



*INSTITUTE OF MONITORING
OF CLIMATIC AND ECOLOGICAL SYSTEMS*

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Monitoring cumulus clouds using global horizontal irradiance data

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Cb formation stages

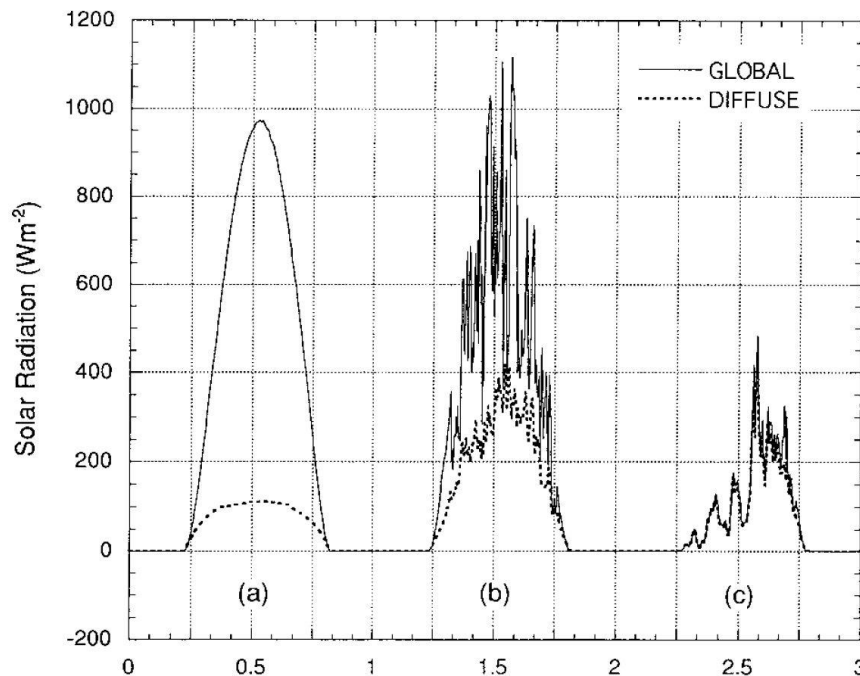


Cb are sources of dangerous meteorological phenomena (showers, thunderstorms, squalls, etc.) and form from *Cu*. Continuous *Cu* monitoring can predict *Cb* formation.

Common method for estimation cloud type using *GHI* data

Global Horizontal Irradiance (*GHI*) is the sum of Direct Normal Irradiance (*DNI*) (at some Sun altitude *h*) and Diffuse Irradiance (*DI*):

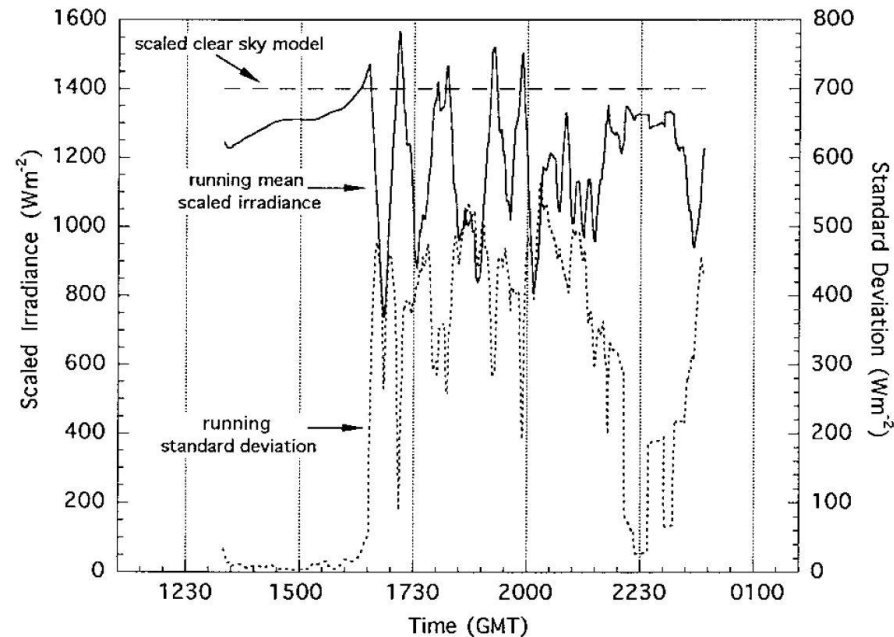
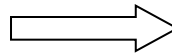
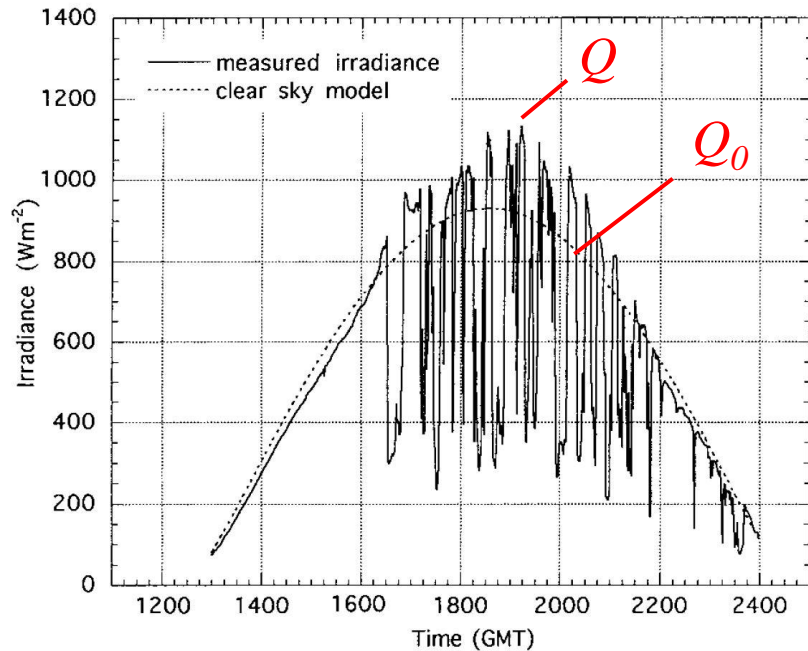
$$Q = S \cdot \sin h + D.$$



