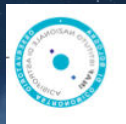


***Analysis and forecasting of weather conditions
from satellite data and
correlation with astronomical parameters for
the E-ELT site***



STEFANO CAVAZZANI

**CTA Consortium
QUANTUM FUTURE Team**



SERGIO ORTOLANI



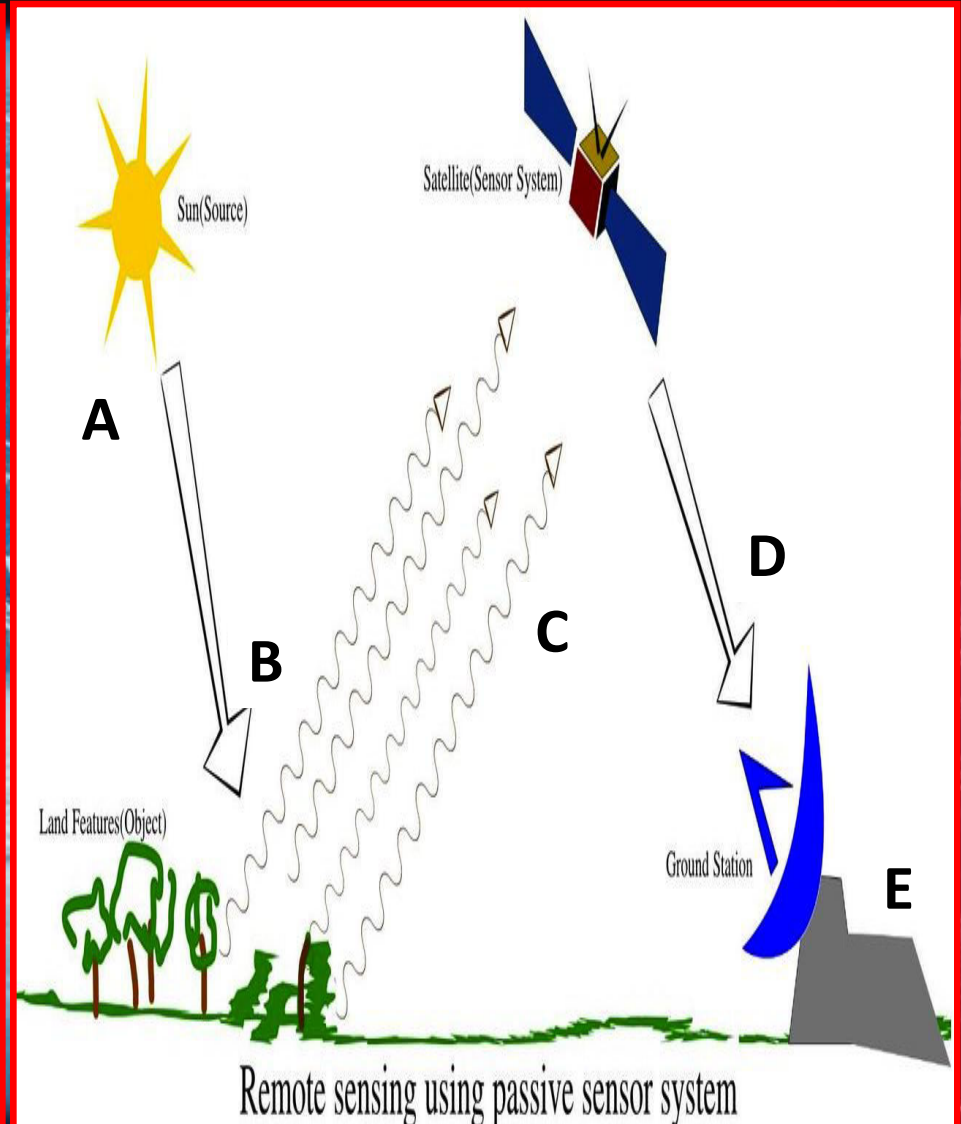
VALENTINA ZITELLI

**THE OUTCOME OF THE T-REX PROJECT, the Italian
Progetto premiale for E-ELT**

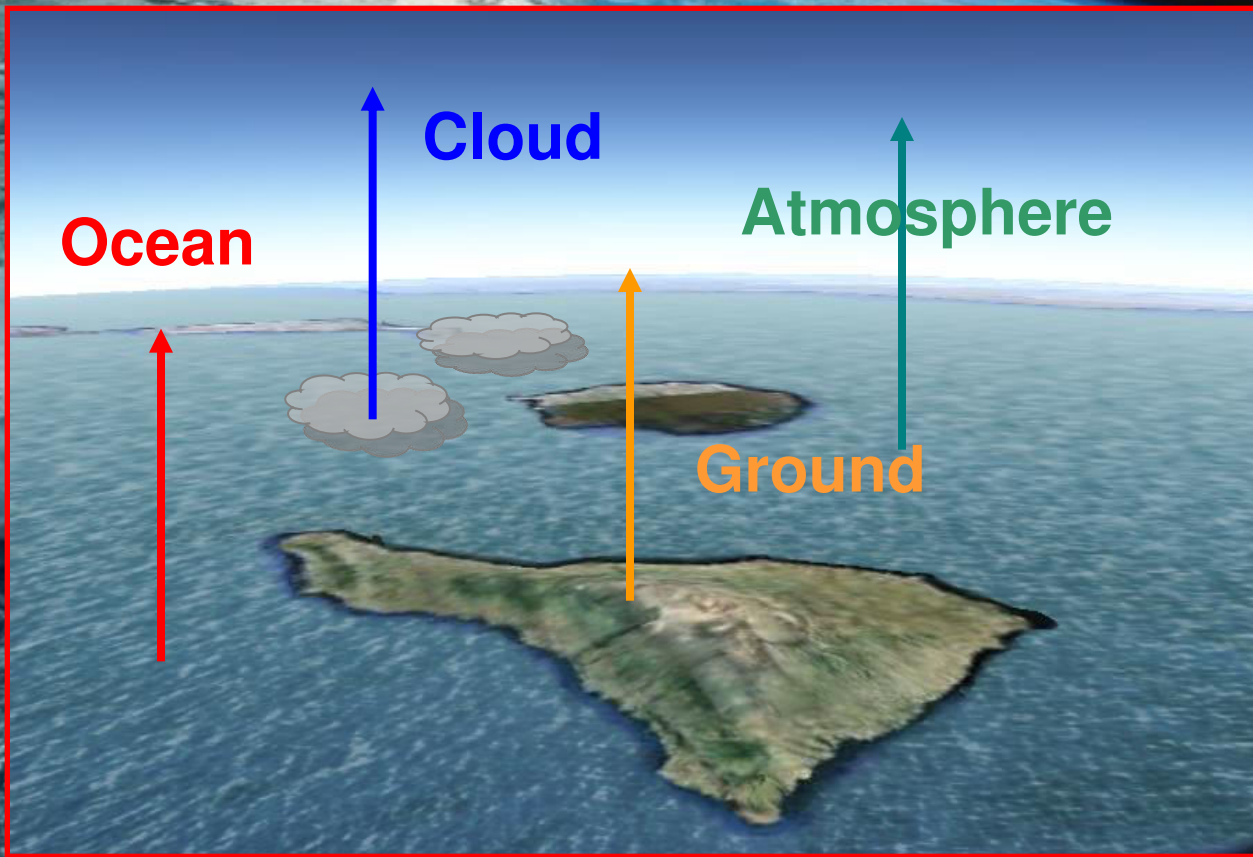
July 20-23 2015 Sexten

The Steps of Remote Sensing

- A.** The Sun provide electromagnetic energy
- B.** The energy reaches the target and interacts with it according to the target's properties
- C.** Energy emitted or scattered by the target is collected by the sensor
- D.** The sensor transmits the electronic information to a receiving and processing station and information is processed into an image
- E.** The processed image is than interpreted



Night Infrared Emission



During the night we observe the infrared emission and we have various components of this emission

There are no meteorological database on the night cloud cover at astronomical sites

It is very difficult to separate these components from satellite

Site Testing

- To give answer to the questions:
 - “Will the sky be clear?”
 - “Will the turbulence be strong, regular or quiet?”
- To optimize and tune the telescope instruments
- Atmospheric turbulence is one of the main limitations for ground based observations.
- Site test campaigns are limited to a short time interval and the local conditions can considerably change after the installation of new dome and buildings
- About 20% of the available science time

Great Importance of a model able to predict the atmospheric conditions

Satellite Data

- **Geostationary satellites**
Orbit: 36000km. They orbit always above the same point. Limited field of view.

Higher Time Resolution

- **Polar satellites**
Orbit: 800km. They pass over the same point about every 12 hours

Theoretical High Spatial Resolution



GOES 12



Orbit always above the same point. Limited field of view.
Higher Time Resolution.

AQUA-MODIS

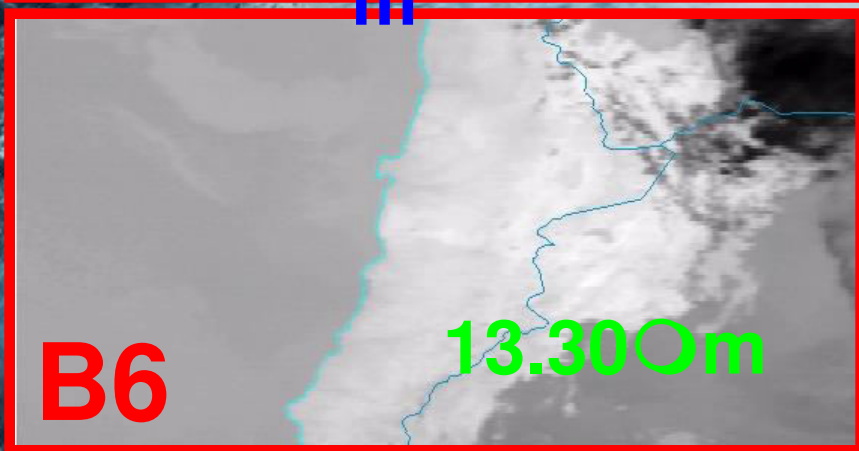
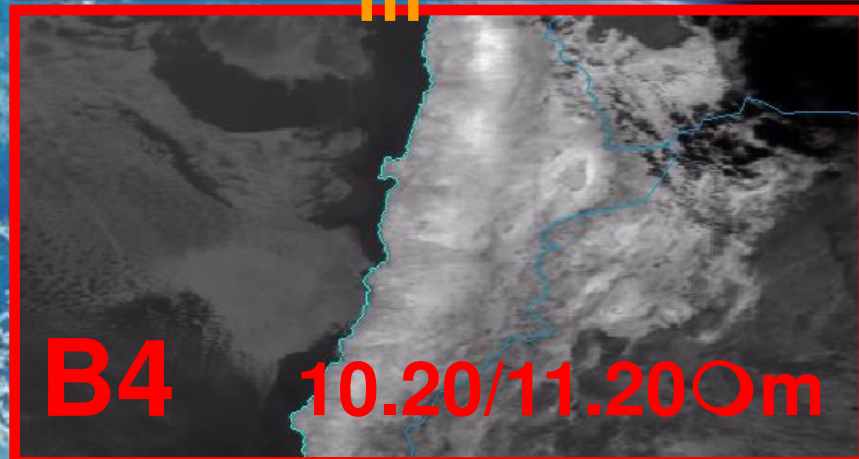
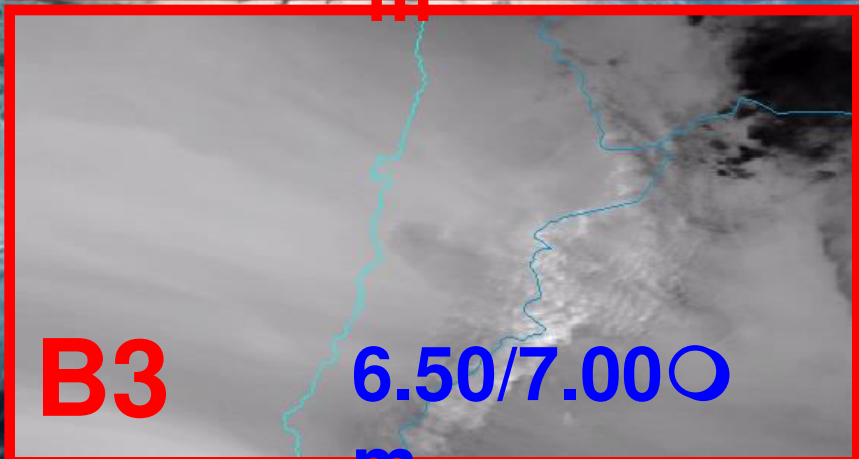
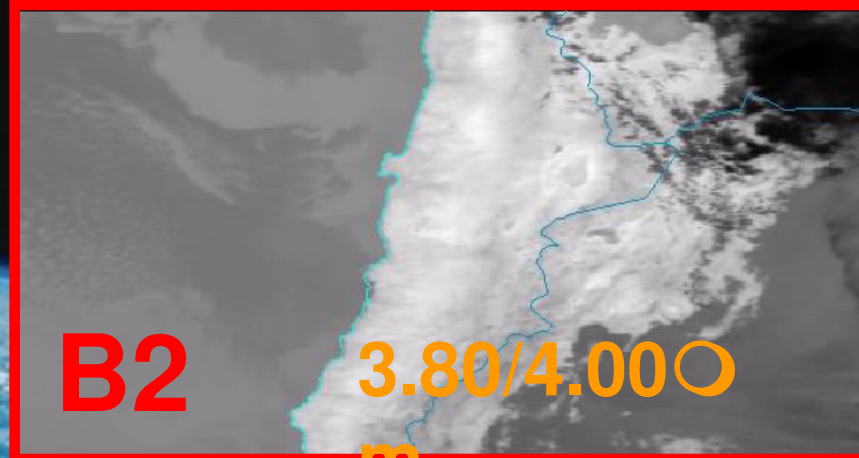
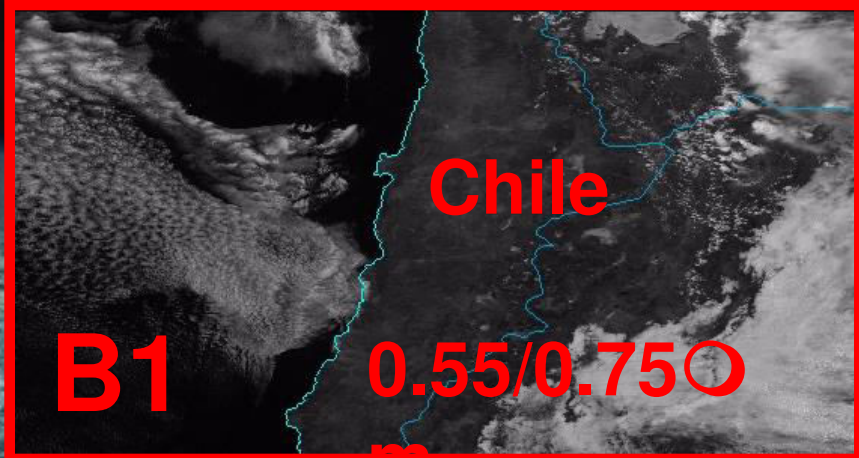


