



## Optimization of turbulence measurements for radar, lidar and sonic anemometers

A.C.P. Oude Nijhuis, C.M.H. Unal, O.A. Krasnov, H.W.J. Russchenberg and A. Yarovoy

# Outline

---

## Introduction and motivation

Turbulence retrieval methods

Cascade turbulence model

Experiments

I. Number of samples

II. Inertial range check

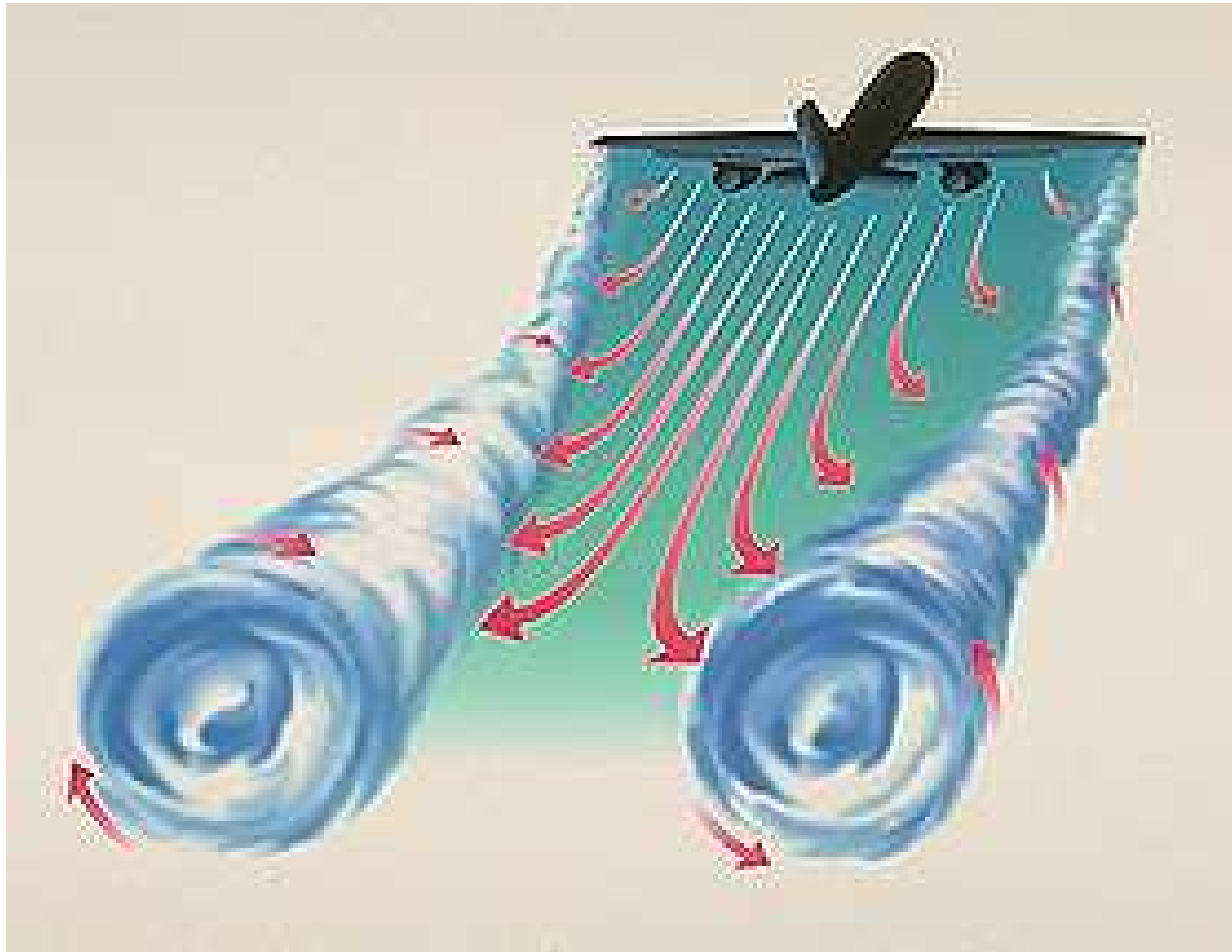
III. Cloud structure and beamwidth

IV. Noise

Conclusions and outlook

# Introduction and motivation

We all want a safe flight...



# Introduction and motivation



New generation operational multifunction x-band and 1.5  $\mu\text{m}$  lidar sensors for wind hazards monitoring sensors on airport



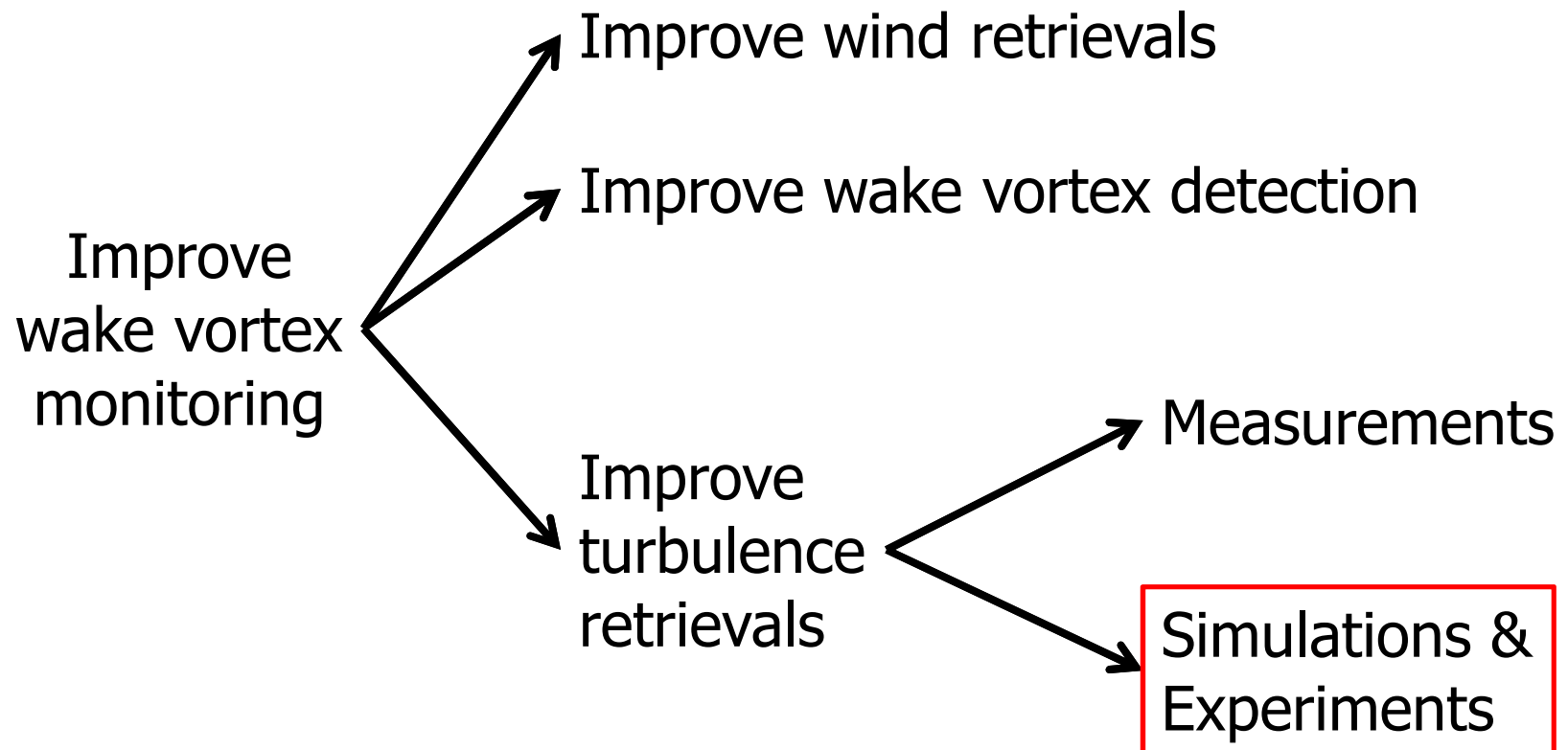
Solution to mitigate wake vortex and weather hazards. Potentially increase the airport capacity.

