



# University of Colorado

Department of Atmospheric & Oceanic Sciences

## Best practices for simulating wind farm wakes with the WRF Wind Farm Parameterization

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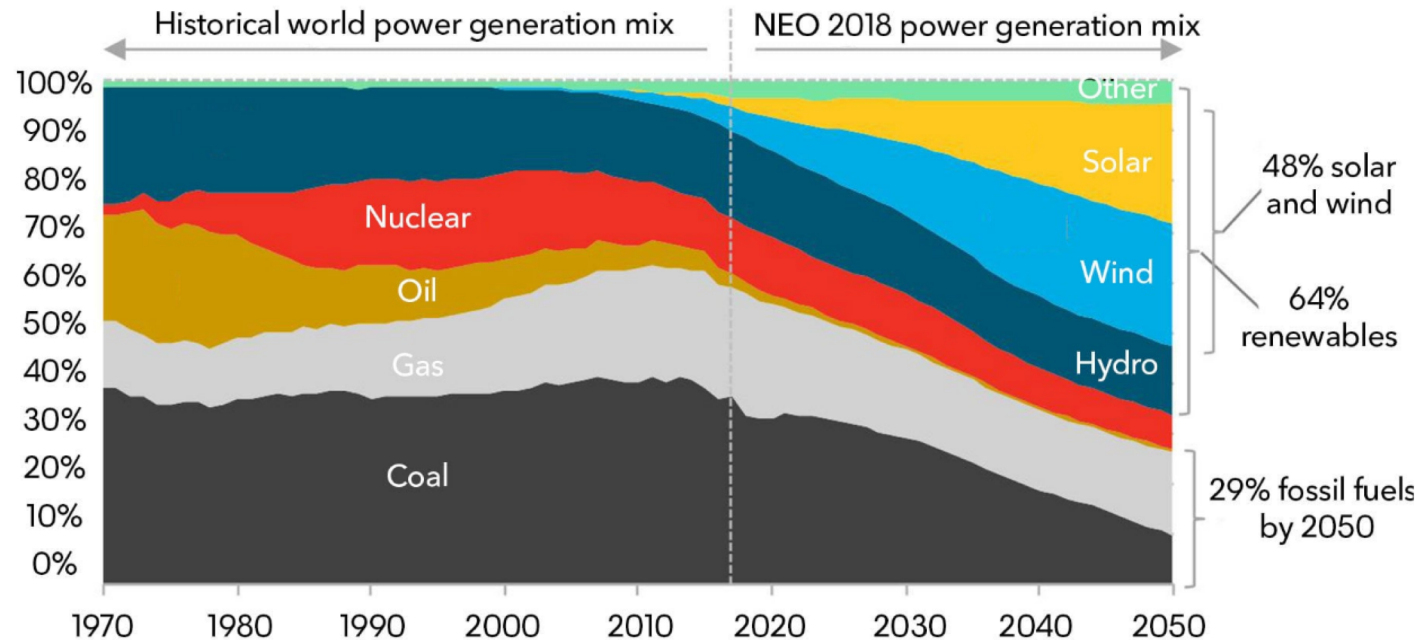
<sup>2</sup>National Renewable Energy Laboratory

# Renewable energy sources in demand globally

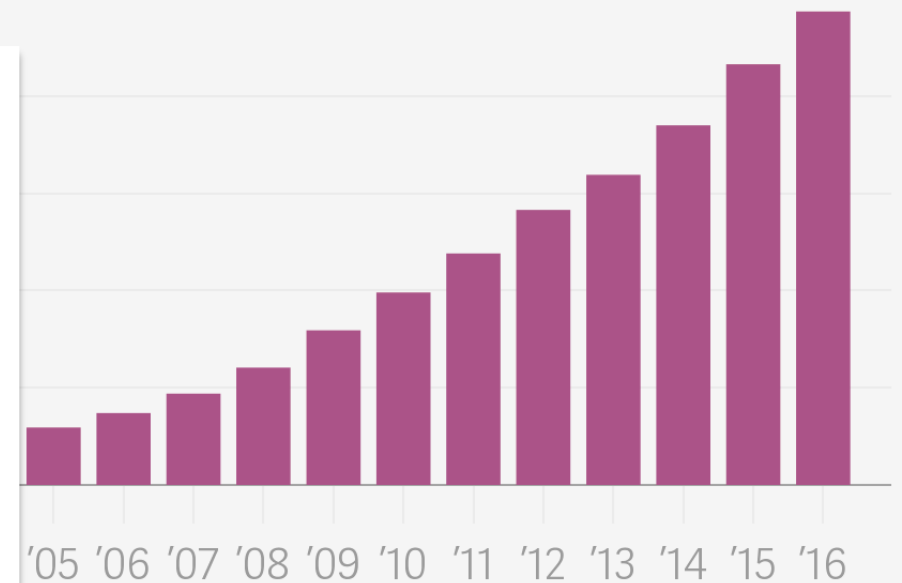
Global wind energy capacity

500,000 MW

## Power generation mix



Source: Bloomberg NEF, IEA.



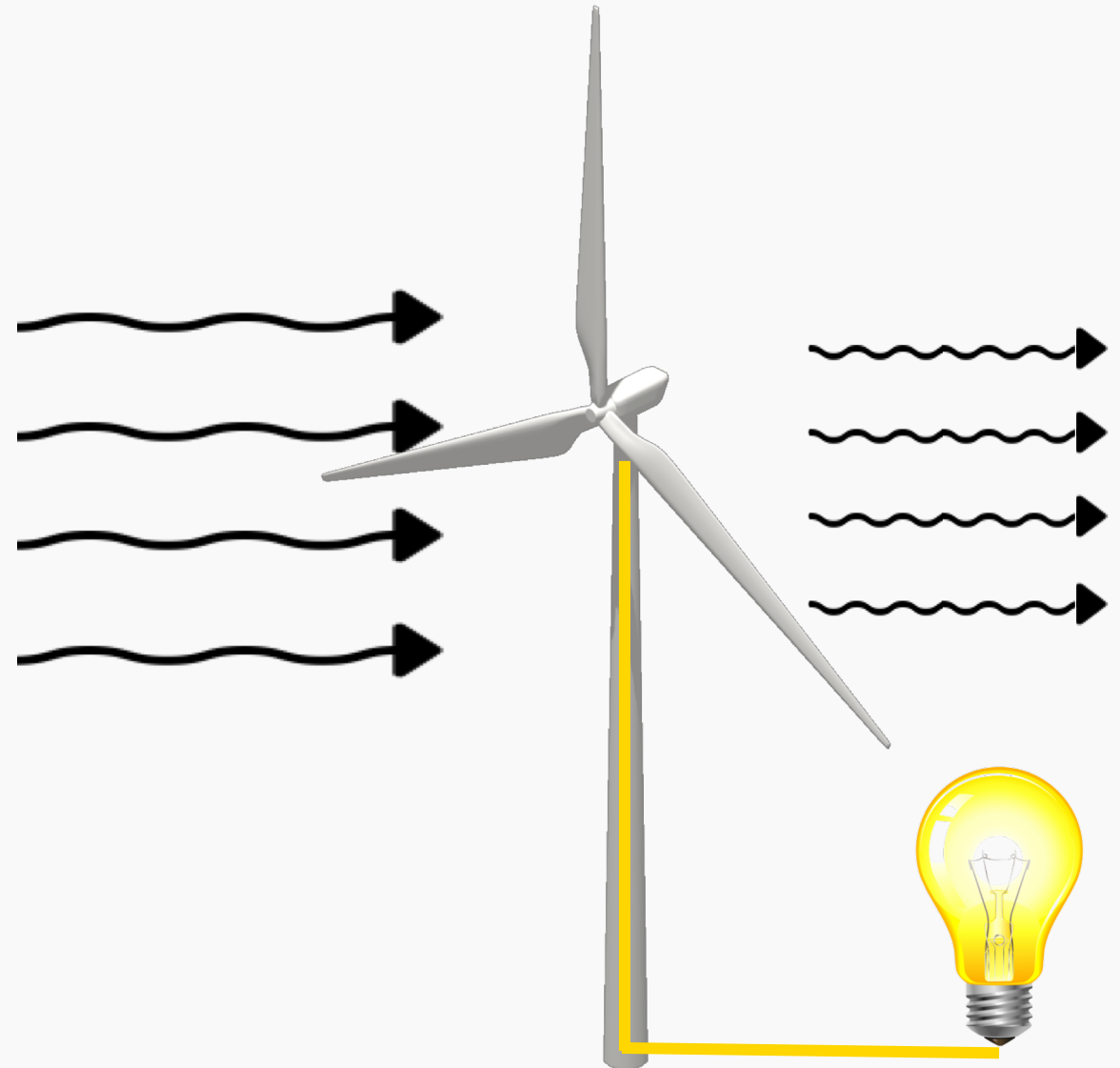


# Wind turbines generate electricity - and wakes

Wind turbines generate electricity by using the momentum in the wind to turn their blades and spin a generator, leaving a “wake” behind them

**Wakes** are characterized by:

Wind speed deficit &  
increased turbulence downwind

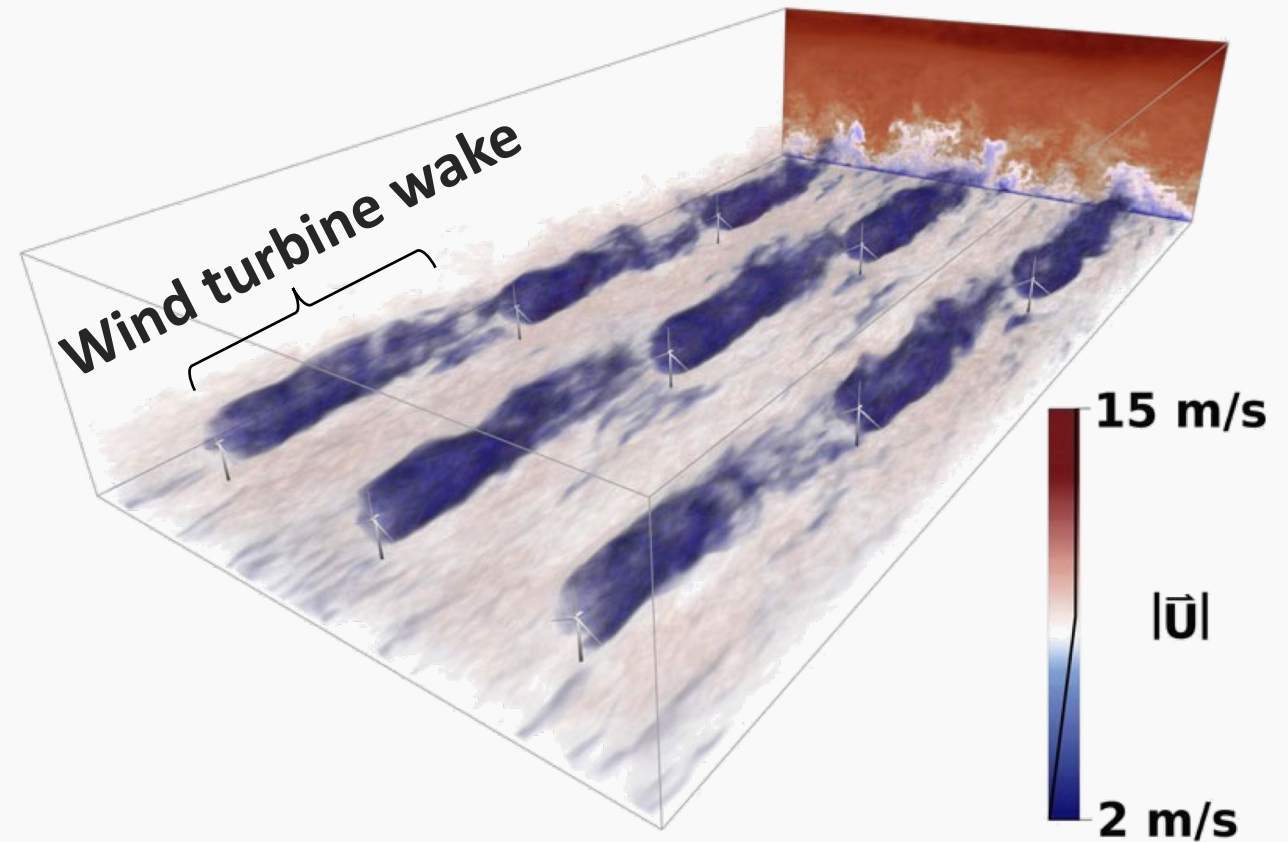


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*Credit: Kenny Gruchala, NREL*