Pass over the same point about every 12 hours.
Covers the entire globe

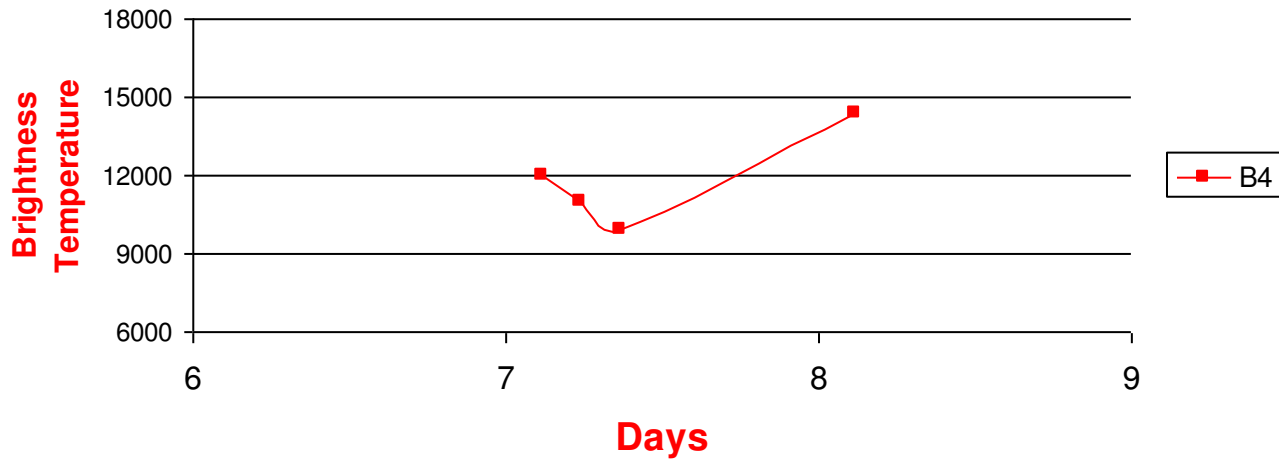
Bands of GOES12

● Resolution

- **BAND1: (Visible) 0.55/0.75 μ m (4Km)**
- **BAND2: (MW) 3.80/4.00 μ m (4Km)**
- **BAND3: (H₂O) 6.50/7.00 μ m (4Km)**
- **BAND4: (IR) 10.20/11.20 μ m (4Km)**
- **BAND6: (CO₂) 13.30 μ m (8Km)**

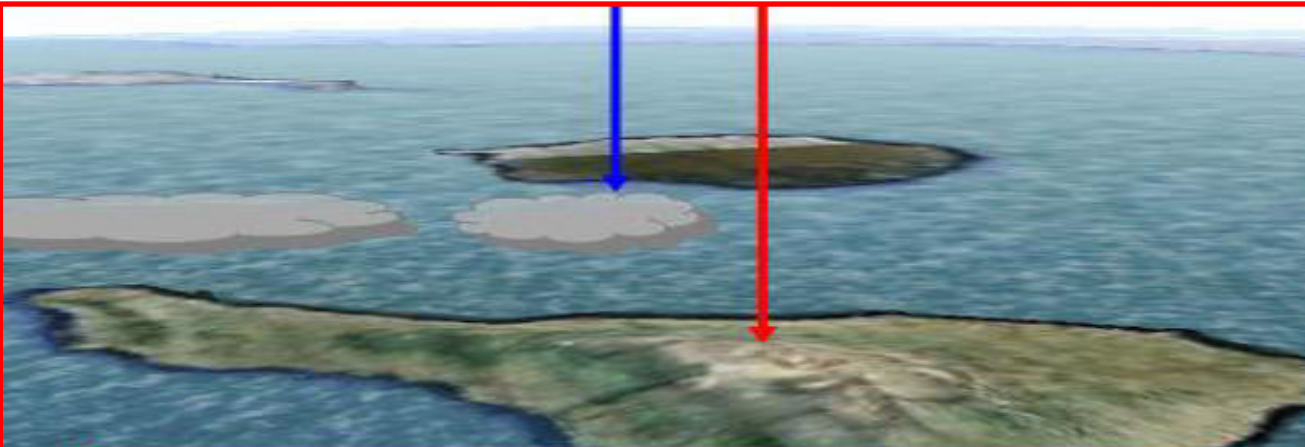


Jan2008 La Palma



23.45

2.45



➤ Higher temperature implies a lower altitude

➤ Lower temperature implies a higher altitude

5.45

8.45

David André Erasmus (1955-2007)

The pioneer of this type of analysis

- He was member of American Meteorological Society and the American Geophysical Union
- Important member of ESO staff
- He was a consulting meteorologist who contributed to work on the siting of telescopes, including the SALT and the ESO VLT.

Inversion Data Method

$$R_\lambda = (I_0)_\lambda \tau_\lambda(z_0) + \int_{z_0}^{\infty} B_\lambda[T(z)] K_\lambda(z) dz$$

The emitted monochromatic radiation intensity at a given \bullet

Emission from the earth surface at height z_0

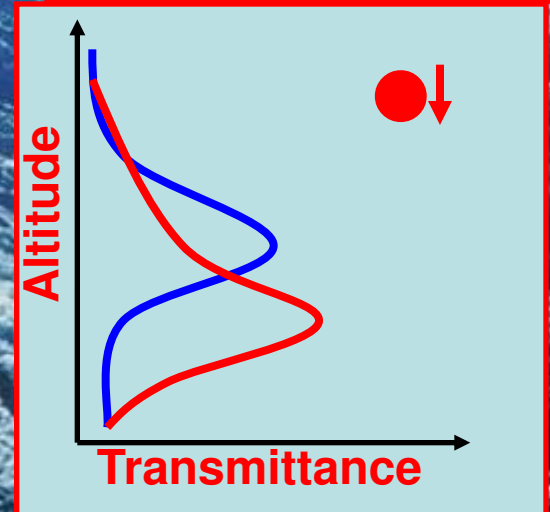
Vertical transmittance from height z to space

Planck function profile as function of vertical temperature profile T

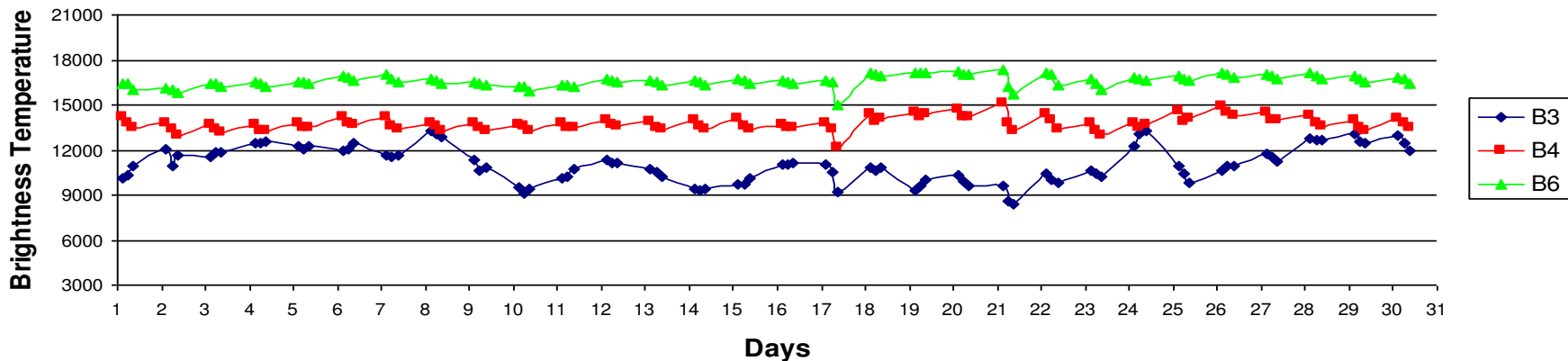
Weighting Function (WF)

Specifies the layer from which the radiation emitted, determines the region of the atmosphere which can be sensed from space at fixed \bullet

