

climate change initiative

→ **SEA SURFACE TEMPERATURE**

# SST CCI Validation

Owen Embury



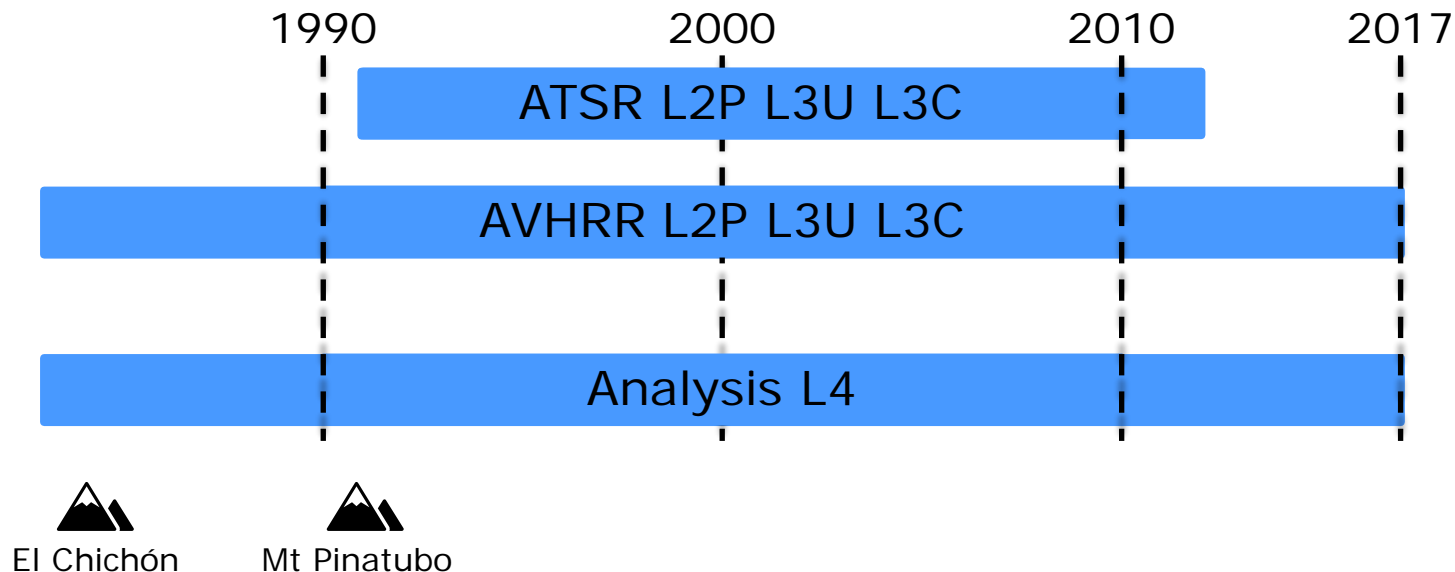


- ESA Climate Change Initiative (CCI)
  - Programme to produce satellite-based Climate Data Records
  - Targeting multiple Essential Climate Variables (ECVs) including SST
- Climate Data Record (CDR) is:
  - A time series of measurements of sufficient length, consistency, and continuity to determine climate variability and change
- Aims for SST-CCI CDR:
  - **INDEPENDENT** of in situ SST measurements
  - Of useful, quantified **ACCURACY** and **SENSITIVITY**
  - With context-sensitive **UNCERTAINTY** estimates (at all spatio-temporal scales)
  - Harmonised to provide useful **STABILITY**
  - Able to be linked to the longer **HISTORICAL RECORD**
  - Generated by a **ROBUST, SUSTAINABLE** processing system