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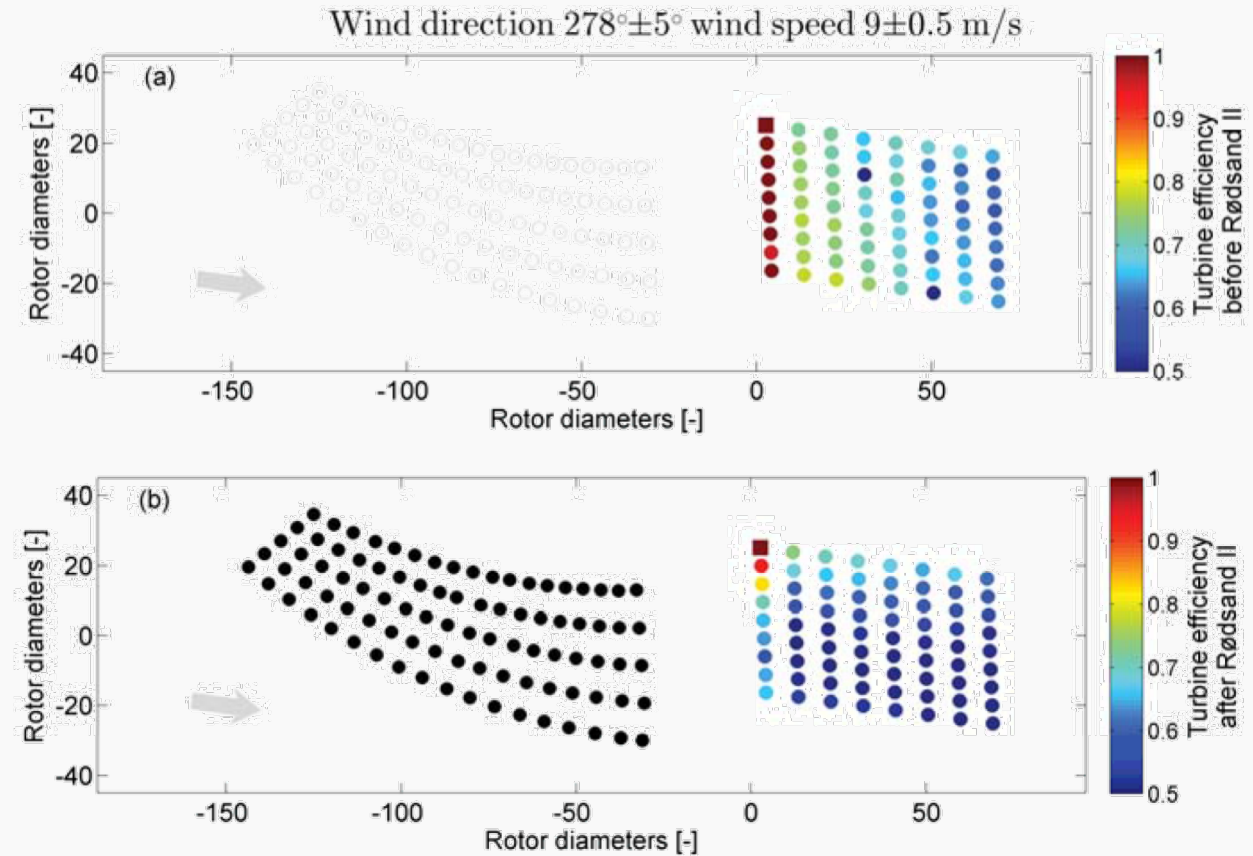
Wind speed deficit &  
increased turbulence downwind



*Credit: Christian Steiness*

# Wakes impact their ambient environment

Hub-height wind speed deficits cause loss in power and revenue for downwind wind farms<sup>1,2</sup>



Nygaard 2014

<sup>1</sup>Nygaard, N. G. Wakes in very large wind farms and the effect of neighbouring wind farms. *J. Phys. Conf. Ser.* (2014).

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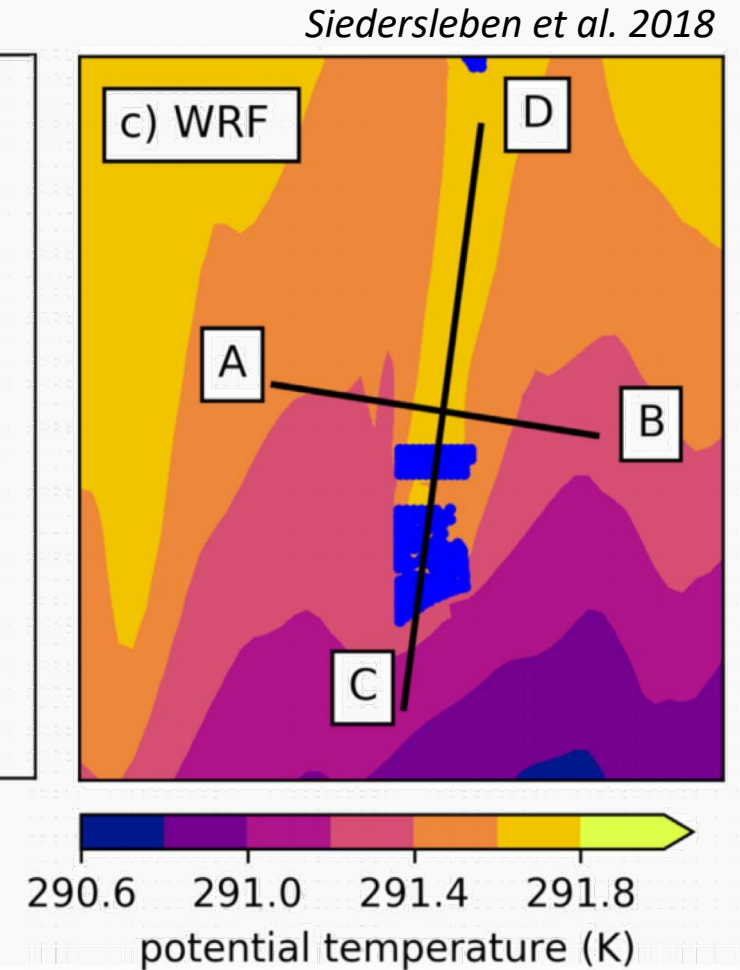
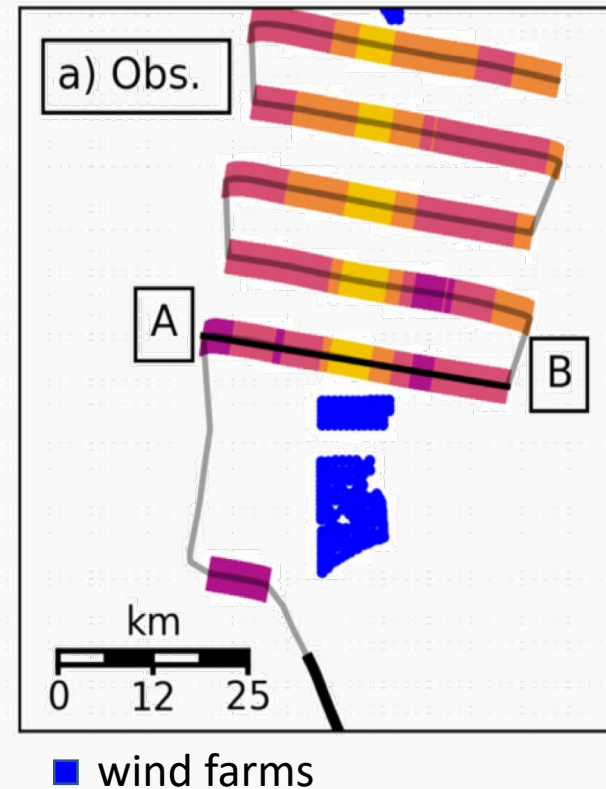
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Increased turbulence mixes warmer air from nighttime inversions to surface<sup>3</sup>

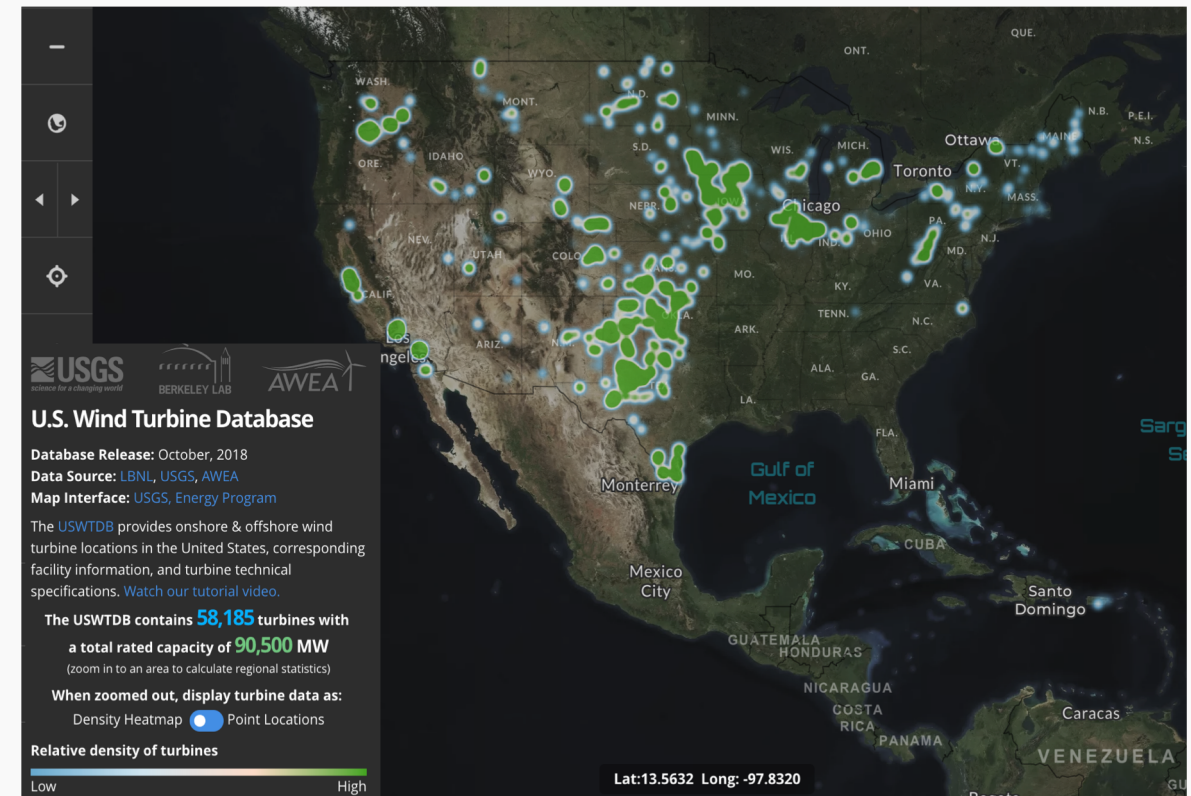
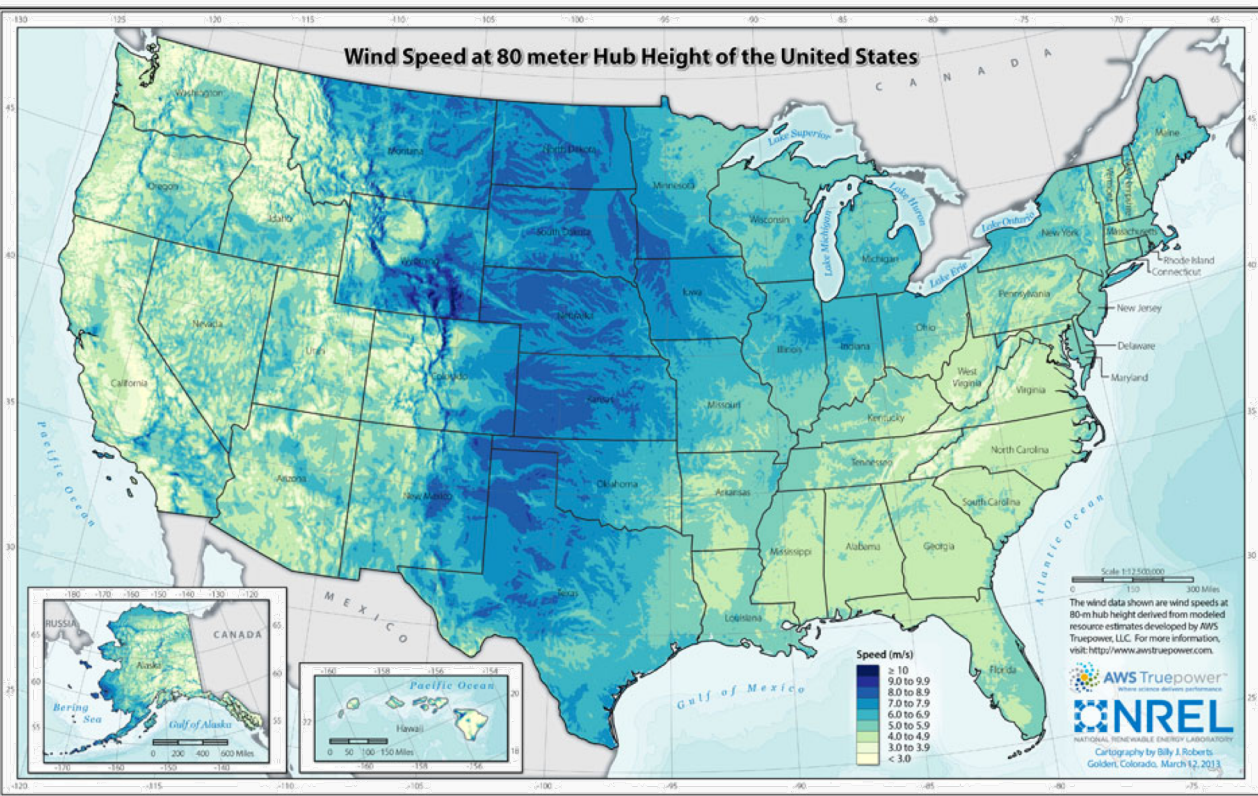