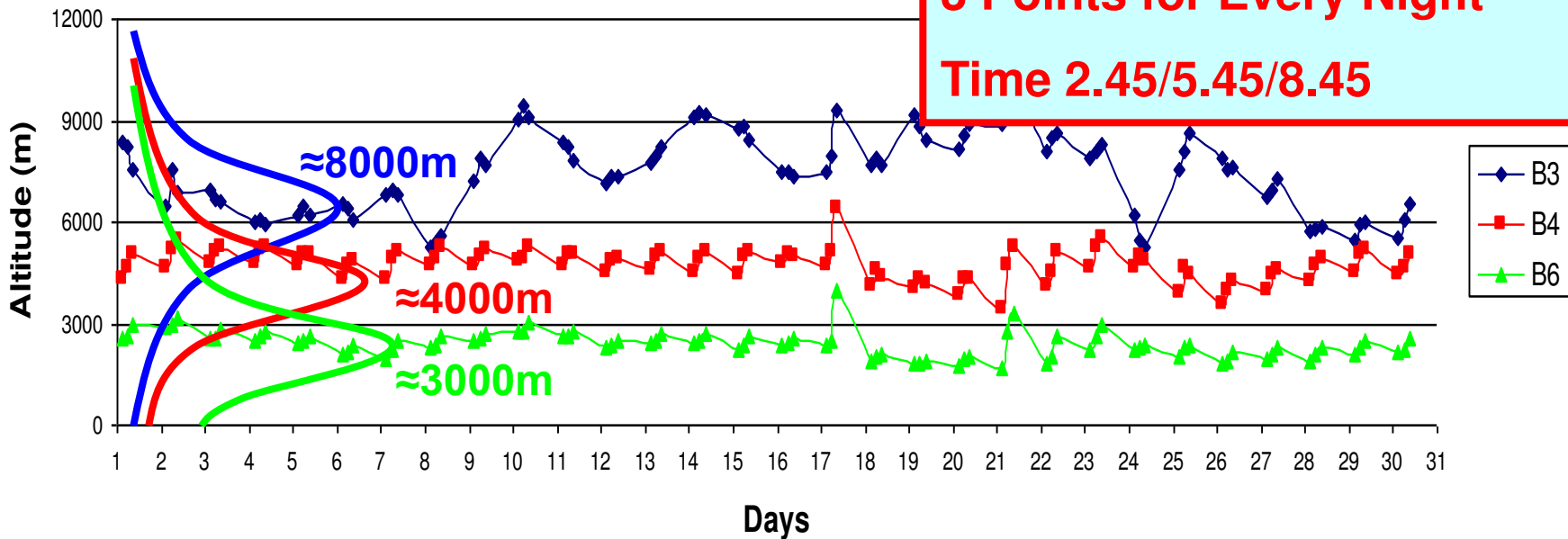
$$\frac{d\tau_\lambda(z)}{dz}$$



Nov2007 Paranal



GOES Weighting Functions Nov2007 Paranal



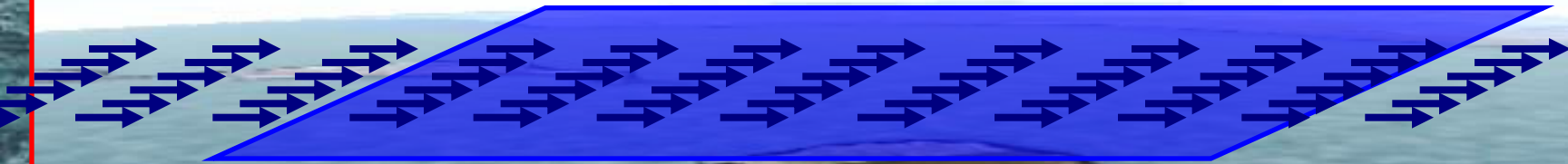
Example Paranal Nov2007

3 Points for Every Night

Time 2.45/5.45/8.45

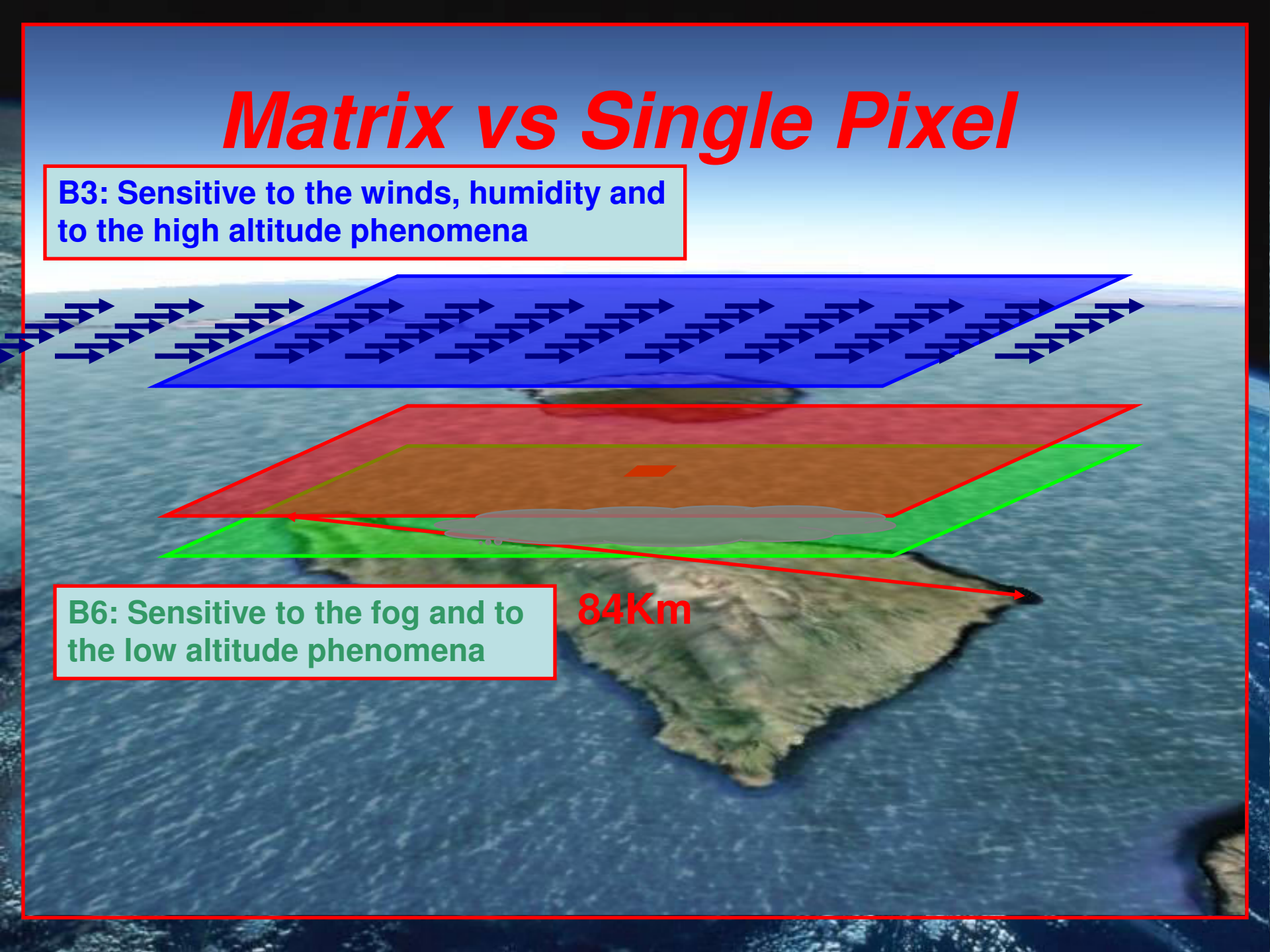
Matrix vs Single Pixel

B3: Sensitive to the winds, humidity and to the high altitude phenomena



B6: Sensitive to the fog and to the low altitude phenomena

84Km



Matrix vs Single Pixel

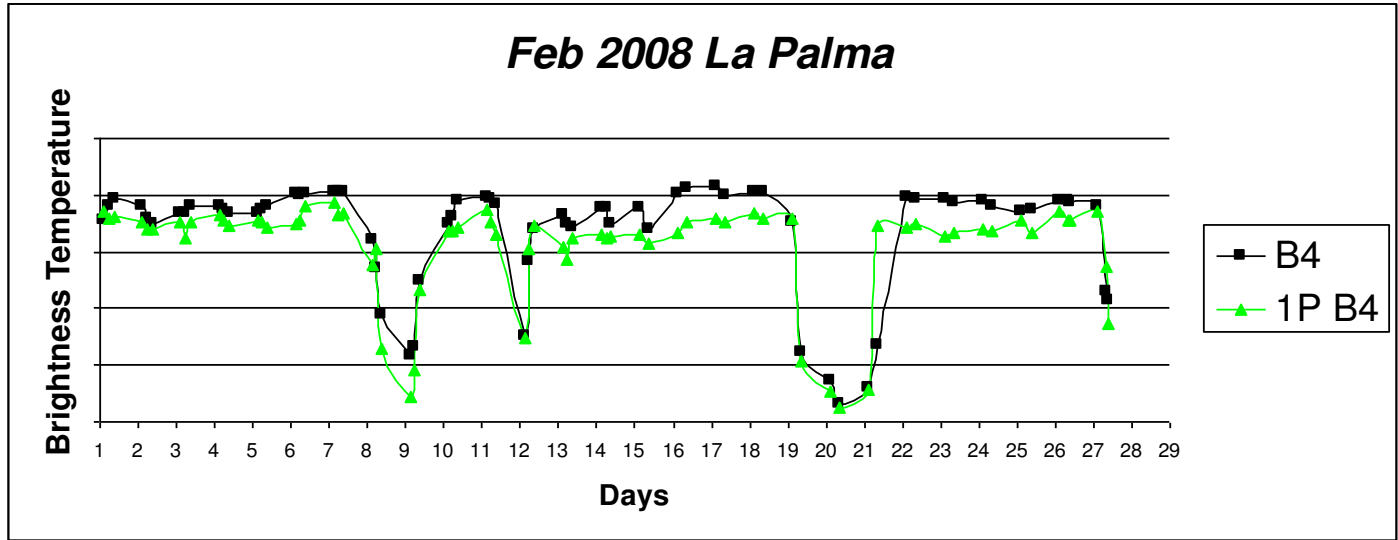
B4 Matrix high standard deviation



Brightness Temperature

0 50 100 150 200 250

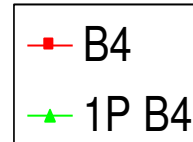
Number of Events



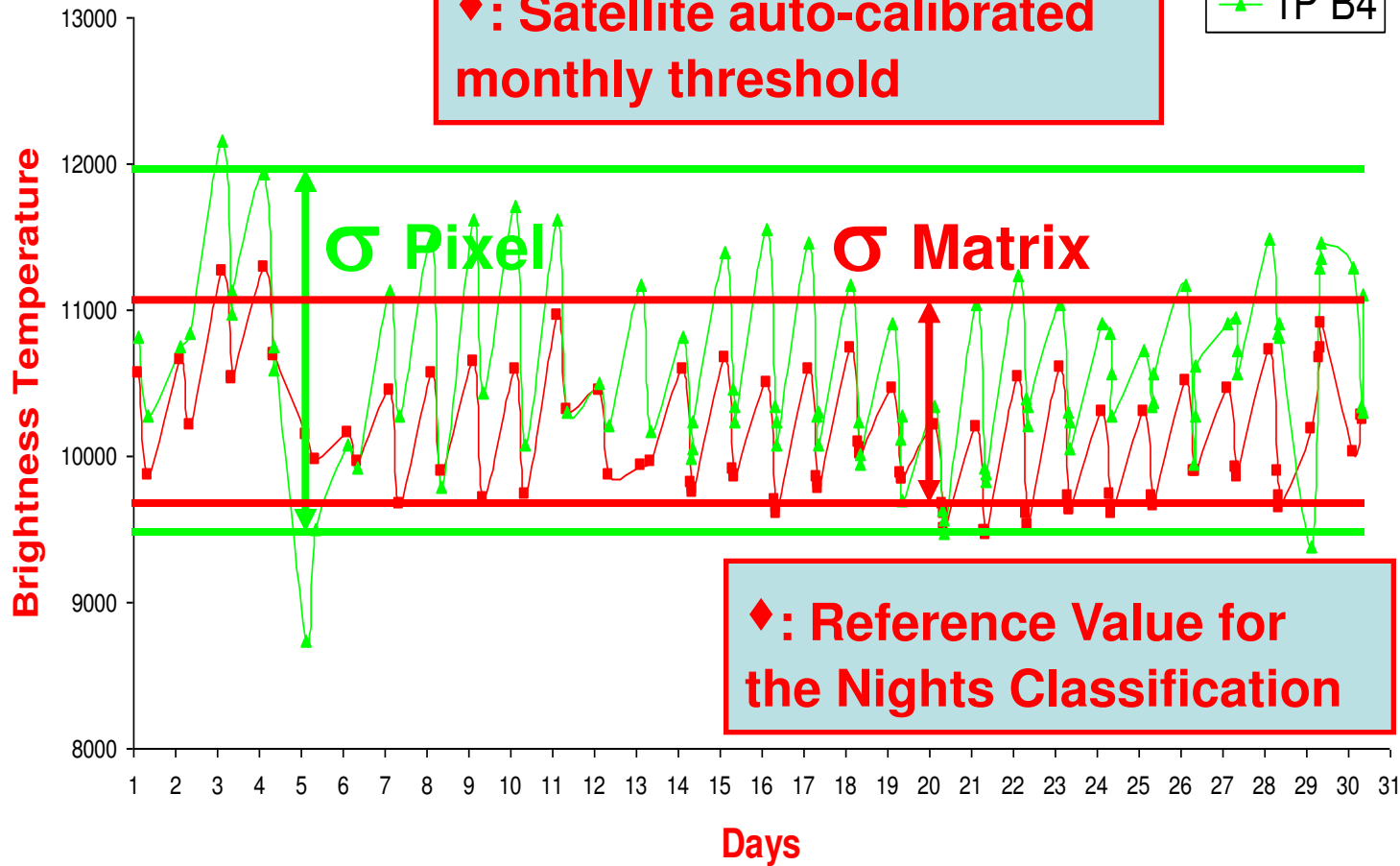
**•La Palma 2008
Correlation 92%**
**•Paranal 2008
Correlation 98%**

Matrix vs. Single Pixel

Sep 2008 Paranal



◆ : Satellite auto-calibrated monthly threshold



Atmospheric Correlation Function

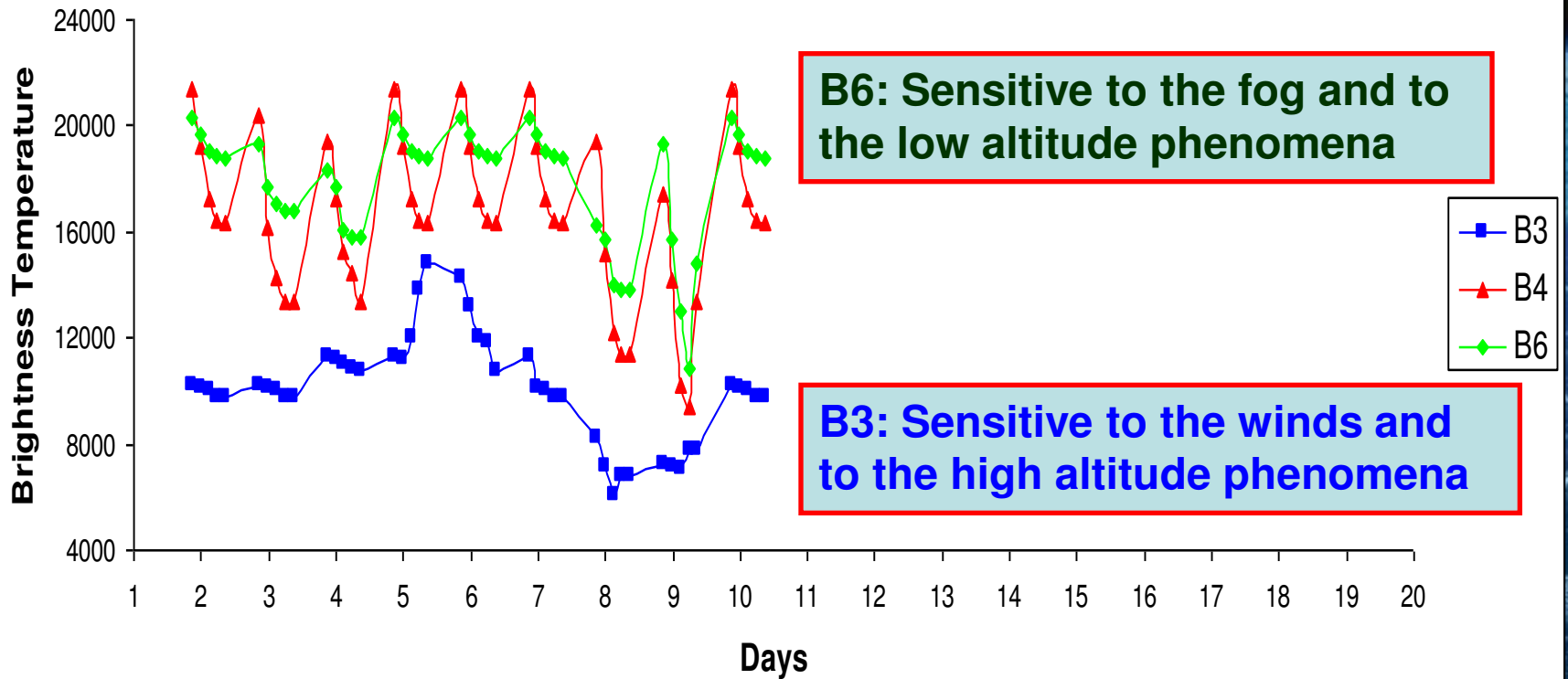


$$I_{C.A.} = \frac{R_{\lambda_3} + R_{\lambda_4} - R_{\lambda_6}}{\tau(z_0)} +$$

$$\frac{\int_{z_0}^{\infty} B_{\lambda_3}[T(z)]K_{\lambda_3} + B_{\lambda_4}[T(z)]K_{\lambda_4} - B_{\lambda_6}[T(z)]K_{\lambda_6} dz}{\tau(z_0)}$$