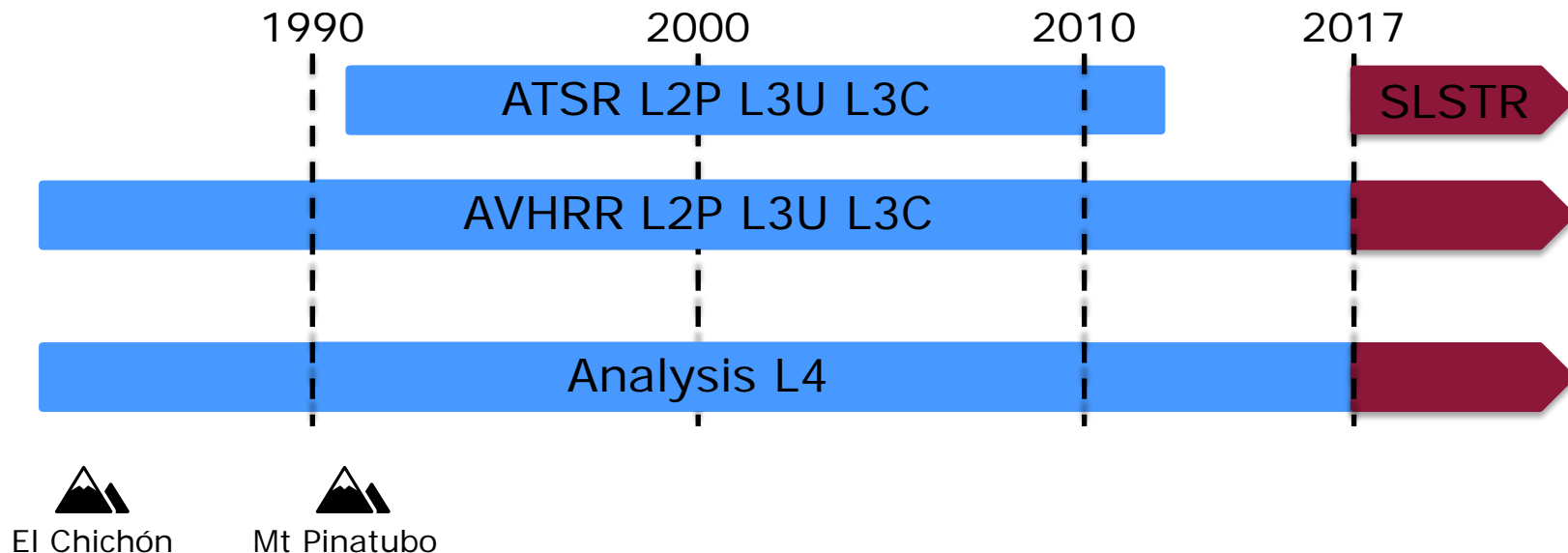


- CCI Phase 2 dataset
  - 35 years (September 1981 – December 2016)
  - L2P, L3U and daily L3C for all sensors





- Copernicus Climate Change Service (C3S) Interim CDR (ICDR)
  - Extends CCI CDR v2 L3C and L4
  - Data available to end-2019 (currently processing 2020)

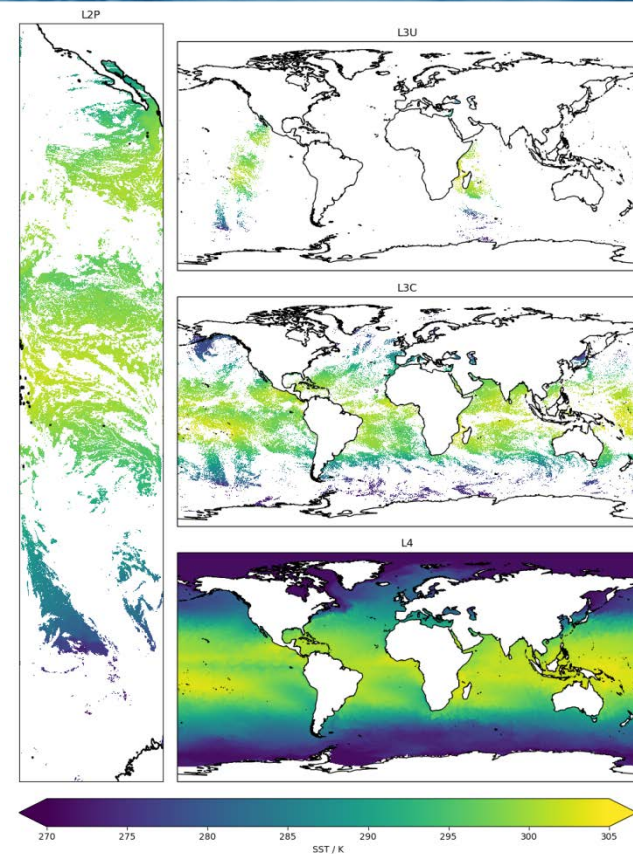




# SST-CCI Climate Data Record v2



- 35 years (September 1981 – December 2016)
- $18 \times 10^{12}$  satellite radiance measurements
- Single-sensor products:
  - **L2P** swath, **L3U** gridded, and **L3C** daily
  - SST-type:
    - Skin at satellite overpass
    - $SST_{20cm}$  at 10:30 local-time
  - Uncertainties provided:
    - random, correlated, systematic
- Multi-sensor: **L4** CCI Analysis
- Other: GMPE, Climatology

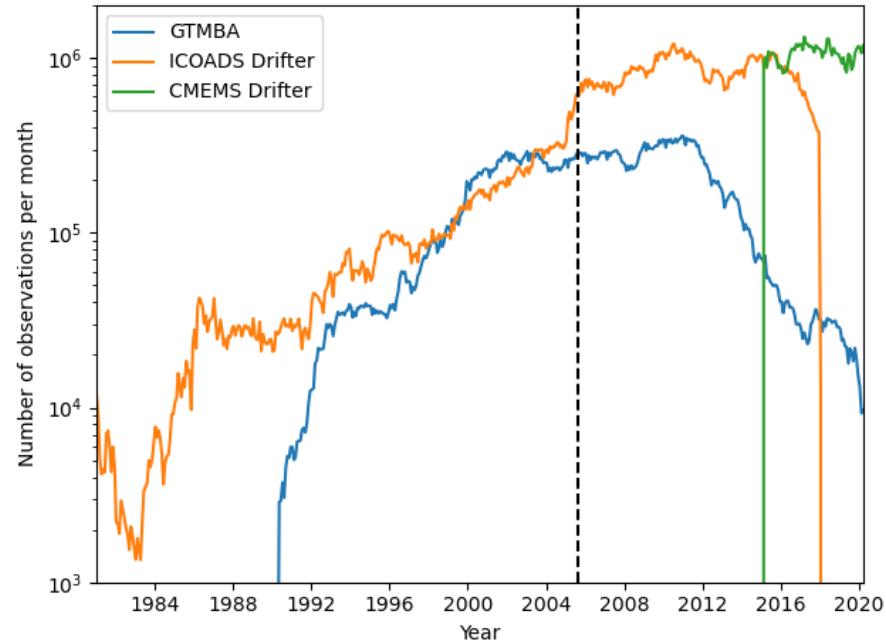




- Reference in situ data supplied by Met Office Hadley Centre
  - Extracted from HadIOD v1.2.0.0
  - We only get SST obs (no salinity)
- Multiple platform types:
  - Drifting buoys (ICOADS and CMEMS)
    - ICOADS record position to 0.01 degree and SST to 0.1 degree
    - CMEMS record position to 0.001 degree and SST to 0.01 degree
  - Global Tropical Moored Buoy Array (GT MBA)
  - Argo Floats
  - Others: Moored buoys (excluding GT MBA); Voluntary observing ships; Animal; Bottles; Conductivity-Temperature-Depth casts (CTDs); Mechanical Bathy Thermographs (MBTs); expendable Bathy Thermographs (XBTs)