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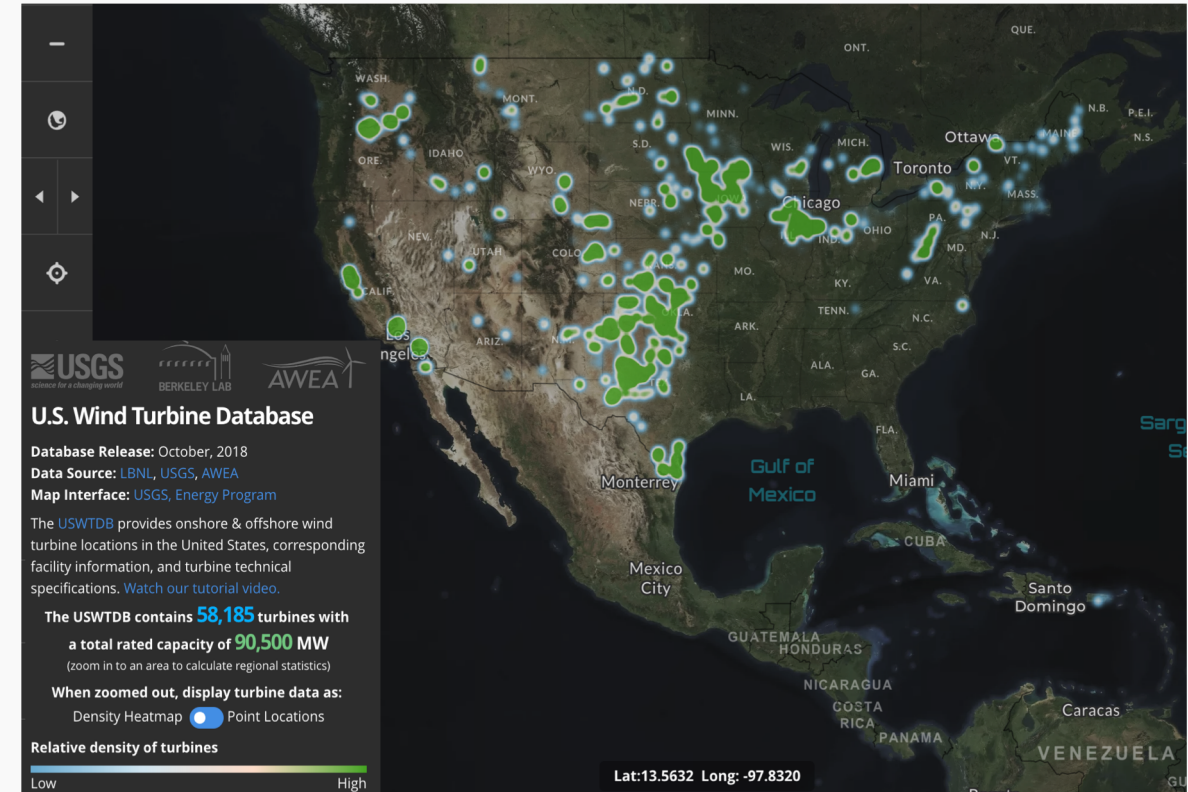
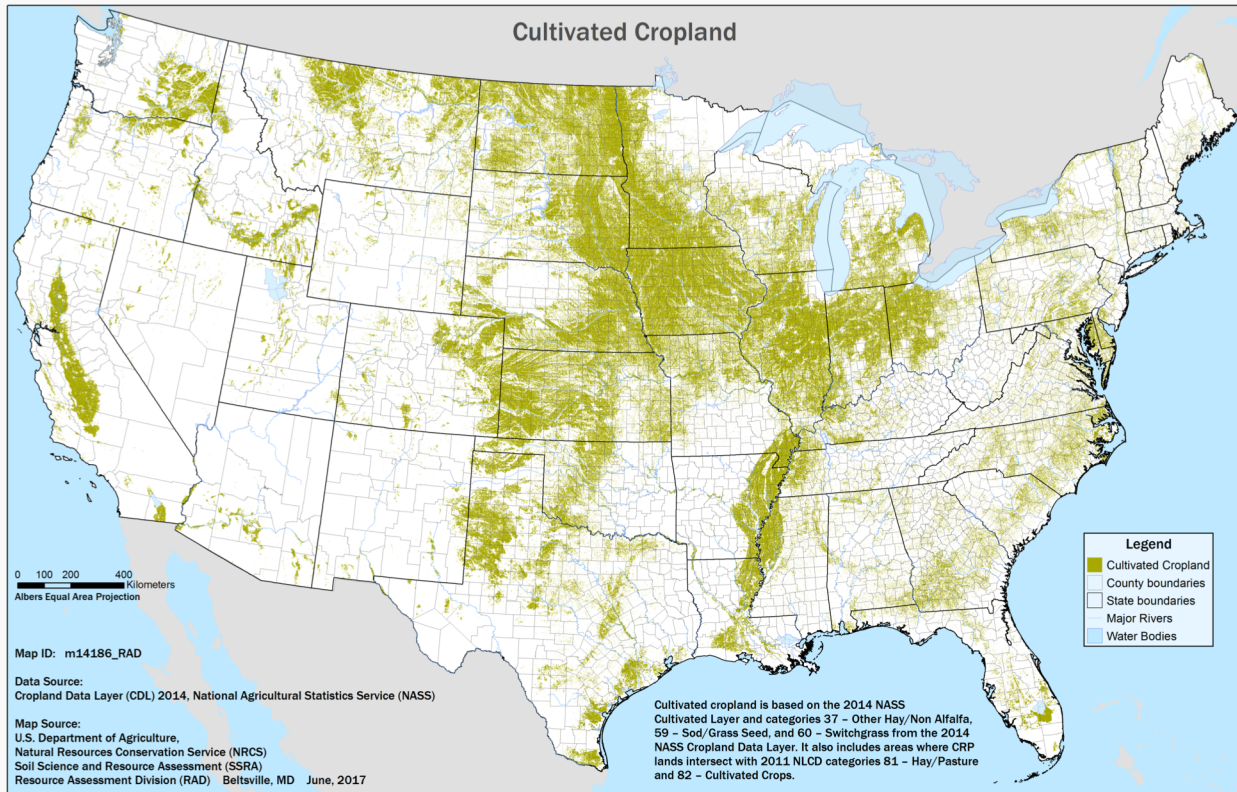
# Wind farms built near each other, over cropland



<https://eerscmap.usgs.gov/uswtodb/viewer/>



# Wind farms built near each other, over cropland



Chances for wind farm wakes to impact cropland

And other wind farms

Encourage deployment of sustainable energy sources and integration into society

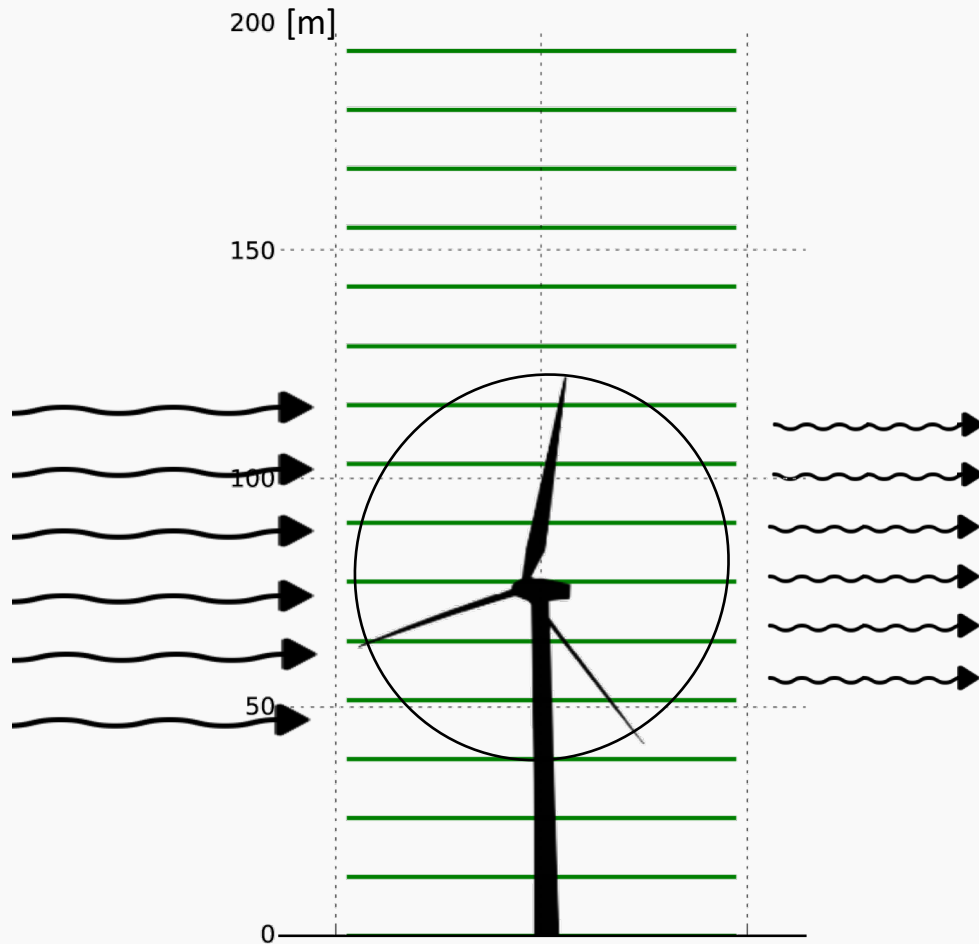


Simulate the impacts of wind farm wakes as accurately as possible

**Hypothesis:** choices in WRF WFP settings impact the surface temperature and wind speed deficits of wind farm wakes



# Wake effects can be simulated with WRF WFP



Weather Research and Forecasting (WRF)  
Wind Farm Parameterization (WFP)<sup>1</sup>

WFP imposes a momentum sink on the mean flow at realistic heights within rotor-swept area

Kinetic energy in wind becomes electricity & TKE

User can input thrust coefficient, power curve of desired turbine, define locations of turbines

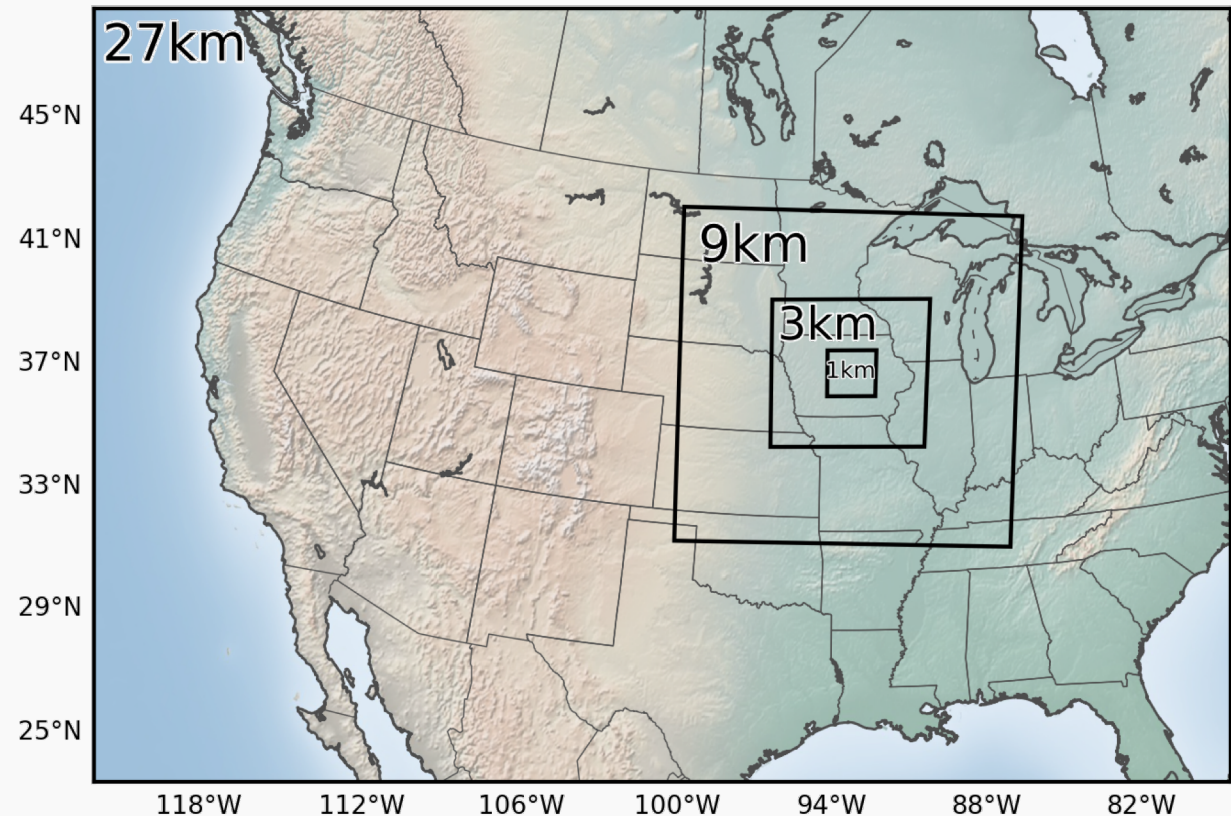
<sup>1</sup>Fitch et al. Local and Mesoscale Impacts of Wind Farms as Parameterized in a Mesoscale NWP Model. *Mon. Wea. Rev.* (2012)

# We test several WRF WFP configurations

## Constant settings

<b>Initial &amp; boundary conditions</b>	ERA-Interim
<b>PBL</b>	MYNN
<b>Period simulated</b>	24-28 Aug 2013, in 24-hr analysis periods
<b>Spin-up time</b>	12 hr
<b>Wind farm</b>	200 GE 1.5 MW SLE (80 m hub height & rotor diameter) turbines from Story County wind farm*

\*Site of the Crop Wind Energy Experiment (CWEX)<sup>1,2</sup>



<sup>1</sup>Rajewski, D., et al. Crop Wind Energy Experiment (CWEX): Observations of Surface-Layer, Boundary Layer, and Mesoscale Interactions with a Wind Farm. *Bull. Amer. Meteor. Soc.* (2013).

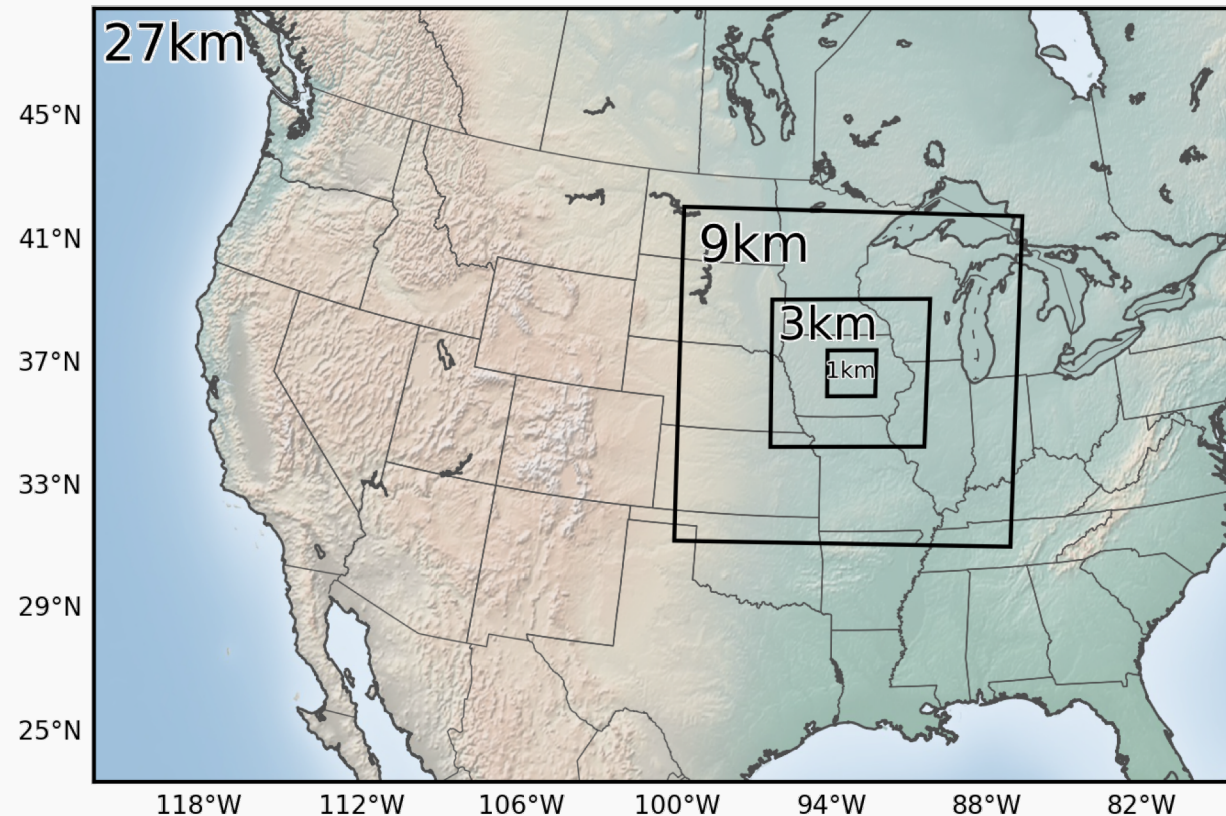
<sup>2</sup>Lee, J. C. Y. and Lundquist, J. K. Evaluation of the wind farm parameterization in the WRF model with meteorological and turbine power data. *Geosci Model Dev.* (2017).



