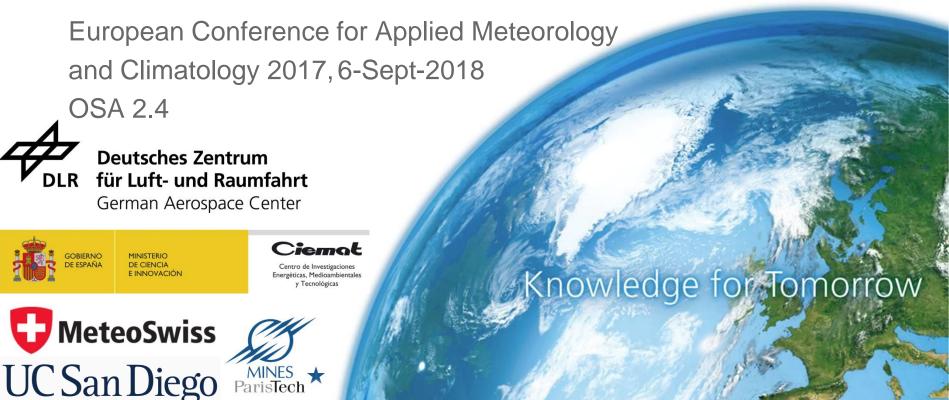


# Benchmarking cloud height and cloud motion measurements

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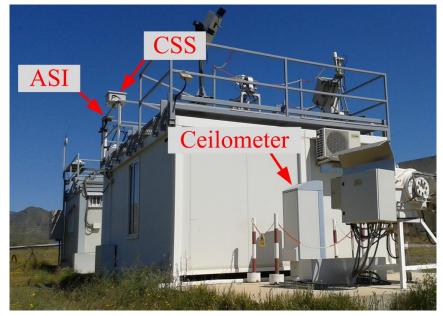
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#### **Overview**

- 1. Relevance of <u>cloud height</u> and <u>cloud motion vector</u> measurements
- 2. Benchmarking five cloud height measurement systems
- 3. Development and application of a novel cloud motion vector reference
- 4. Conclusion and future work











#### On the relevance of <u>cloud motion vector</u> measurements

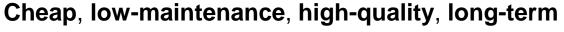
Cloud motion vectors are important for forecasts and site evaluations

Cloud motion vectors are relevant for

- Solar forecasts
- Solar site assessments (expected max. ramp rates)
- Wind profiles at cloud heights
- Model inputs / reference measurements

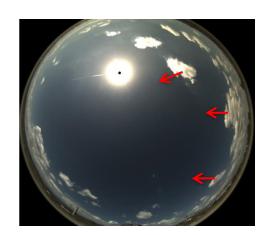


- NWP products
- Satellite-derived cloud motion vectors
- All-sky imager derived cloud motion vectors
- Cloud motion vectors derived by radiometer networks



ground-based reference cloud motion vectors were previously not available.







#### On the relevance of <u>cloud height</u> measurements

Cloud height measurements are important for various applications

Reliable cloud height measurements are relevant for

- Solar forecasting
- Non-instrument rated flight operations
- Variety of leisure activities
- Model inputs / reference measurements

Approaches to derive cloud heights:

- Ceilometer / LIDAR
- Radar
- Model-based (NWP)
- Satellite-based
- All-sky imager based
- ..



https://goo.gl/9Hnc9e

Jason Pohl | The Republic | azcentral.com

What is the best approach to measure cloud heights?