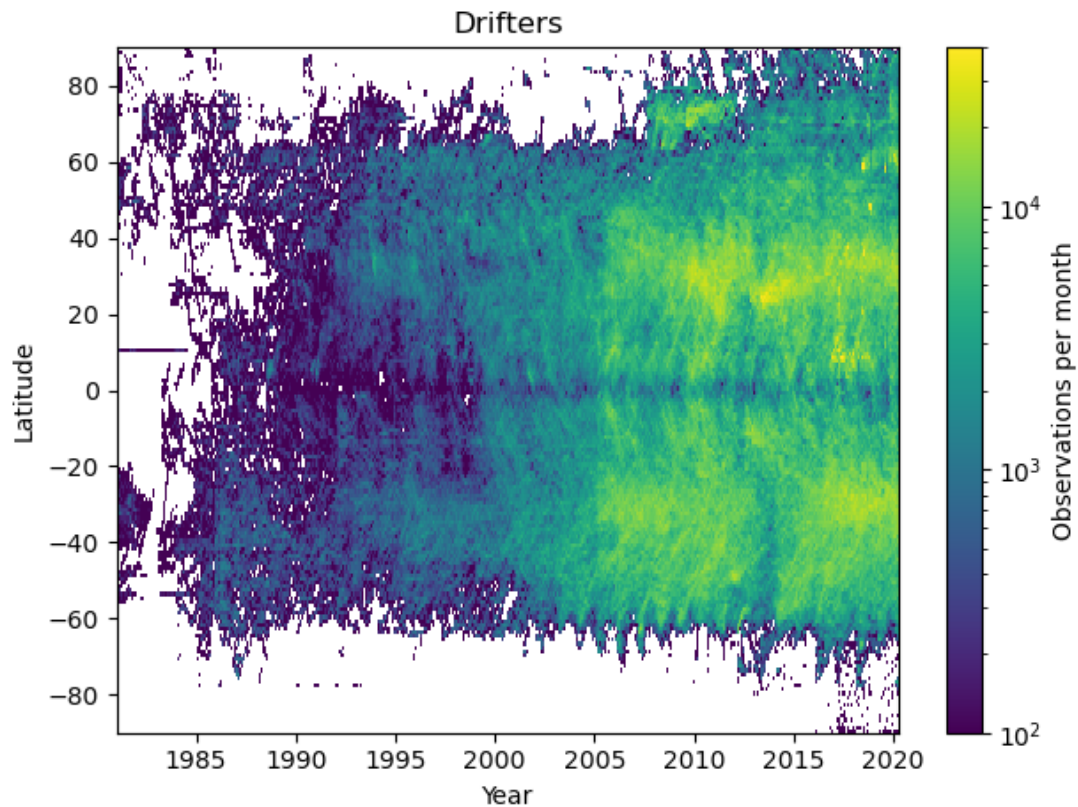


- Drifters provide most “complete” coverage
  - “Full” coverage from Sept 2005
  - Very limited coverage before 1995
  - Need to switch from ICOADS to CMEMS drifters in 2006
  - Note – the “best” satellite retrievals can have lower uncertainties than drifter SSTs
- GTMBA moorings
  - Lower uncertainties than drifters
  - Used for stability analysis
    - See Berry et al. 2018