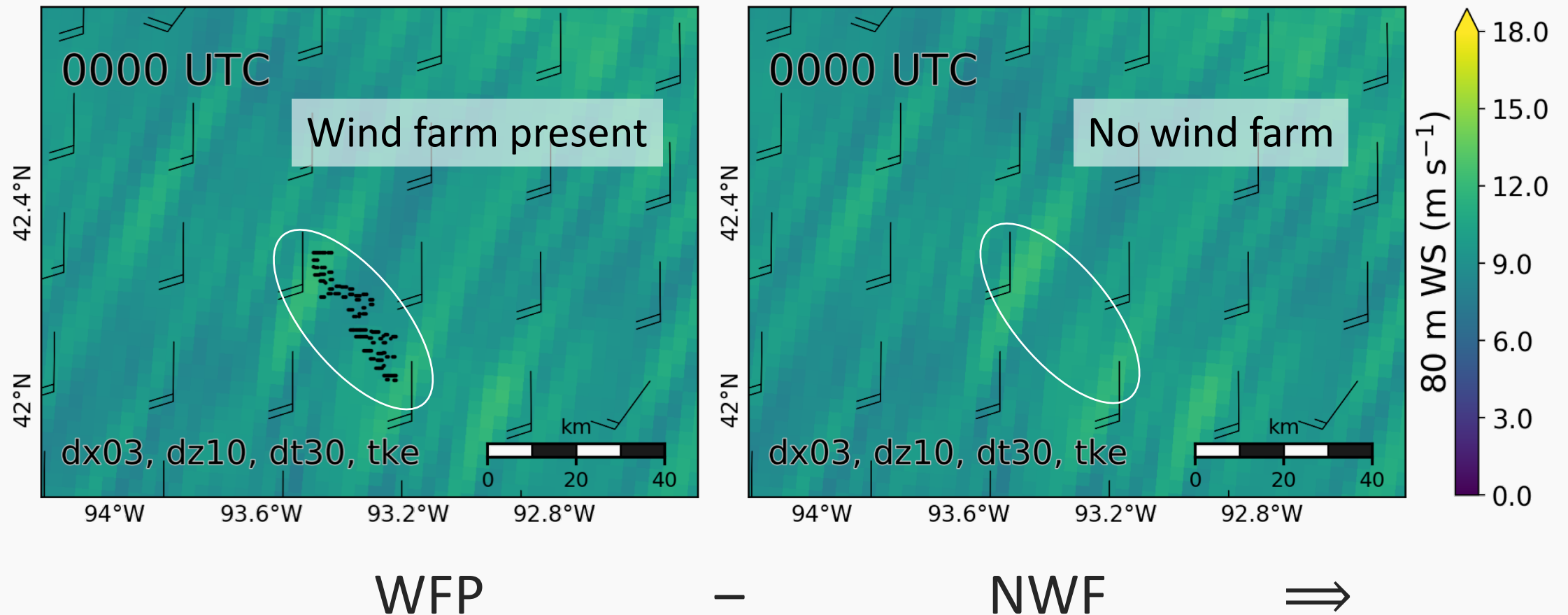
# We test several WRF WFP configurations

## *Varied settings*

<b>Horizontal resolution (dx)</b>	27, 9, 3, 1 km
<b>Vertical resolution 0-200 m (dz)</b>	30, 10 m
<b>Time step (dt)</b>	30, 10 sec
<b>Turbine-generated TKE option (tke/ntke)</b>	On, off

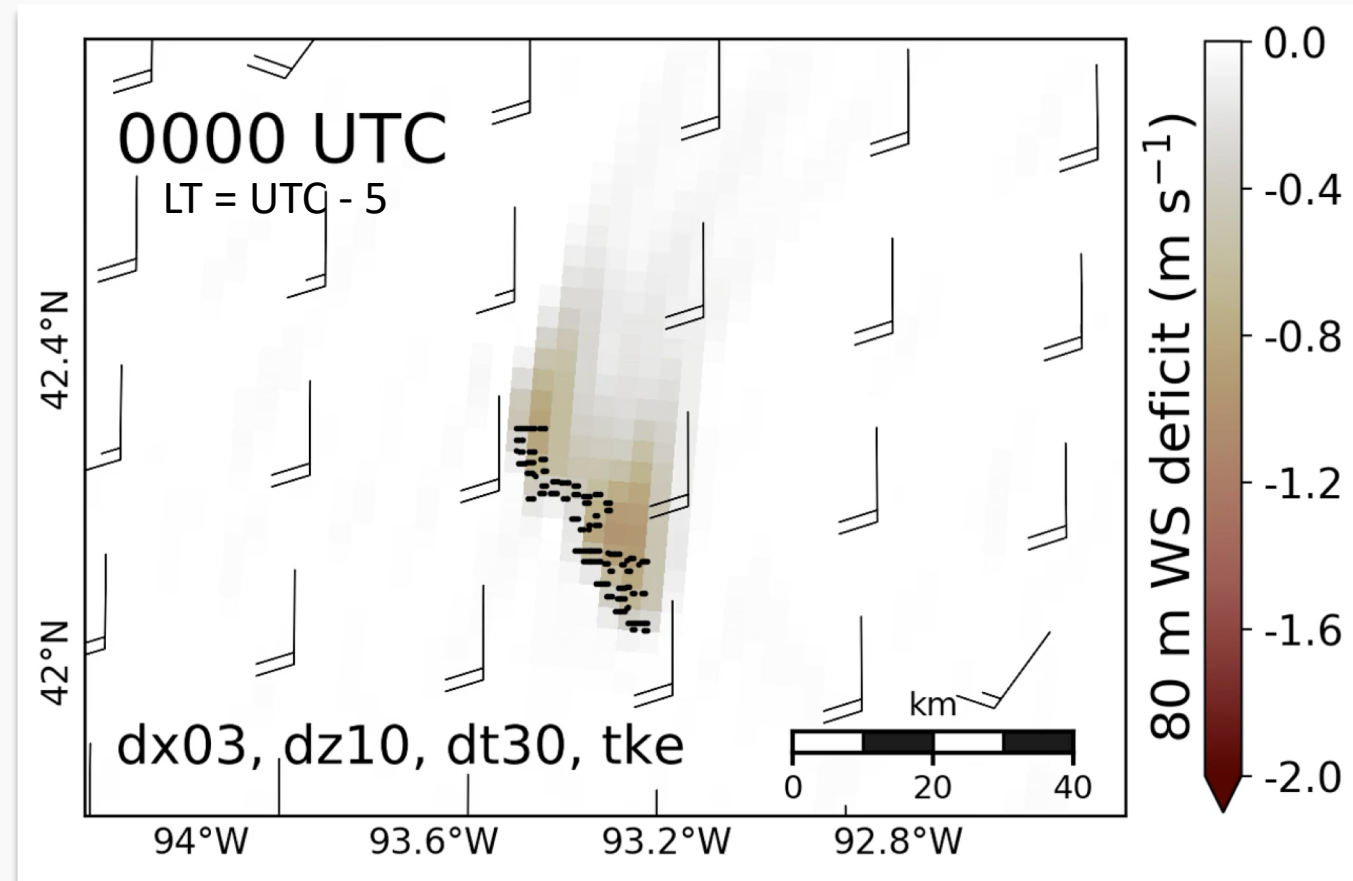


# Subtract model solutions to isolate wake effects



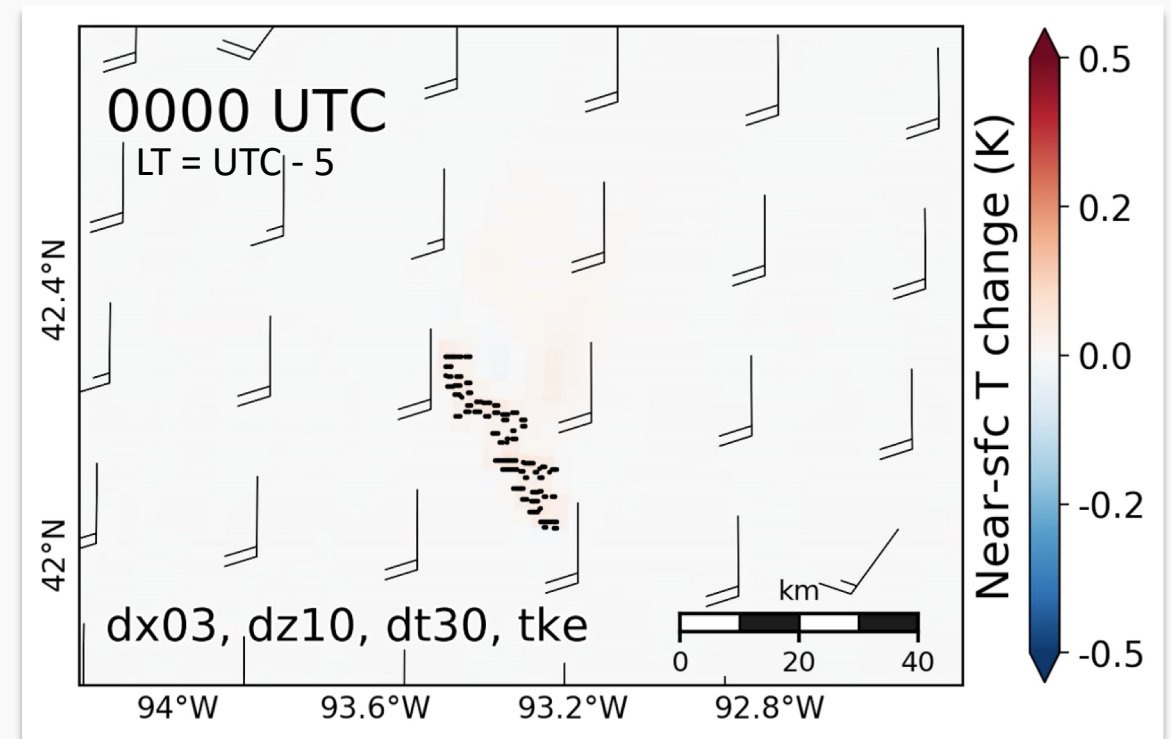
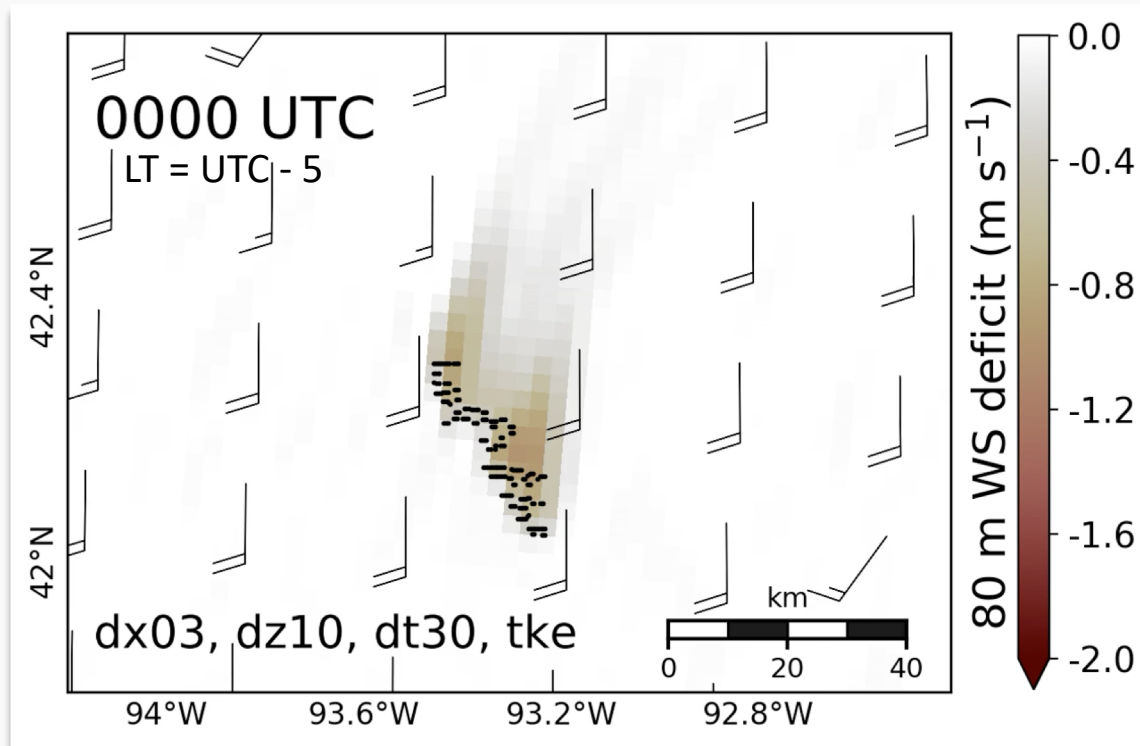


