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# 7<sup>th</sup> Sentinel-3 Validation Team Meeting 2022

18-20 October 2022 | ESA-ESRIN | Frascati (Rm), Italy

Comparison of SLSTR Clear-Sky Infrared Measurements with those of Geo-stationary Imagers, and skin SST Accuracy Assessment Using Ship Radiometers Peter J. Minnett and Bingkun Luo \* *Rosenstiel School of Marine, Atmospheric and Earth Science, University of Miami, Miami, FL, USA* \* Now at Harvard Smithsonian Astrophysical Observatory, Harvard University, Cambridge, MA, USA

### Sequence of Presentation

- Motivation
- Data: SLSTR on Sentinel 3a, ABI on GOES-16, SEVIRI on MSG-4

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- Procedure
  - Brightness temperature harmonization
  - Test cases
  - Assess accuracies
- Validation of derived  $SST_{skin}$  using M-AERIs
- Conclusions

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# Motivation

- The generation of multi-decadal Climate Data Records of SST requires the combination of measurements from several sensors on different satellites.
- The successful combination requires knowledge of the accuracies and consistency of the on-orbit measurements and of the derived skin SSTs.

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 We present results of a comparison of the brightness temperatures (BTs) measured by the Sentinel-3a SLSTR and those by the Geostationary Operational Environmental Satellite (GOES-16) Advanced Baseline Imagers (ABI) and Meteosat Second Generation (MSG-4) Spinning Enhanced Visible and Infrared Imager (SEVIRI).

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### Radiometer Sampling Characteristics.

| Satellite<br>radiometer | Source  | Temporal resolution        | Nadir Spatial resolution |
|-------------------------|---|----------------------------|--------------------------|
| Sentinel-3A<br>SLSTR    | EUMETSAT Copernicus<br>Online Data Access<br>(CODA) | 3 minutes for L-1B<br>data | 1 km                     |
| GOES - ABI              | NOAA Amazon Web<br>Services (AWS) Data<br>Centre    | 10 minutes                 | 2 km                     |
| MSG-4<br>SEVIRI         | EUMETSAT Data Centre                                | 15 minutes                 | 3 km                     |

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### Infrared Bands for SST<sub>skin</sub>

| Band  | Band | Center<br>Wavelength<br>(µm) | Band | Center<br>Wavelength<br>(µm) | Band   | Center<br>Wavelength<br>(µm) |
|-------|------|------------------------------|------|------------------------------|--------|------------------------------|
|       | C    | GOES - ABI                   | MS   | G-4 SEVIRI                   | Sentin | el-3A SLSTR                  |
| IR038 | 7    | 3.90                         | 4    | 3.90                         | S7     | 3.74                         |
| IR087 | 11   | 8.50                         | 7    | 8.70                         | -      | -                            |
| IR112 | 14   | 11.20                        | 9    | 10.80                        | S8     | 10.95                        |
| IR123 | 15   | 12.30                        | 10   | 12.00                        | S9     | 12.00                        |

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### Radiometer Relative Spectral Response Functions. 0.9 0.8 Atmospheric Transmission Gap 0.7 Navelength 0.6 0.5 0.4 0.3 SLSTR ABI 0.1 SEVIR 0 10 11 12 13 8 9 3 4 Wavelength (µm)

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### SLSTR L1-B data used in this study

| Areas  | Compari-<br>sons                   | Date            | UTC Time                         | Geosta                |
|--|------------------------------------|-----------------|----------------------------------|-----------------------|
| 1 Eastern<br>tropical North<br>Atlantic<br>Ocean | SLSTR<br>with ABI                  | Jan 01,<br>2020 | Day: 15:21:14<br>Night: 02:55:20 | 70°N<br>40°N          |
| 2 Mediterran-<br>ean Sea                         | SLSTR<br>with<br>SEVIRI            | Dec 23,<br>2019 | Day: 09:04:56<br>Night: 20:21:51 | 10°N<br>20°S -        |
| 3 Cross-<br>covered<br>region                    | SLSTR<br>with<br>SEVIRI<br>and ABI | Nov 27,<br>2019 | Day: 12:09:44<br>Night: 00:36:20 | 50°S<br>80°S<br>145°W |

# Seostationary satellite coverages. Background: May 2020 SST





- Select SLSTR granules in mostly cloud-free areas, but some cloud is desirable.
- For each SLSTR pixel find ABI and SEVIRI pixel within 1 km, and usually < 5 minutes
- Use Radiative Transfer modelling (RTTOV) to simulate top-of-atmosphere brightness temperatures (TOA BTs) in all bands.

