



# Development of an uncertainty model for ship-based lidar measurements

**Hugo Rubio, Julia Gottschall**

2022-01-19

**EERA DeepWind  
Conference 2022**



# Presentation Outline



1

## Introduction and motivation

Page 3 - 4

- Offshore wind characterization and ship-based lidar technology

2

## Materials and Methods

Page 5 - 10

- Methodology stages
- From lidar measurements to wind speed
- Ship motion effects
- Derivation of uncertainties
- Assumptions

3

## Results

Page 11 - 13

- Misalignment
- Velocity ratio
- Pitch and roll

4

## Outline

Page 14 - 15

- Conclusion
- References

# Introduction and Motivation

## Offshore wind characterization

- ↪ Offshore sites offer advantageous wind resources compared to onshore:
  - ↪ Higher mean wind speeds
  - ↪ More stationary
- ↪ Scarce offshore measurements → ship-based lidar technology



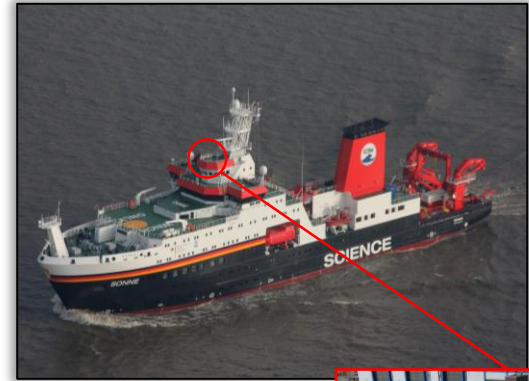
Reduction of cost and complexity of offshore meas. campaigns



Characterization of winds along vast regions



Not limited to shallow waters



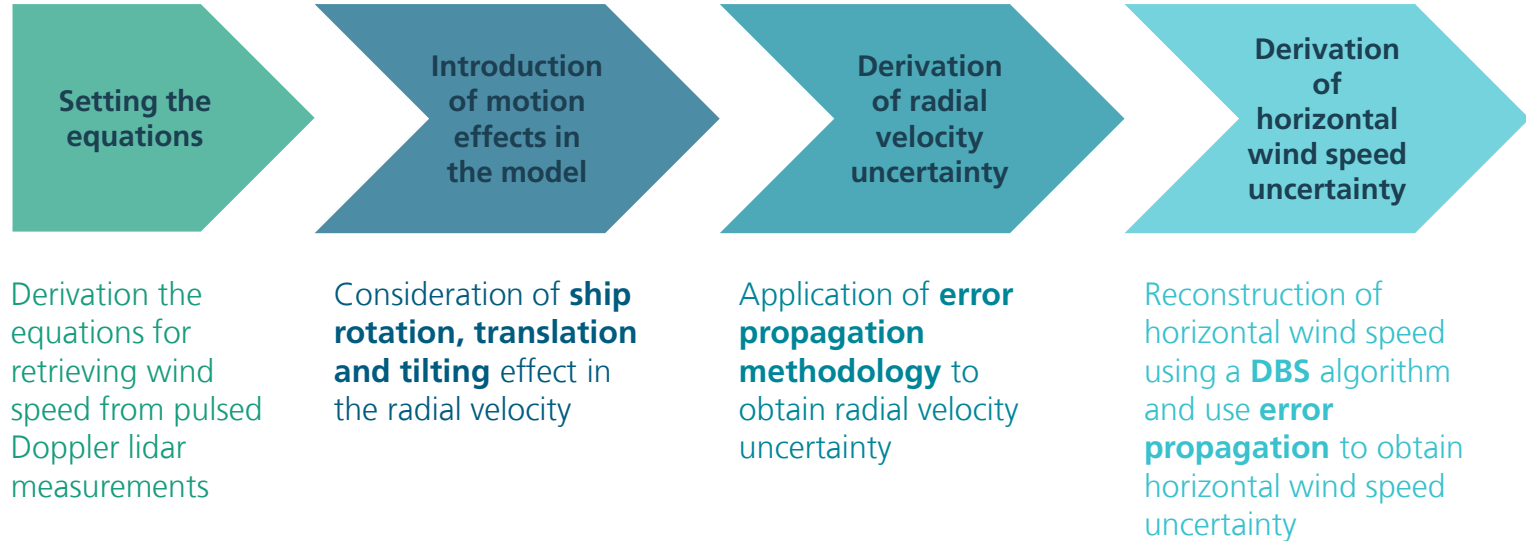
# Introduction and Motivation

## Ship-based lidar technology

- ↪ Lack of reference data to compare with. Two main questions arise:
  - ↪ **How accurate are these measurements?**
  - ↪ **What is the best configuration for ship-based lidars?**
- ↪ These questions are addressed in this study by developing an analytical uncertainty model (error propagation method [1]):
  - ↪ Not requires comparable/reference data
  - ↪ Allow the consideration and combination of the relevant parameters