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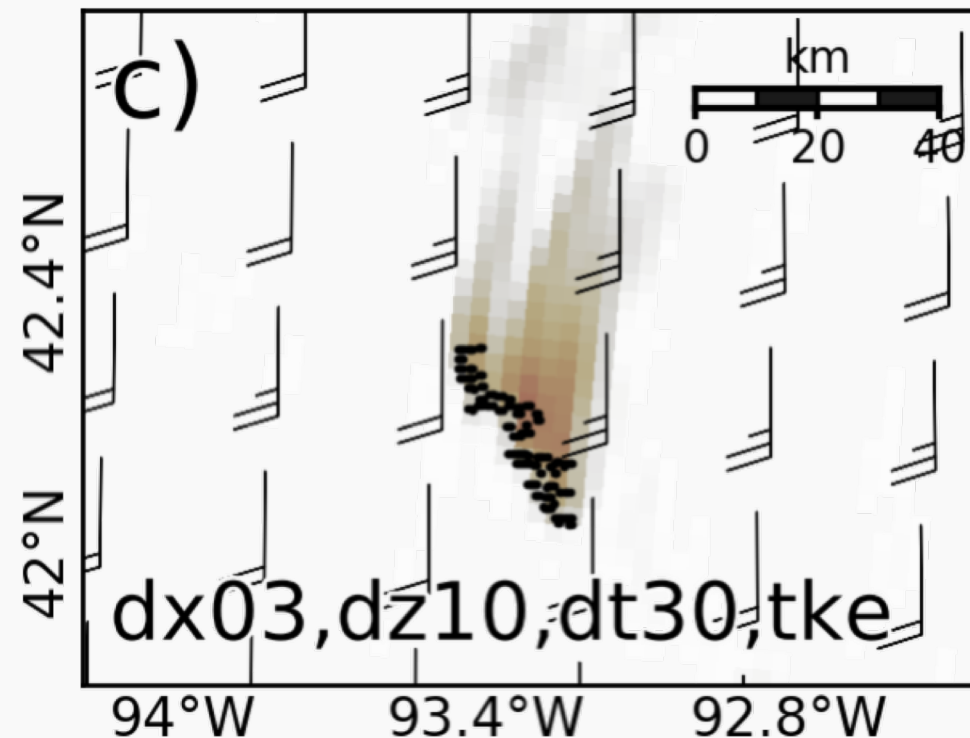


WFP – NWF = wake effect

# Subtract model solutions to isolate wake effects



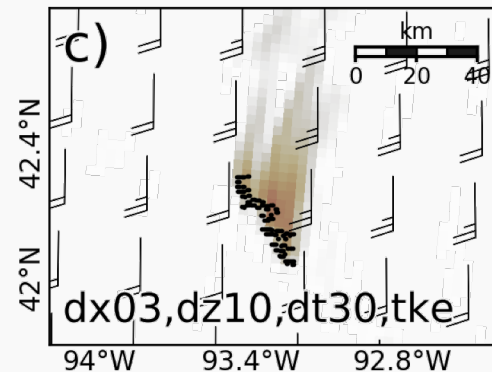
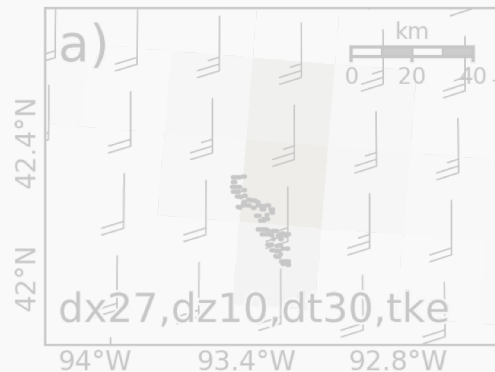
$$\text{WFP} - \text{NWF} = \text{wake effect}$$



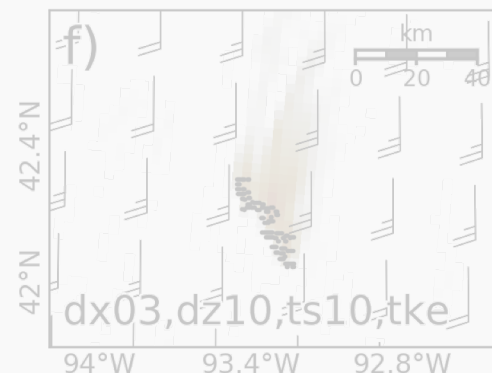
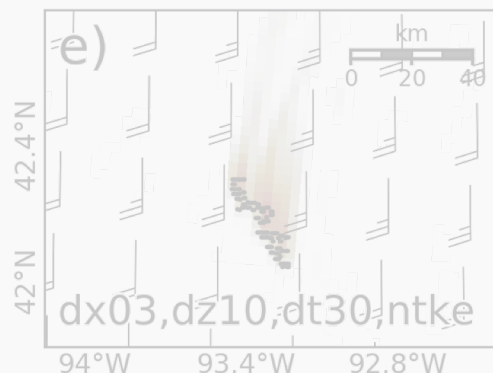
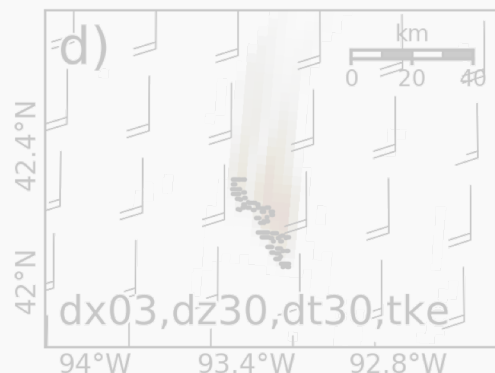


# 80 m WS deficit is sensitive to WRF WFP config

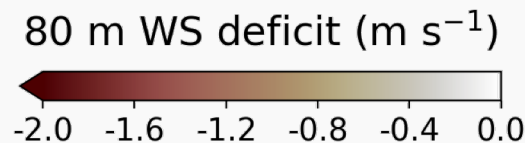
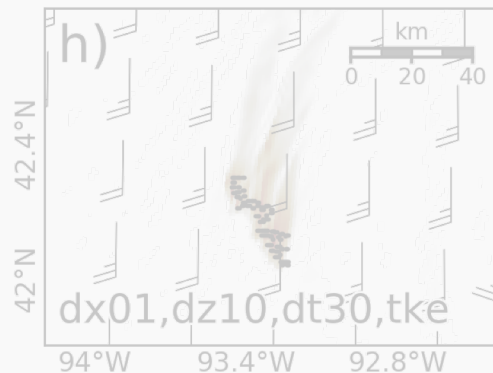
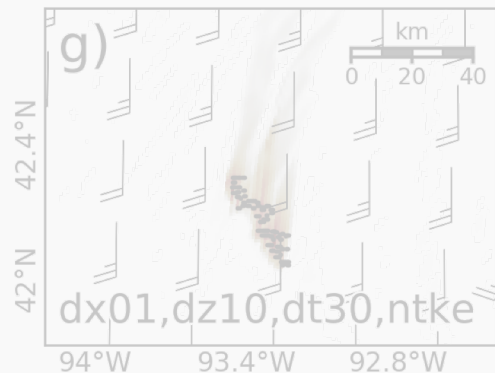
*Coarse dx (a,b)  
reduces WS deficit  
but spans larger area*



*Coarse dz (d) or TKE  
opt. off (e) modifies  
far-wake shape*

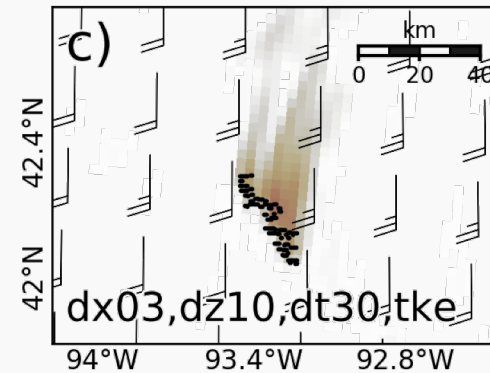
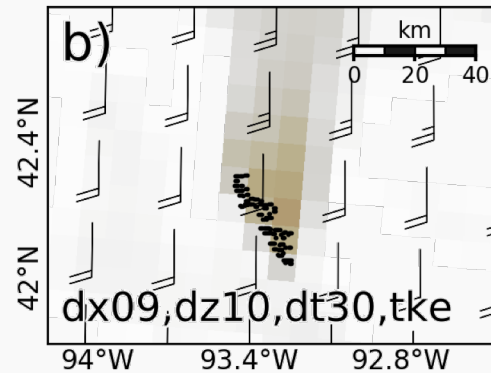
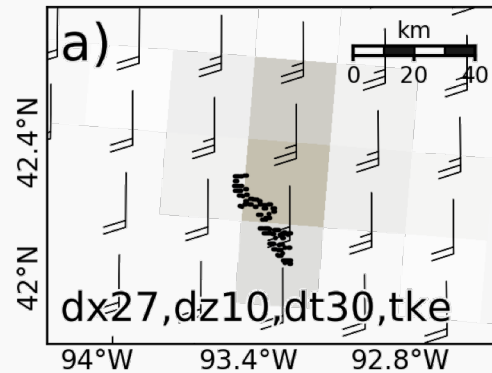


*Changing dt (f) has  
minimal impact*

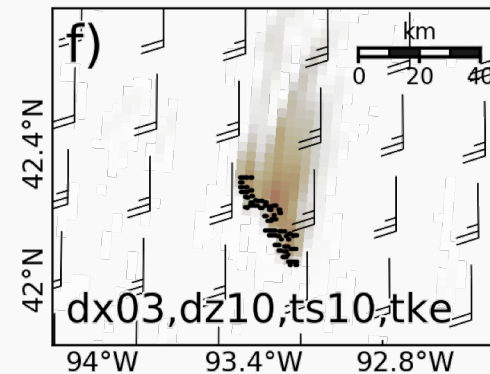
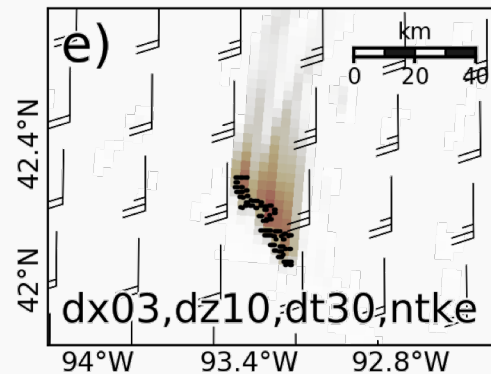
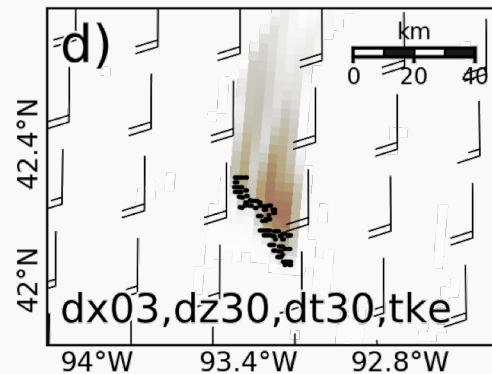


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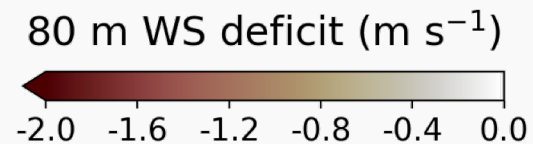
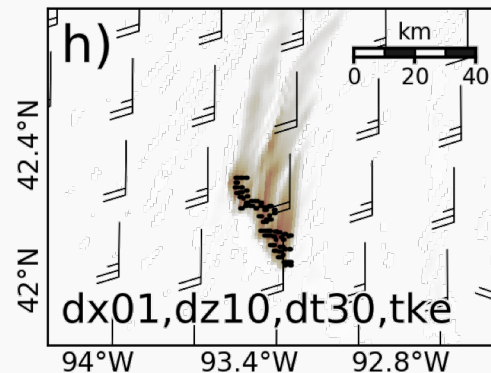
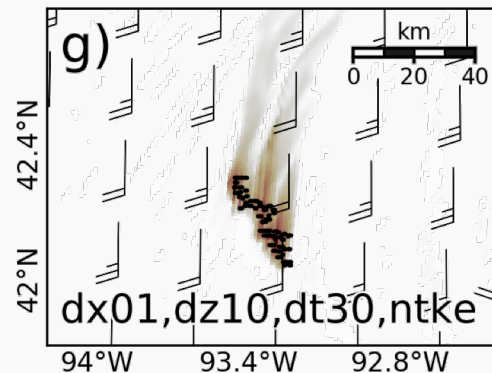


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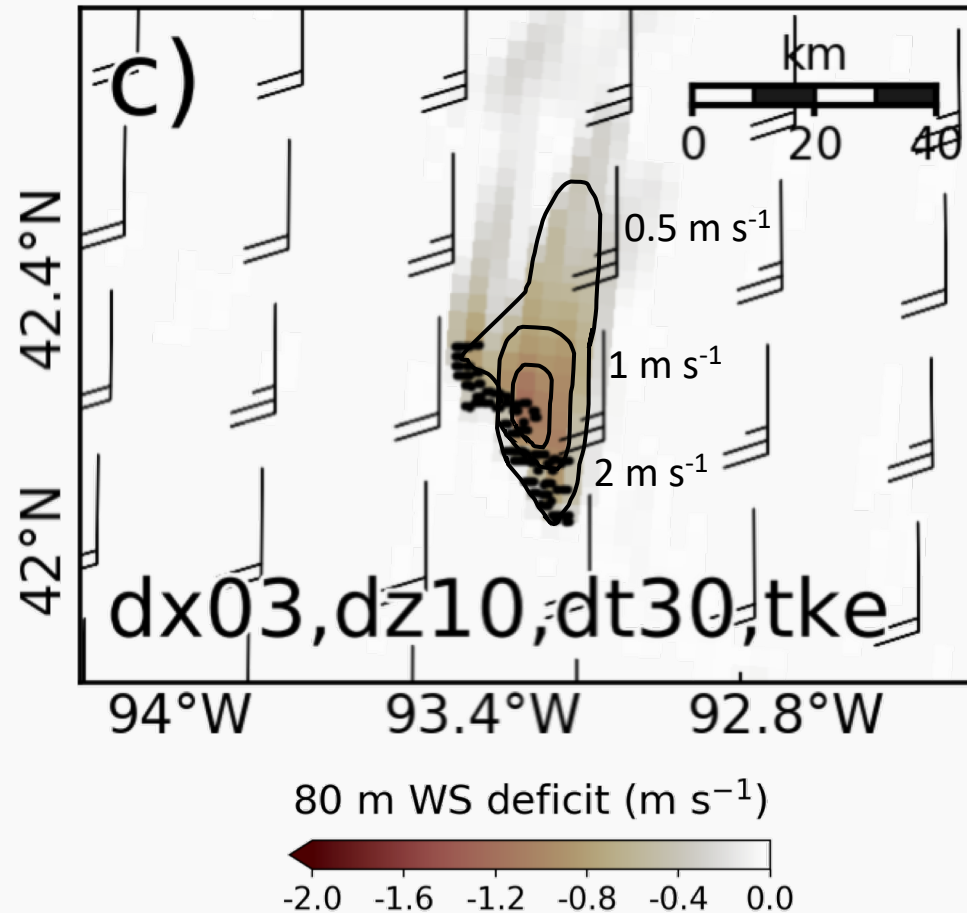
*Fine dx (g,h)  
dominates effect of  
changing TKE opt. (g)*



How much space does the config predict is impacted by large WS deficits of  $2 \text{ m s}^{-1}$ ?