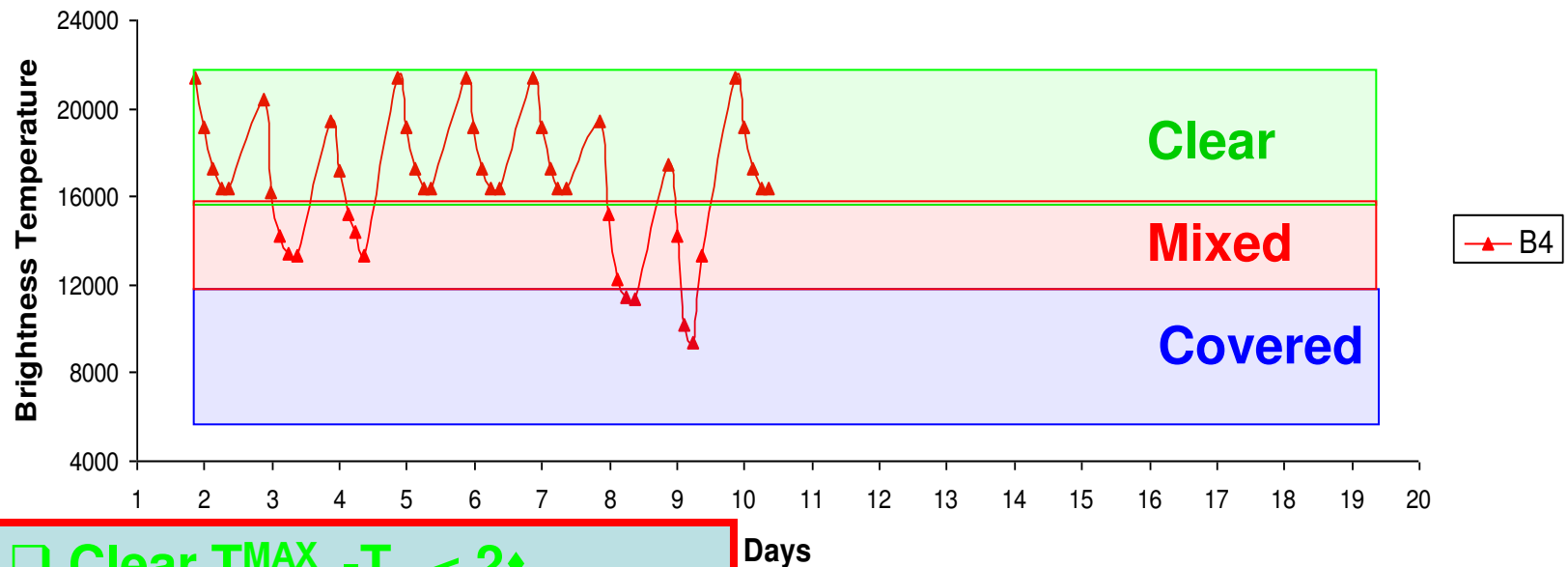
Simulation of the model

B3, B4 and B6 Trends



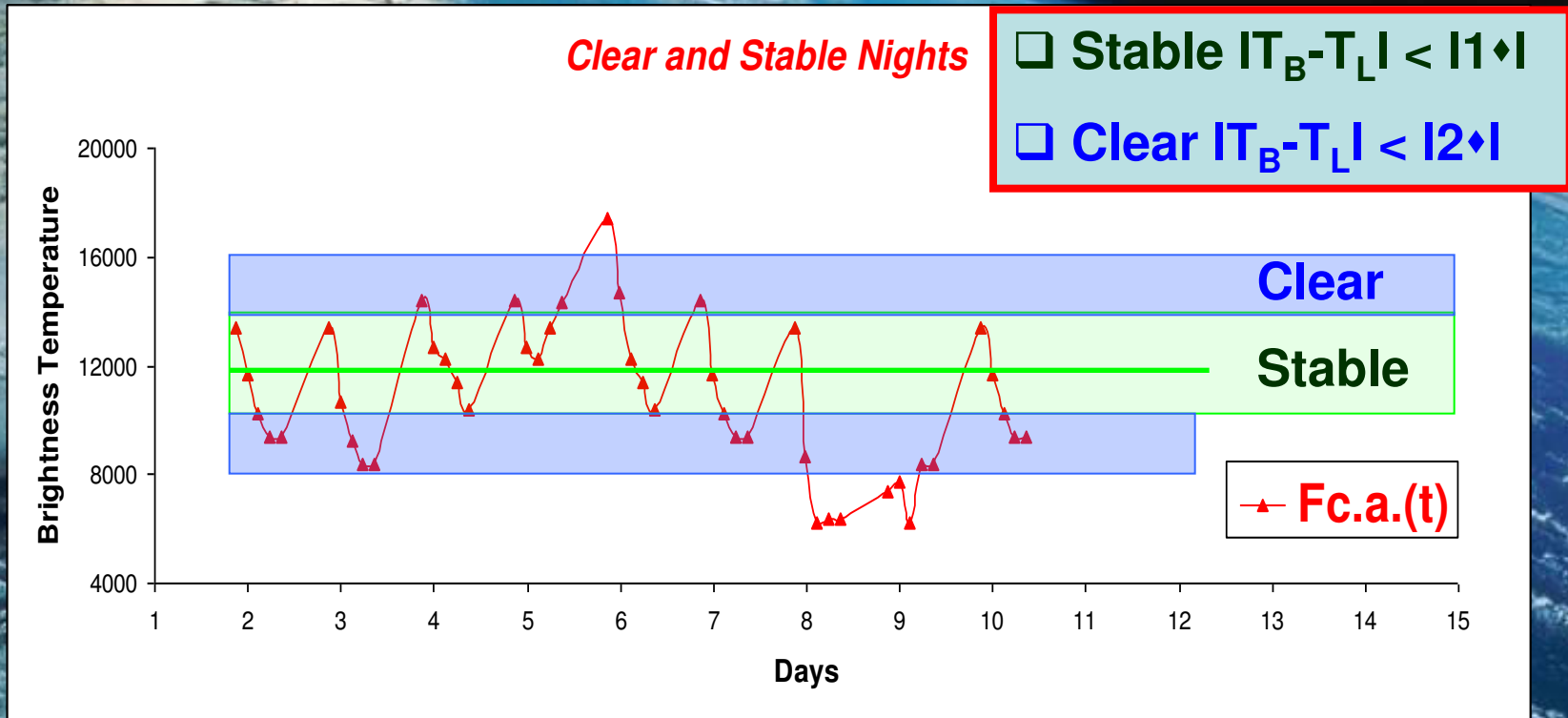
Clear, Mixed, and Covered *Classification*

Clear, Mixed and Covered Nights



- Clear $T_{B}^{MAX} - T_{B} < 2 \diamond$
- Mixed $2 \diamond < T_{B}^{MAX} - T_{B} < 3 \diamond$
- Covered $T_{B}^{MAX} - T_{B} > 3 \diamond$

Stable and Clear Classification



The Selected Sites for the Model Validation



Description of LOGBooks

January 2009

Observing: 156.7 hours
Weather Loss: 156.0 hours
Technical Loss: 18.7 hours
Scheduled Maintenance: 0 hours

Liverpool Log

Date	Hours Used			Comment
	Observing	Weather	Technical	
31 Jan	0.0	10.5	0.0	Ice.
30 Jan	0.0	10.5	0.0	Ice.
29 Jan	6.0	4.5	0.0	High humidity second half of night.
28 Jan	10.6	0.0	0.0	Non-photometric
27 Jan	10.6	0.0	0.0	Photometric
26 Jan	10.6	0.0	0.0	Non-photometric
25 Jan	3.6	7.0	0.0	Non-photometric. High humidity at start and end of night.
24 Jan	8.6	0.0	2.0	Non-photometric. Cass rotator jammed at start of night.
23 Jan	9.6	0.0	1.0	Non-photometric. Cass torque errors leading to node reboot & unrelated altitude node reboot.
22 Jan	0.0	3.0	7.6	High humidity at times. Cass rotator jammed.
21 Jan	9.5	0.0	1.1	Photometric. Cass torque errors leading to node reboot. Also unrelated AZM node reboot.
20 Jan	10.2	0.0	0.5	Photometric. Cass node reboot.

CAMC Log January 2009

090120 RM Obs toda la noche. Buena noche. 15 tiras. Rebuteo en la 12. 9.54 horas buenas. Fluctuaciones.

090121 RM Obs toda la noche (buena). 15 tiras. 10.96 horas buenas.

090122 RM Obs media noche. Tiras 1-11, 2 NotObs. Parada por humedad en 1 y 7. 1 hora buena. Problema con Seals al abrir en la 8, observa con Domo cerrado.

090123 RM Obs casi toda la noche. tiras 1-14, la 8 NotObs. Rebuteo en 3 y 6. Humedad en 10 y 13. 3.85 horas buenas. Error en single_find_act: archivo que no puede borrar.

090124 RM Obs toda la noche. 11 tiras. 6.21 horas buenas.

090125 MS Cortes por lluvia y alta humedad. 5 tiras, 1 hora buena. En la apertura del domo despues del cierre por lluvia fallan los seals y observa las tiras 4 y 5 con el domo cerrado.

JM Modificado automati.pas (linea 1007) para que intente abrir varias veces si fallan los seals.

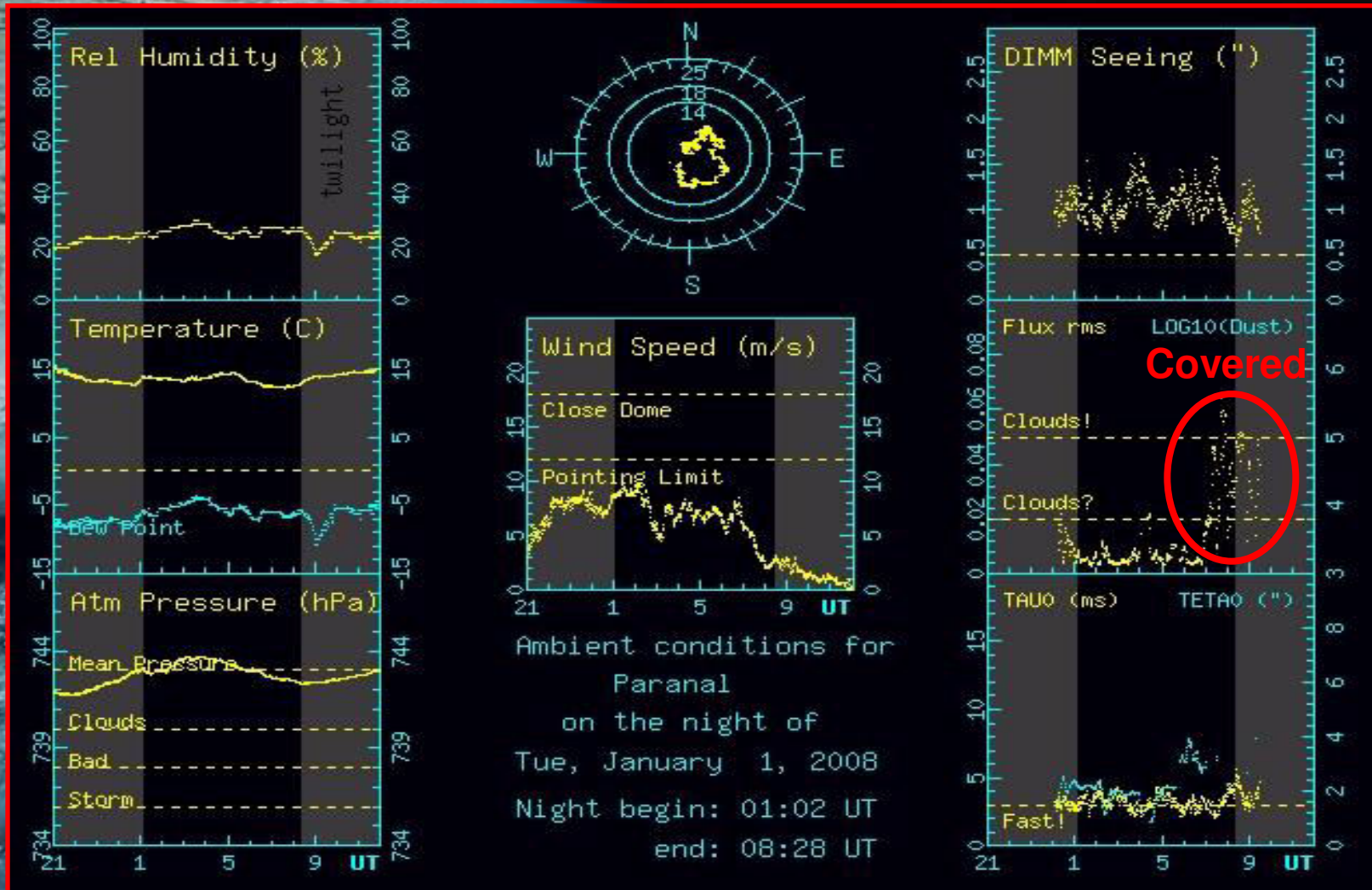
090126 MS Obs 2/3 de la noche. Empieza tarde por continuos fallos en los seals. 7 tiras, 6.5 horas buenas.

090127 MS Obs toda la noche. 11 tiras, fluctuaciones.

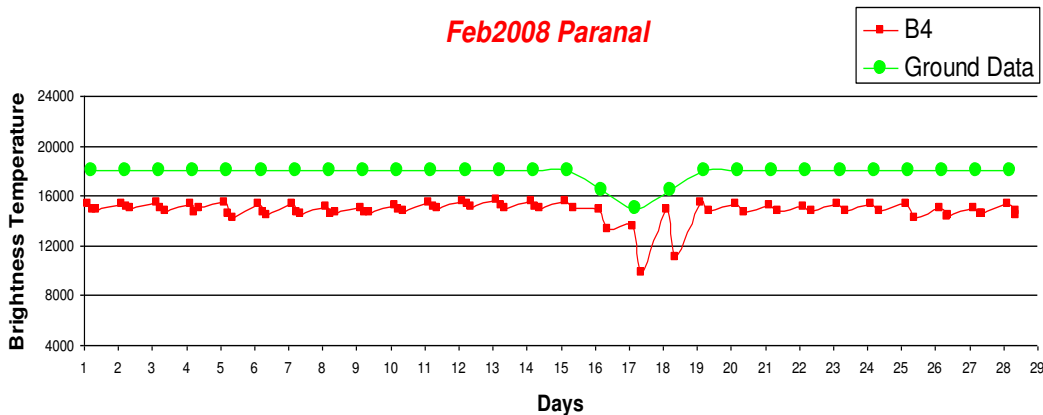
090128 MS Obs toda la noche. 18 tiras, fallan todas las pares hasta la 12 por camera not idle y despues de un rebuteo en la 11 no vuelve a fallar. Errores continuos de checksum en el mic 3. Aun asi la punteria fue buena y todas las tiras estaban bien reducidas, 6 horas buenas y el resto fluctuaciones.