Procedure for determining the cloud type:

1. Estimation of the average value of the analyzed GHI window.
2. Estimation of the GHI standard deviation of the analyzed window.

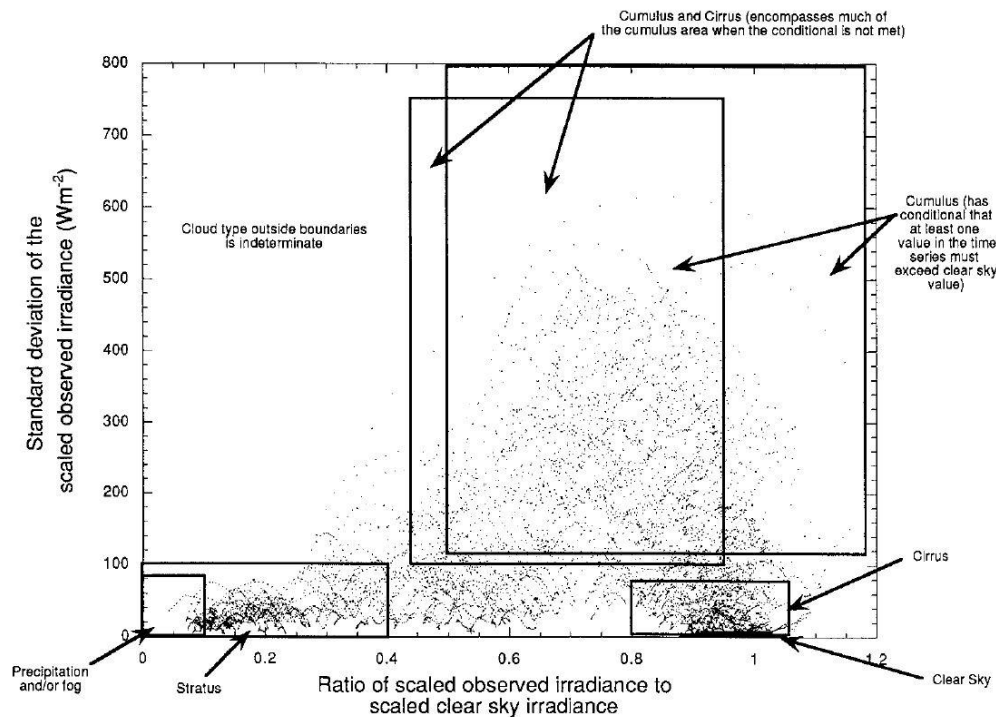
Common method for estimation cloud type using GHI data



At first, non-stationary GHI time series is converted to stationary using any clear sky model Q_0 .

Common method for estimation cloud type using *GHI* data

Then, using a 21-minute moving window (± 10 minutes near the point of analysis), its variation and amplitude characteristics are determined.



And finally, the analyzed point is assigned a cloud type according to the decision criterion.

