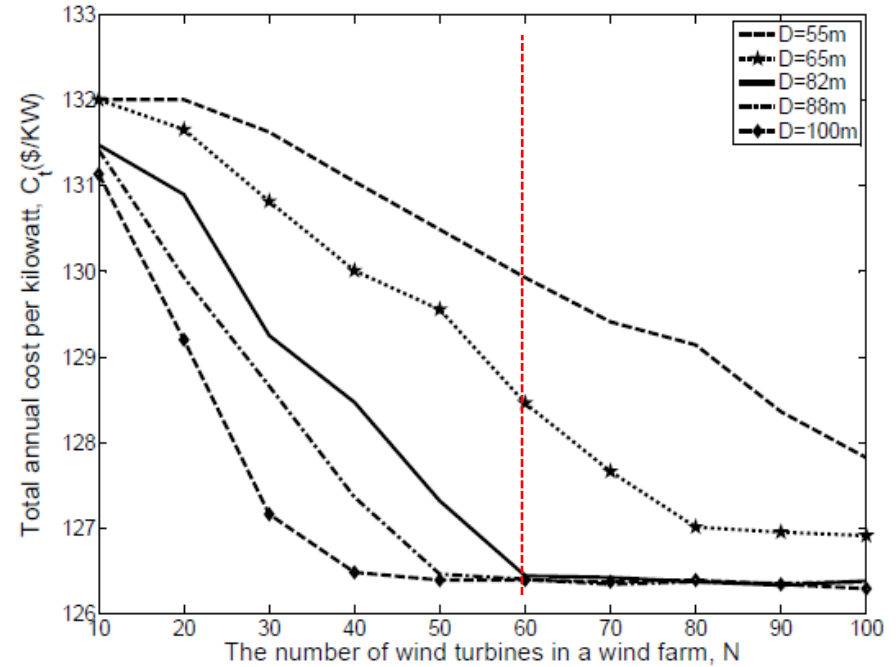
- The total annual cost decreases from \$131.3/KW to \$126.4/KW (approximately 3.73%) when the rotor diameter of a wind turbine increases from 50m to 100m.
- The total annual cost decreases slowly when the rotor diameter is less than 70m.
- The total annual cost begins to decrease sharply when the rotor diameter changes from 70m to 85m.
- If the rotor diameter continues to increase beyond 85m, the change in the total annual cost is particularly limited.



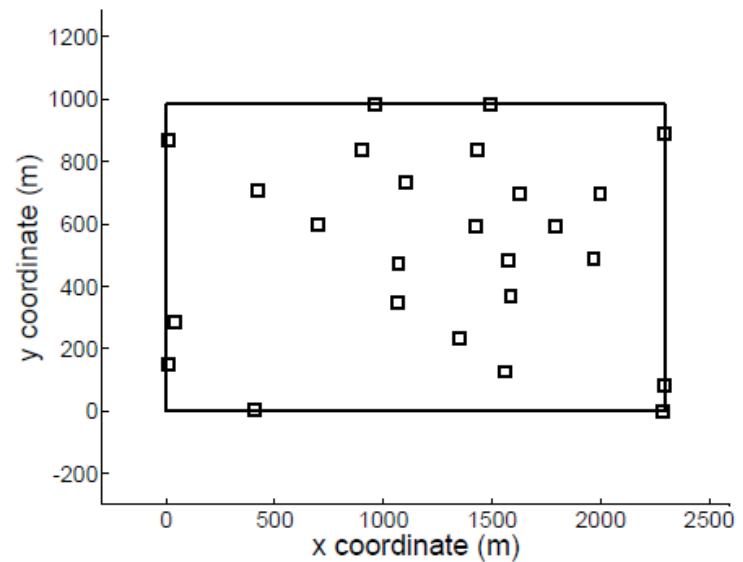
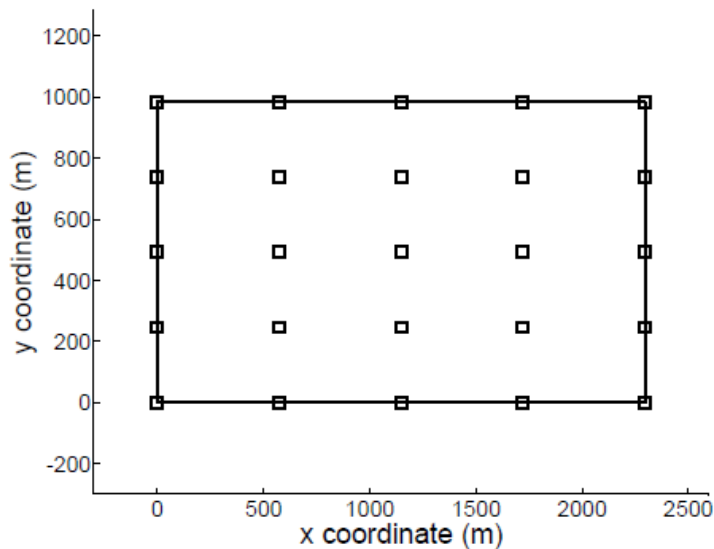
**The total annual cost based on the rotor diameter of a wind turbine**