Analysis of clear nights was based on visual inspection of the sky: an empirical method subject to personal judgment biases

Paranal Web Pages



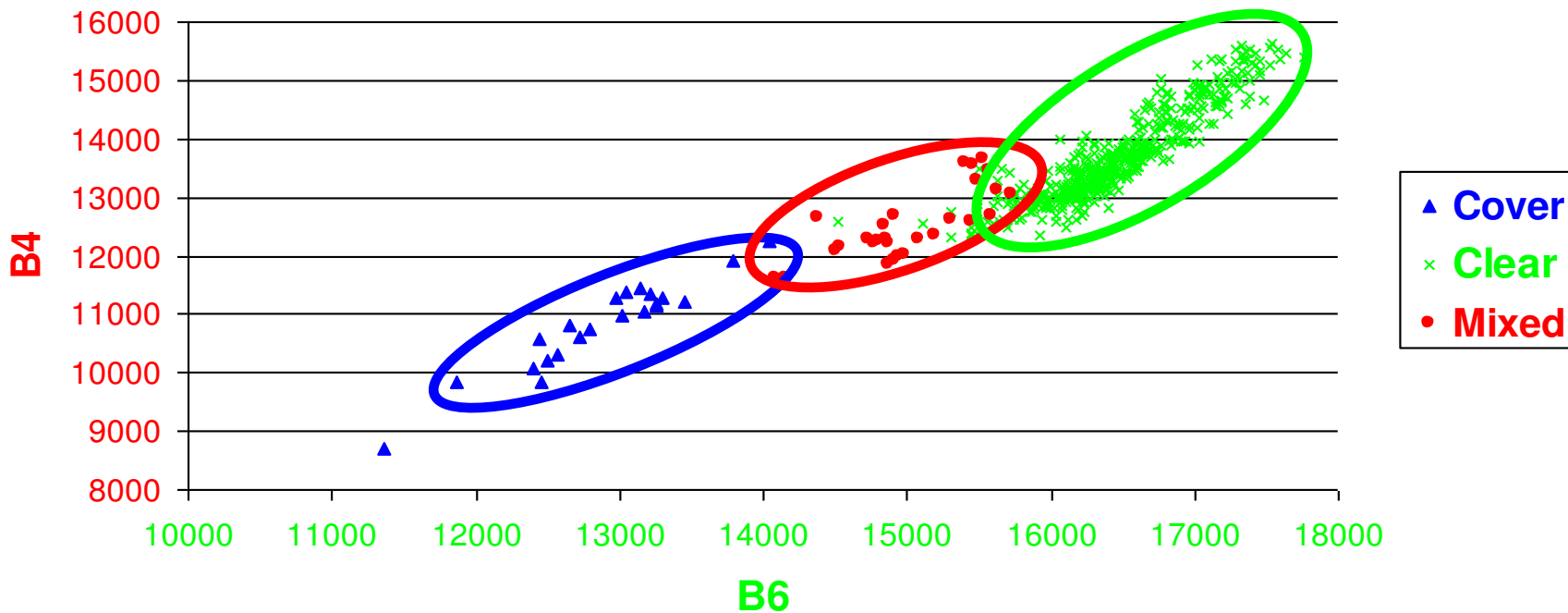
Feb2008 Paranal



**Punctual Uncertainty
5%**

**Statistical Uncertainty
2%**

Ground-Satellite Data Correlation 2008



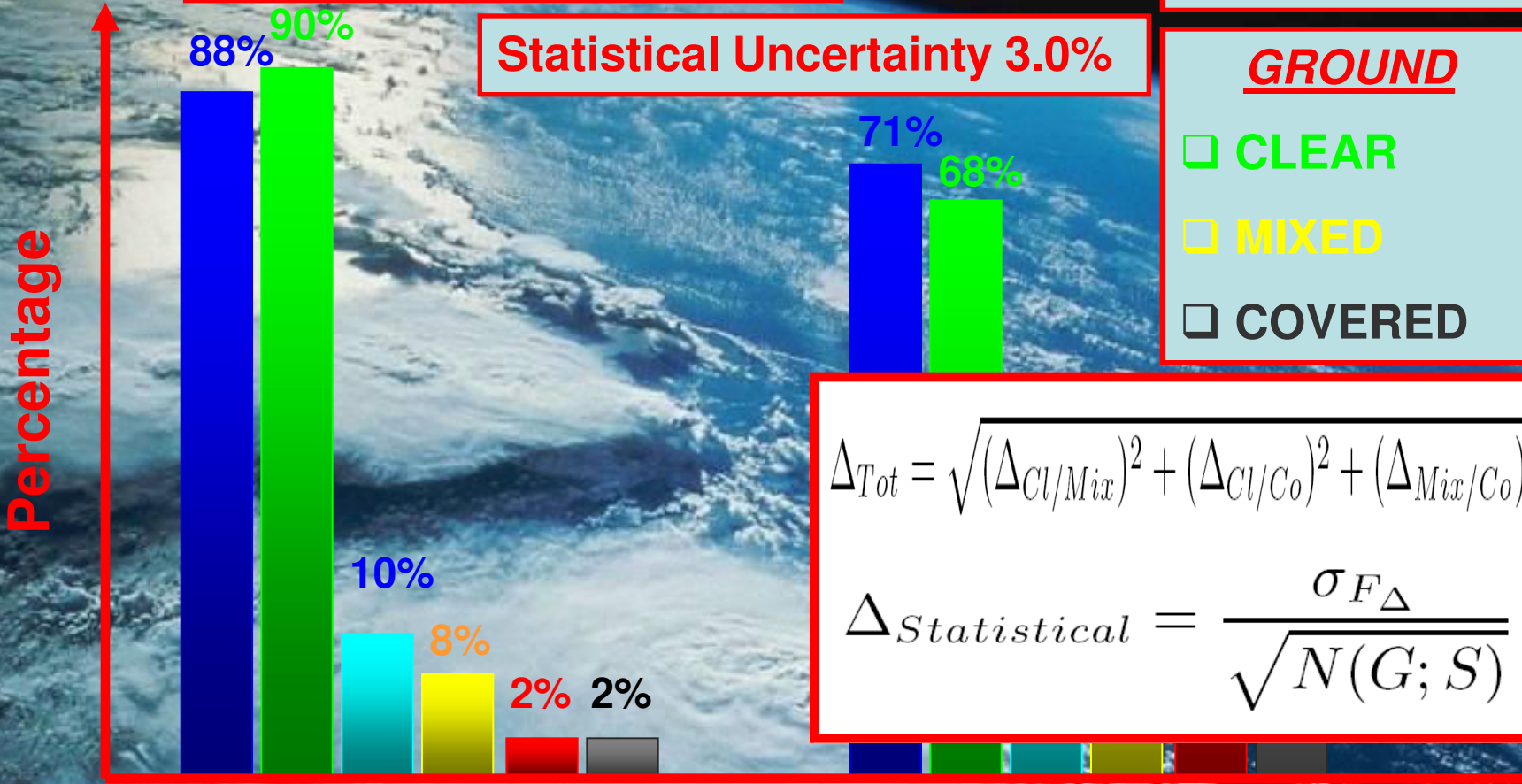
Ground/Satellite 2008

- CLEAR
- MIXED
- COVERED

- GROUND
- CLEAR
 - MIXED
 - COVERED

Statistical Uncertainty 2.0%

Statistical Uncertainty 3.0%



$$\Delta_{Tot} = \sqrt{(\Delta_{Cl/Mix})^2 + (\Delta_{Cl/Co})^2 + (\Delta_{Mix/Co})^2}$$

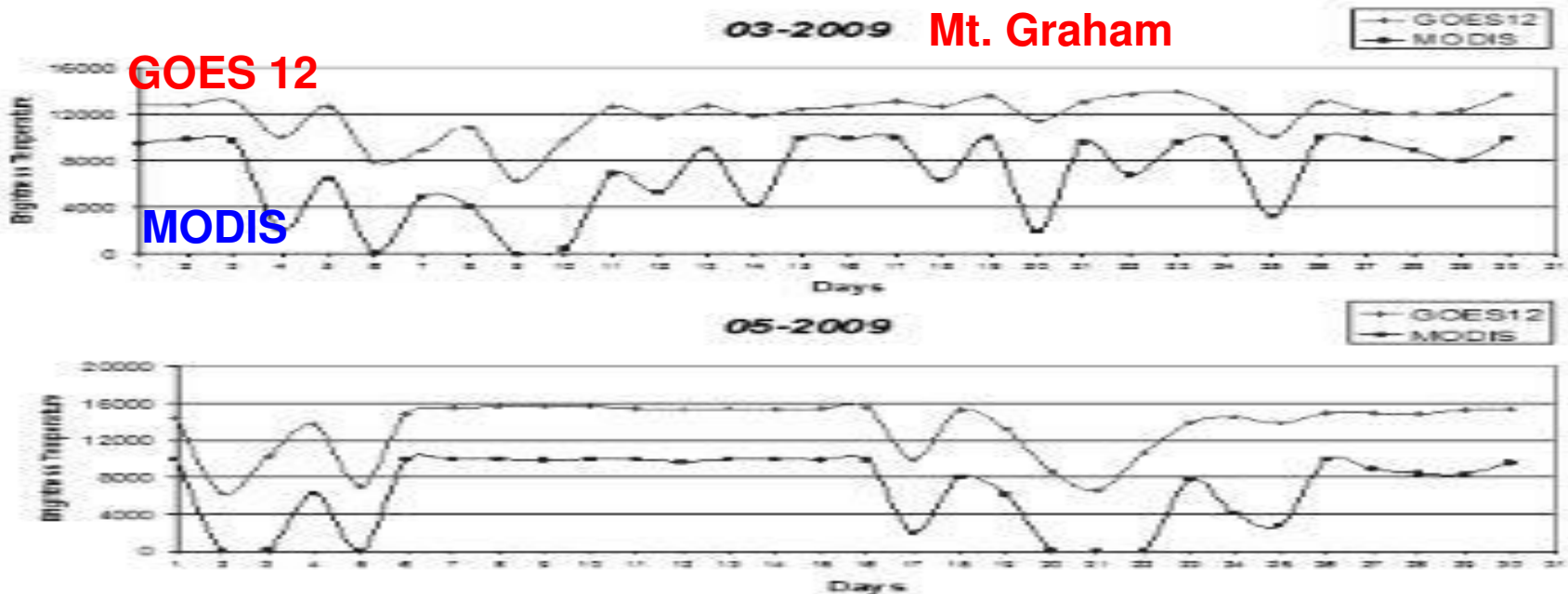
$$\Delta_{Statistical} = \frac{\sigma_{F\Delta}}{\sqrt{N(G; S)}}$$

Paranal

La Palma

MODIS-GOES 12 Comparison

The comparison with the two groups of data allows us to overcome the limitations of the individual satellite. At the same time it helps us to understand important features of the two satellites.



MODIS-GOES 12 Comparison

Table 5. Table shows the comparison between the GOES results and the MODIS results at Mt. Graham in 2009. In the first column we have the month, in the second column the coverage detected by GOES, in the third column the percentage of clear nights detected by GOES, in the fourth column the coverage detected by MODIS and in the fifth column the percentage of clear nights detected by MODIS. The GOES results correspond to the analysis of a single night point (2:45 local time).

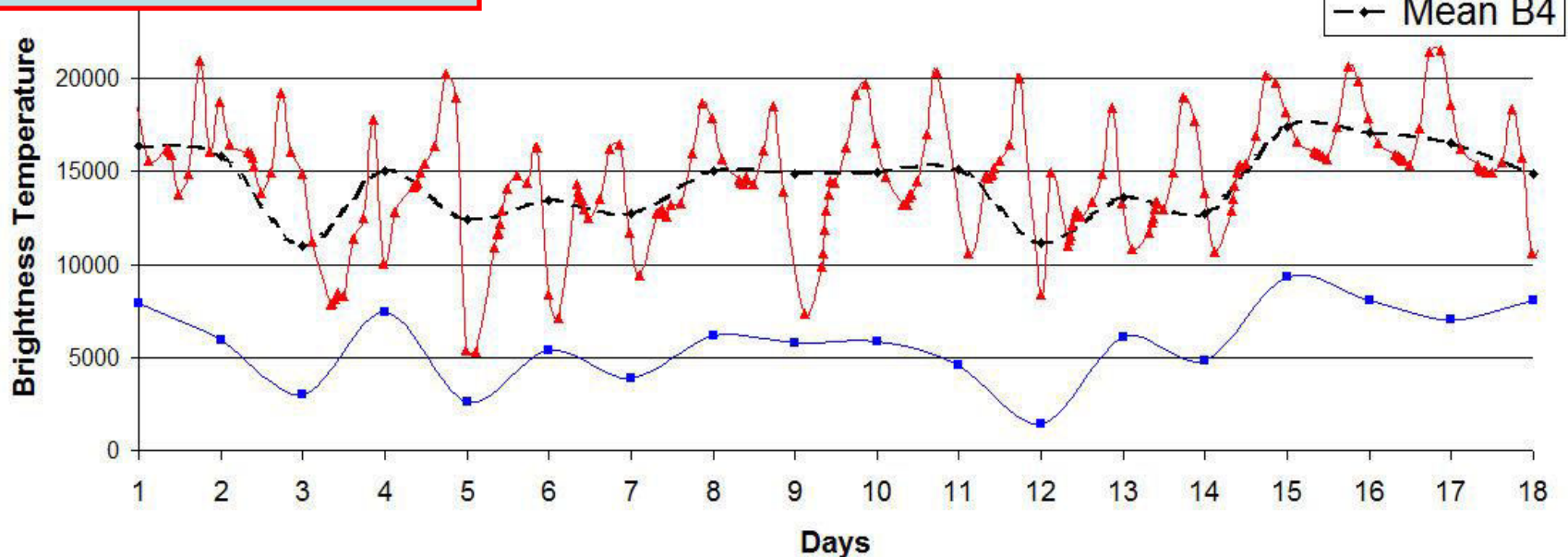
2009	GOES Mt.Graham		MODIS Mt.Graham	
Month	Covered	Clear	Covered	Clear
1	33	67	35	65
2	36	64	37	63
3	30	70	31	69
4	27	73	30	70
5	33	67	33	67
6	57	43	55	45
7	47	53	49	51
8	34	66	38	62
9	37	63	36	64
10	34	66	36	64
11	23	77	23	77
12	52	48	48	52
Average	37	63	38	62

Table 6. Table shows the monthly correlation coefficient at Mt. Graham in 2009.