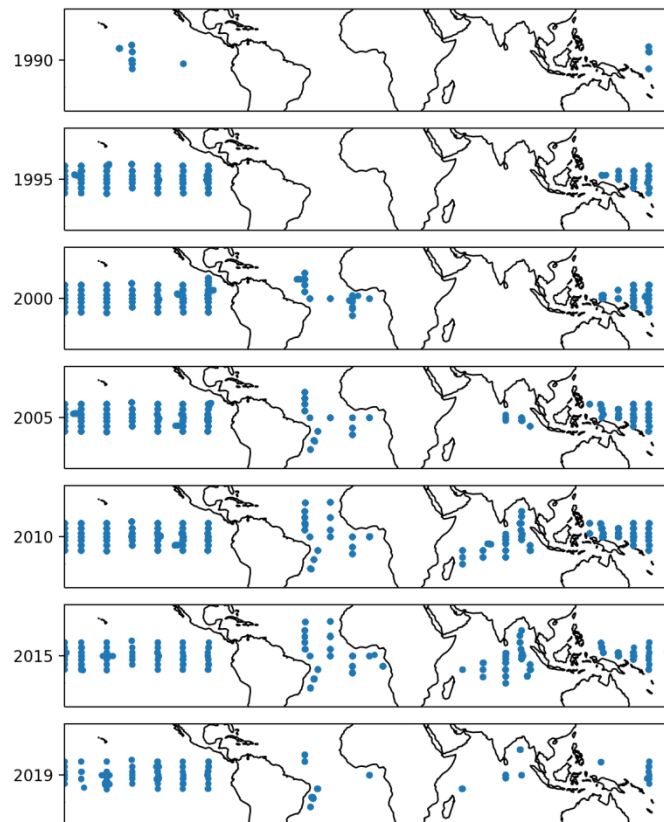
# Distribution of drifter locations







# Distribution of GTMBA locations





- Multi-sensor Matchup System (MMS)
  - Developed by Brockmann Consult
  - Can produce Matchup Datasets (MD) from various combinations of inputs:
    - Satellite L1b, L2P
    - In situ
    - NWP
  - Examples:
    - ATSR2 – AATSR clear-sky matches (for algorithm development)
    - AVHRR\_GAC – in situ all matches (for testing and validation)
- Simple matching for L3 SST products
  - L3 products use regular lat/lon grid so matching process is trivial
  - Very quick/easy – used when we only need to validate SSTs



# L2/L3 validation against drifters



- Following slides show L2/L3 SST compared to in situ drifters
  - Data up to end-2016 are SST-CCI vs. ICOADS drifters
  - Data from 2017 onwards are C3S-SST vs. CMEMS drifters
- Comparing satellite SST 0.2m against drifter
  - Fairall-Kantha-Clayson model used for time/depth adjustments
  - Code supplied by Met Office

	Level-2				Level-3			
	Day		Night		Day		Night	
	Median	RSD	Median	RSD	Median	RSD	Median	RSD
<b>NOAA-07</b>	<b>-0.15</b>	<b>0.56</b>	-0.06	0.66	<b>-0.17</b>	<b>0.55</b>	-0.06	0.68
<b>NOAA-09</b>	-0.07	0.59	+0.02	0.61	<b>-0.10</b>	<b>0.59</b>	-0.02	0.65
<b>NOAA-11</b>	-0.06	0.52	+0.03	0.49	-0.09	0.51	+0.01	0.47

- NOAA-07 through NOAA-11 are referenced to in situ
  - Ships + subset of drifters used as reference
  - Drifters used for reference are excluded from validation
- ATSR1 is adjusted to drifters (night-only) for 7 months from end-1991
  - These drifters have not been excluded from validation

<b>ATSR-1</b>	+0.03	0.33	+0.01	0.25	+0.02	0.46	-0.00	0.28
<b>ATSR-2</b>	-0.01	0.26	+0.01	0.20	-0.00	0.27	+0.02	0.21
<b>AATSR</b>	+0.01	0.19	+0.01	0.16	+0.01	0.20	+0.01	0.18
<b>SLSTR-A</b>					+0.02	0.25	+0.00	0.21
<b>SLSTR-B</b>					-0.01	0.25	+0.00	0.19

	Level-2				Level-3			
	Day		Night		Day		Night	
	Median	RSD	Median	RSD	Median	RSD	Median	RSD

- NOAA-12 onwards are referenced to ATSR
- ATSR2 + AATSR are fully independent (no tuning to in situ)

NOAA-12	-0.01	0.51	+0.02	0.44	-0.03	0.50	-0.00	0.45
NOAA-14	-0.03	0.45	-0.00	0.37	-0.05	0.45	+0.01	0.35
NOAA-15	-0.01	0.39	-0.01	0.38	-0.04	0.38	-0.02	0.37
NOAA-16	+0.02	0.36	-0.01	0.33	-0.01	0.37	-0.02	0.32
NOAA-17	+0.01	0.34	+0.02	0.28	-0.02	0.34	+0.00	0.27
NOAA-18	-0.07	0.34	<b>-0.15</b>	<b>0.28</b>	<b>-0.11</b>	<b>0.34</b>	<b>-0.17</b>	<b>0.27</b>
NOAA-19	+0.03	0.34	+0.02	0.29	-0.00	0.33	-0.00	0.27
MetOp-A	+0.01	0.33	+0.04	0.27	-0.02	0.33	+0.02	0.26
ATSR-1	+0.03	0.33	+0.01	0.25	+0.02	0.46	-0.00	0.28
ATSR-2	-0.01	0.26	+0.01	0.20	-0.00	0.27	+0.02	0.21
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NOAA-14	-0.03	0.45	-0.00	0.37	-0.05	0.45	+0.01	0.35
NOAA-15	-0.01	0.39	-0.01	0.38	-0.04	0.38	-0.02	0.37
NOAA-16	+0.02	0.36	-0.01	0.33	-0.01	0.37	-0.02	0.32
NOAA-17	+0.01	0.34	+0.02	0.28	-0.02	0.34	+0.00	0.27
NOAA-18	-0.07	0.34	<b>-0.15</b>	<b>0.28</b>	<b>-0.11</b>	<b>0.34</b>	<b>-0.17</b>	<b>0.27</b>
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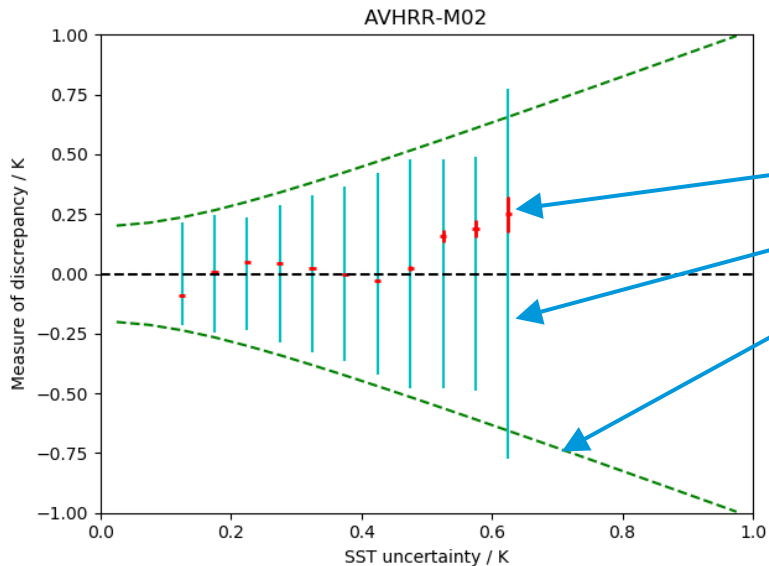
# L2/L3 validation against GTMBA