Monitoring under all weather conditions by using scanning radars and lidars.

Does it work???!!!???

# Introduction and motivation

We would like to improve turbulence retrievals and improve wake vortex monitoring. How to do this?



# Outline

---

Introduction and motivation

Turbulence retrieval methods

Cascade turbulence model

Experiments

I. Number of samples

II. Inertial range check

III. Cloud structure and beamwidth

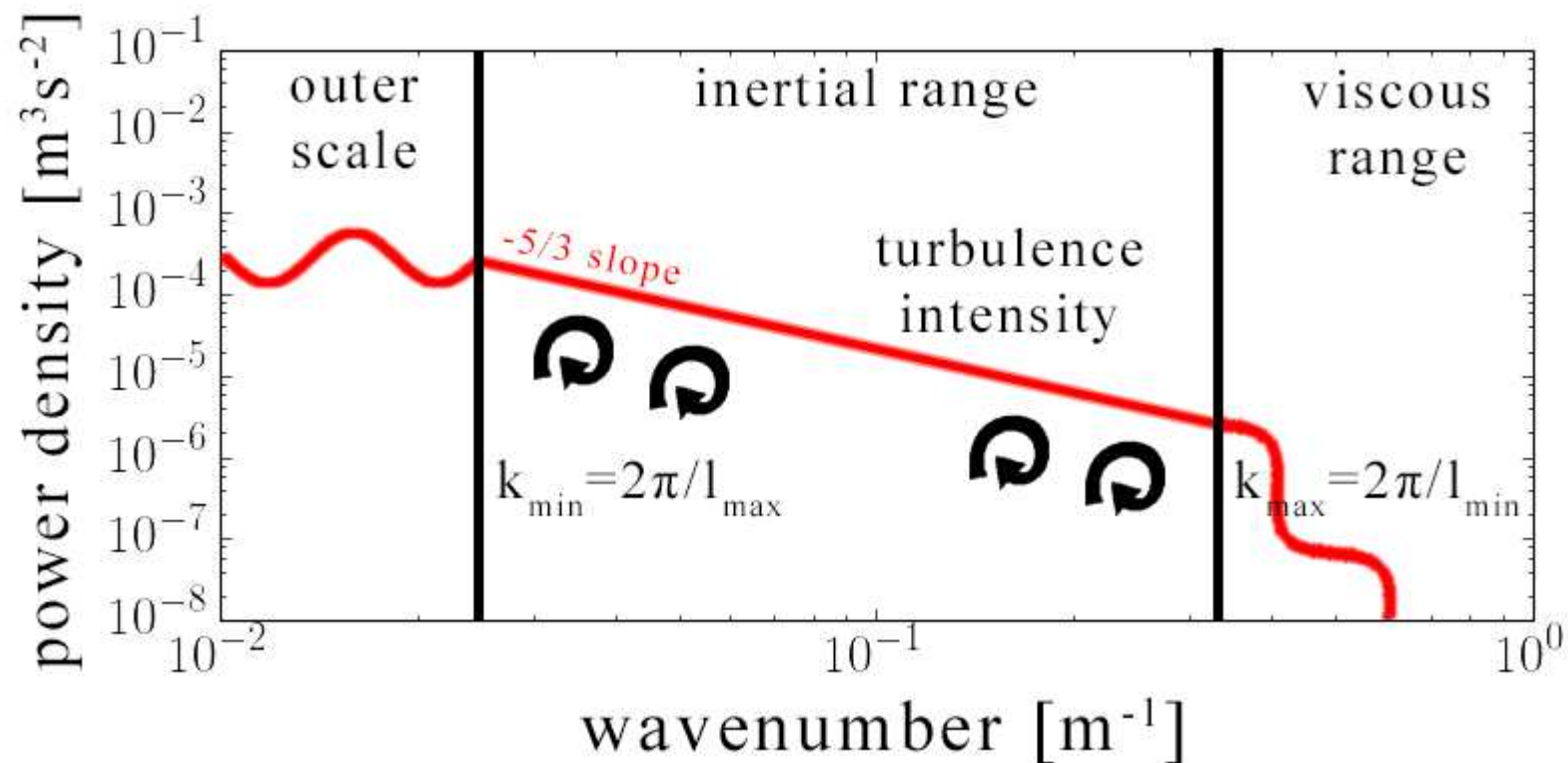
IV. Noise

Conclusions and outlook

# Turbulence retrieval methods

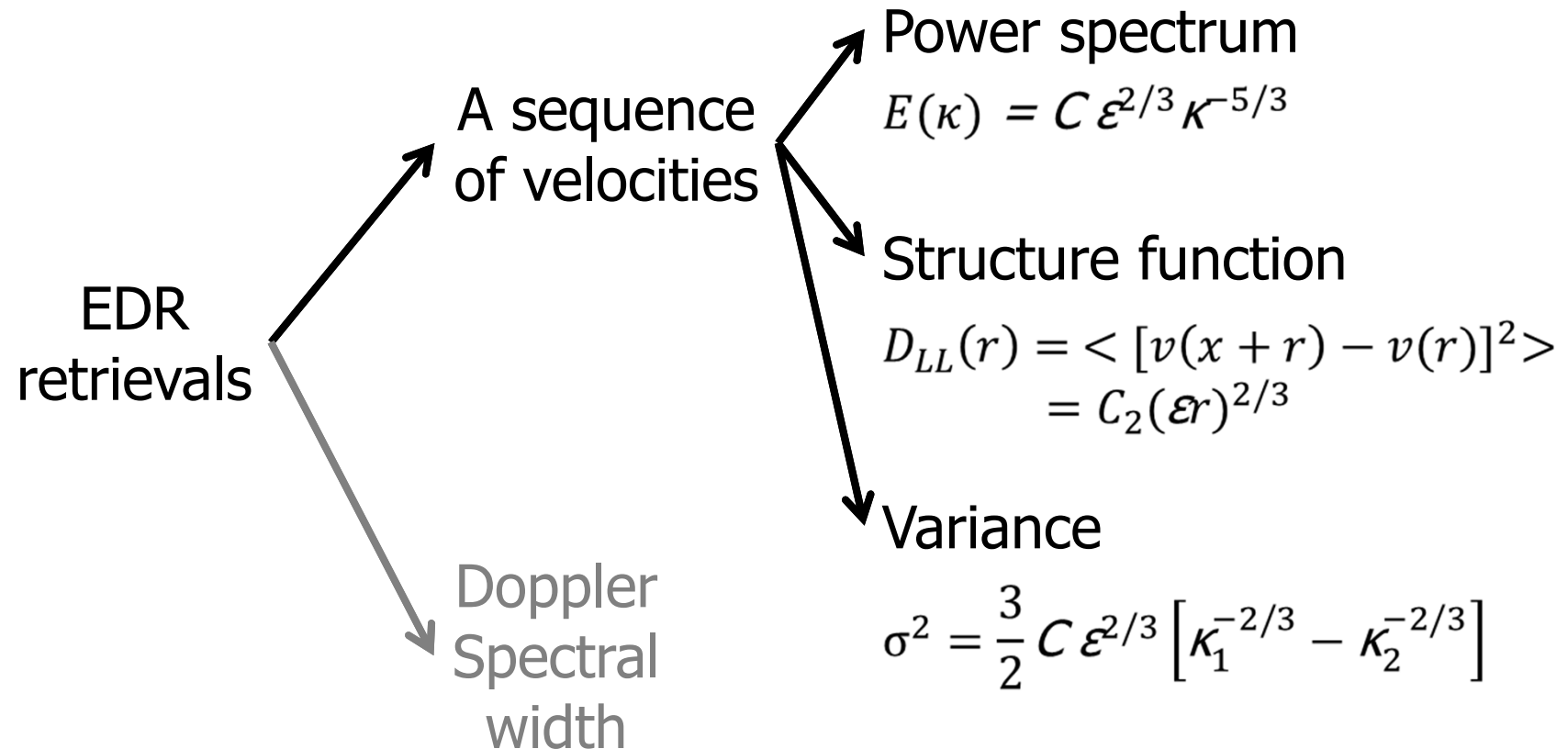
Turbulence is quantified by the Eddy dissipation rate (EDR)

- Assumption on homogenous isotropic frozen turbulence
- In inertial range the dissipation goes with the Kolmogorov  $-5/3$  power.