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- Sea surface and vertical atmospheric data for TOA BT simulations from NASA Modern-Era Retrospective Analysis for Research and Applications, Version 2 (MERRA-2).
- Convert BTs of ABI and SEVIRI into equivalent SLSTR brightness temperatures:

$$BT_{\text{SLSTR equivalent}} = a \times BT_{ABI \text{ or } SEVIRI} + b \times BT_{SLSTR} \times (\sec(\theta_{SLSTR}) - 1) + c \times BT_{ABI \text{ or } SEVIRI} \times (\sec(\theta_{ABI \text{ or } SEVIRI}) - 1) + d$$

Coefficients are scene dependent

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### Area 1. SLSTR daytime IR image on Jan 01, 2020, 15:21:14 UTC



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### Area 1. SLSTR nighttime IR image on Jan 01, 2020, 02:55:20 UTC.







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Area 1. SLSTR nighttime IR image on Jan 01, 2020, 02:55:20 UTC.



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### Area 1. SLSTR vs ABI BTs.

| Eastern<br>Tropical<br>North<br>Atlantic<br>Ocean | Day/<br>night | Band (SLSTR)  | Mean<br>(K) | STD<br>(K) | RSD<br>(K) |
|---|---------------|---------------|-------------|------------|------------|
| SLSTR<br>vs ABI                                   | Day<br>Night  | S7 - 3.74 μm  | 0.028       | 0.296      | 0.248      |
|   |               | S8 - 10.95 μm | 0.054       | 0.326      | 0.145      |
|   |               | S9 - 12.00 µm | 0.042       | 0.401      | 0.260      |
|   |               | S7 - 3.74 μm  | 0.039       | 0.360      | 0.281      |
|   |               | S8 - 10.95 μm | 0.079       | 0.383      | 0.230      |
|   |               | S9 - 12.00 µm | -0.035      | 0.360      | 0.330      |

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### Area 2. SLSTR vs SEVERI BTs.

| Mediter-<br>ranean<br>Sea | Day/<br>night | Band (SLSTR)  | Mean<br>(K) | STD<br>(K) | RSD<br>(K) |
|---------------------------|---------------|---------------|-------------|------------|------------|
|                           |               | S7 - 3.74 μm  | 0.133       | 0.544      | 0.493      |
|                           | R Day         | S8 - 10.95 µm | 0.067       | 0.454      | 0.143      |
| SLSTR                     |               | S9 - 12.00 µm | 0.073       | 0.440      | 0.198      |
| VS                        |               | S7 - 3.74 µm  | 0.077       | 0.480      | 0.320      |
| SEVIRI                    | Night         | S8 - 10.95 µm | 0.143       | 0.674      | 0.240      |
|                           |               | S9 - 12.00 µm | 0.124       | 0.644      | 0.328      |

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### Area 3. SLSTR vs ABI and SEVIRI BTs

| Equatorial<br>Atlantic<br>Ocean | Day/<br>night | Band (SLSTR)  | Mean<br>(K) | STD<br>(K) | RSD<br>(K) |
|---------------------------------|---------------|---------------|-------------|------------|------------|
| SLSTR                           | Dav           | S8 - 10.95 µm | 0.035       | 0.452      | 0.184      |
| VS                              | Day           | S9 - 12.00 µm | 0.056       | 0.516      | 0.211      |
| ABI                             | Niaht         | S8 - 10.95 μm | 0.128       | 0.891      | 0.186      |
|                                 | i tigitt      | S9 - 12.00 µm | 0.143       | 1.084      | 0.207      |
| SLSTR                           | Dav           | S8 - 10.95 μm | 0.087       | 0.450      | 0.202      |
| VS                              | Day           | S9 - 12.00 µm | 0.072       | 0.467      | 0.241      |
| SEVIRI                          | Niaht         | S8 - 10.95 μm | 0.084       | 0.465      | 0.224      |
|                                 | - ign         | S9 - 12.00 µm | 0.105       | 0.549      | 0.265      |

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5°N-w

85°W

80°W

75°W

70°W

65°W

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- Matchups within 60 minutes and 10 km.
- Best retrievals from the four possible algorithms used.
- SSESs not applied.
- 5216 Matchups.