	Level-2				Level-3			
	Day		Night		Day		Night	
	Median	RSD	Median	RSD	Median	RSD	Median	RSD
NOAA-11	<b>-0.16</b>	<b>0.48</b>	-0.06	0.40	<b>-0.26</b>	<b>0.47</b>	-0.09	0.39
NOAA-12	+0.10	0.48	-0.08	0.40	+0.05	0.48	<b>-0.11</b>	<b>0.40</b>
NOAA-14	-0.02	0.43	-0.04	0.32	-0.06	0.43	-0.07	0.31
NOAA-15	+0.01	0.42	-0.05	0.38	-0.05	0.41	-0.08	0.37
NOAA-16	+0.04	0.40	-0.00	0.31	-0.02	0.39	-0.03	0.30
NOAA-17	+0.00	0.38	+0.00	0.24	-0.05	0.37	-0.02	0.24
NOAA-18	<b>-0.11</b>	<b>0.37</b>	<b>-0.16</b>	<b>0.27</b>	<b>-0.16</b>	<b>0.37</b>	<b>-0.18</b>	<b>0.25</b>
NOAA-19	+0.04	0.38	-0.02	0.28	-0.01	0.37	-0.05	0.26
MetOp-A	+0.04	0.36	+0.00	0.25	-0.01	0.35	-0.02	0.25
ATSR-1	+0.04	0.29	+0.02	0.11	+0.03	0.45	-0.00	0.14
ATSR-2	-0.01	0.20	-0.01	0.10	-0.01	0.22	-0.01	0.11
AATSR	+0.00	0.18	+0.01	0.11	-0.00	0.19	-0.00	0.13
SLSTRA					-0.03	0.25	+0.00	0.16



- SST-CCI provides estimate of uncertainty
  - This is an output of the retrieval and is independent of *in situ* data
  - Therefore we can use the *in situ* data to validate the uncertainty
- Compare the estimated uncertainty against satellite – *in situ* discrepancy



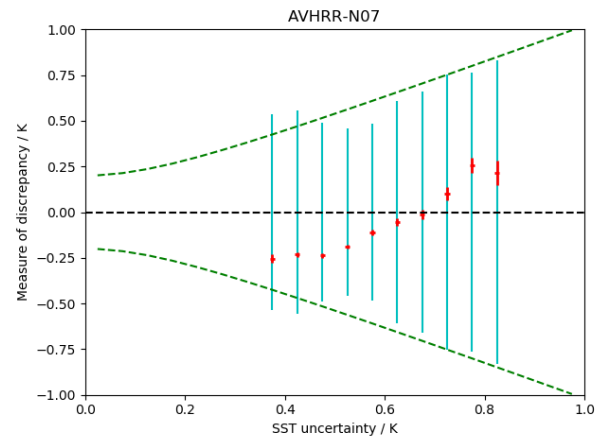
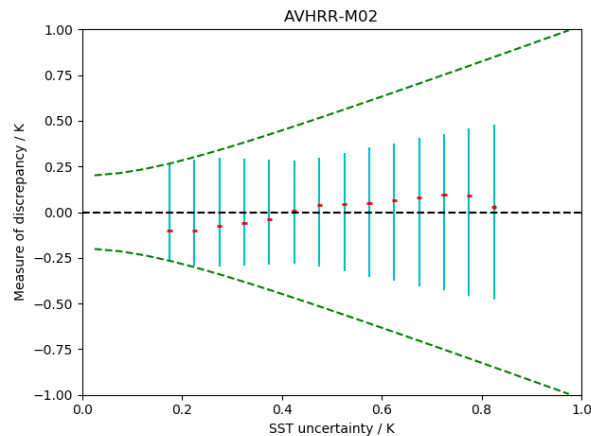
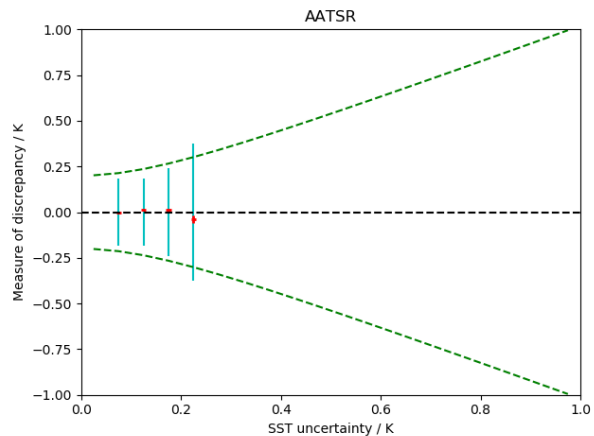
- X-axis: estimated uncertainty
- Y-axis: satellite – *in situ* discrepancy
- **RED**: Median discrepancy in bin
- **CYAN**: RSD discrepancy in bin
- **GREEN**: Expected RSD given in situ uncertainty

If the vertical lines match the dashed curve the uncertainty estimates are good!