# Turbulence retrieval methods

EDR can be derived from velocity measurements from radar, lidar or sonic anemometers.





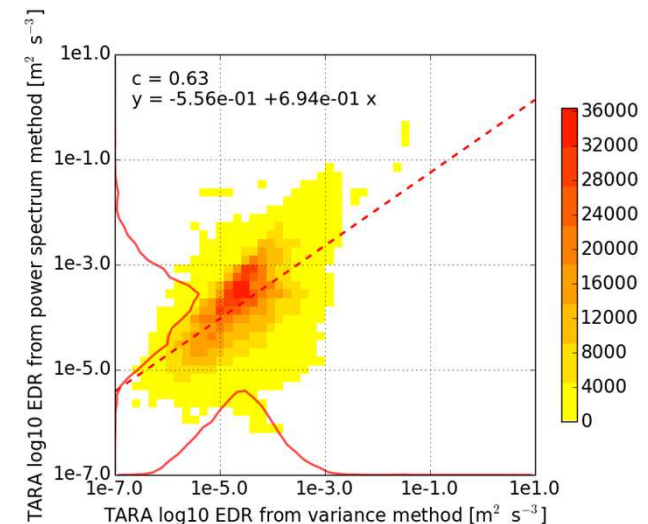
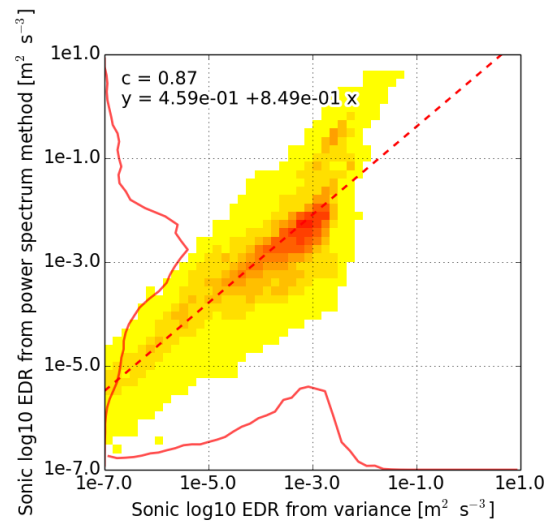
# Turbulence retrieval methods

- When different EDR retrieval methods are applied, we find biases...

## TARA S-Band



## Sonic



## EDR comparison for 2012

- Can we better understand turbulence retrievals?
- What does (in)consistency of retrieval methods mean?

# Outline

---

Introduction and motivation

Turbulence retrieval methods

Cascade turbulence model

Experiments

I. Number of samples

II. Inertial range check

III. Cloud structure and beamwidth

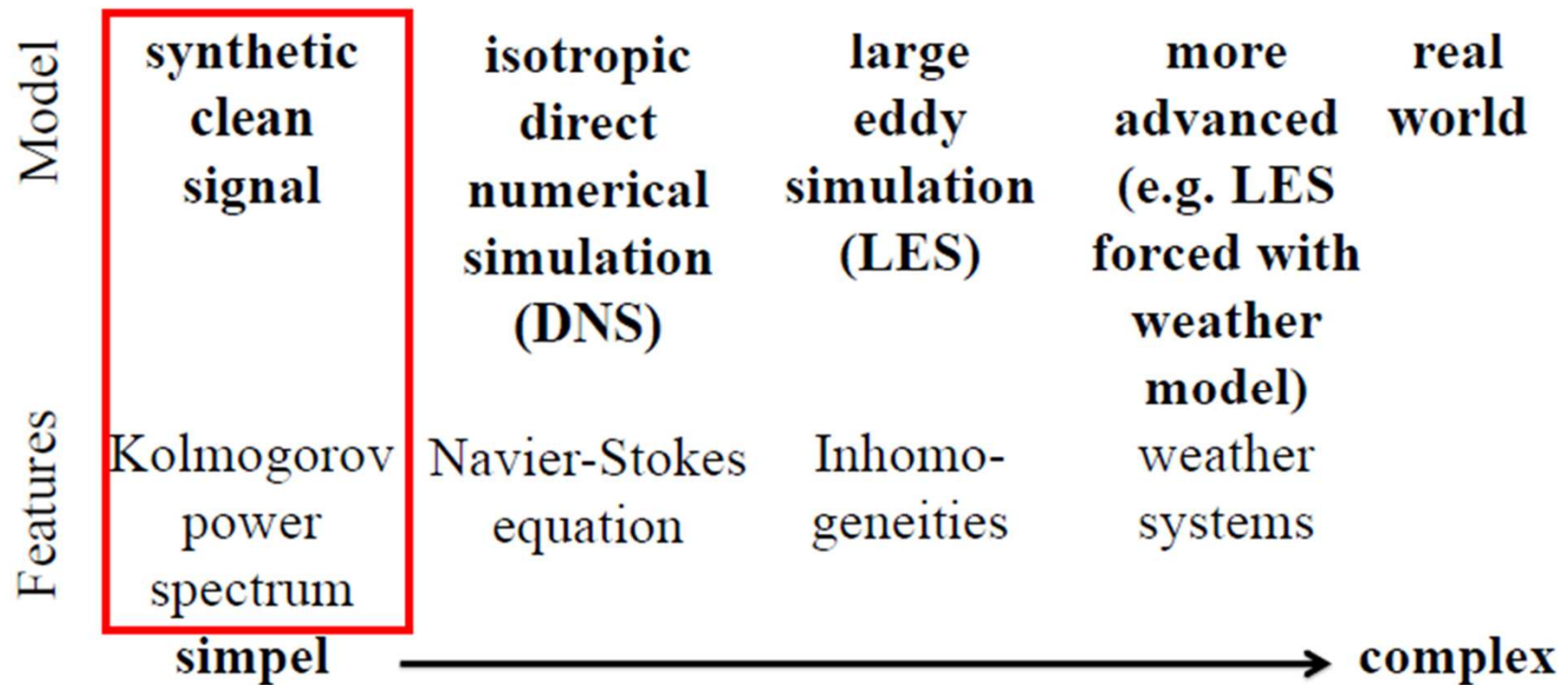
IV. Signal-to-noise ratio and minimal detectable EDR

Conclusions and outlook

# Cascade turbulence model

To understand the nature of turbulence retrievals

- we prefer **the most simple turbulence model!**



*Models of turbulence in order of complexity*

# Cascade turbulence model

- Input:  $N$  samples
- Periodic Nyquist sampling interpolation
- Velocity is a sum over  $n$  scales

$$f(t) = \sum_{i=-\infty}^{\infty} f(i) \frac{\sin \pi(t - i)}{\pi(t - i)}$$

$$f(i + N) = f(i)$$

Leads to an analytic interpolating function  $\Xi$

$$v = \sum_n v_n = \varepsilon^{1/3} \sum_n 2^{5n/6} \sum_{i=0}^{N-1} a_i \Xi(2^{-n}x, i, N)$$

