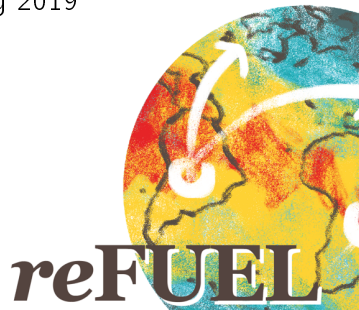


The potential for re-powering wind turbines: reducing turbines, increasing output

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Introduction

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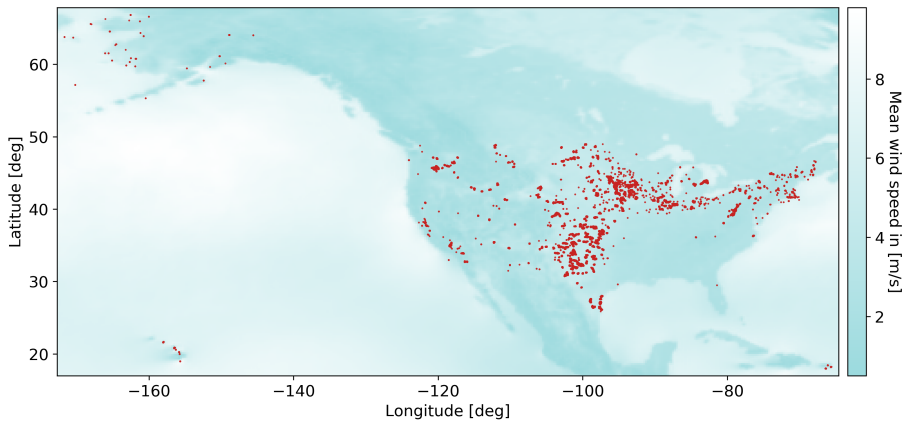
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- ▶ **repowering** = replacing power plants with newer ones, which have a higher rated **capacity** or more **efficiency**
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Data



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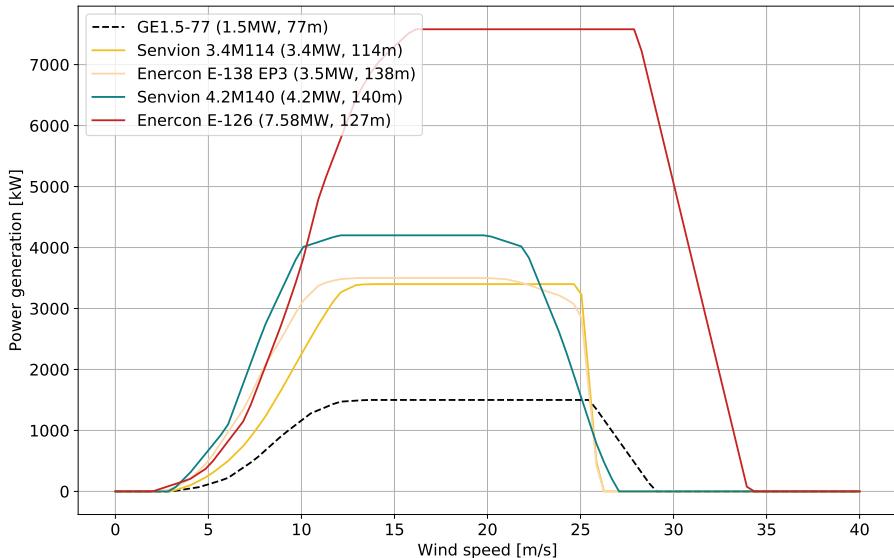
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- ▶ Data sheets and NREL SAM: **rotor diameter**, **power curve** for some selected turbine models

