# #16245

Verification of nacelle-mounted LiDAR systems A comparison of black and white box methodology

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### Abstract

Especially for offshore measurements, the use of nacelle-mounted LiDAR systems becomes more and more important in the wind industry. For traceable field measurements it is recommended to assess the performance of the LiDAR system against a well known reference sensor, e.g. cup anemometer. For nacelle-mounted LiDAR systems two verification methodologies are discussed:

White box approach Black box approach 

The results of several verification campaigns for both the black box and white box methodology are summarized. The campaigns were conducted at two different test sites, whereby two different LiDAR types were verified. The methodologies are

## Results of linear regression analysis

Unit	# values	slope (forced)	R <sup>2</sup>	HWS-avg Cup	HWS-avg Lidar	Mean HWS Diff.	Rel. Mear HWS Diff
	-	-	-	[m/s]	[m/s]	[m/s]	%
Unit 1	1526	1.008	0.980	6.71	6.75	0.04	0.65%
Unit 2	1528	1.008	0.981	6.71	6.75	0.05	0.71%
Unit 3	1053	1.002	0.980	6.12	6.13	0.01	0.20%
Unit 4	943	0.998	0.967	6.52	6.51	0.01	0.18%
Unit 5	2044	0.993	0.989	8.47	8.41	-0.06	-0.72%
Unit 6	1041	1.009	0.988	7.49	7.55	0.06	0.82%

**Summary of Black Box results** 

Unit	# values	slope (forced)	R <sup>2</sup>	RWS-avg Cup	RWS-avg Lidar	Mean RWS Diff.	Rel. Mean RWS Diff.
	-	-	-	[m/s]	[m/s]	[m/s]	%
Unit 1	1369	0.999	0.995	6.32	6.31	0.00	0.03%
Unit 2	1361	0.999	0.997	6.30	6.29	0.01	0.10%
Unit 3	783	1.002	0.996	5.70	5.72	-0.01	-0.26%
Unit 4	754	0.998	0.995	5.60	5.58	0.01	0.21%
Unit 5	3779	0.997	0.991	7.10	7.08	-0.02	-0.32%
Unit 6	1384	1.001	0.993	6.52	6.54	0.01	0.21%



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#### White Box (left) and Black Box (right) results (Unit 1)

- Comparable results for both test sites and both LiDAR types.
- Slopes close to unity for both WB and BB.

#### compared and the pros and cons are discussed.

# Methods

#### White Box (WB):

The WB methodology is based on the assessment of different input quantities which are used by the LiDAR to reconstruct the wind field characteristics. In general, the WB approach includes the verification of the following parameter:

- Scan geometry
- Measurement range
- Inclinometers
- Line-of-sight velocity
- Uncertainty assessment

### Black Box (BB):

The BB methodology is based on the assumption that the total functionality of the LiDAR system is represented by the output quantities provided by the LiDAR system (e.g. horizontal wind speed). Therefore, a separate consideration of single input quantities, e.g. scan geometry or measurement position, which are used by the LiDAR algorithm, is not done.

White box	Black box
(e.g. line-of-sight velocity, scan geometry)	<b>Output quantities</b> (e.g. Horizontal wind speed, Wind direction)

**Summary of White Box results** 

- Squared correlation coefficient:
  - WB: 0.991 0.997
  - BB: 0.980 0.989

For most analysis rel. mean WS difference below 1%.

# Assessment of LiDAR performance

#### **Uncertainty assessment for White Box methodology**



### **Differences in uncertainty assessment**

- Less complex for BB methodology.
- Different uncertainty components, depending on the test site and test setup.
- Slightly higher statistical uncertainty for BB methodology, but not that much higher

### **DNV GL internal KPIs and ACs for accuracy assessments**

		Black b	ox AC's	White box AC's		
KPI	Definition / Rationale	Best Practice	Minimum	Best Practice	Minimum	
Cmwsd	Mean Wind Speed -Difference Absolute difference of mean wind speeds between LiDAR and reference as measured over the whole verification campaign duration, expressed as percentage relative to the Campaign Mean Wind.	< 1 %	1 - 1.5 %	<1%	1 - 1.5 %	
X <sub>mws</sub>	Mean Wind Speed – Slope Slope returned from single variant regression with the regression analysis constrained to pass through the origin.	0.98 - 1.02	0.97 - 1.03	0.99-1.01	0.98-1.02	
R <sup>2</sup> mws	Mean Wind Speed – Coefficient of Determination Correlation Coefficient returned from single variant regression.	>0.98	>0.97	>0.99	>0.98	



**Illustration of white and black box methodology [1].** 

# Test specifications

The comparison between black and white box approach is based on six verification campaigns. The campaigns were conducted at two different test sites, whereby two different LiDAR types (CW and pulsed) were verified. For the six tests, the following test configuration were applied:

#### **Unit 1-4**

- Horizontal setup (platform test)
- Test setup according to figure below:







**Uncertainty schema for White Box methodology [1] [2] [3].** 

In practice, further KPIs and ACs, e.g. for data coverage, system and data availability should be considered for both methodologies. Additionally, KPIs and ACs for other verification parameters of the white box methodology (e.g. Scan gemometry) should be defined.

Conclusions							
	White Box	Black Box					
Pros	<ul> <li>Most proven method for verification of nacelle LiDARs</li> <li>Generic method for verification of Line-of-sight velocity</li> </ul>	<ul> <li>Shorter campaign duration (about 4-6 weeks)</li> <li>Less costly (about 70 % of WB)</li> <li>Less complex → Less experience needed</li> </ul>					
Cons	<ul> <li>Longer campaign duration (about 6-12 weeks)</li> <li>More costly (see bar chart below)</li> <li>More complex → More experience needed</li> </ul>	<ul> <li>Higher statistical uncertainty, due to higher scatter</li> <li>Specific for each type of device/Reliability on manufacturer algorithm</li> </ul>					

- Both methodologies are applicable for the verification of nacelle-mounted LiDAR systems
  - Comparable results for different test sites, site specifics and LiDAR types.  $\rightarrow$  BB and WB are applicable at different sites and for different LiDAR types



#### **Unit 5-6**

- Inclined test setup (slant test)
- Inclination angles: 12-25°
- Comparison against 100m mast
- Measurement range: 130-180m

## References

- 1. Generic methodology for calibration profiling nacelle lidars, DTU Wind Energy E-0086, A. Borraccino et al., July 2015
- 2. Calibrating Nacelle lidars, DTU, Michael Courtney, DTU Wind Energy E-0020, January 2013
- 3. IEC 61400-12-1: Power performance measurements of electricity producing wind turbines. Ed. 2., Apr. 2017

- Slightly better regression coefficients (slope, R<sup>2</sup>, mean dev.) for WB
  - $\rightarrow$  Different KPIs and ACs for assessment of LiDAR performance needed
  - WB methodology is more complex than BB methodology:
    - $\rightarrow$  Longer campaign duration
    - $\rightarrow$  Higher costs (see bar chart beside)
    - $\rightarrow$  More complex uncertainty assessment

#### **Different methodologies for different applications?**

Whit	e Box		Black Box			
Applications where a "calibration" of the LiDAR is needed	Applications where a "calibration"Power Curve Verification according to coming IEC Standard		Lidar Assisted Control (LAC)	Other applications		



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#### 60 40 Rel 20 Preparation Work at site Monthly Analysis and Total & pre-testing reporting costs ■ White Box ■ Black Box