For *Cu*: $\sigma = 100 \div 800 W/m^2$

$$Q/Q_0 = 0.4 \div 1.2$$

Difficulty of clear sky irradiance modeling

To compute the clear sky model

$$Q_0 = S_0 \cos \Theta_z T_R T_g T_w T_a$$

a large dataset of measurements and reference data (8 parameters in total) are required:

$$T_R T_g = 1.021 - 0.084[m(949p \times 10^{-5} + 0.051)]^{0.5},$$

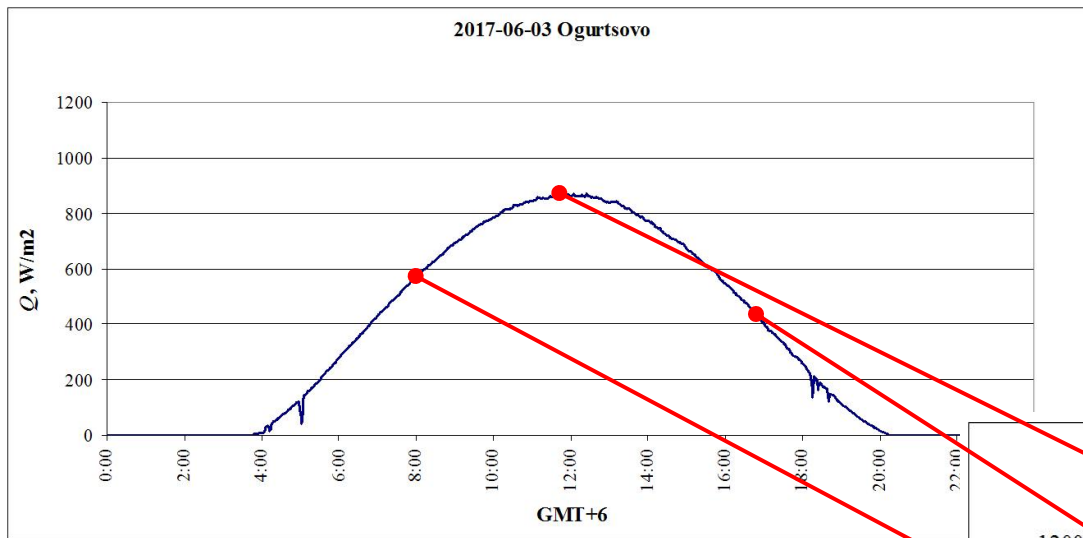
$$m = 35(1224 \cos^2 \theta_z + 1)^{-0.5},$$

$$T_w = 1 - 0.077(um)^{0.3},$$

$$u = \exp[0.1133 - \ln(\lambda + 1) + 0.0393 T_d],$$

$$T_a = X^m$$

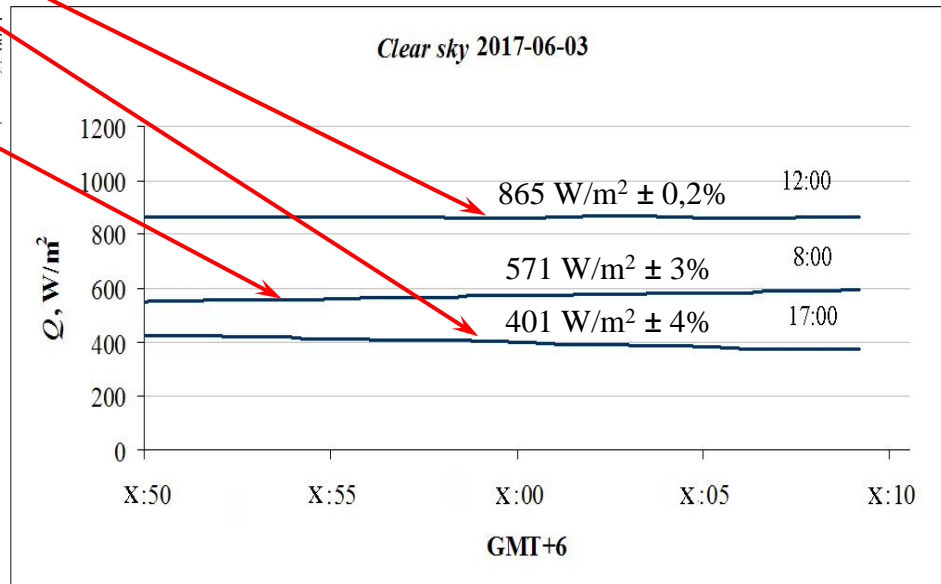
Stationarity of short GHI samples



Short 21-min samples of the GHI time series can be considered as stationary.

No clear sky model needed.