Or of  $1 \text{ m s}^{-1}$ ?

Of  $0.5 \text{ m s}^{-1}$ ?

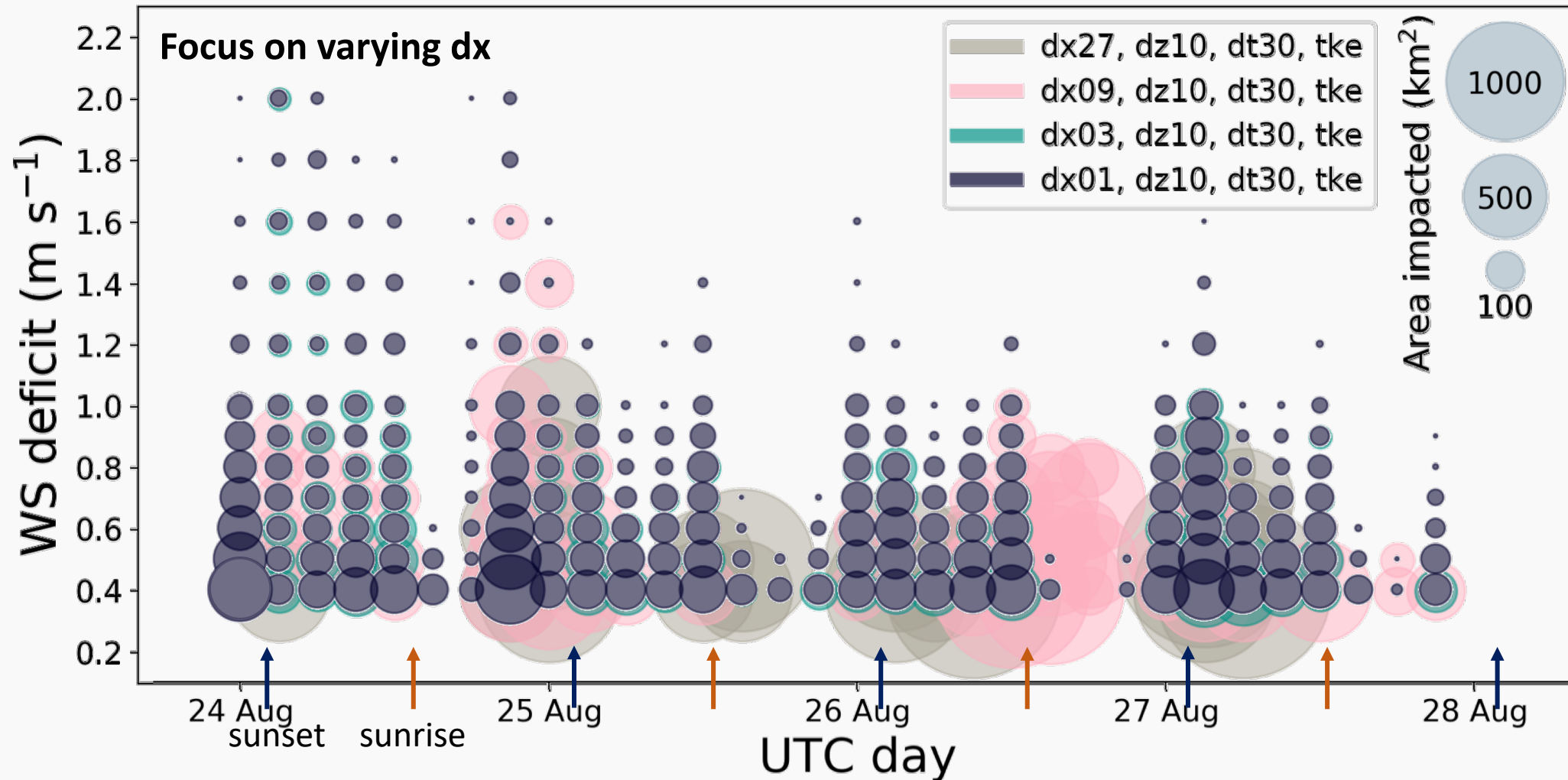


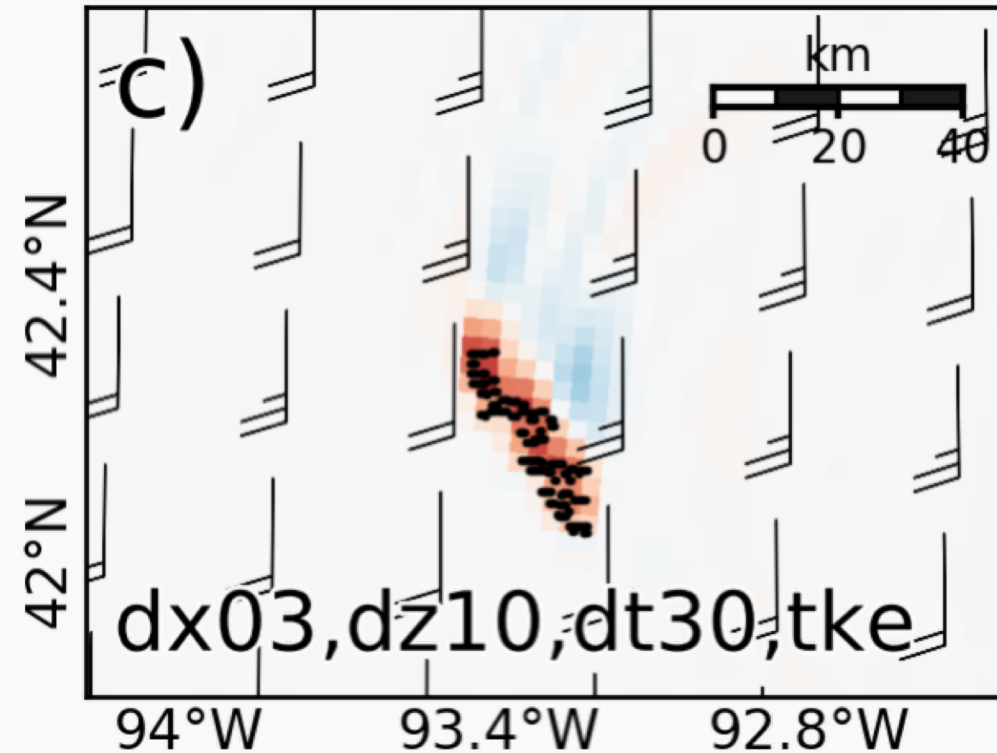
And how often?

During which times of day?



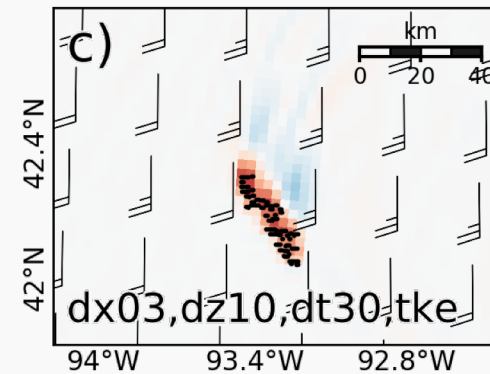
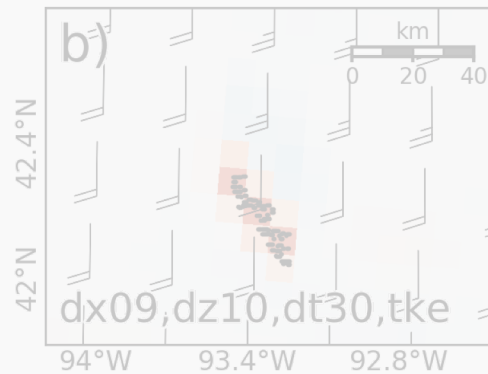
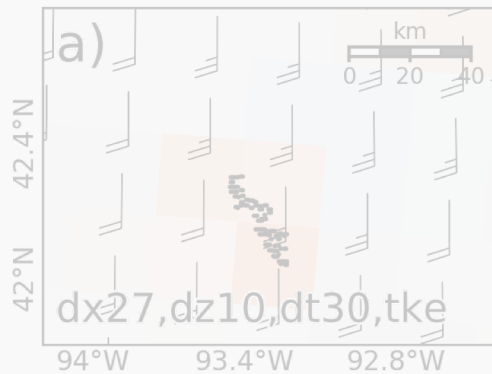
# Smaller dx needed to capture higher WS deficits



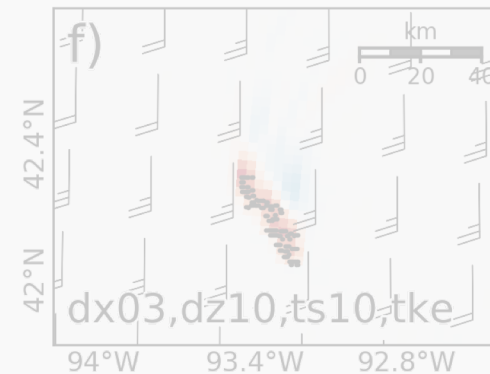
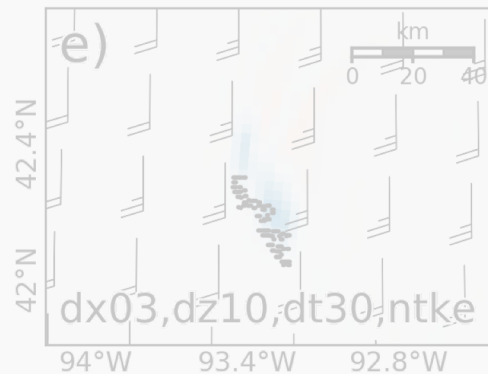
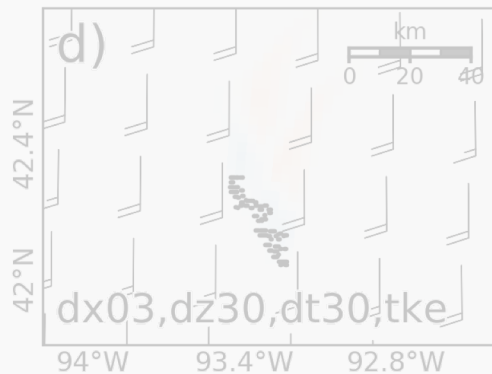


# Even the sign of sfc T change depends on config

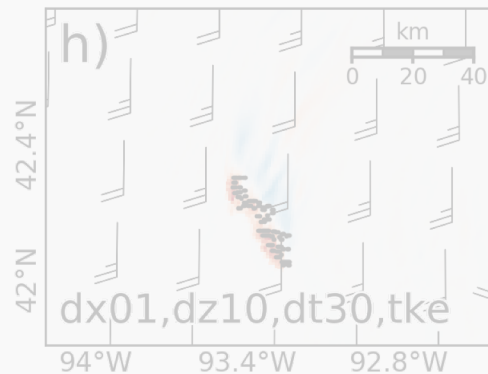
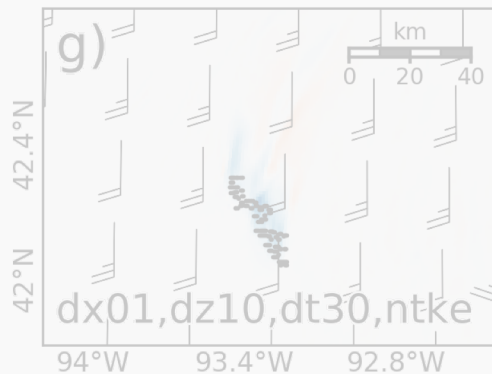
*Coarse dx (a,b) has larger areas of subtle warming*



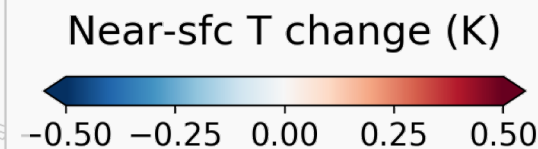
*Coarse dz (d) or TKE opt. off (e) changes sign of T change*