Month	Punctual Correlation [%]	ϵ_{Max} [%]
1	93	3
2	93	4
3	97	3
4	97	3
5	97	3
6	97	3
7	100	3
8	97	3
9	93	3
10	93	3
11	97	3
12	93	3
Average	96	3

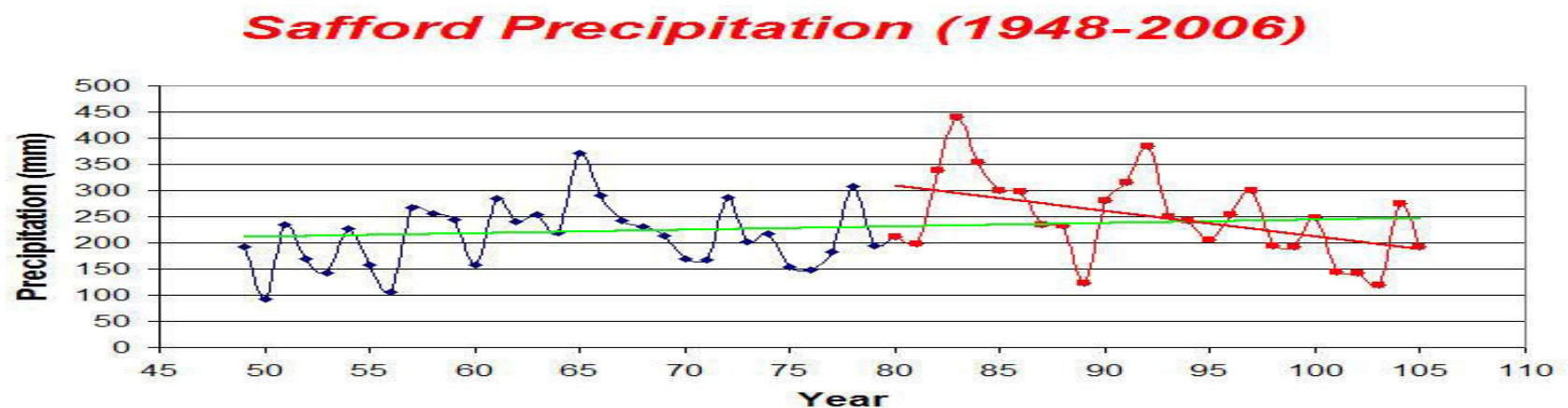
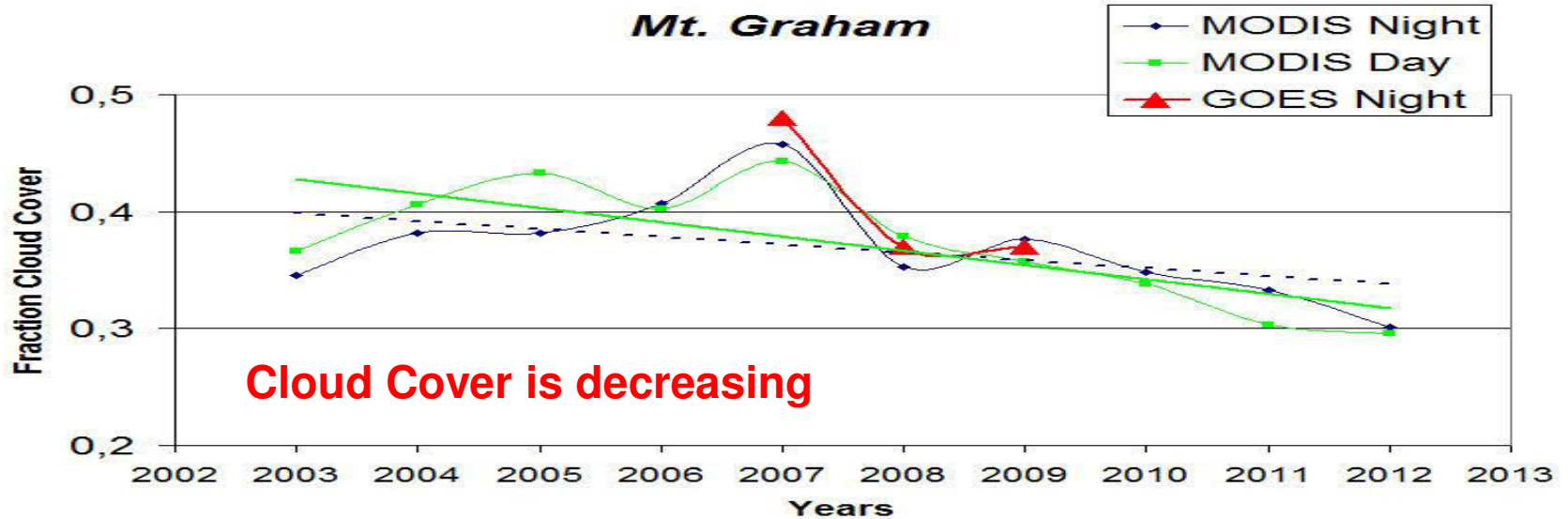
- About 10 points for day
- MODIS 2 point for day

Mt. Graham 1-18 September 2009



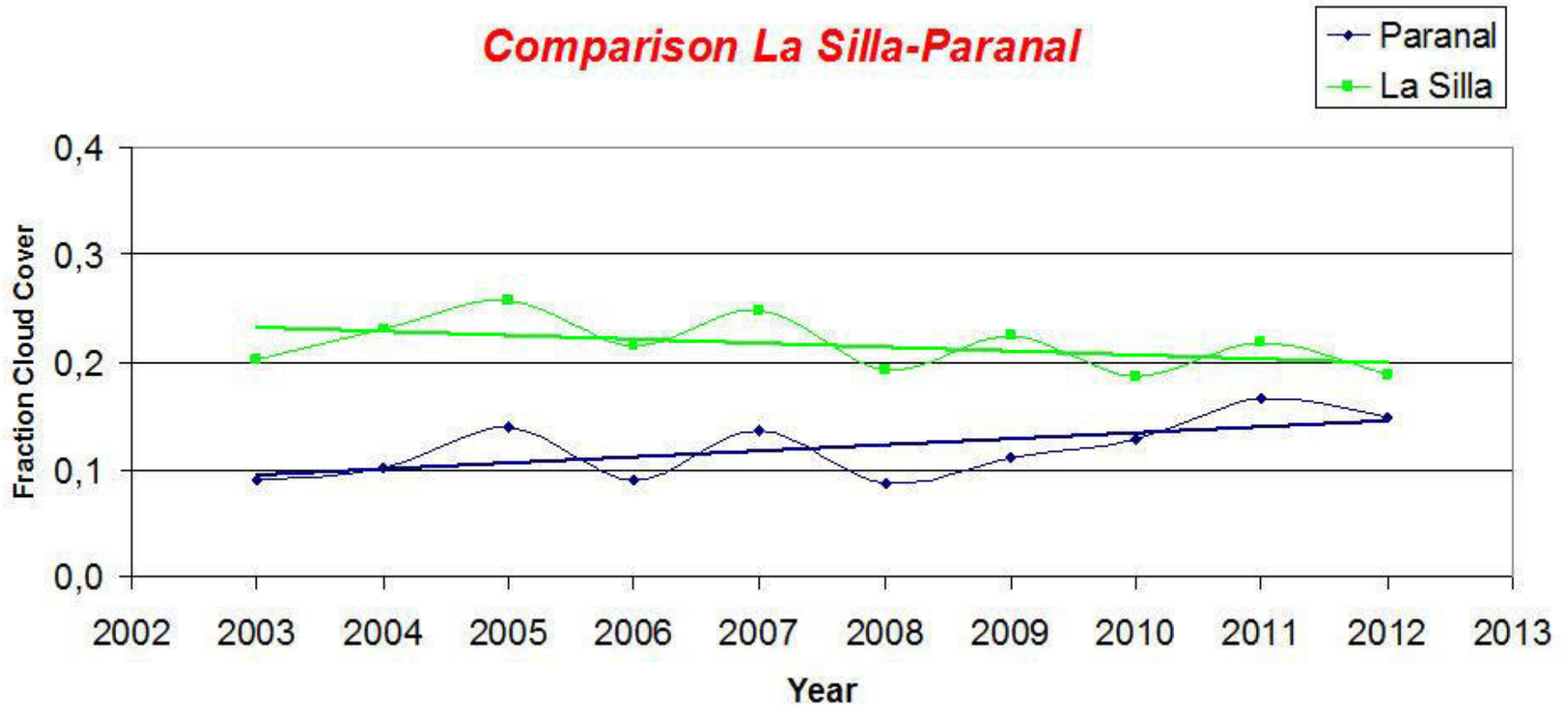
- GOES main advantage is the great temporal resolution
- GOES data access is free
- MODIS data comes already elaborated (Black Box)
- MODIS data processing is very fast

Long term analysis



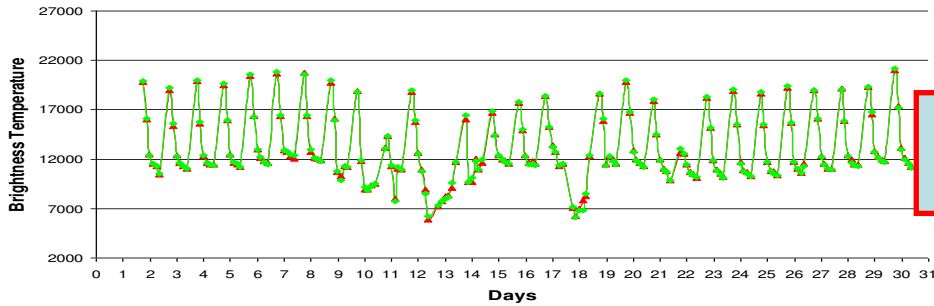
Rainfall recorded at the meteorological station of Safford

Comparison La Silla-Paranal



- Analysis of about 4000 points (annual averages)
- The cloud cover is increasing at Paranal
- The cloud cover is decreasing at La Silla

Comparison Jul2009



Armazones
Paranal

Armazones

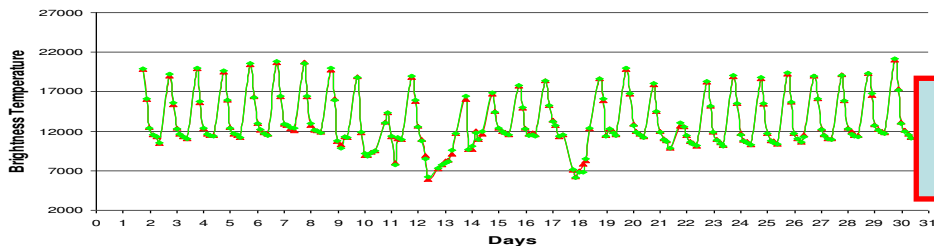


Paranal

25km



Comparison Jul2009



Armazones
Paranal

- Correlation Coefficient (2007) Paranal-Armazones 0.97
- Correlation Coefficient (2009) Paranal-Armazones 0.98

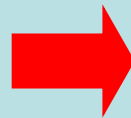
Forecasting of weather conditions

- 1) Mathematical approach with the Fourier transform for the analysis of cloud cover**
- 2) Correlation between the points of the afternoon and the points of the night for cloud cover**
- 3) Correlation between the atmospheric correlation function and the seeing measured from the ground**
- 4) Algorithm for predicting short terms night conditions**

Discrete Fourier Transform (DFT)

- The Discrete Fourier Transform (DFT) is the equivalent of the continuous Fourier Transform for signals known only at instants separated by sample times (i.e. a finite sequence of data)

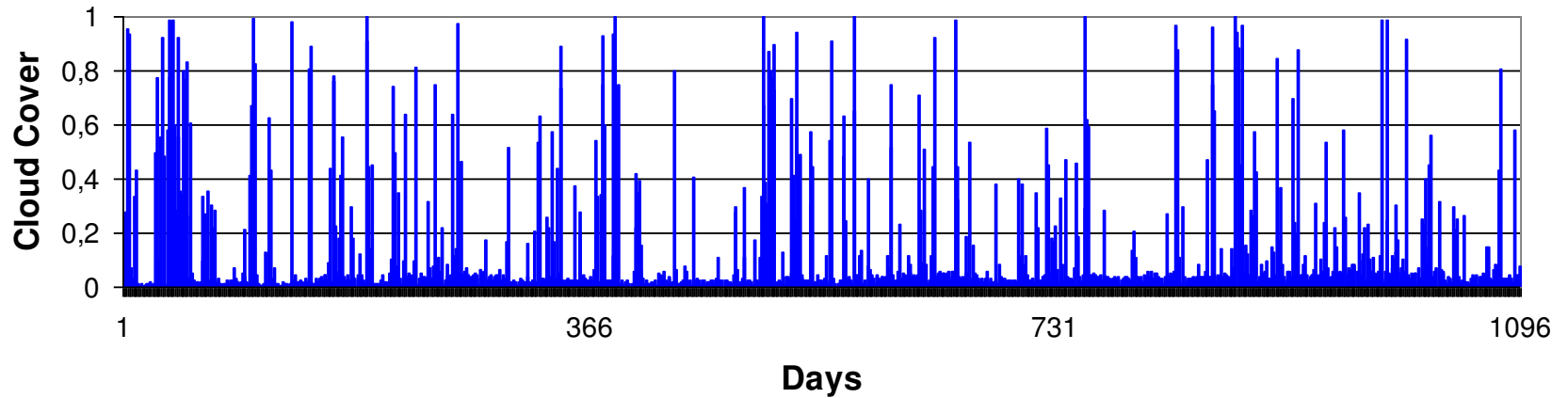
$$F(j\omega) = \int_{-\infty}^{\infty} f(t)e^{-j\omega t} dt$$