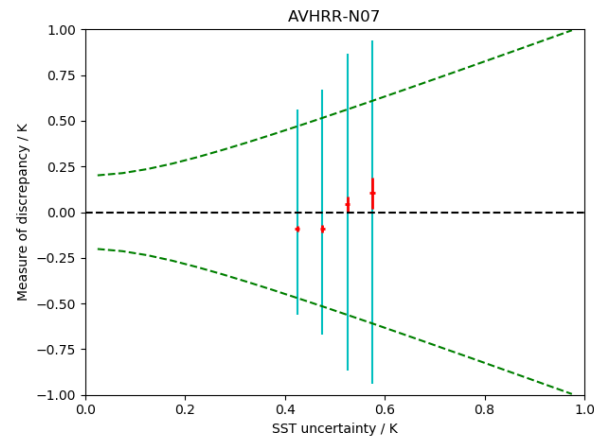
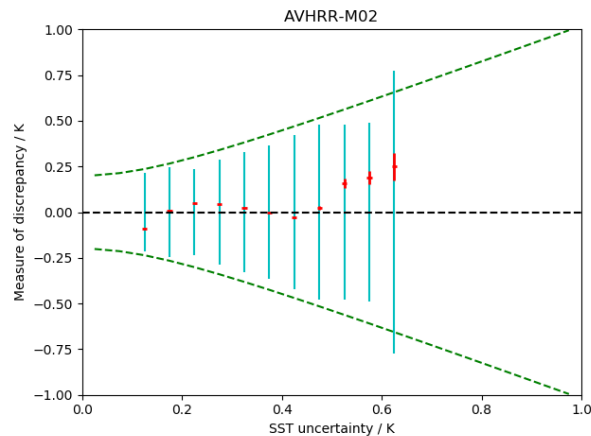
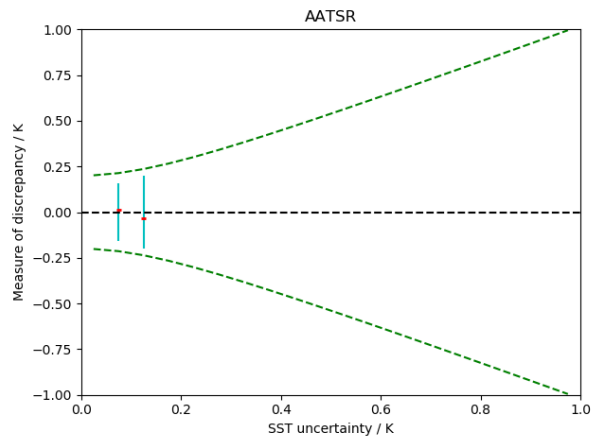
# L2P Uncertainty (daytime)



- ATSR uncertainty is good
- MetOp uncertainty is overestimated (also applies to NOAA-12 onwards)
- NOAA-07 uncertainty is good



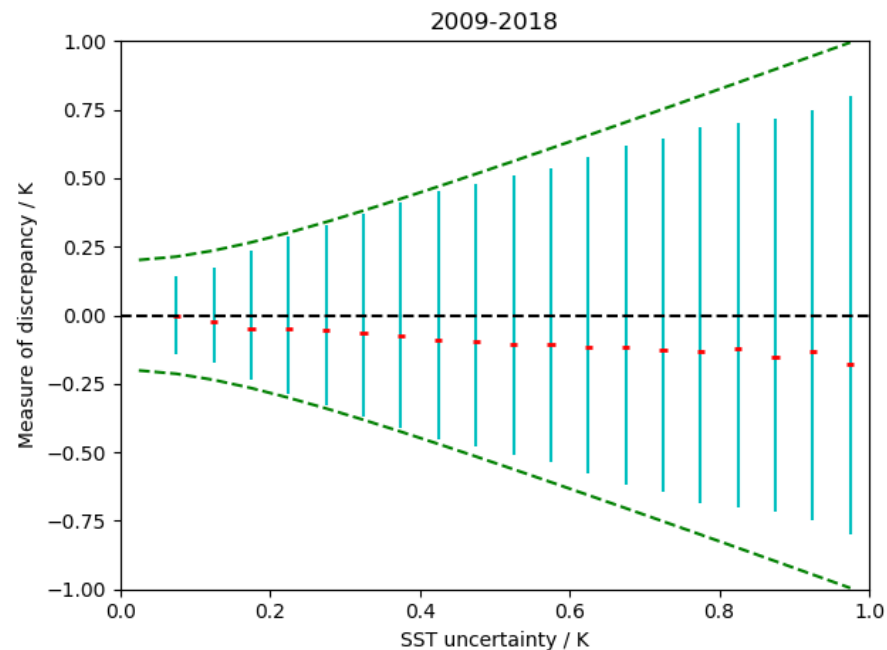
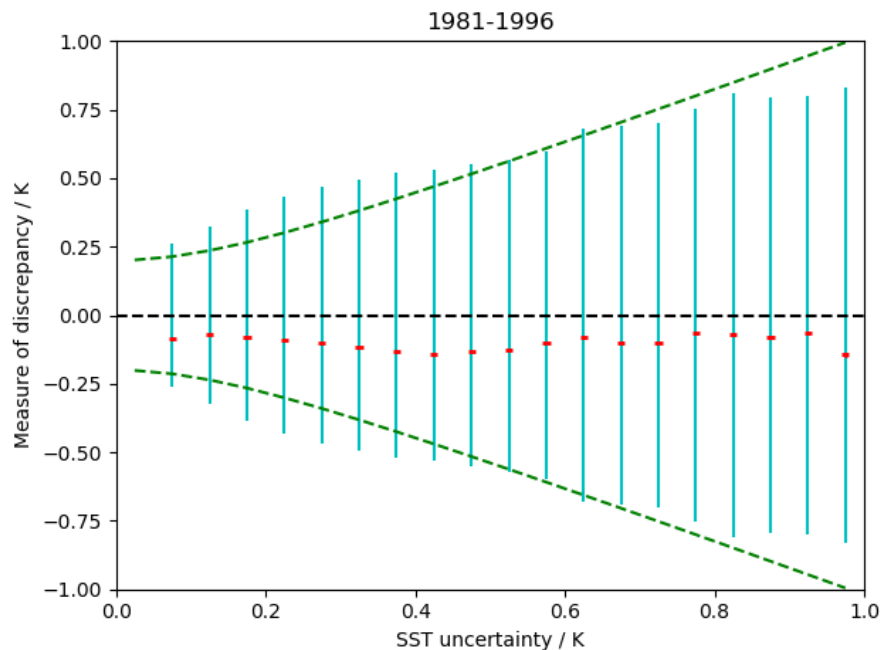
# L2P Uncertainty (nighttime)