*Reducing dt (f) has minimal impact*



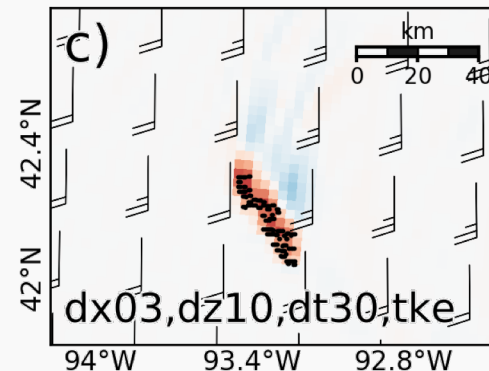
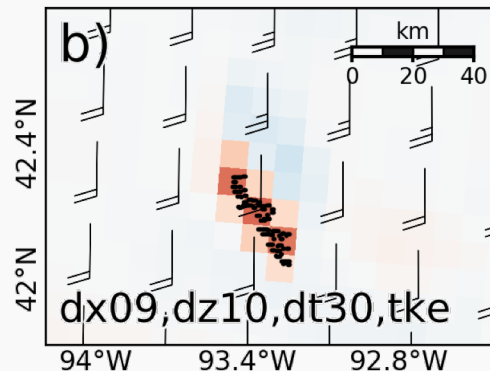
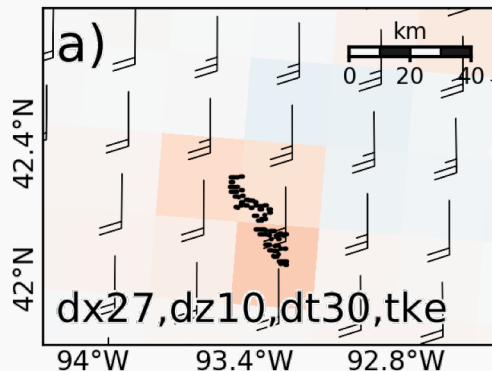
*1km dx (h) warms sfc only of cells with turbines*



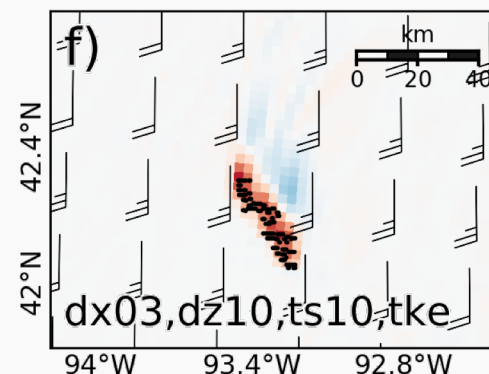
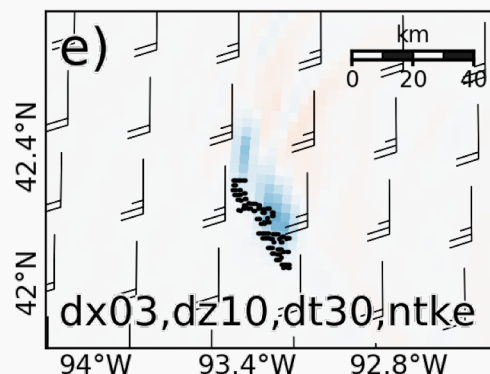
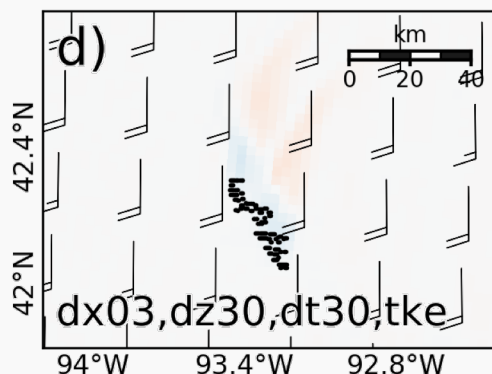


# Even the sign of sfc T change depends on config

*Coarse dx (a,b) has larger areas of subtle warming*

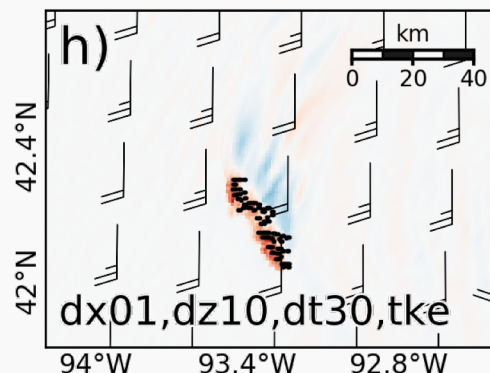
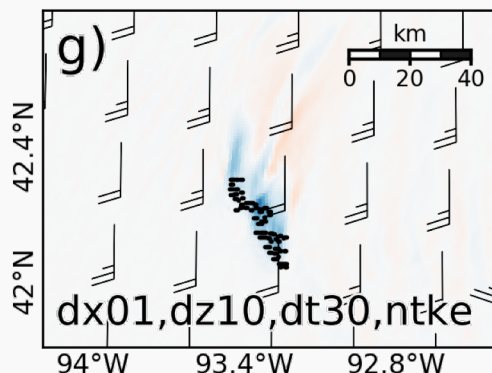


*Coarse dz (d) or TKE opt. off (e) changes sign of T change*

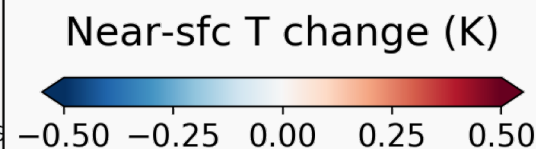


*Reducing dt (f) has minimal impact*

*TKE opt. off (g) cools surface even at finer dx*



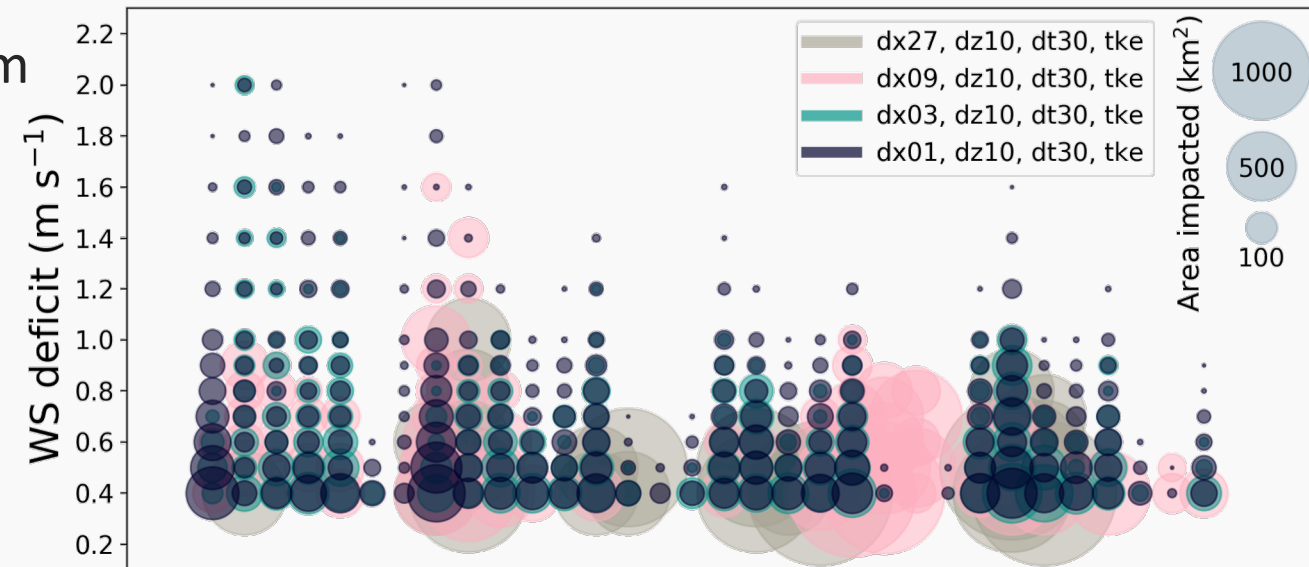
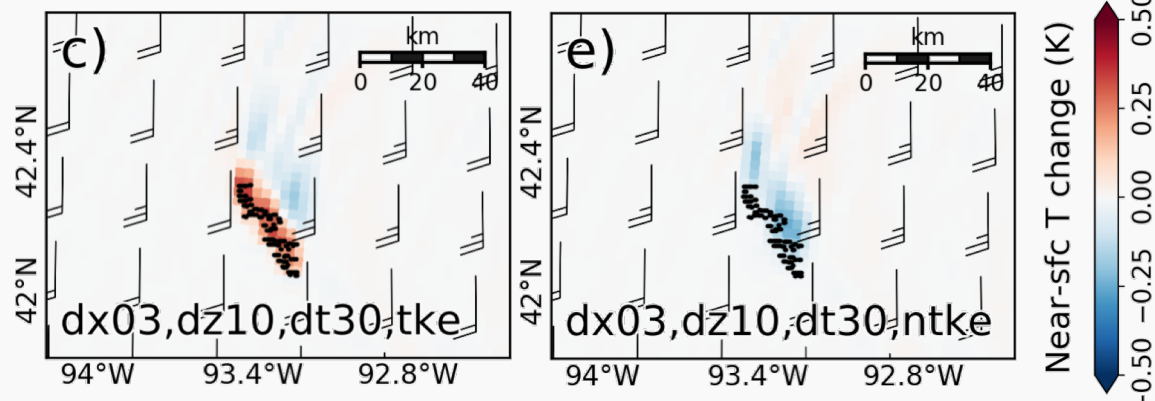
*1km dx (h) warms sfc only of cells with turbines*




# Wake effects are sensitive to WRF WFP settings

## WRF WFP Recommendations:

1. Horizontal resolution (dx): no coarser than 3 km
2. Vertical resolution (dz): 10 m preferable to 30 m
3. Time step (dt): 30 sec at 27 km dx (3.33 at 3 km dx) is sufficient
4. TKE option must be turned on to match observed sfc T change







# Thank you!

## Any questions?

### **Acknowledgments**

National Science Foundation grant BCS-1413980 (Coupled Human Natural Systems)

Computing resources provided by the Extreme Science and Engineering Discovery Environment (XSEDE)

National Science Foundation grant ACI-1053575 (NSF GRFP)