# Materials and Methods

## Methodology summary



# Materials and Methods

## From lidar measurements to wind speed

→ The calculation of the radial wind speed calculated as:

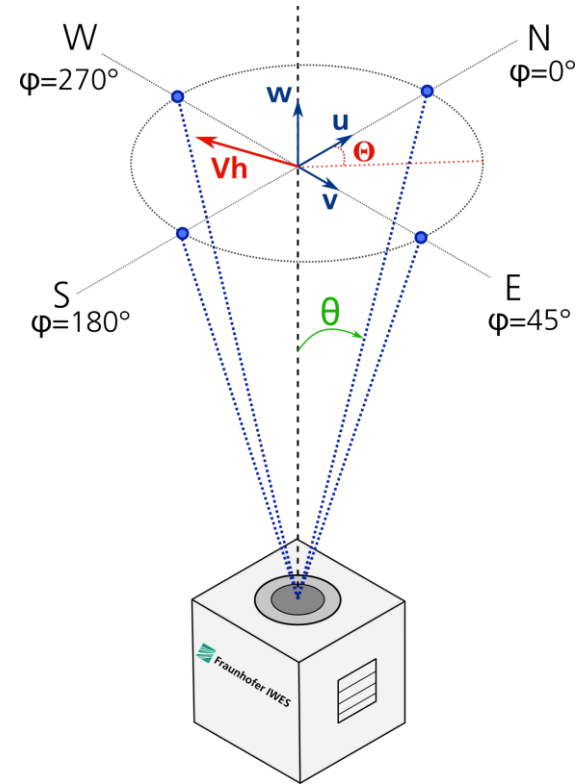
$$v_{radial} = \vec{r} \cdot \vec{u}_{wind} = \begin{pmatrix} \sin(\theta) \cos(\varphi) \\ \sin(\theta) \sin(\varphi) \\ \cos(\theta) \end{pmatrix} \cdot \begin{pmatrix} u \\ v \\ w \end{pmatrix}$$

$$u = V_h \cos(\theta) \quad v = V_h \sin(\theta)$$

→ With:

→  $V_h$  as the horizontal wind speed

→  $\theta$  as the wind direction (from which the wind originates)



# Materials and Methods

## Consideration of the ship motions

- The retrieved radial velocity is affected by the tilting, rotation and translation of the ship:

$$v_{radial}^{meas} = \underbrace{R_{rot} \cdot \vec{r} \cdot \vec{u}_{wind}}_{\text{Wind contribution}} + \underbrace{R_{rot} \cdot \vec{r} \cdot \vec{u}_{ship}}_{\text{Ship translation contribution}}$$

$$\vec{u}_{ship} = \begin{pmatrix} sog^1 * \cos(cog^2) \\ sog * \sin(cog) \\ heave \end{pmatrix}$$

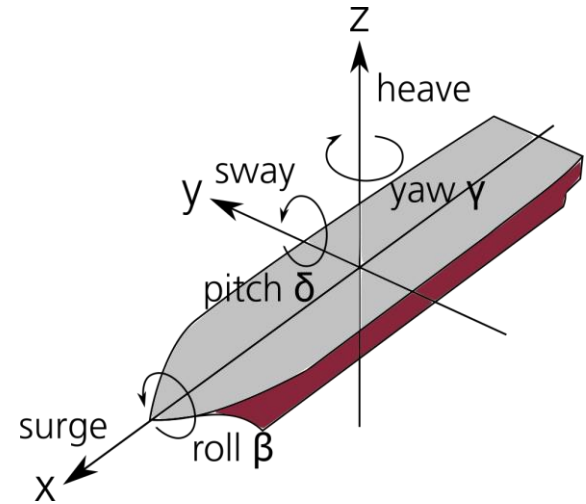


Figure: ship's 6 degrees of freedom

<sup>1</sup>Speed over ground

<sup>2</sup>Course over ground

# Materials and Methods

## Radial velocity uncertainty

- ↪ For simplification, a separation of the tilting and rotation motions has been done:
  - ↪ Consideration of ship **rotation**  $\rightarrow R_{rot} = R_{yaw}$
  - ↪ Consideration of ship **tilting**  $\rightarrow R_{rot} = R_{roll}R_{pitch}$
- ↪ Applying the law of the uncertainty propagation for each case, we obtain the radial velocities uncertainties:

$$U_{v_{radial}}^{2, meas} = \left( U_{\gamma} \frac{\partial v_{radial}^{meas}}{\partial \gamma} \right)^2 + \left( U_{cog} \frac{\partial v_{radial}^{meas}}{\partial cog} \right)^2 + \left( U_{sog} \frac{\partial v_{radial}^{meas}}{\partial sog} \right)^2$$

$$U_{v_{radial}}^{2, meas} = \left( U_{\beta} \frac{\partial v_{los,i}}{\partial \beta} \right)^2 + \left( U_{\delta} \frac{\partial v_{los,i}}{\partial \delta} \right)^2 + \left( U_{cog} \frac{\partial v_{los,i}}{\partial cog} \right)^2 + \left( U_{sog} \frac{\partial v_{los,i}}{\partial sog} \right)^2$$



# Materials and Methods

## Horizontal wind speed uncertainty

- Using a DBS algorithm, the horizontal wind speed components measured by the lidars can be calculated as:

$$u_{meas} = \frac{v_{los,N}^{meas} - v_{los,S}^{meas}}{2\sin(\theta)} \quad v_{meas} = \frac{v_{los,E}^{meas} - v_{los,W}^{meas}}{2\sin(\theta)}$$

- And by considering the ship motions effects:  $\bar{u}_{wind} = R_{rot} \cdot \bar{u}_{meas} + \bar{u}_{ship}$

- The horizontal wind speed will be then:  $V_h = \sqrt{u_{wind}^2 + v_{wind}^2}$

- Applying the error propagation:

$$U_{V_h}^2 = \sum_{i=0}^n \left( U_{v_{radial,i}^{meas}} \frac{\partial V_h}{\partial v_{radial,i}^{meas}} \right)^2$$

Where  $n$  is the number of lidar beams

# Materials and Methods

## Model assumptions

- ↪ Vertical wind speed component is small, so it is omitted in the model derivation
- ↪ Time scales of motion and orientation changes are longer than the reference time scale
- ↪ No shear impact considered

# Results

## Effect of lidar north misalignment

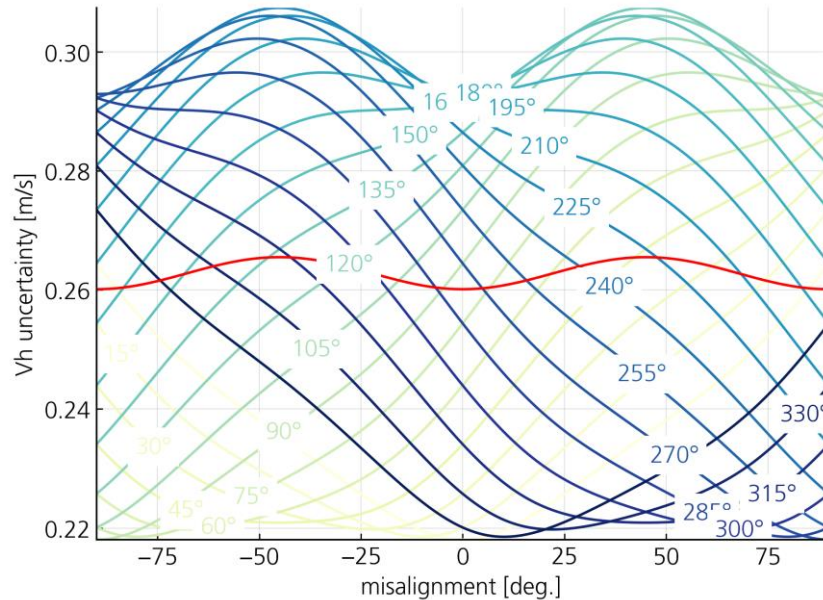
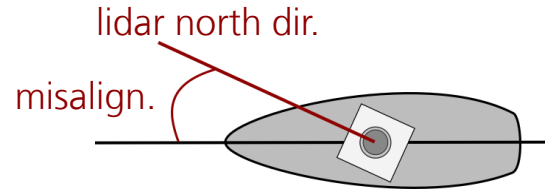