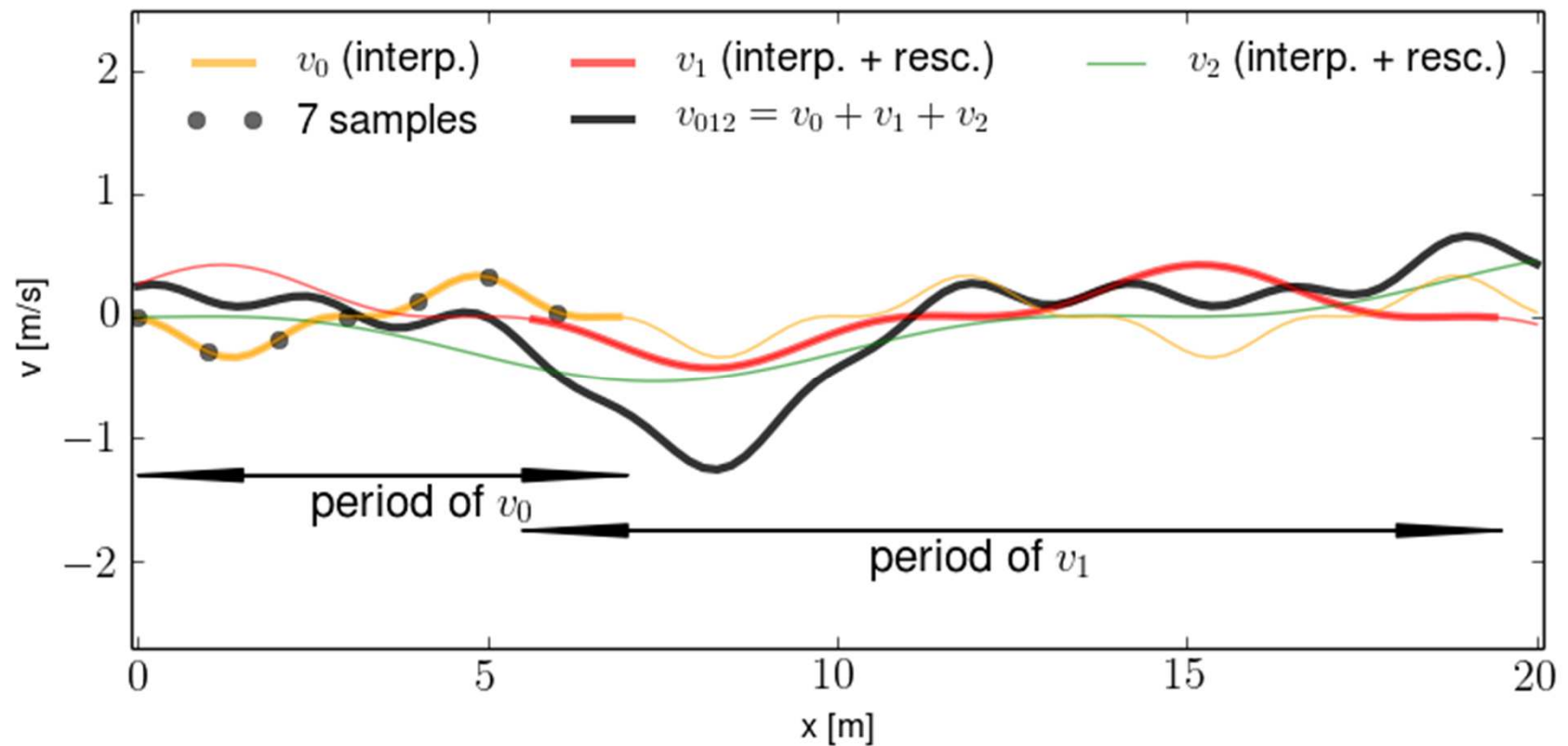
rescaling

Eddy dissipation rate

samples

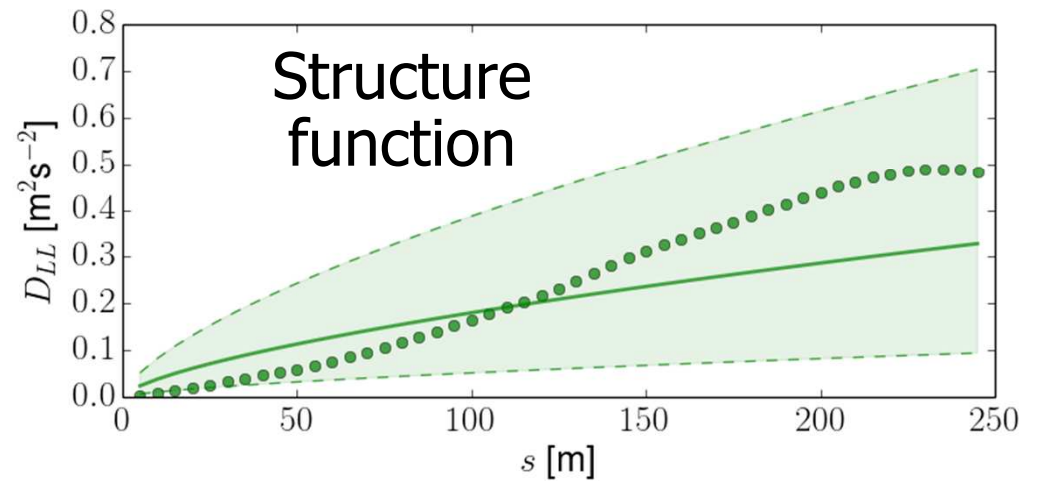
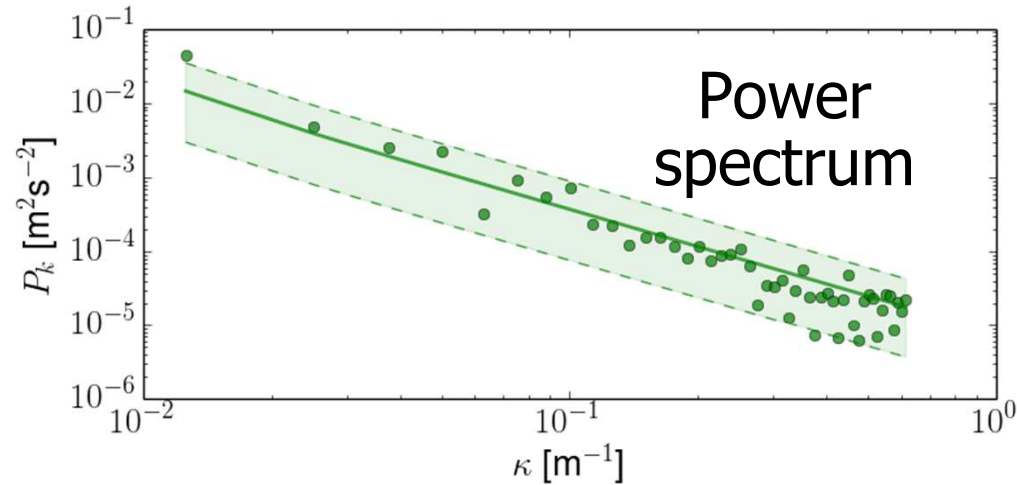
# Cascade turbulence model