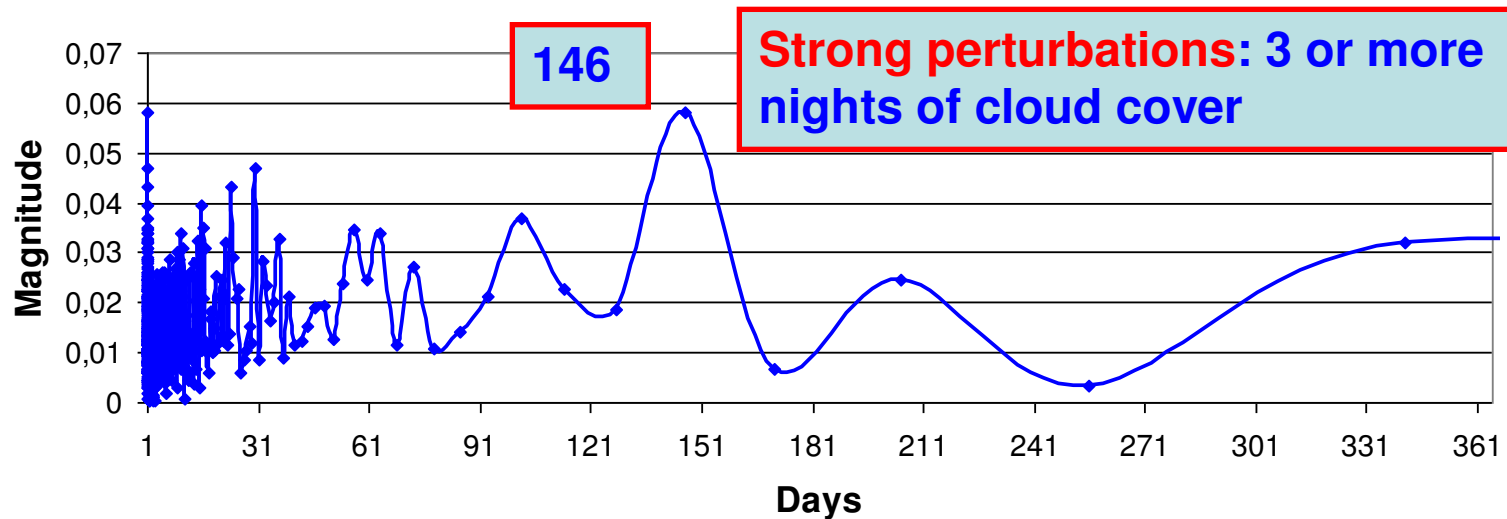
$$F(j\omega) = \sum_{k=0}^{N-1} f[k]e^{-j\omega kT}$$

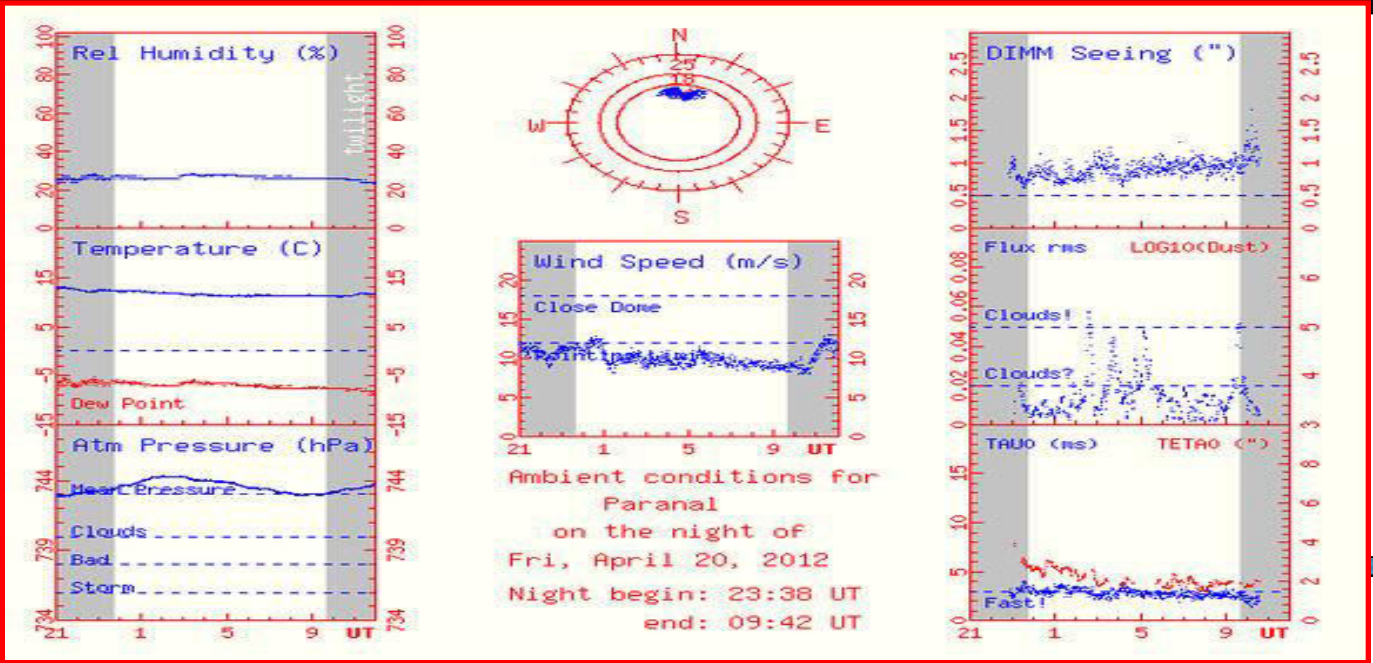
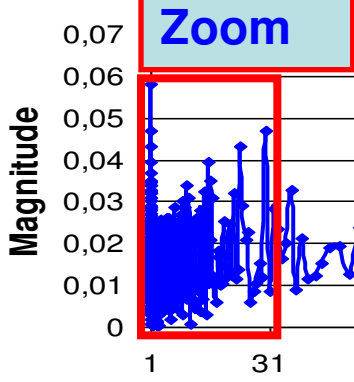
- The Cooley–Tukey algorithm: the most common **Fast Fourier Transform (FFT)** algorithm to calculate DFT
- We analyze three years at Paranal with MODIS (2012-2014)

Paranal 2012 - 2014 Night (Mean 0,13)



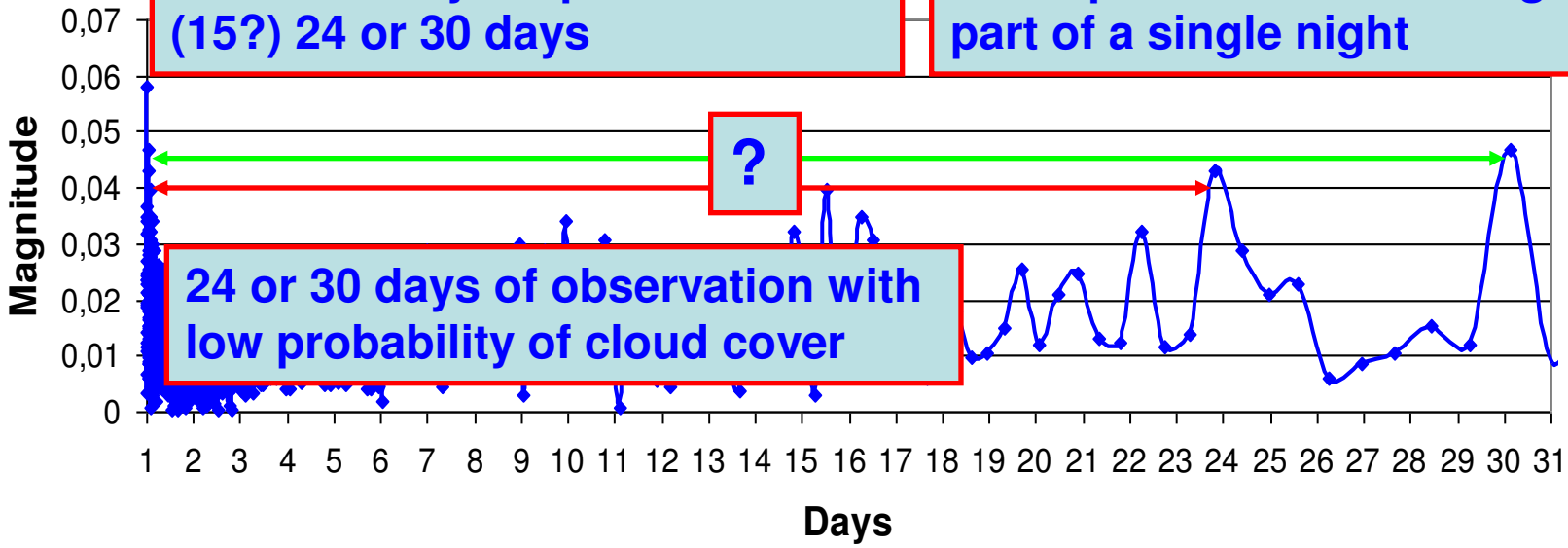
Paranal 2012-2014 (DFT) Night





Main monthly frequencies are (15?) 24 or 30 days

Small perturbations during a part of a single night

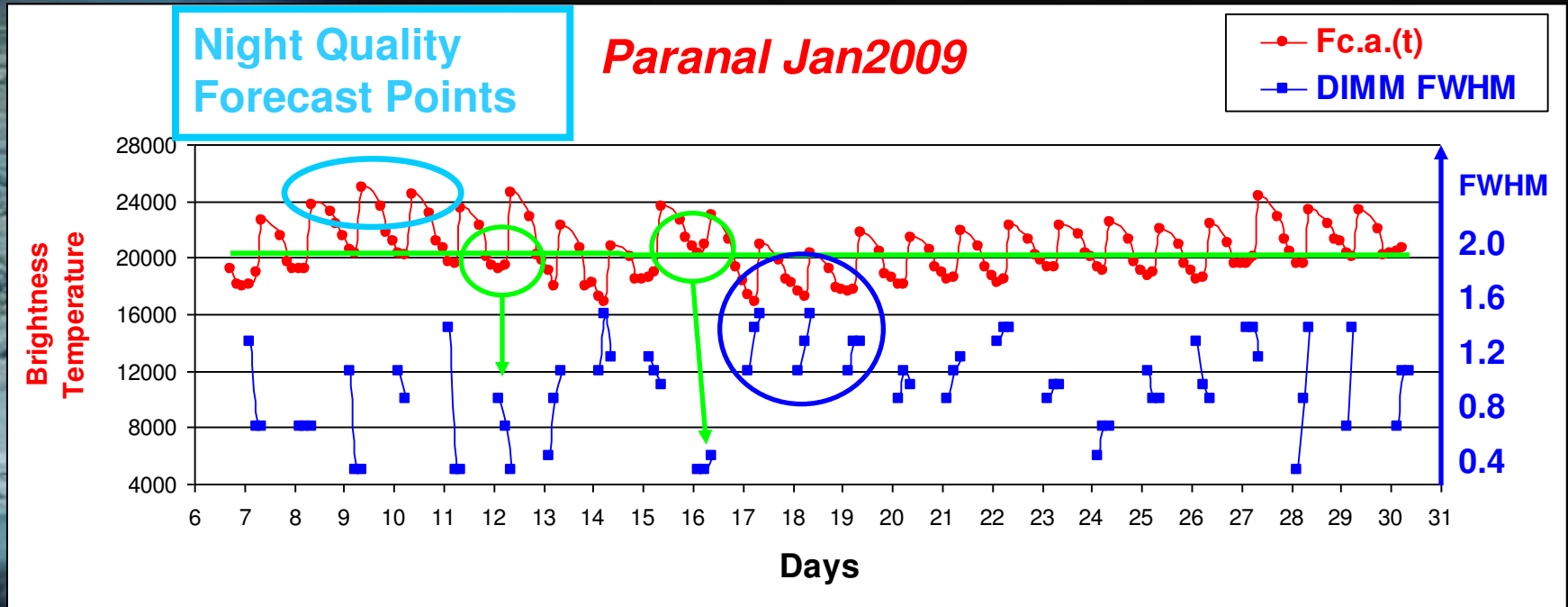


Forecast at Paranal and La Palma for the year 2009

Table 9. Forecast at Paranal and at La Palma for the year 2009. $A \rightarrow N$ is the correlation between the afternoon and the next night and $N \rightarrow M$ is the correlation between the morning and the night before.

Months	Days	Paranal		La Palma	
		$A \rightarrow N$ Correlation	$N \rightarrow M$ Correlation	$A \rightarrow N$ Correlation	$N \rightarrow M$ Correlation
January	31	100.0	100.0	93.5	96.8
February	28	96.4	100.0	85.7	92.9
March	31	96.8	100.0	90.3	93.5
April	30	96.7	100.0	90.0	96.7
May	31	100.0	96.8	100.0	96.8
June	30	100.0	93.3	90.0	90.0
July	31	93.5	93.5	96.8	96.8
August	31	96.8	96.8	96.8	100.0
September	30	100.0	100.0	96.7	100.0
October	31	100.0	100.0	96.8	96.8
November	30	100.0	100.0	100.0	100.0
December	31	96.8	96.8	96.8	96.8

Night Quality Forecast

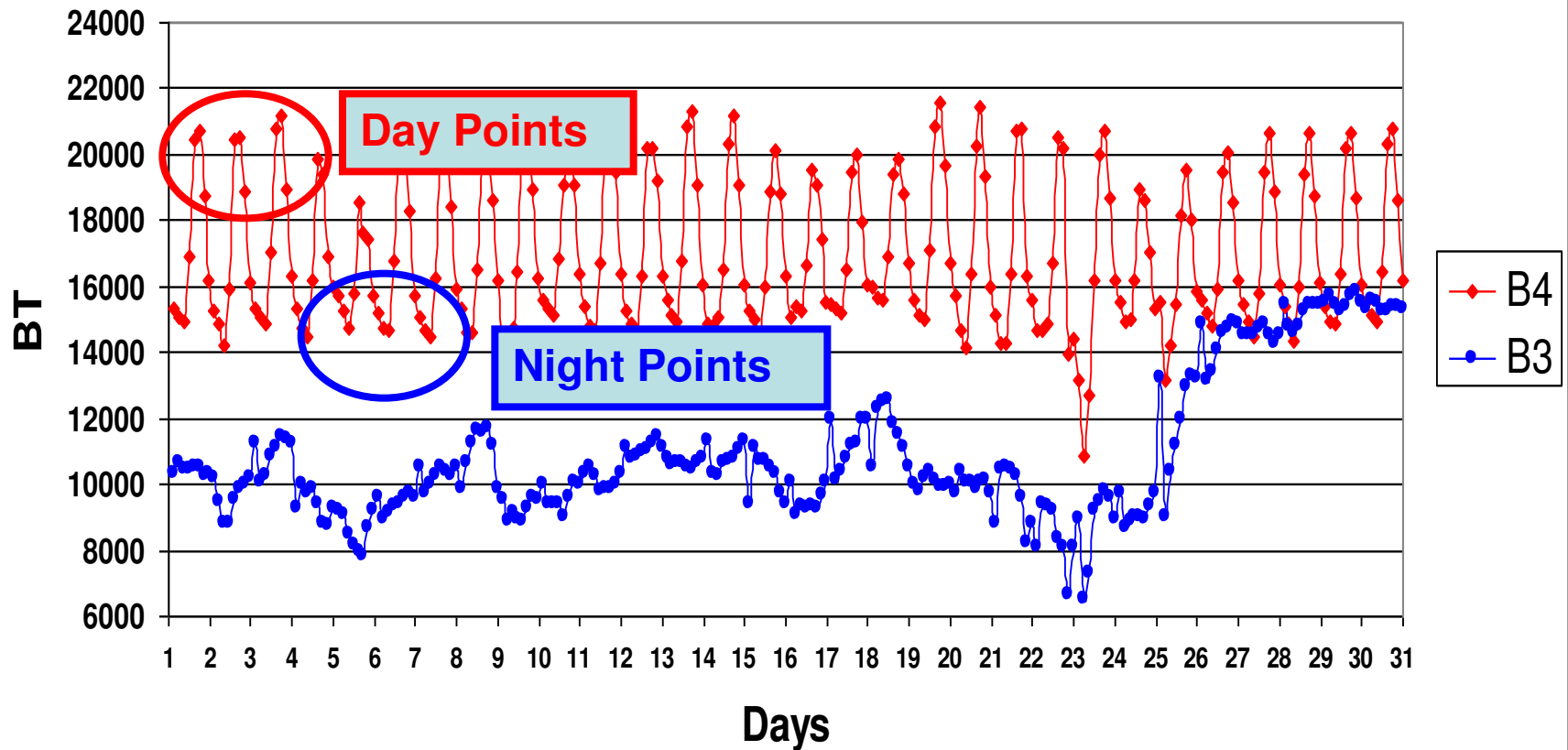


- Stable $|T_B - T_L| < 1 \diamond$
- Clear $1 \diamond < |T_B - T_L| < 2 \diamond$
- Covered $|T_B - T_L| > 2 \diamond$