Turbine models

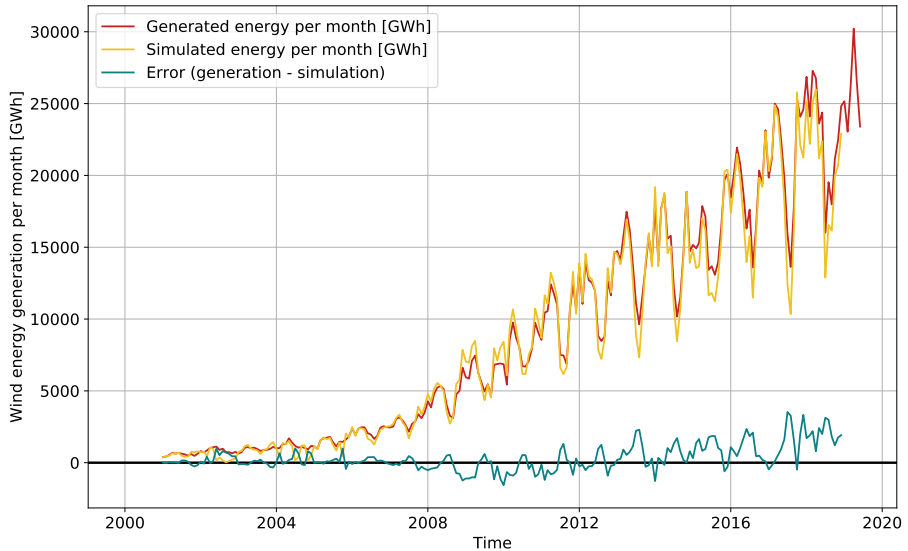
Model name	Rated capacity	Rotor diameter
GE-1.5 77	1.5 MW	77 m
Senvion 3.4M114	3.4 MW	114 m
Enercon E-138 EP3	3.5 MW	138 m
Senvion 4.2M140	4.2 MW	140 m
Enercon E-126	7.58MW	127 m

GE-1.5 77 is the most frequent model in the U.S. (14.7% of all turbines).

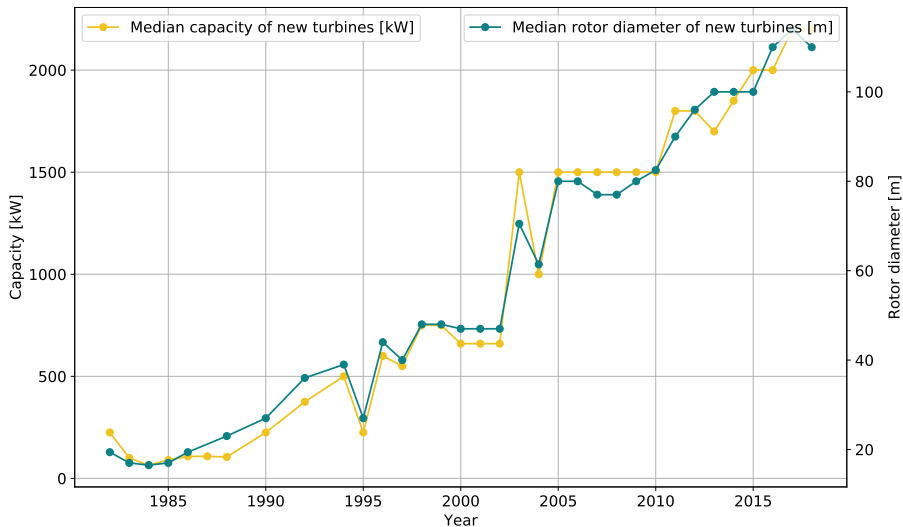
Power curves



Simulation of power generation



Historical development of wind turbine characteristics



Optimization problem:

Existing turbines are replaced by newer ones at the location of the old turbines, such that:

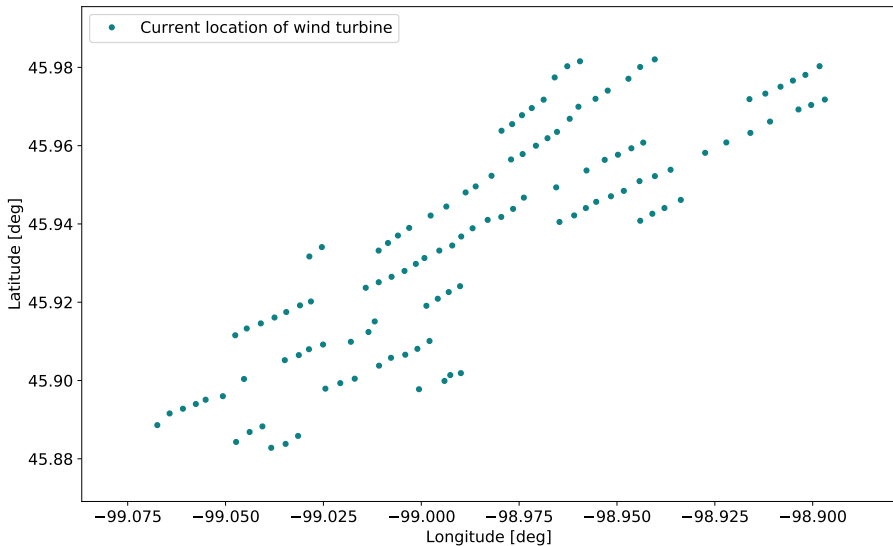
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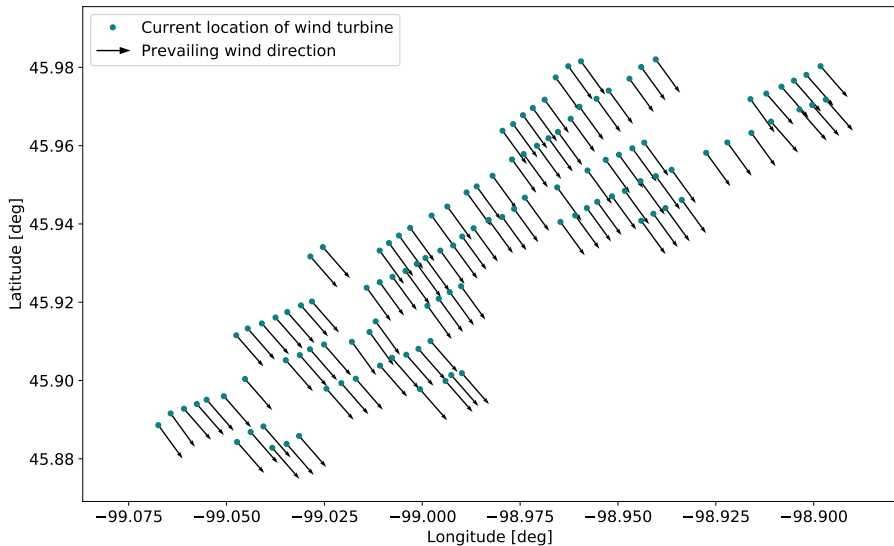
Existing turbines are replaced by newer ones at the location of the old turbines, such that:

- ▶ objective function: total power generation is maximized
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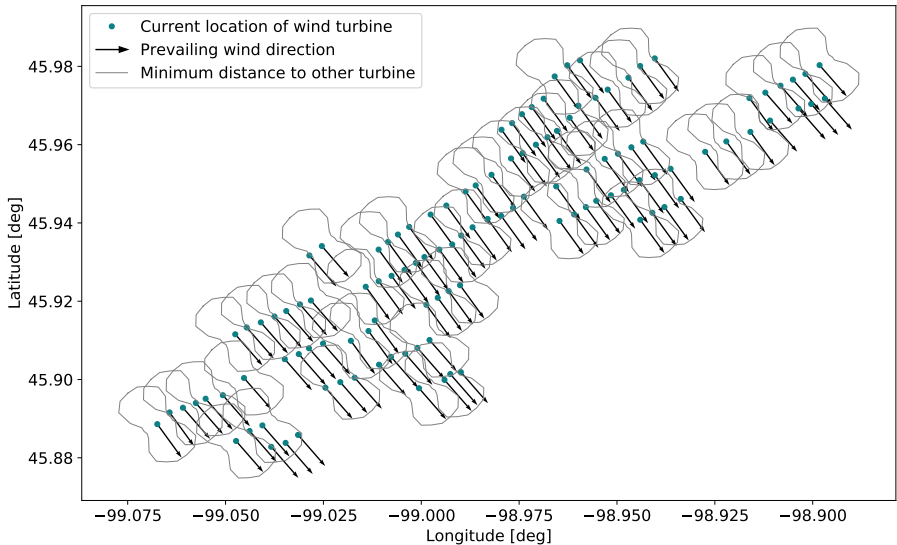
Optimal locations for new wind turbines