- Example  $N = 7$

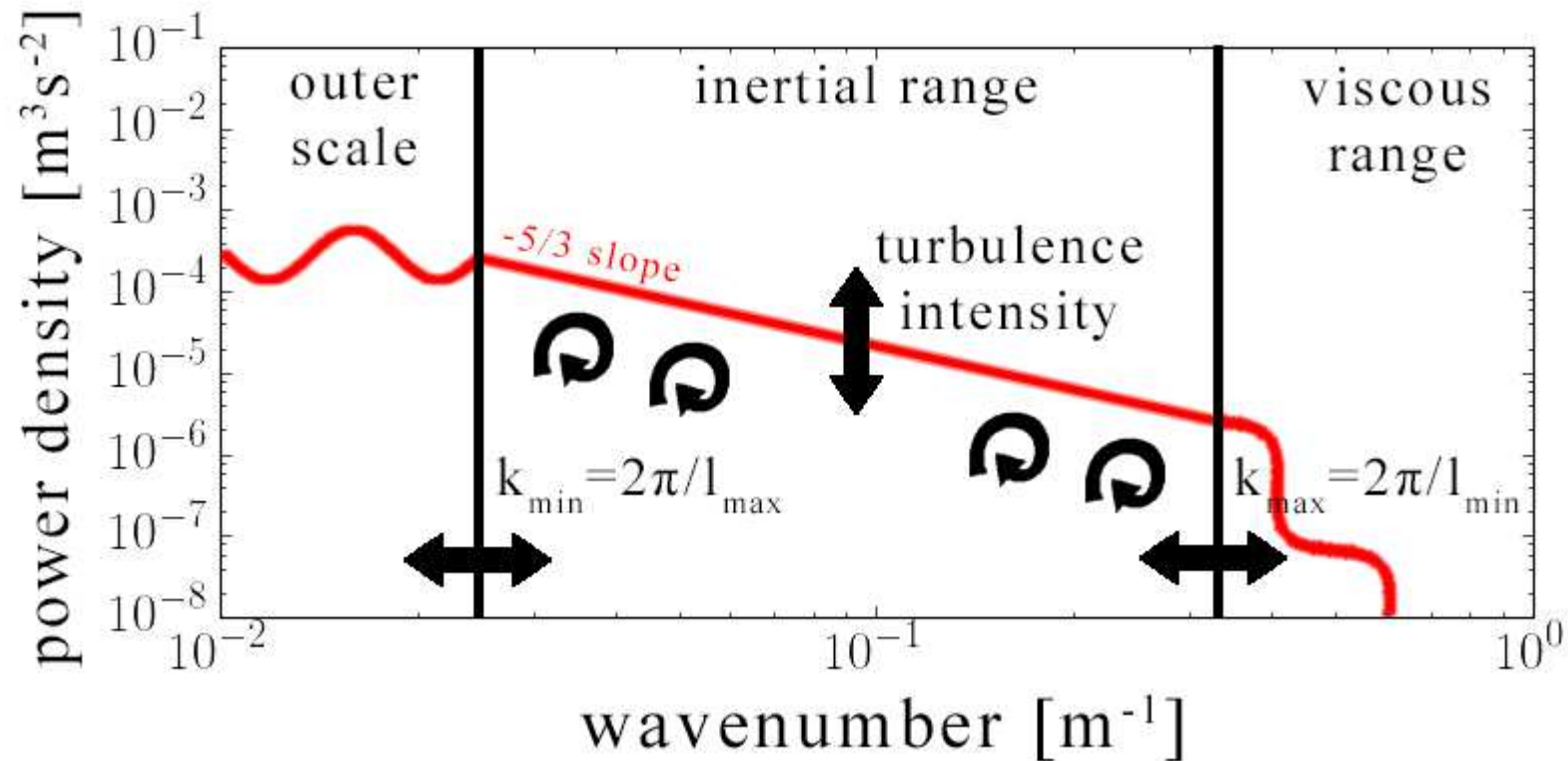


# Cascade turbulence model

## Basic validation



# Cascade turbulence model



## Summary:

- Turbulent velocity  $(u, v, w)$  defined on  $(x, y, z, t) \in \mathbb{R}^4$
- Input:  $l_{\max}(x, y, z, t)$  and  $\varepsilon(x, y, z, t)$
- $l_{\min}(x, y, z, t) \ll l_{\max}(x, y, z, t)$