The coefficient of variation (CV) $V = \frac{\sigma}{Q_{AV}}$ is used instead of the standard deviation σ .



Specific features of *Cu*



1. Dense opaque clouds.

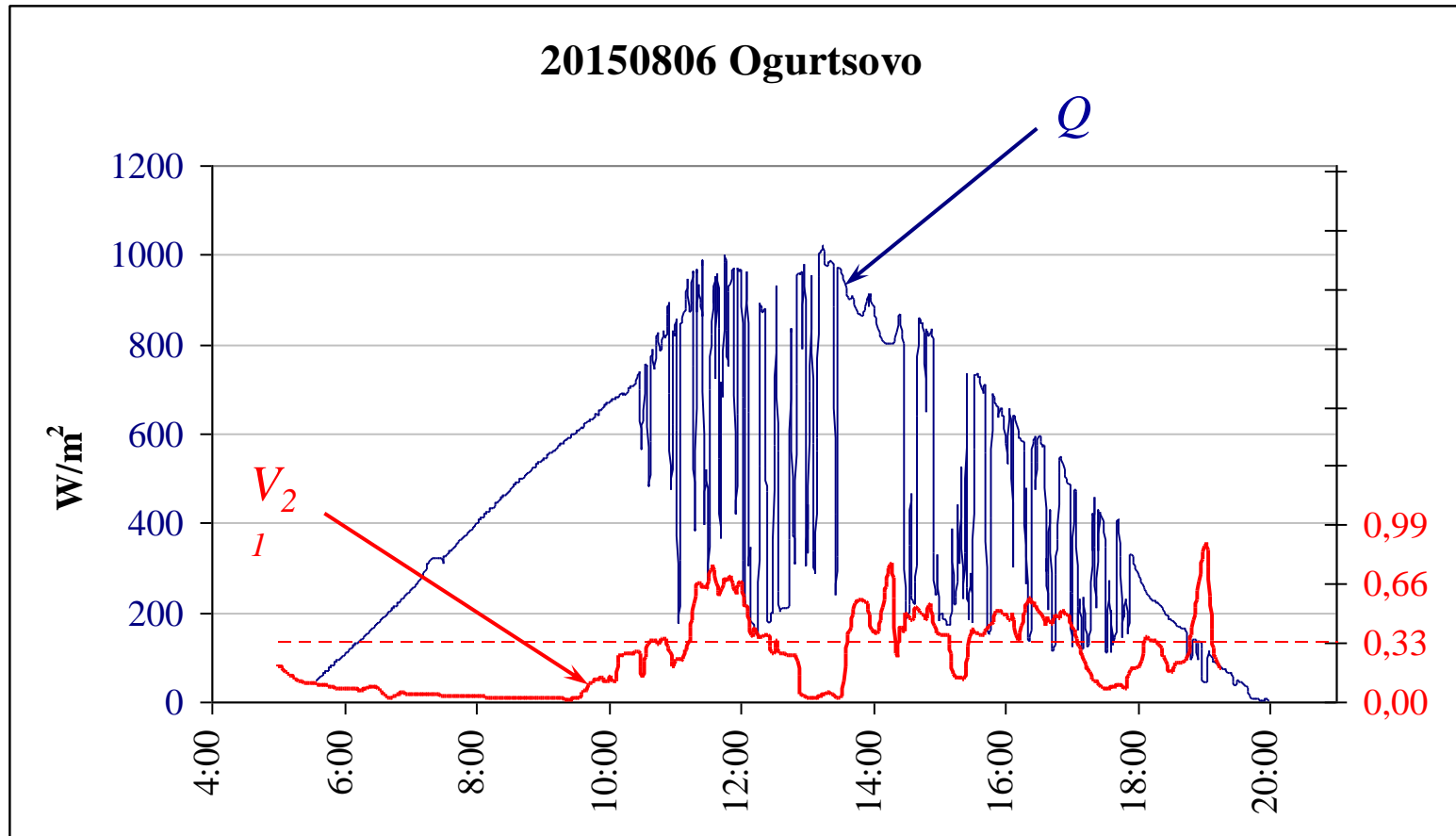
2. Clear skies between separate clouds.

3. The Sun is almost always at one of a stable states:

- completely closed and $Q_{min} = D,$

- completely open and $Q_{max} = S' + D.$

Cu detector V_{21}



The result, under *Cu* form a very heterogeneous GHI time series. When the coefficient of variation (CV) for a 21-min. moving window $V_{21} > 0.33$, near analyzed point ± 10 min. cumulus are present.

Cu detector V_{21} problems



Similar variation characteristics also form under St and Ns .