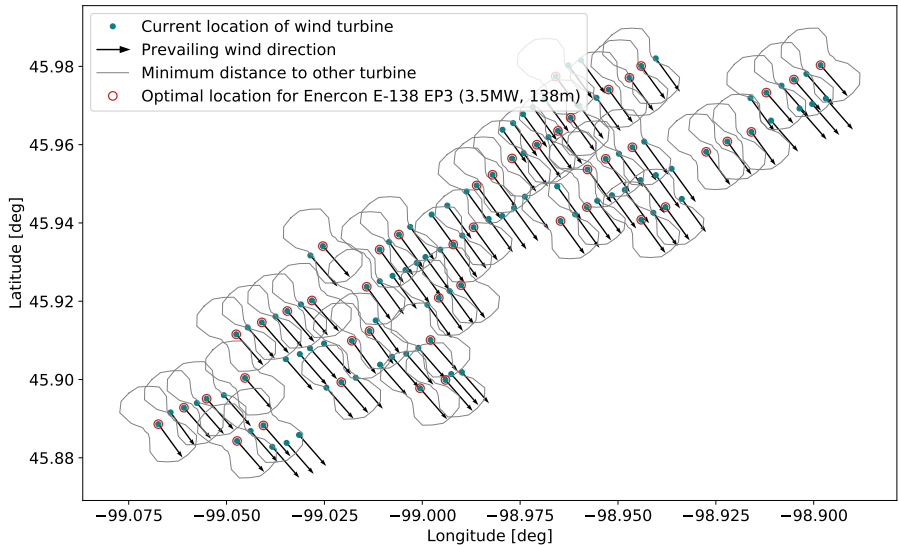
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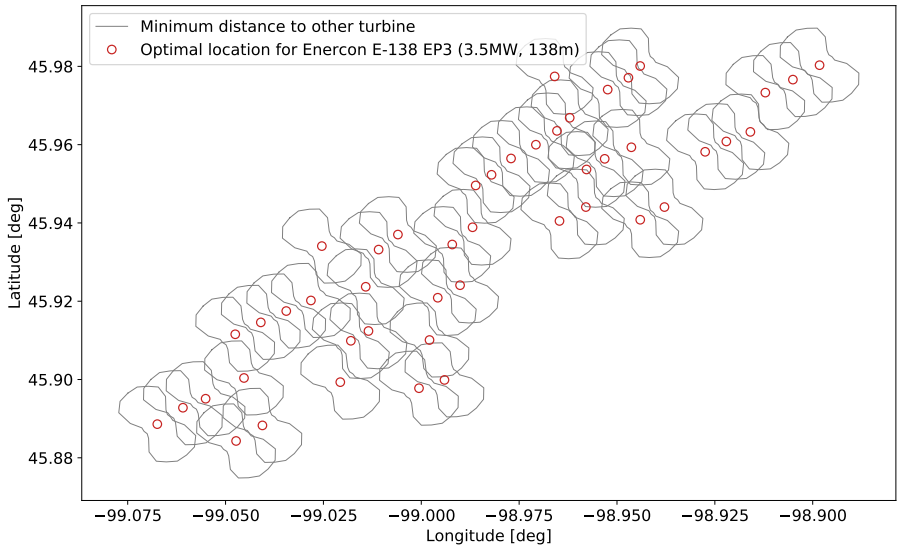
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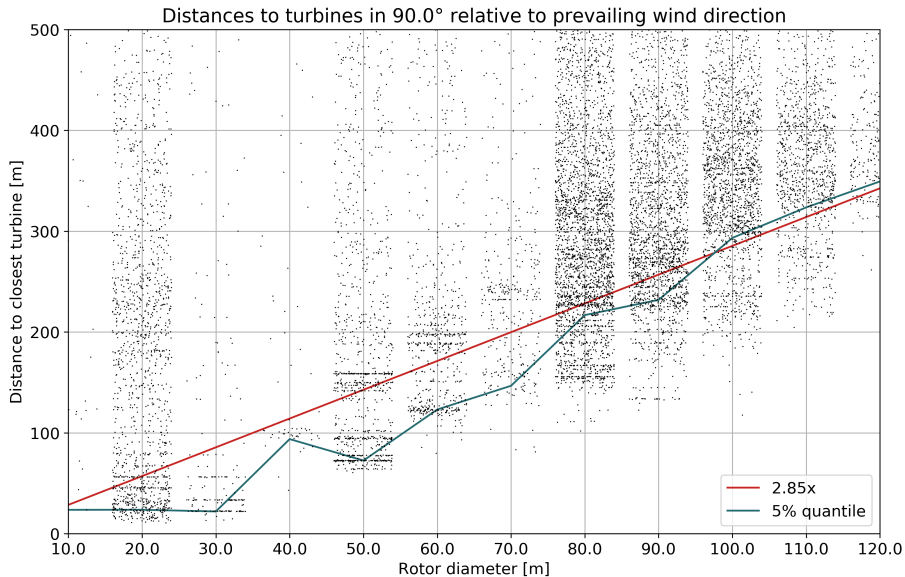
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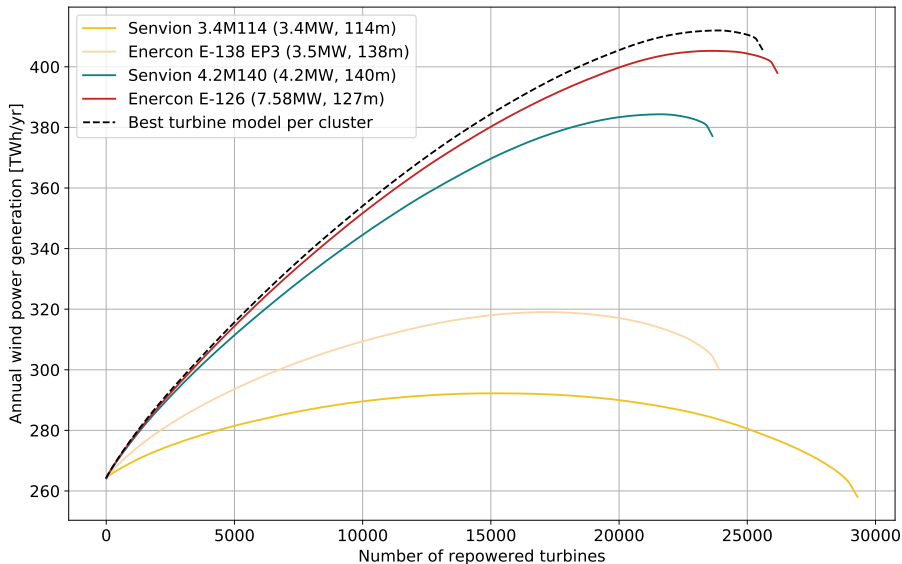
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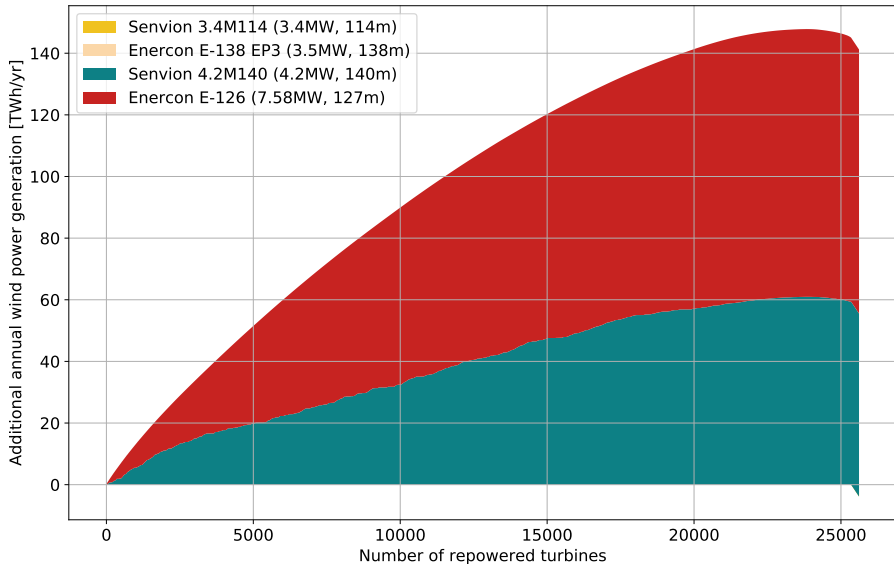
Minimum distances between turbine locations