# Outline

---

Introduction and motivation

Turbulence retrieval methods

Cascade turbulence model

## Experiments

I. Number of samples

II. Inertial range check

III. Cloud structure and beamwidth

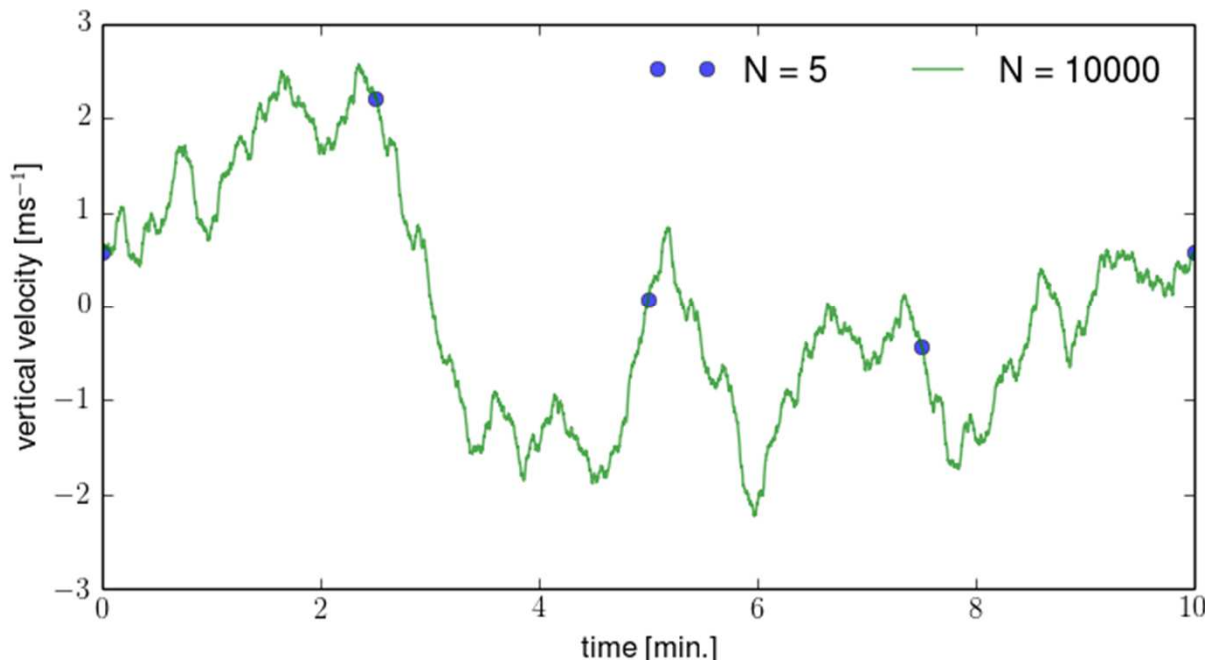
IV. Noise

Conclusions and outlook

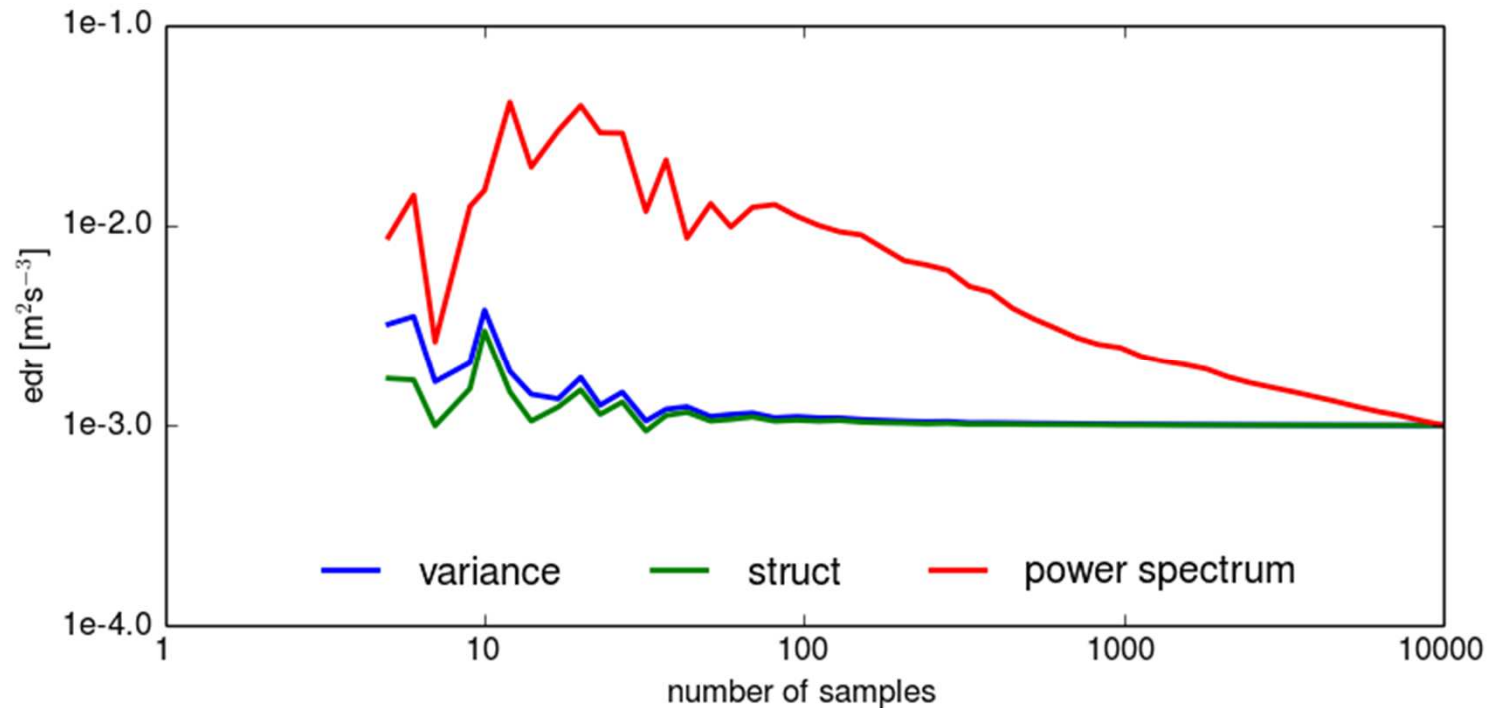


# Experiment I: Number of samples

- **Number of samples: varying**
- Time window: 10 minutes
- Horizontal wind speed: 10 m/s
- Instrument: No noise, no space weighting.
- In the inertial range,  $l_{max} = 100 l_{retr}$



# Experiment I: Number of samples

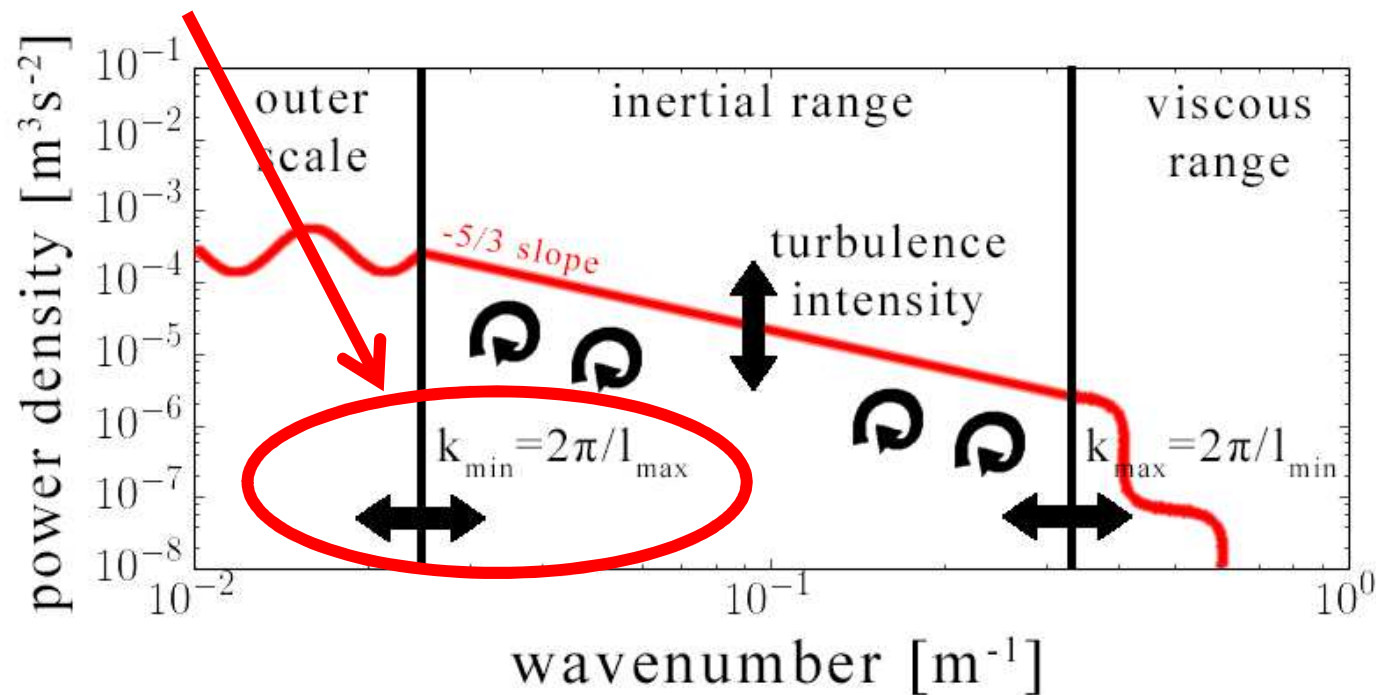


## Result:

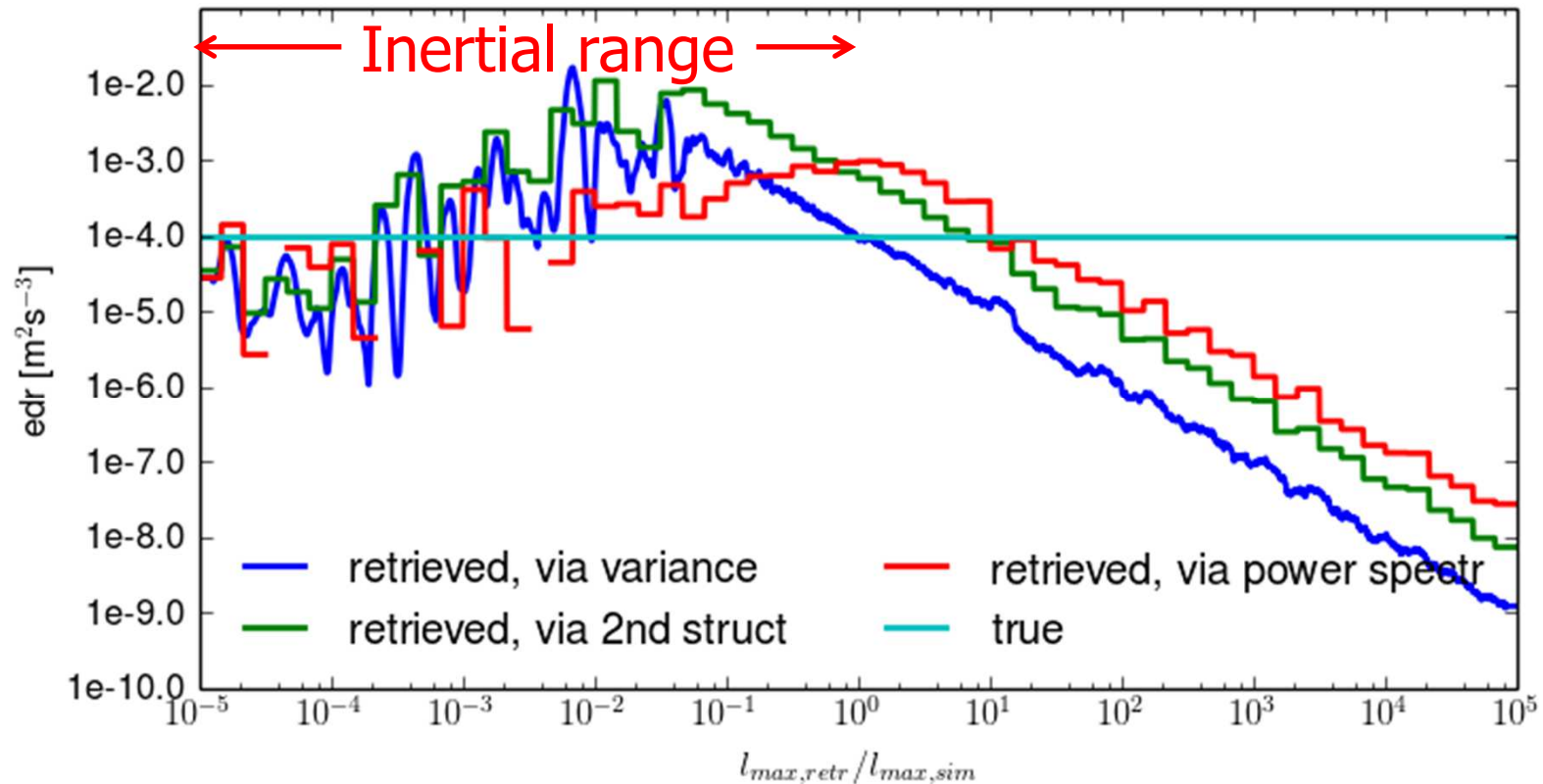
- About 50 samples sufficient for variance method
- About 50 samples sufficient for structure function
- **Power spectrum methods has a positive bias and needs much more samples for consistency!**