- ATSR uncertainty is good
- MetOp uncertainty is good (also applies to NOAA-12 onwards)
- NOAA-07 uncertainty is underestimated



# L4 Uncertainty



- Some under-estimation at low end for early data
- Some over-estimation at high end for more recent data

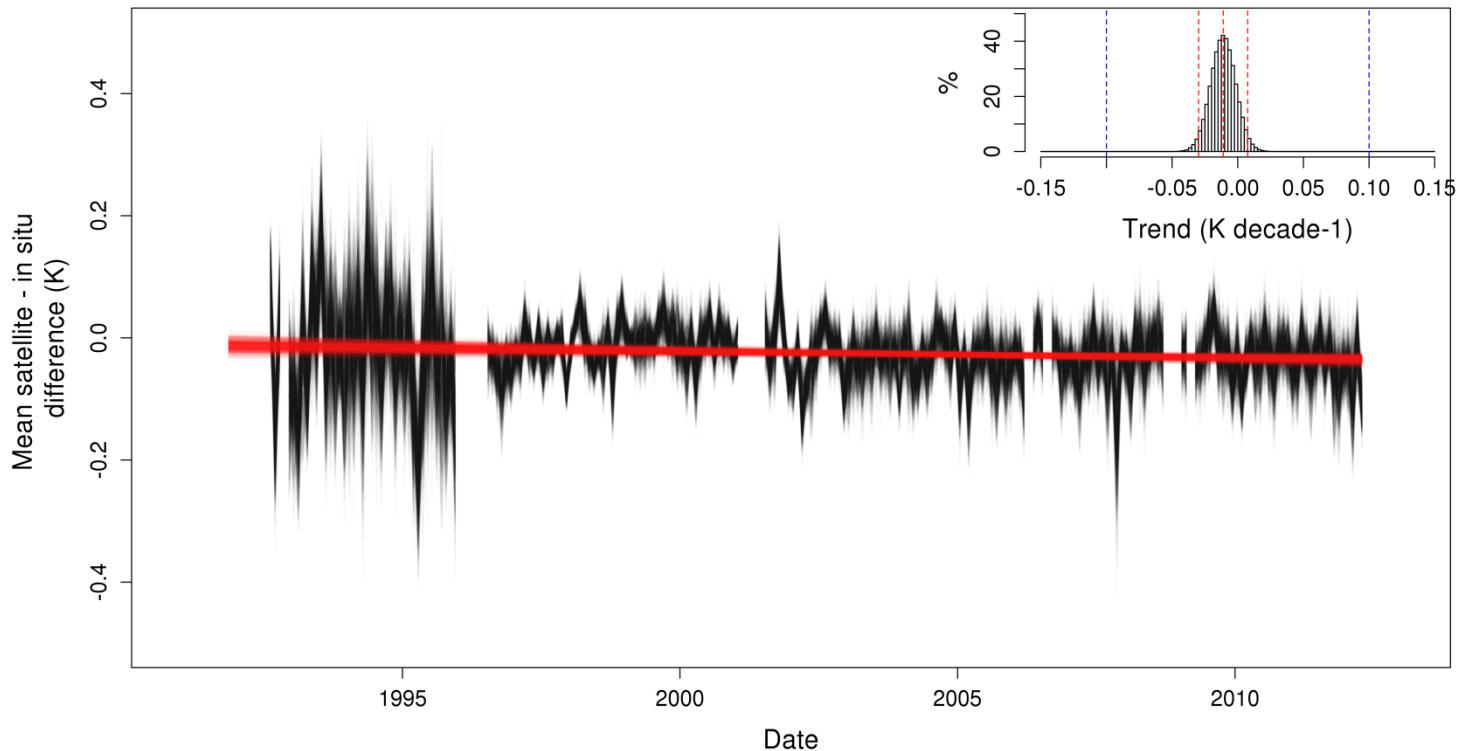


Data	Trend [mK/year]
ATSR (day)	-2.1 < trend < 2.3
ATSR (night)	-2.6 < trend < 0.4
AVHRR (day)	3.6 < trend < 15.5
AVHRR (night)	-2.1 < trend < 9.8
Analysis	-1.51 < trend < -0.05