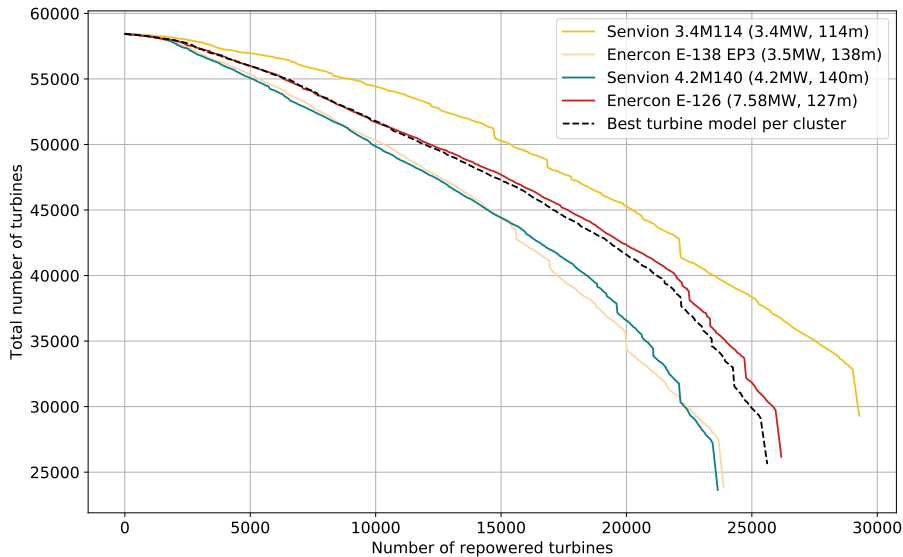
Repowering potential: power generation



Repowering potential: best turbine models



Repowering potential: number of turbines



Conclusions

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- ▶ **Code:** MIT-licensed (partially CC-BY), see <http://bit.ly/wind-repower-us>

Thank you!

<https://refuel.world/>
peter.regner@boku.ac.at
<http://bit.ly/wind-repower-us>



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