# Total Annual Cost vs. The Input Factors

- The total annual cost decreases from \$131.48/KW to \$126.38/KW (approximately 3.88%) while the number of wind turbines increases from 10 to 100.
- The total annual cost does not change significantly when the number of wind turbines increases beyond 60.



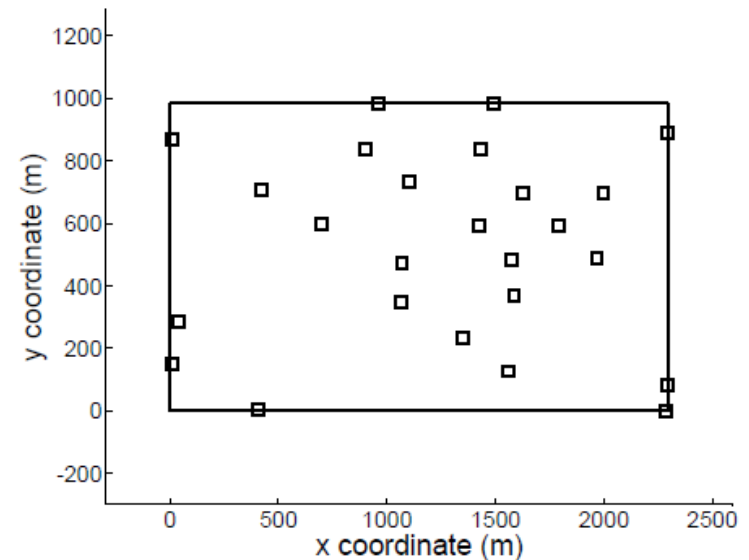
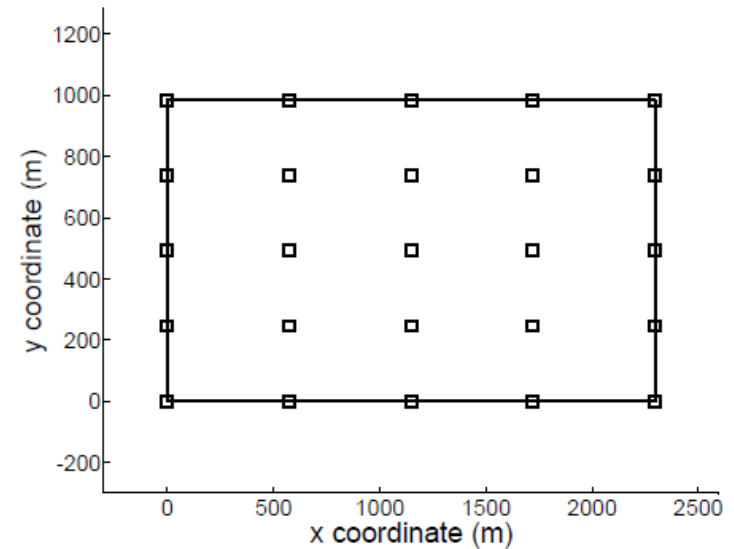
The total annual cost based on the number of wind turbines



# Case Study

## Wind farm parameters

Parameter	Value
Number of wind turbines	25
Type of wind turbines	ENERCON E-82
Length of the wind farm	28D
Breadth of the wind farm	12D
Rated power ( $P_0$ )	2MW
Rotor diameter (D)	82m
Hub height (H)	85m
Cut-in wind speed	2m/s
Cut-out wind speed	28m/s
Rated wind speed	13m/s



## Summary:

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- How much momentum transfer is caused by mean velocity dispersive stresses?
  - small compared with Reynolds shear stresses
  - although in the near-wake region they may contribute to wake recovery
- **The vertical fluxes of mean kinetic energy** associated with the streamwise velocity due to Reynolds shear stresses are of the **same order of magnitude as the power extracted by the wind turbines.**
  - This becomes the dominant mechanism providing kinetic energy to the turbines.
- **The Cost of Energy (COE) was minimized to improve the overall economics** of wind energy project.
- The preliminary cost map shows **wide variation** in wind farm cost in the U.S.
- The resulting cost model could be a **useful tool for wind farm planning.**