#### Benchmarking five cloud height measurement systems

Brief presentation of the considered approaches

- 1. Combination of one all-sky imager and a Cloud Shadow Speed Sensor
  - Adaption from Wang et al., <a href="https://doi.org/10.1016/j.solener.2016.02.027">https://doi.org/10.1016/j.solener.2016.02.027</a>
- 2. Differential approach combining one all-sky imager and a shadow camera
- 3. Differential two all-sky imager approach
  - > These approaches also provide cloud motion vector measurements
- 4. NWP cloud heights: Integrated Forecast System, ECMWF (3h data)
- 5. Ceilometer: CHM 15k NIMBUS, G. Lufft Mess- und Regeltechnik GmbH













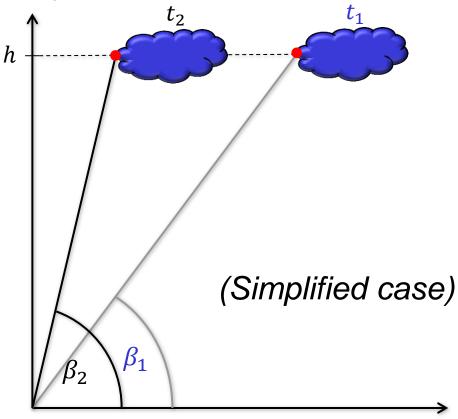
#### **Ground-based cloud height measurement systems**

Cloud heights are derived from cloud speeds in [rad/s] and [m/s]

Cloud height can be derived if  $v_{rad/s}$  and  $v_{m/s}$  are known



Time  $t_2$ 



$$h = v_{m/s} \cdot \frac{(t_2 - t_1)}{\cot(\boldsymbol{\beta}_1) - \cot(\boldsymbol{\beta}_2)} \longrightarrow \sim \frac{1}{v_{\text{rad/s}}}$$

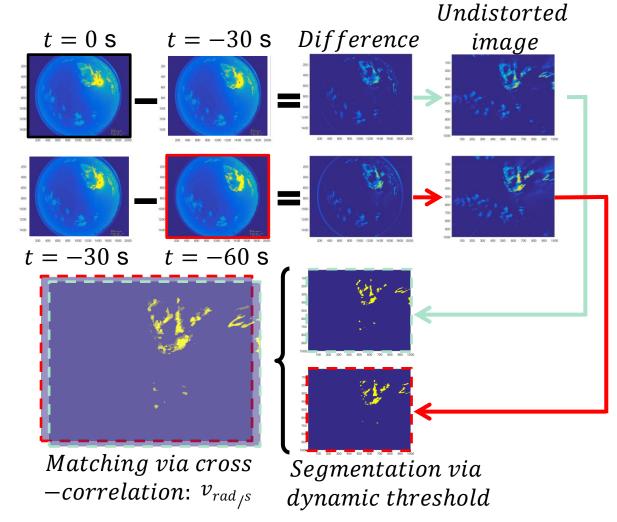




## Deriving v<sub>rad/s</sub> without detecting clouds

Cloud detection is a difficult task and an origin of deviations

- Detecting clouds
   within all-sky images
   is surprisingly difficult
- Novel approach is independent from detecting clouds
- Difference images of the blue color channel are used
- More robust against dirt

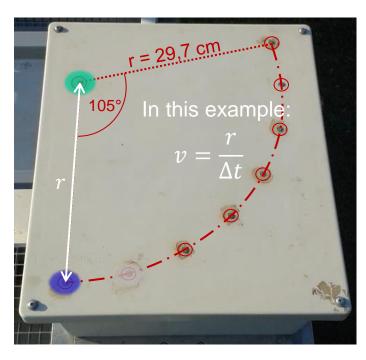


We have the angular velocity – how do we get the absolute velocity [m/s]?