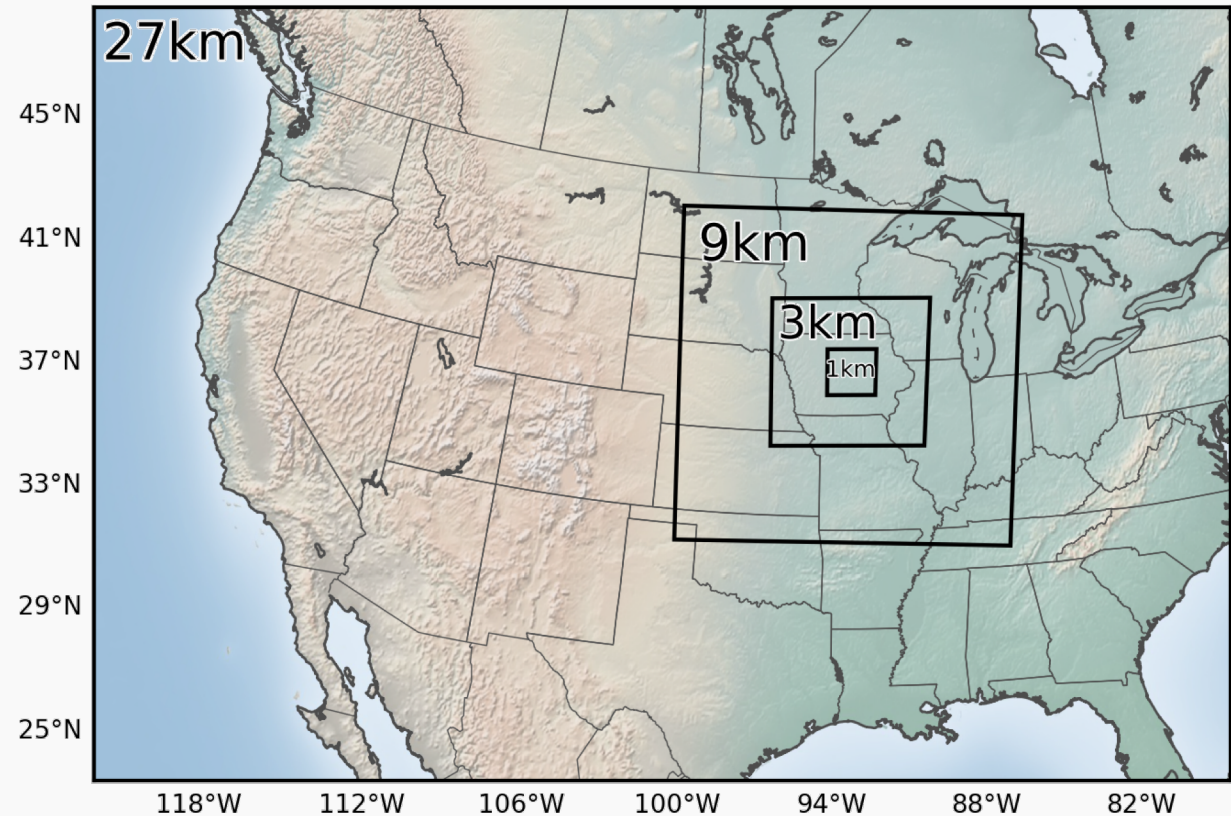
Photo by: Jessica Tomaszewski



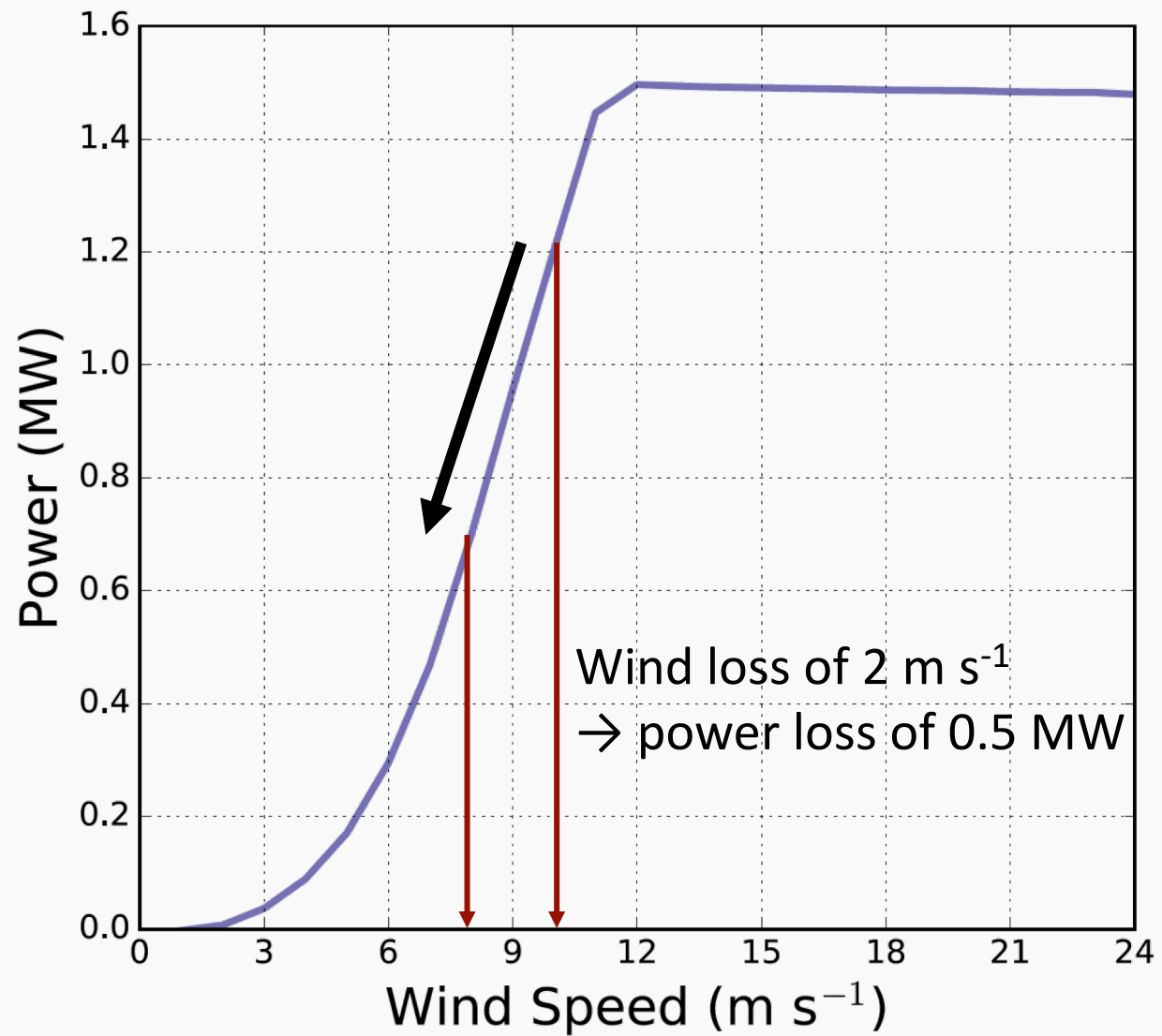


# Computation expense per simulated day

config	core-hrs
<b>dx27</b> , dz10, dt30, tke	12
<b>dx09</b> , dz10, dt30, tke	48
<b>dx03</b> , dz10, dt30, tke	200
<b>dx01</b> , dz10, dt30, tke	630
dx03, <b>dz30</b> , dt30, tke	156
dx03, dz10, <b>dt10</b> , tke	650
dx03, dz10, dt30, <b>ntke</b>	200
dx01, dz10, dt30, <b>ntke</b>	630

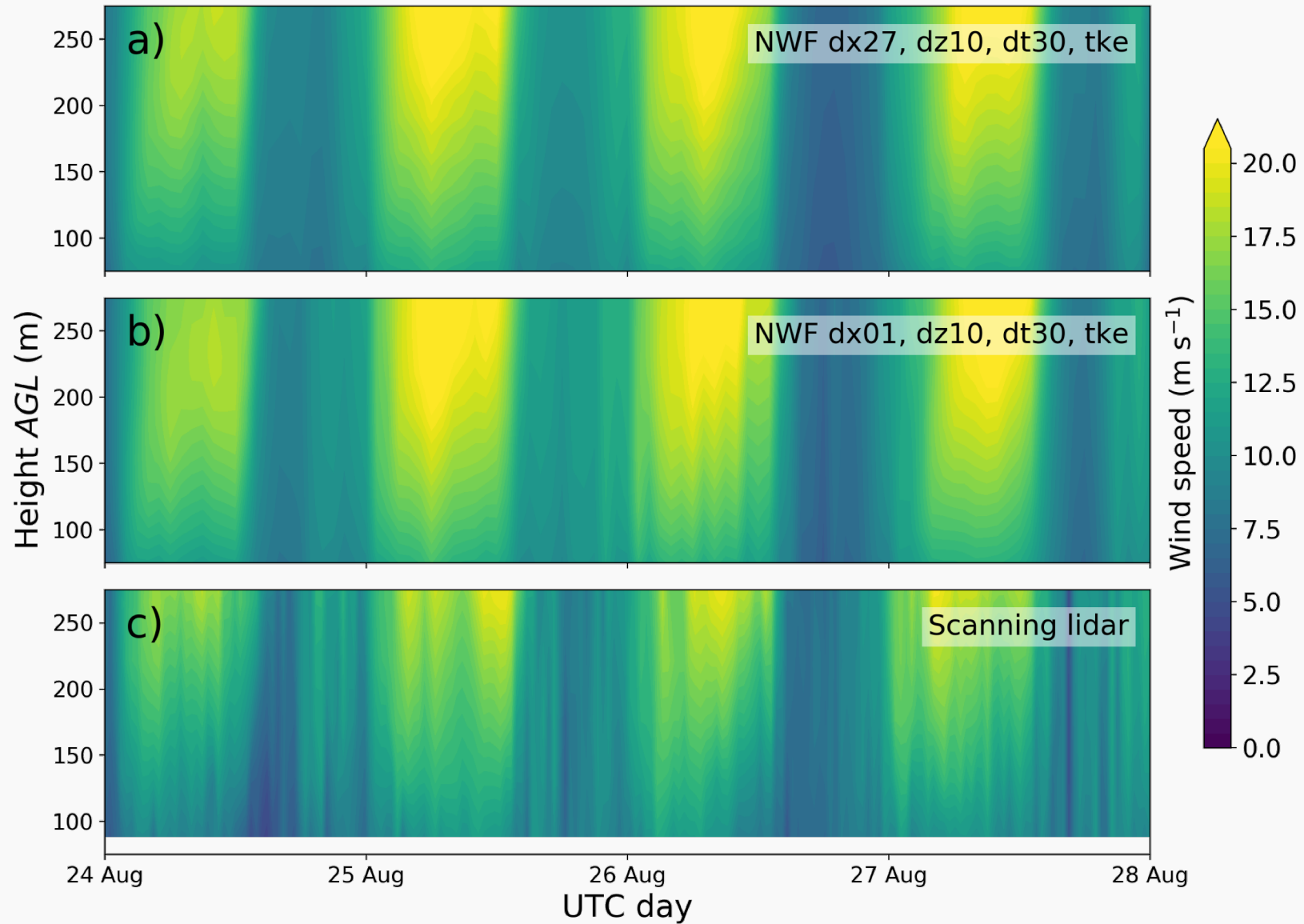


(each run 12 hrs spin-up + 24 hrs analysis)



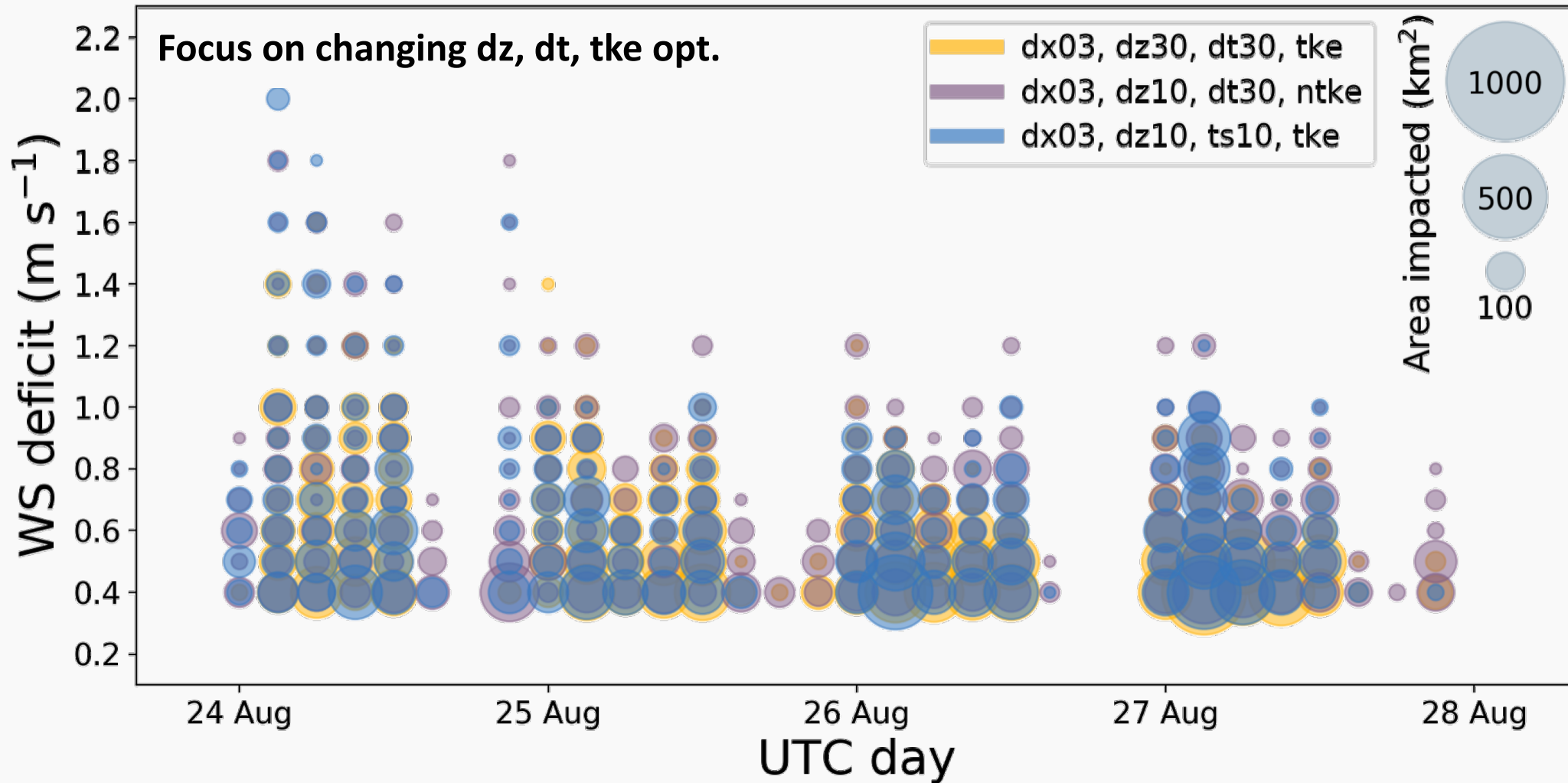


# All WRF configs see high WS bias



dx01 resolves pulsing  
intensity of LLJ vs dx27

# Larger dz predicts larger areas of low deficits

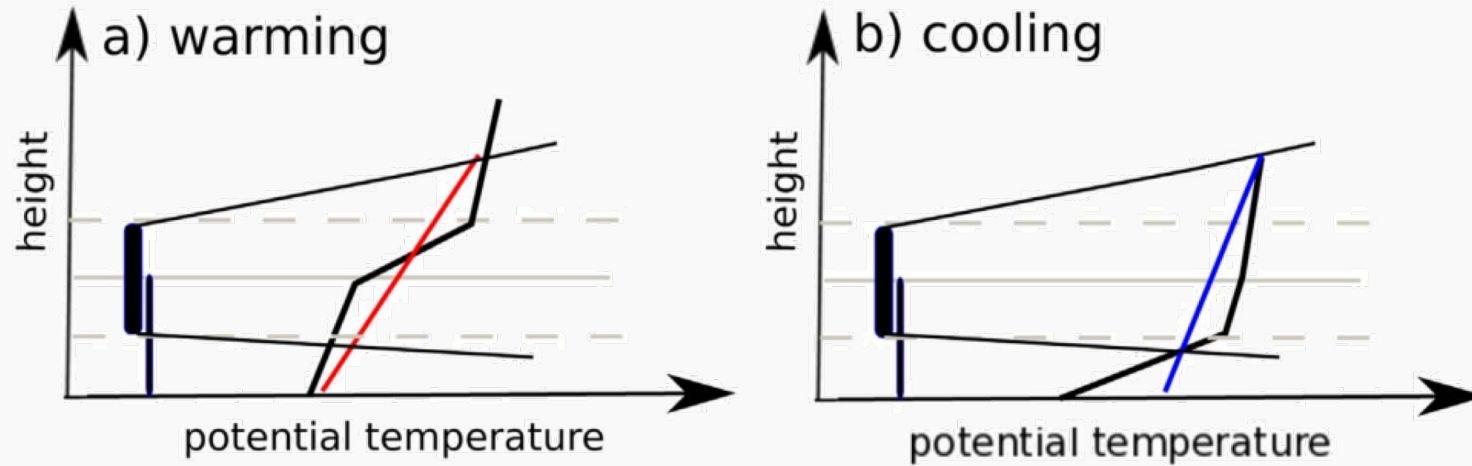




# Wakes impact their ambient environment

Hub-height wind speed deficits cause loss in power and revenue for downwind wind farms<sup>1,2</sup>

Increased turbulence mixes warmer air from nighttime inversions to surface<sup>3</sup>



*Siedersleben et al. 2018*

<sup>1</sup>Nygaard, N. G. Wakes in very large wind farms and the effect of neighbouring wind farms. *J. Phys. Conf. Ser.* (2014).

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<sup>3</sup>Siedersleben, S. K. et al. Micrometeorological impacts of offshore wind farms as seen in observations and simulations. *Environ. Res. Lett.* (2018).

# We test several WRF WFP configurations

8 configurations

dx	dz	dt	tke opt.
<b>dx27</b> , dz10, dt30, tke	dx03, <b>dz30</b> , dt30, tke	dx03, dz10, <b>dt10</b> , tke	dx03, dz10, dt30, <b>ntke</b>
<b>dx09</b> , dz10, dt30, tke			dx01, dz10, dt30, <b>ntke</b>
<b>dx03</b> , dz10, dt30, tke			
<b>dx01</b> , dz10, dt30, tke			