This is due to the high sensitivity of CV to small changes of Q at its low average values.

For the detector V_{21} an additional criterion is required.

Cu detector $V_{21}+V_3$



The Sun is completely closed.



Transitional state of the Sun.



The Sun is completely open.

Another specific feature of *Cu* is its distinct boundaries. Therefore, the change from one Sun stable state to another takes a short time (usually 1-2 min.). At the same time, sharp changes are formed between Q_{max} and Q_{min} at the GHI time series. This is an additional criterion, the analysis of the CV of a 3-minute window V_3 (± 1 min. near the point of analysis), moving within the analyzed 21-min. window. If at least for one point $V_3 > 0.33$, then *Cu* are present.

Comparison of V_{21} and $V_{21}+V_3$ detectors



For compare the detectors, the GHI data of the CM-11 pyranometer (May-August 2018 for $h > 30^\circ$) and the All-sky images of the MVK-1653c panoramic camera (IMCES SB RAS) are used.

Comparison of V_{21} and $V_{21}+V_3$ detectors

		Predicted state	
		<i>Cu</i>	not <i>Cu</i>
Real state	<i>Cu</i>	True Positive	False Negative
	not <i>Cu</i>	False Positive	True Negative

Detecting *Cb* as *Cu* was not considered a mistake.

The results were checked using a binary classifier (predicted / real state):

True Positive (*TP*) – *Cu* / *Cu*

False Positive (*FP*) – *Cu* / not *Cu*

False Negative (*FN*) – not *Cu* / *Cu*

True Negative (*TN*) – not *Cu* / not *Cu*

Positive Predictive Value $PPV = \frac{TP}{TP + FP}$

True Positive Rate $TPR = \frac{TP}{TP + FN}$

F-measure $F_1 = \frac{2 \cdot PPV \cdot TPR}{PPV + TPR}$

Comparison results

Month	Version	Total analysis points	<i>TP</i>	<i>FP</i>	<i>FN</i>	<i>PPV</i>	<i>TPR</i>	<i>F₁</i>
May	V_{21}	14806	2821	440	316	0,86	0,90	0,88
	$V_{21} + V_3$	14745	2051	191	390	0,91	0,84	0,88
June	V_{21}	13255	1885	723	677	0,72	0,74	0,73
	$V_{21} + V_3$	13201	1556	344	722	0,82	0,68	0,74
July	V_{21}	16913	2628	448	588	0,85	0,82	0,84
	$V_{21} + V_3$	16853	2621	230	668	0,92	0,80	0,86
August	V_{21}	14784	2562	592	913	0,81	0,74	0,77
	$V_{21} + V_3$	14732	1933	306	1037	0,86	0,65	0,74
Total (mean)	V_{21}	59758	9907	2203	2494	(0,81)	(0,80)	(0,81)
	$V_{21} + V_3$	59531	8188	1071	2817	(0,88)	(0,74)	(0,81)

The result of using the additional criterion:

1. Errors of *Cu* detection decreased by 50%;
2. The precision has increased by 7% with a decrease of the sensitivity by 6%.

Comparison results

Month	Version	Total analysis points	Total points <i>FP</i>				
			<i>Ci fib.</i>	<i>Ac cuf.</i>	<i>Sc cuf.</i>	<i>St</i>	<i>Ns</i>
May	V_{21}	14806	0	191	244	0	5
	$V_{21} + V_3$	14745	0	79	112	0	0
June	V_{21}	13255	125	365	223	0	18
	$V_{21} + V_3$	13201	17	233	94	0	0
July	V_{21}	16913	0	145	147	52	104
	$V_{21} + V_3$	16853	0	128	178	0	0
August	V_{21}	14784	24	206	455	0	73
	$V_{21} + V_3$	14732	5	167	139	0	0
Total	V_{21}	59758	149	907	895	52	200
	$V_{21} + V_3$	59531	22	607	442	0	0

3. Errors of *St* and *Ns* have completely disappeared.

4. Errors of *Ac cuf.* decreased by 30%;

5. Errors of *Sc cuf.* decreased by 50%;

To reduce errors of *Ac cuf.* and *Sc cuf.* further studies are required.

Conclusion

- The proposed method allows monitoring medium and high Cu amount at near real time.
- To realize the method does not require difficult calculations.
- Possibility to use the existing network of actinometric observations.
 - Possibility of using simple PAR sensors.



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Thank you for attention!

This work was supported by the Ministry of Science and Higher Education (Project IX.138.2.5 "Scientific and methodological foundations for development and use of technologies and information-measuring systems for remote monitoring of the lower atmosphere").

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