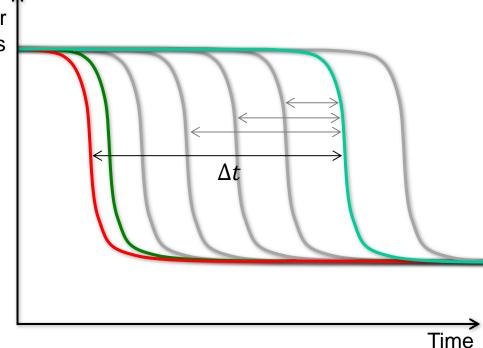


#### Cloud shadow speed sensor (CSS)

Detecting cloud shadow speeds by measuring signal ramps



Sensor signals



(Simplified case)

Fung, V., Bosch, J. L., Roberts, S. W., and Kleissl, J.: Cloud shadow speed sensor, Atmos. Meas. Tech., 7, 1693-1700, doi:10.5194/amt-7-1693-2014 2014.





### **Shadow camera system (SC)**

Detecting cloud shadow speeds by imaging an area



Off-the-shelf surveillance camera



Shadow camera image (4 per minute)



Orthoimage (5m per pixel)





#### Obtaining cloud motion vectors with a shadow camera

Determination of motion vectors is independent from segmentation

$$t = 0 \text{ s}$$

$$- \begin{bmatrix} t = -15 \text{ s} \\ - \end{bmatrix}$$

$$- \begin{bmatrix} t = -15 \text{ s} \\ - \end{bmatrix}$$

 $\Delta x$ 

$$t = -15 \text{ s}$$

$$t = -30 \text{ s}$$

Shadow speed  $v_{m/s} = \frac{\Delta x \times k}{\Delta t}$  meter/pixel meter/pixel

Reference cloud (shadow) motion vectors:

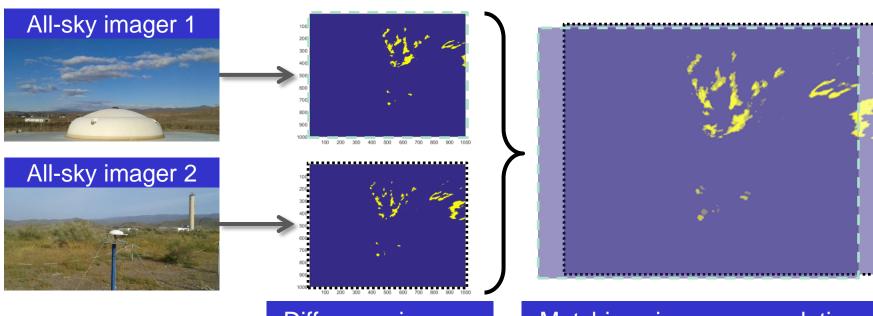
- Low cost sensor
- Little maintenance is needed
- Aperture problem is less relevant





### Using two all-sky imagers (ASI)

Measuring cloud speeds by matching difference images



of two ASIs at the same time

Matching via cross-correlation:  $v_{m/s}$  is determined by the known distance between the cameras

- Two all-sky imagers are used
- Difference images are calculated as shown for  $v_{rad,s}$

 No cloud detection needed - more resilient against dirt, more hardware-independent





#### Benchmarking five cloud height measurement systems

Results of the benchmarking campaign

- Benchmarking campaign on 59 days
- Benchmarking site:

Plataforma Solar de Almería, Spain

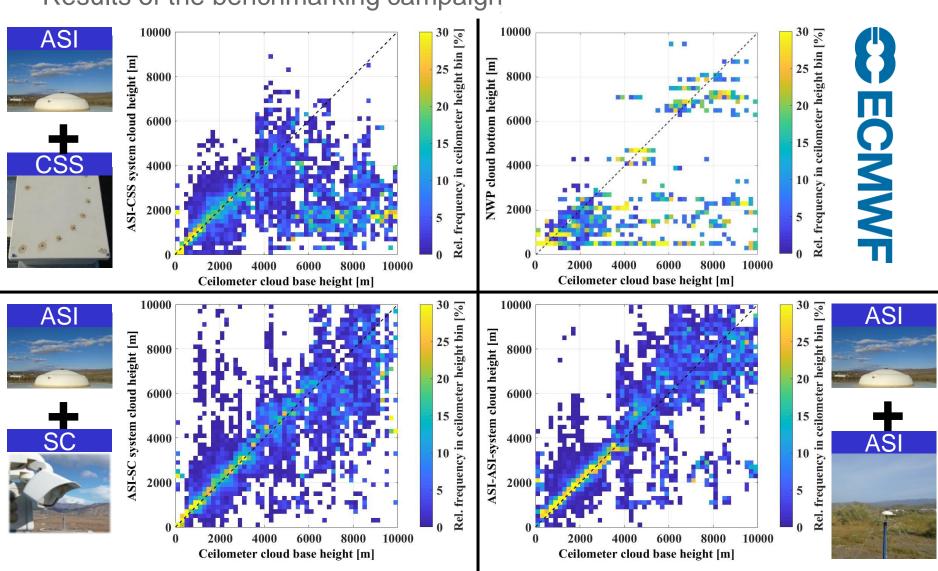
- Validation period contains large variety of cloud heights
- Multilayer cloud situations are included
- All considered systems provide one cloud height
  - For the ASI-ASI-approach, individual cloud heights can be derived
  - Systematic differences between point-like ceilometer cloud base heights and cloud heights derived by developed systems

This study is published in Kuhn et al., Benchmarking three low-cost, low-maintenance cloud height measurement systems and ECMWF cloud heights against a ceilometer, Solar Energy, 2018, <a href="https://doi.org/10.1016/j.solener.2018.02.050">https://doi.org/10.1016/j.solener.2018.02.050</a>



#### Benchmarking five cloud height measurement systems

Results of the benchmarking campaign



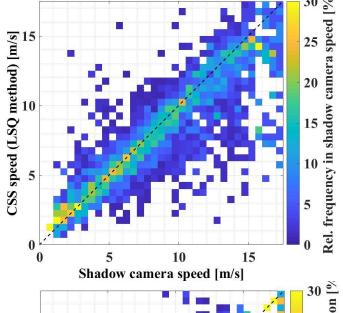


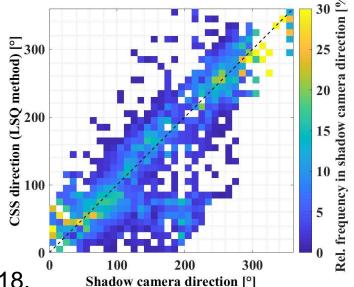
Development and application of the novel cloud motion

vector reference on 59 days

- Validation of the Cloud Shadow Speed Sensor:
  - MAD: 1.6 m/s (21.9 %) w/o temp. avg.
  - MAD: 30.4°(16,8 %) w/o temp. avg.
  - Detection rate on 223 days: 3.7 % 21.6 %
  - Aperture problem
- Data availability of the shadow camera reference system:
  - Years, 2015-2017
  - Currently looking for new setup, imaging a larger area
- Validation of all-sky imager derived cloud speeds conducted, publication in review

This study is published in Kuhn, P., et al., *Field validation and benchmarking of a cloud shadow speed sensor*, Solar Energy, 2018, <a href="https://doi.org/10.1016/j.solener.2018.07.053">https://doi.org/10.1016/j.solener.2018.07.053</a>.





#### Conclusion and further work

- Three low-cost, low-maintenance systems to derive cloud motion vectors and cloud heights are developed and benchmarked to ECMWF and ceilometer data on 59 days
- A system consisting of two all-sky imagers shows the best accuracy in comparison to a ceilometer
- A novel method to derive reference cloud motion vectors was developed and applied to a Cloud Shadow Speed Sensor
- Cloud motion vectors can be derived and used as a reference for ground based sensors, satellite based products and NWP models
- Study on optimal distance between all-sky imagers finalized
- Future work: Camera-derived cloud heights for aviation





Supported by:



on the basis of a decision by the German Bundestag



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Thank you! Questions?



## Thank you!

## **Questions?**

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