- See Berry et al. (2018) doi:10.3390/rs10010126
- Stability assessed against long term stable moorings
  - Tropical Pacific (1990 – 2012)
- Trend range is the 95% confidence interval for the relative multi-year trend between satellite SSTs and the Global Tropical Moored Buoy Array
- Aim is trend less than  $0.1 \text{ K decade}^{-1}$  (or  $10 \text{ mK year}^{-1}$ )

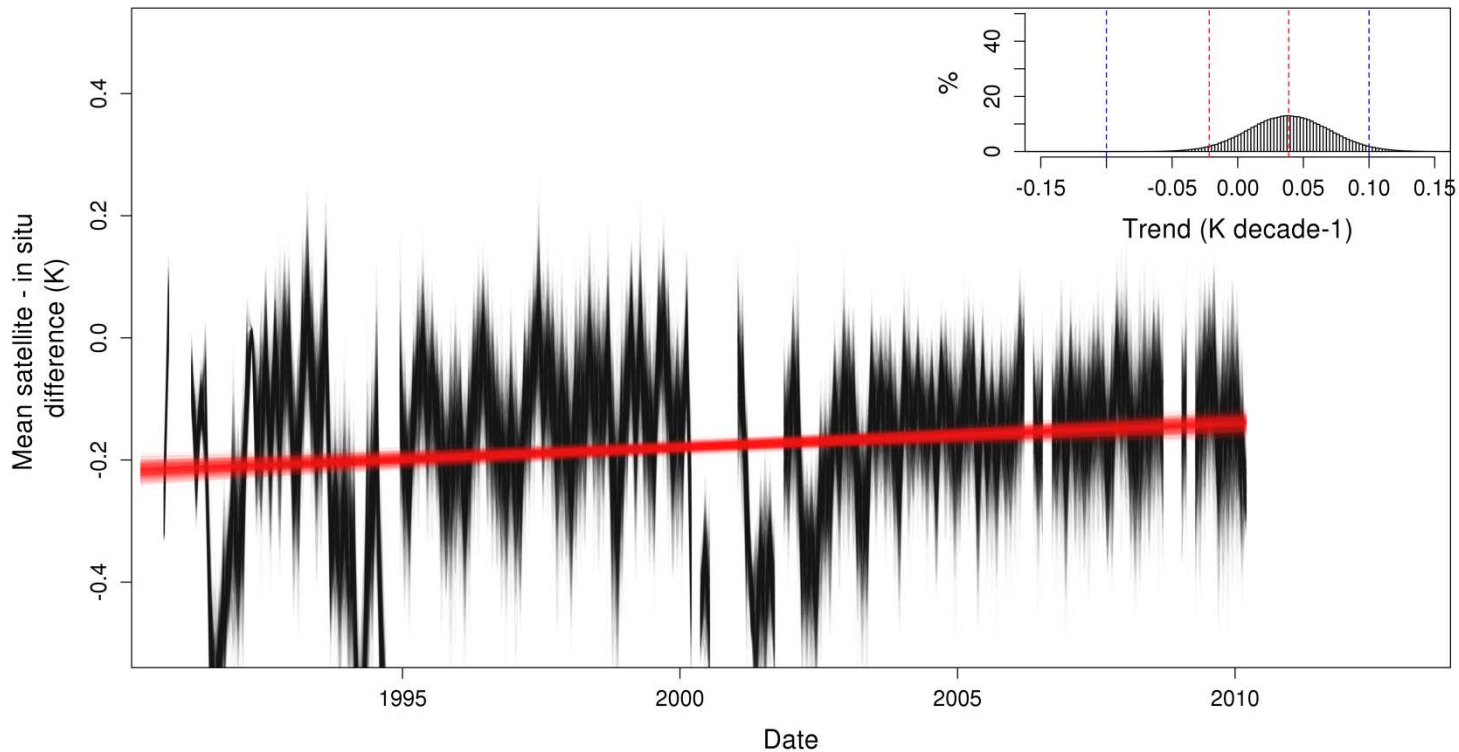


# Stability Assessment – ATSR (night)





# Stability Assessment – AVHRR (night)





- SST-CCI CDR v2 is now available
  - <http://cci.esa.int/data> (Access via FTP, other methods soon)
  - Merchant et al. (2019). Satellite-based time-series of sea-surface temperature since 1981 for climate applications, *Scientific Data*, in prep
- 35-year CDR with ongoing extension via C3S ICDR
  - Data from 1991 onwards referenced to ATSR (independent of *in situ*)
  - 1980s data is referenced to *in situ* SST
- ATSR2 / AATSR (fully independent) global bias  $\lesssim 0.01$  K
- AVHRR 7,9,11 tuned to *in situ*; AVHRR 12 onwards tuned to ATSR
  - Global bias  $\lesssim 0.1$  K except for AVHRR 7 and 18