Stable: Clear nights thermally stable, thermal inhomogeneity can cause winds, high humidity and a variable seeing

We can make a short-term forecasting of the night quality through the study of day data of this function

Paranal 01-2014

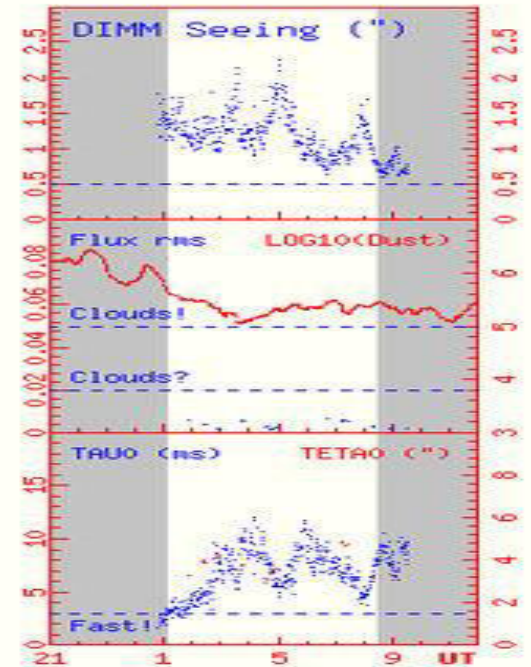
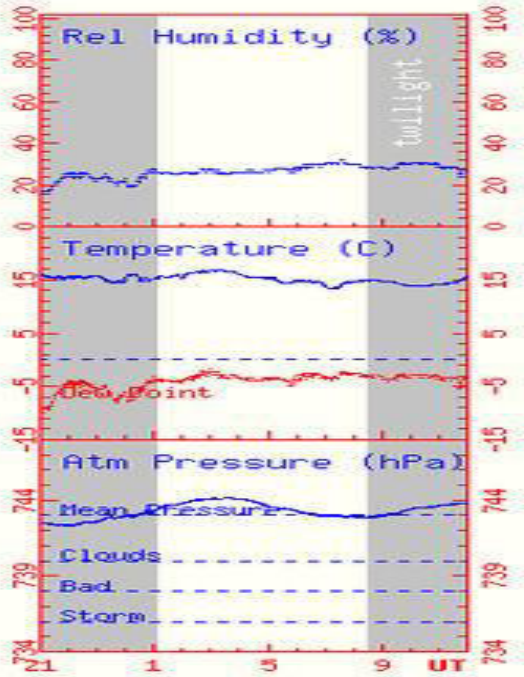
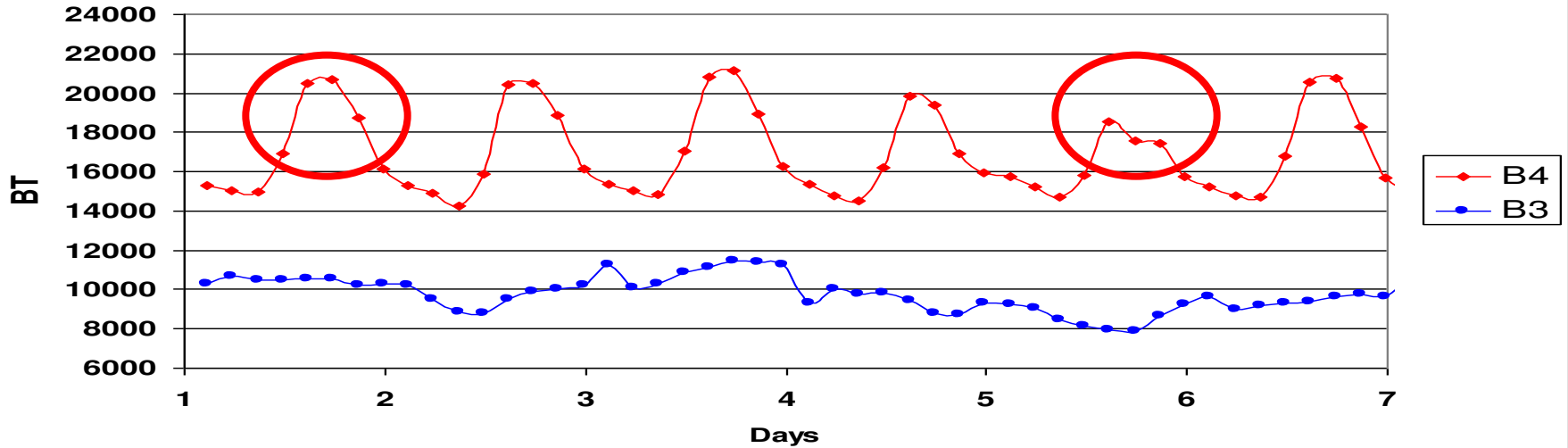


Example Paranal Jan2014

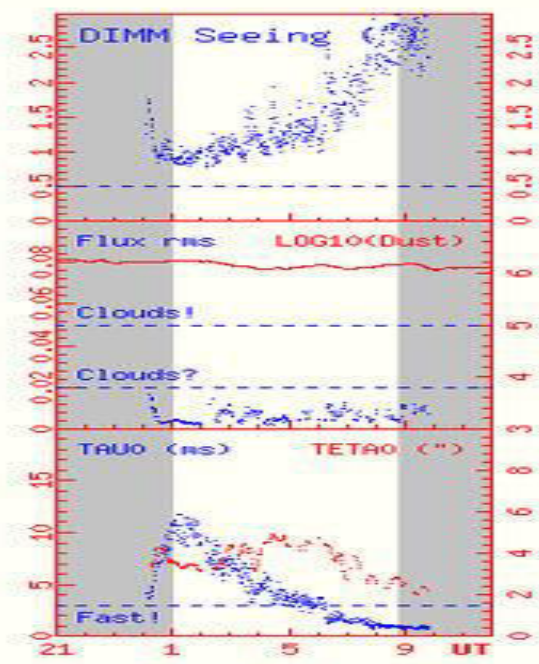
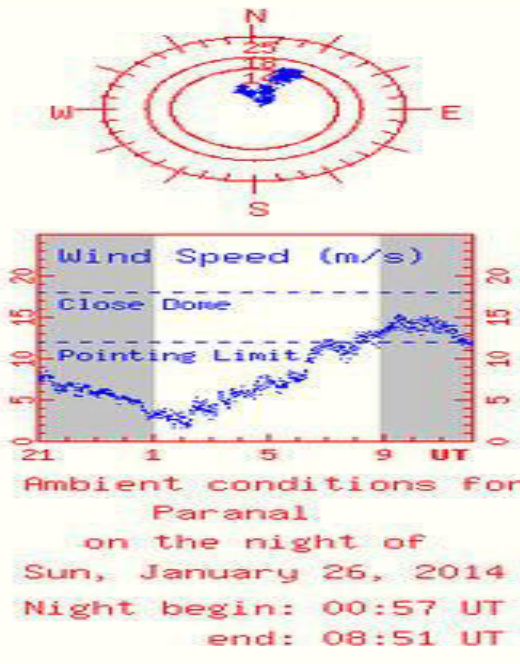
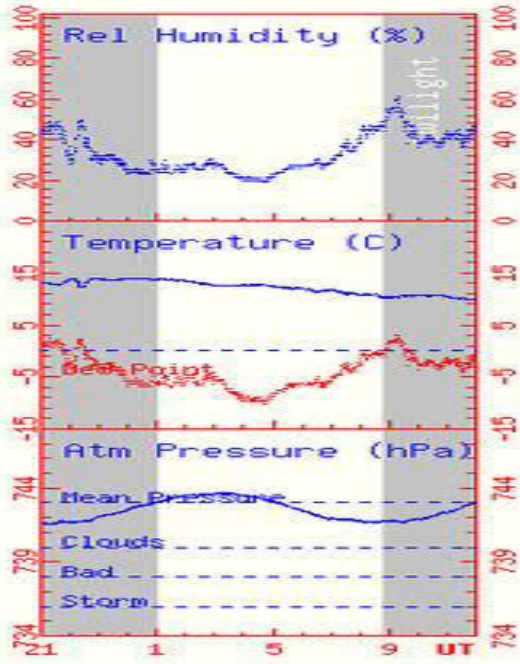
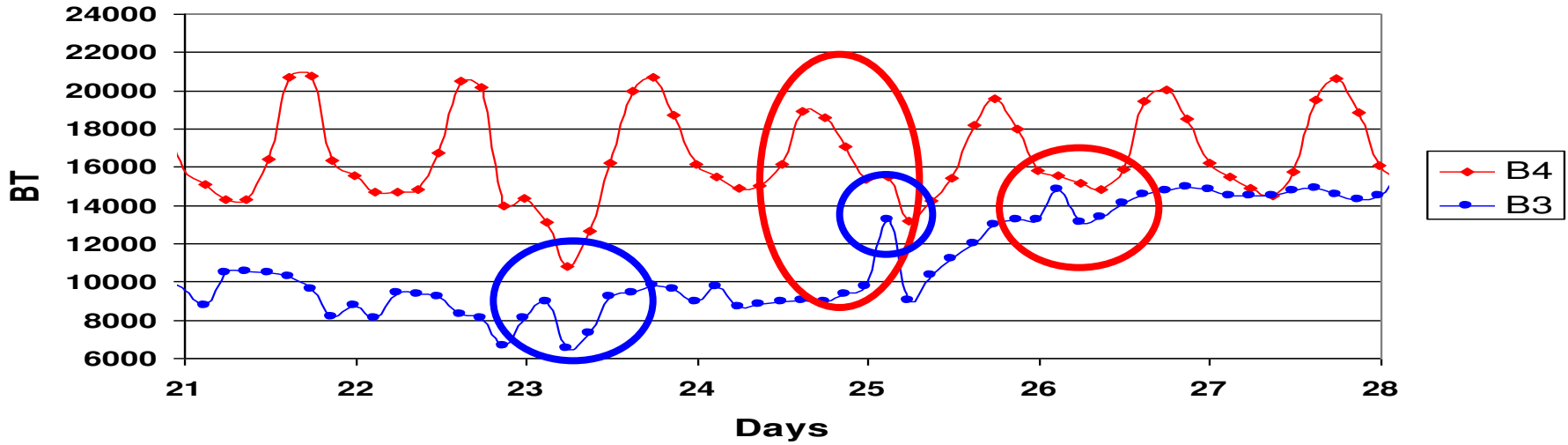
8 Points for day:

Time 2.45/5.45/8.45/11:45/14:45/17:45/20:45/23:45

Paranal 01-2014



Paranal 01-2014



Conclusion and Future Work

- **New model for the study of cloud cover (Matrix and Remote Sounding)**
- **Long term analysis**
- **Empirical satellite study of the SEEING**
- **Correlation between MODIS and GOES**
- **Physical study of the model**
- **Implementation of the model for short-term forecast of the night quality**
- **Study of possible climate change in the long term**



Fraction of clear skies above astronomical sites: a new analysis from the *GOES12* satellite

S. Cavazzani



¹Department of Astronomy
²INAF-Osservatorio Asiago
³Department of Physics

Accepted 2010 September

Site testing at astronomical sites: evaluation of seeing using satellite-based data

S. Cavazzani,^{1*}



¹Department of Astronomy, MNRAS **429**, 1849–1857 (2013)
²INAF-Osservatorio Asiago

Accepted 2011 October 4

Satellite characterization of four interesting sites for astronomical instrumentation

S. Cavazza



¹Department of Astronomy
²INAF-Osservatorio Asiago

Accepted 2012 October

Long-term analysis of clear sky at astronomical sites: a comparison between polar and geostationary satellites

S. Cavazzani,^{1,2*} V. Zitelli³ and S. Ortolani^{1,2}

¹Department of Astronomy, University of Padova, Vicolo dell'Osservatorio 3, I-35122, Padua, Italy

²INAF-Osservatorio Astronomico di Padova, Vicolo dell'Osservatorio 5, I-35122, Padua, Italy

³INAF-Osservatorio Astronomico di Bologna, Via Ranzani 1, I-40127, Bologna, Italy

A satellite is shown in space, with the Earth visible in the background. The satellite is a complex structure with various instruments and antennas. The text "GOES-R" is overlaid on the image in a bright, glowing font. The satellite is positioned in the lower-left quadrant of the frame, and the Earth is visible in the upper-right quadrant. The text "GOES-R" is centered horizontally and vertically in the image.

GOES-R



Thanks!