60°W

55°W

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60°W

5°N 90°W

75°W

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### Sentinel-3a SLSTR - M-AERI SST<sub>skin</sub>



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### Sentinel-3a SLSTR - M-AERI SST<sub>skin</sub>

| Cruises               | START    | END      | Ν    | Mean   | Med    | STD   | RMS   | RSD   |
|-----------------------|----------|----------|------|--------|--------|-------|-------|-------|
| 2017 Equinox          | 20170701 | 20171231 | 929  | -0.274 | -0.059 | 0.742 | 0.790 | 0.473 |
| 2017 Allure           | 20171002 | 20171126 | 205  | -0.179 | -0.023 | 0.780 | 0.799 | 0.313 |
| 2018 Equinox          | 20180111 | 20180415 | 532  | -0.200 | -0.106 | 0.691 | 0.719 | 0.326 |
| 2018 Adventure, Leg 1 | 20180212 | 20180527 | 451  | -0.116 | -0.029 | 0.529 | 0.541 | 0.291 |
| 2018 Adventure, Leg2  | 20180601 | 20181231 | 1344 | 0.038  | 0.033  | 0.385 | 0.386 | 0.242 |
| 2018 RHB              | 20180307 | 20181023 | 921  | -0.001 | 0.044  | 0.415 | 0.415 | 0.275 |
| 2019 RHB              | 20190224 | 20190329 | 394  | -0.143 | -0.050 | 0.471 | 0.492 | 0.326 |
| Total                 | 20170701 | 20190329 | 5216 | -0.098 | -0.008 | 0.565 | 0.574 | 0.296 |

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# Validation of GOES-16 ABI SST<sub>skin</sub> with M-AERI

- Matchups within 30 minutes and 5 km.
- ACSPO SST<sub>skin</sub> retrievals.
- With and without SSESs.
- 44448 Matchups.



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# GOES-16 ABI - M-AERI SST<sub>skin</sub>



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GOES-16 ABI - M-AERI SST<sub>skin</sub>

### SSTskin difference with Local time ABI minus M-AERI SSTskin 0 15 20 24 0 5 10 Local time [hour] **Daytime SSTskin retrieval Difference** Nighttime SSTskin retrieval Difference 800 2500 N:4396 N:12138 700 Mean:0.156K Mean:0.125K 2000 STD:0.467K STD:0.390K 600 RSD:0.242K RSD:0.286K Number 200 Number 1000 1000 300 200 500 100 0 0 -2 -1 -2 -1 2 0 0 ABI minus MAERI SSTskin Difference ABI minus MAERI SSTskin Difference

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### GOES-16 ABI - M-AERI SST<sub>skin</sub>

| CRUISES        | Ν     | MEAN  | MED   | STD   | RMS   | RSD  |
|----------------|-------|-------|-------|-------|-------|------|
| 2018 Equinox   | 10869 | 0.036 | 0.035 | 0.302 | 0.304 | 0.19 |
| 2018 Allure    | 8948  | 0.035 | 0.031 | 0.231 | 0.233 | 0.20 |
| 2018 Adventure | 11840 | 0.171 | 0.136 | 0.394 | 0.430 | 0.24 |
| 2019 Adventure | 10081 | 0.089 | 0.081 | 0.420 | 0.430 | 0.26 |
| 2018 RHB       | 1188  | 0.060 | 0.069 | 0.234 | 0.242 | 0.19 |
| 2019 RHB PNE   | 1003  | 0.069 | 0.101 | 0.291 | 0.299 | 0.16 |
| 2019 RHB UNOLS | 519   | 0.174 | 0.259 | 0.744 | 0.764 | 0.49 |
| Total          | 44448 | 0.086 | 0.072 | 0.356 | 0.367 | 0.22 |

| SLSTR | 5216 | -0.098 | -0.008 | 0.565 | 0.574 | 0.296 |
|-------|------|--------|--------|-------|-------|-------|
|       |      |        |        |       |       | 1     |

### Conclusions

- This study demonstrates the feasibility of combining BTs from SLSTR with those of ABI and SEVIRI.
- Generation of SLSTR effective BTs from radiometers on geostationary satellites requires scene dependent coefficients.

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- Test cases indicate SLSTR BTs compare better with those of ABI than those of SEVIRI.
- Conversion equations applicable to larger areas with greater atmospheric variability will likely require extra terms, possibly including additional variables, such as water vapor amount, aerosols...
- Larger discrepancies in the BTs from different sensors are related to cloud edges.
- Basic statistics of SST<sub>skin</sub> retrievals from SLSTR and ABI are comparable when compared to M-AERI data, with SLSTR having a smaller Median but larger Robust Standard Deviation.

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### Further details

- Luo, B., & Minnett, P.J. (2020). Comparison of SLSTR Thermal Emissive Bands Clear-Sky Measurements with Those of Geostationary Imagers. *Remote Sensing 12*, 3279. doi:10.3390/rs12203279
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 Luo, B., & Minnett, P.J. (2021). Skin Sea Surface Temperatures From the GOES-16 ABI Validated With Those of the Shipborne M-AERI. *IEEE Transactions on Geoscience and Remote Sensing 59*, 9902-9913. doi: 10.1109/TGRS.2021.3054895



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### Thank you for your attention

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