Figure:  $V_h$  uncertainty for several  $\text{cog}$  angles. Red line indicates the overall average uncertainty for all  $\text{cog}$  angles

Parameterization	
$V_h$	5 m/s
$\theta$	$[0^\circ - 360^\circ]$
$\text{sog}$	2 m/s
$\text{cog}$	$[0^\circ - 360^\circ]$
$\gamma$	$[0^\circ - 360^\circ]$
$\theta$	$28^\circ$

- Minimum uncertainty with **no misalignment** or an offset of  $\pm 90^\circ$
- Maximum uncertainty at  $\pm 45^\circ$
- The overall average uncertainty (**red line**) is the same for  $\theta = [0^\circ - 90^\circ]$

# Results

## Effect of velocity ratio

$$\text{velocity ratio} = \frac{\text{sog}}{V_h}$$

Parameterization			
$V_h$	0-15 m/s	cog	0°
$\theta$	[0°-360°]	$\gamma$	0°
sog	0-15 m/s	$\theta$	28°

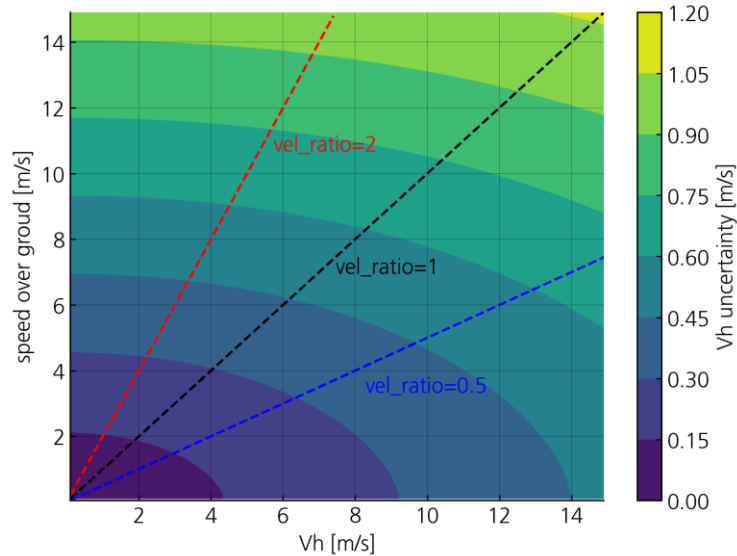


Figure:  $V_h$  uncertainty different values of sog and  $V_h$ . Red, black and blue lines indicate vel. ratios of 2, 1 and 0.5 respectively