## Experiment II: Inertial range check

- Number of samples: 100
- Time window: 10 minutes
- Horizontal wind speed: 10 m/s
- Instrument: No noise, no space weighting.
- $l_{max}$  varying.



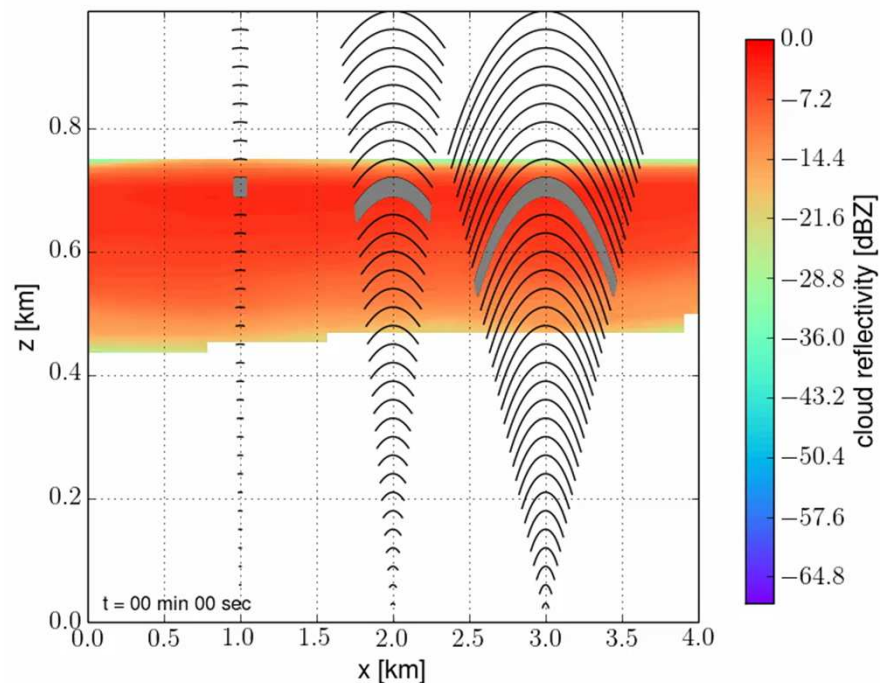
## Experiment II: Inertial range check



- Inside the inertial typical error is an order of magnitude
- **Different methods consistent, even outside the inertial range!**

## Experiment III: Cloud structure and beamwidth

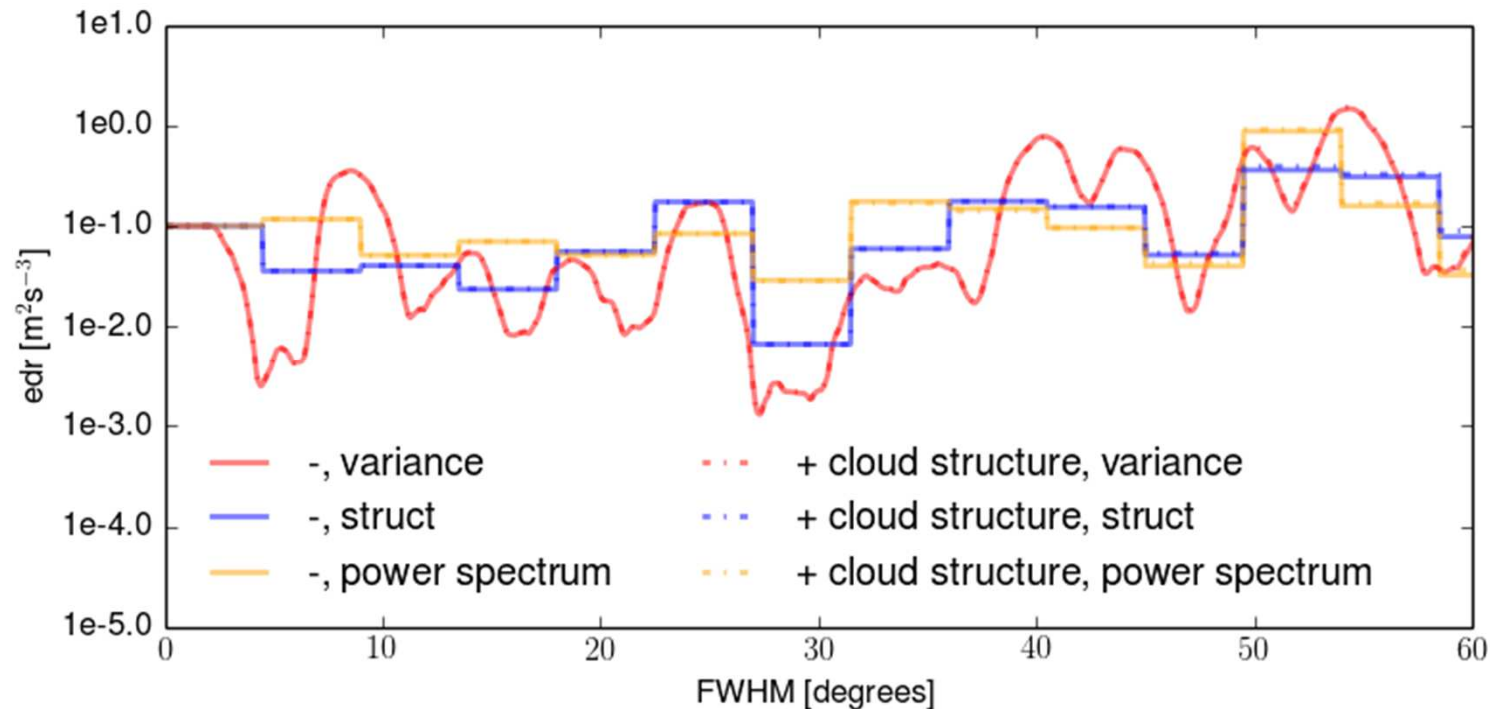
- Number of samples: 100
- Time window: 10 minutes
- Horizontal wind speed: 10 m/s
- Instrument: No noise, **vary beam width, cloud structure**
- In the inertial range,  $l_{max} = 100 l_{retr}$



Stratocumulus cloud, see Hogan et al. (2005).

dBZ obtained via simple LWC-dBZ relation, see Hagen et al. (2003).