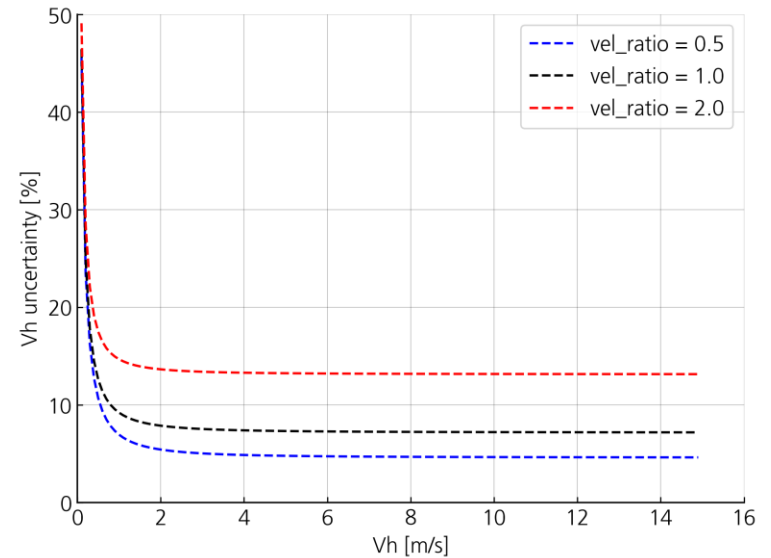


Figure:  $V_h$  relative uncertainty for three different vel. ratios

# Results

## Effect of pitch and roll

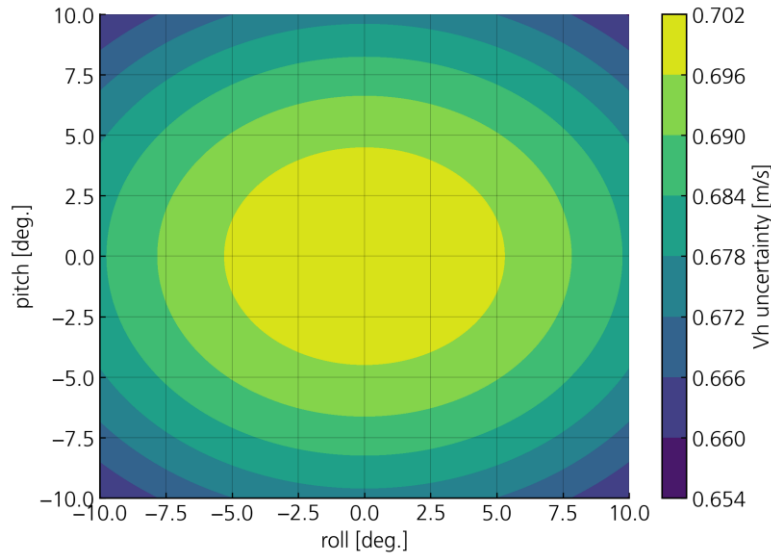


Figure:  $V_h$  uncertainty for different pitch and roll values

Parameterization			
$V_h$	5 m/s	cog	0°
$\theta$	[0° - 360°]	pitch, roll	[-10° - 10°]
sog	2 m/s	$\theta$	28°

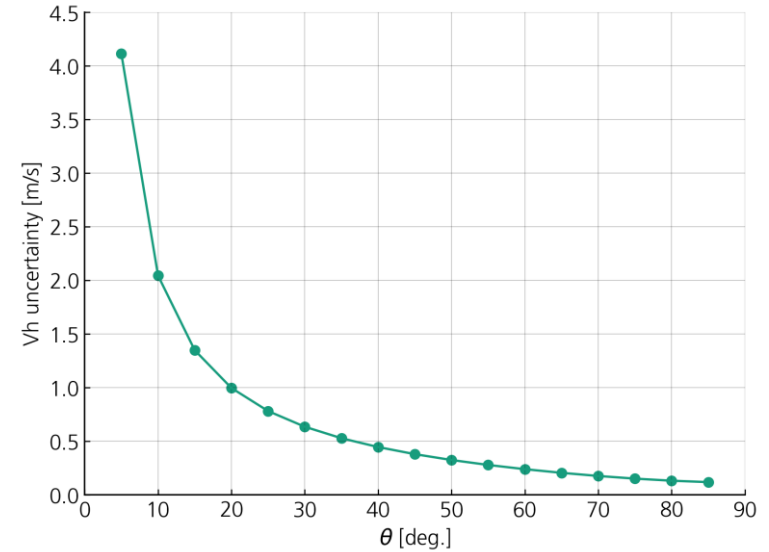


Figure:  $V_h$  uncertainty for different cone angles

# Conclusions

- > The effect of lidar north misalignment is small, but maximum when the offset is  $\pm 45^\circ$ 
  - > Increasing the number of lidar beams could help to minimize this effect
- > Uncertainty is very high for low horizontal wind speed values
- > Increasing the ship velocity with regards to the wind speed considerably increases the uncertainty of the measurements
- > Tilting effects slightly affect the wind speed uncertainty. However, smaller pitch and roll values show higher uncertainty levels

# Conclusions

- ↪ The effect of lidar north misalignment is small, but maximum when the offset is  $\pm 45^\circ$ 
  - ↪ Increasing the number of lidar beams could help to minimize this effect
- ↪ Uncertainty is very high for low horizontal wind speed values
- ↪ Increasing the ship velocity with regards to the wind speed considerably increases the uncertainty of the measurements
- ↪ Tilting effects slightly affect the wind speed uncertainty. However, smaller pitch and roll values show higher uncertainty levels
- ↪ Further work:
  - ↪ Consideration of different lidar technologies and correction methods
  - ↪ Include other potentially relevant parameters: heave, shear...
  - ↪ Validation of model with real observational data

# References

- ↪ [1] Joint Committee for Guides in Metrology: Evaluation of measurement data — Guide to the expression of uncertainty in measurement



# Acknowledgements

The project LIKE Lidar Knowledge Europe H2020-MSCA-ITN-2018, Grant no. 858358 is funded by the European Union



# Thank you for your attention!

[hugo.rubio@iwes.fraunhofer.de](mailto:hugo.rubio@iwes.fraunhofer.de)