## Experiment III: Cloud structure and beamwidth



### Result:

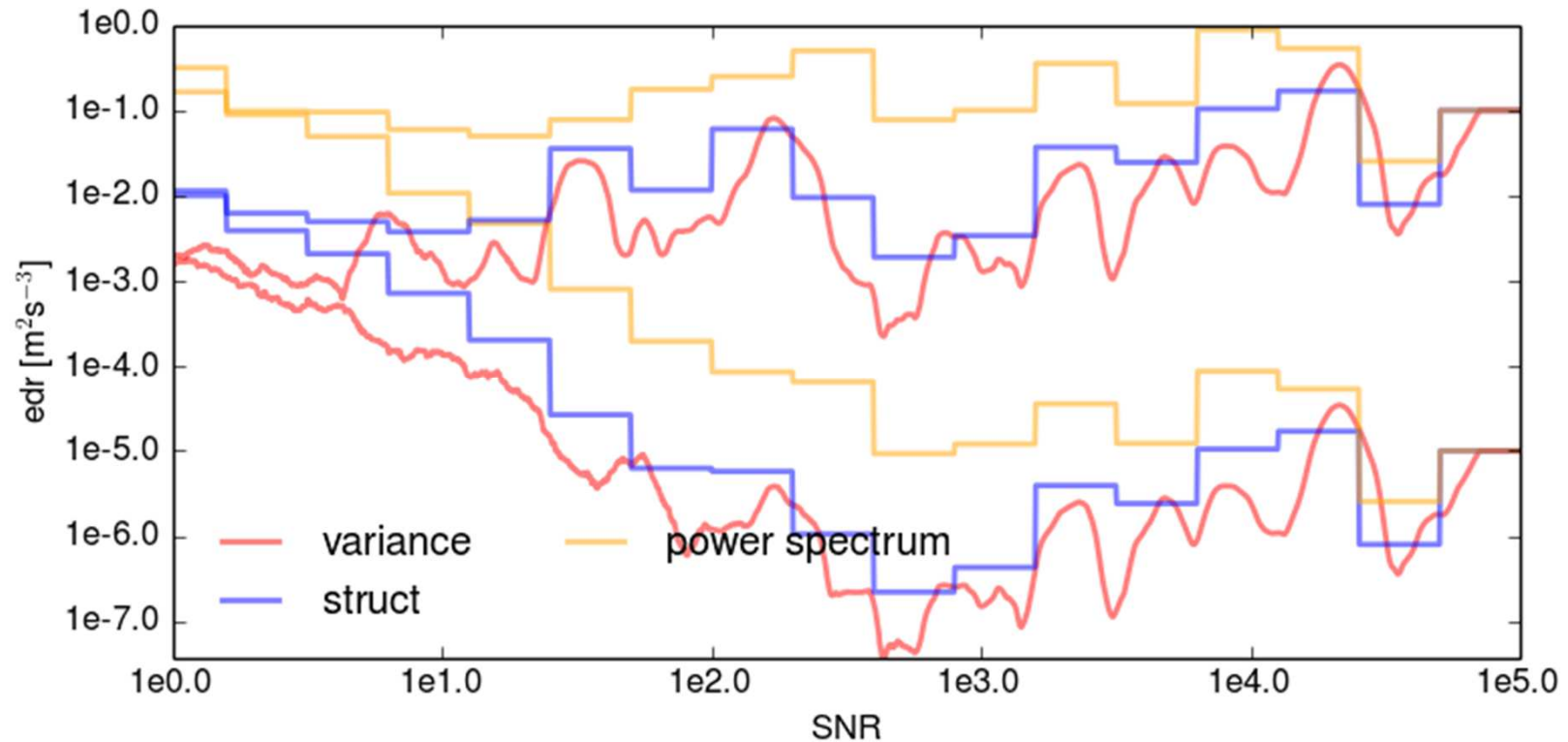
- With practical all methods EDR is well retrieved.
- Cloud structure or weighting does not prove to be a problem for stratocumulus clouds.

## Experiment IV: Noise

---

- Number of samples: 100
- Time window: 10 minutes
- Horizontal wind speed: 10 m/s
- **Instrument: Vary noise intensity**
- In the inertial range,  $l_{max} = 100 l_{retr}$

## Experiment IV: Noise



### Result:

- SNR of 100 sufficient for variance and structure method
- SNR of 1000 sufficient for all methods



# Outline

---

Introduction and motivation

Turbulence retrieval methods

Cascade turbulence model

Experiments

I. Number of samples

II. Inertial range check

III. Cloud structure and beamwidth

IV. Noise

Conclusions and outlook

## Conclusions and outlook

---

- Cascade turbulence model (CTM) is a new tool (under development) for simple modelling of turbulence.
- CTM can be used for simple turbulence retrieval experiments for radar, lidar and sonic anemometers
- Turbulence nature causes errors in EDR of up to 100%.
- Consistency of methods does not prove anything!
- Stratocumulus cloud structure or beam width has little influence on the retrieved EDR.
- From the available methods, the power spectrum is most challenging. For consistency a high S/R is required and a high number of samples.
- Future work: consider convective clouds; include scatterer modelling.

## References

---

- S. Pope, *Turbulent flows*, 2000.
- A. Oude Nijhuis, C. Unal, O. Krasnov, H. Russchenberg, and A. Yarovoy, "Simulation of atmospheric turbulence: Fractal turbulence," Poster presentation at the 21st Symposium on Boundary Layers and Turbulence, 2014.
- R.J. Hogan and S.F. Kew, "A 3D stochastic cloud model for investigating the radiative properties of inhomogeneous cirrus clouds," *Q. J. R. Meteorol. Soc.*, 2005.
- M. Hagen and S.E. Yutter, "Relations between radar reflectivity, liquid-water content, and rainfall rate during the MAP SOP," *Q. J. R. Meteorol. Soc.*, 2003.

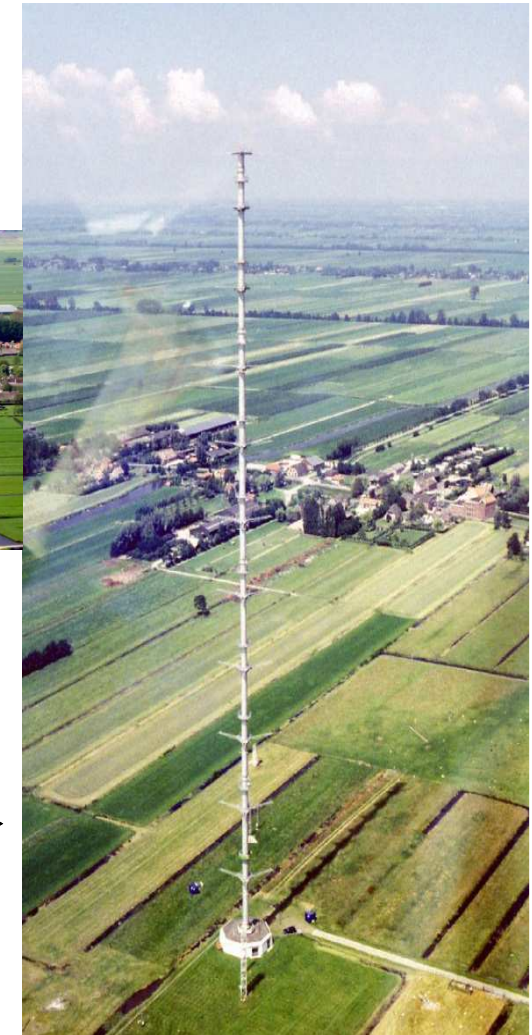
- Questions?



# Backup-slide: Cabauw research site

↑  
Atmospheric  
Profiling  
between 180 m  
and ~ 15 km.

Tower with  
sonic  
anemometer



TARA (S-band  
RADAR) measures  
the vertical Doppler  
velocities at  
Cabauw.

330 m  
↔