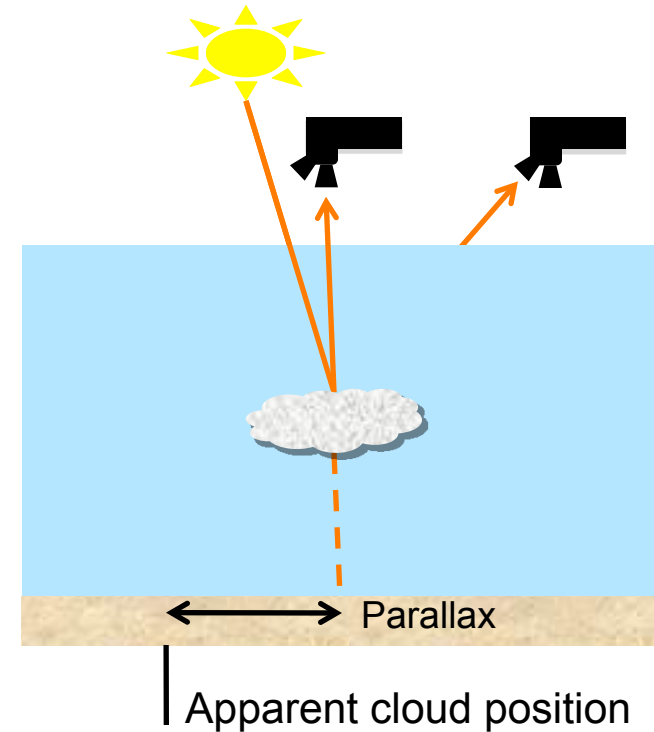
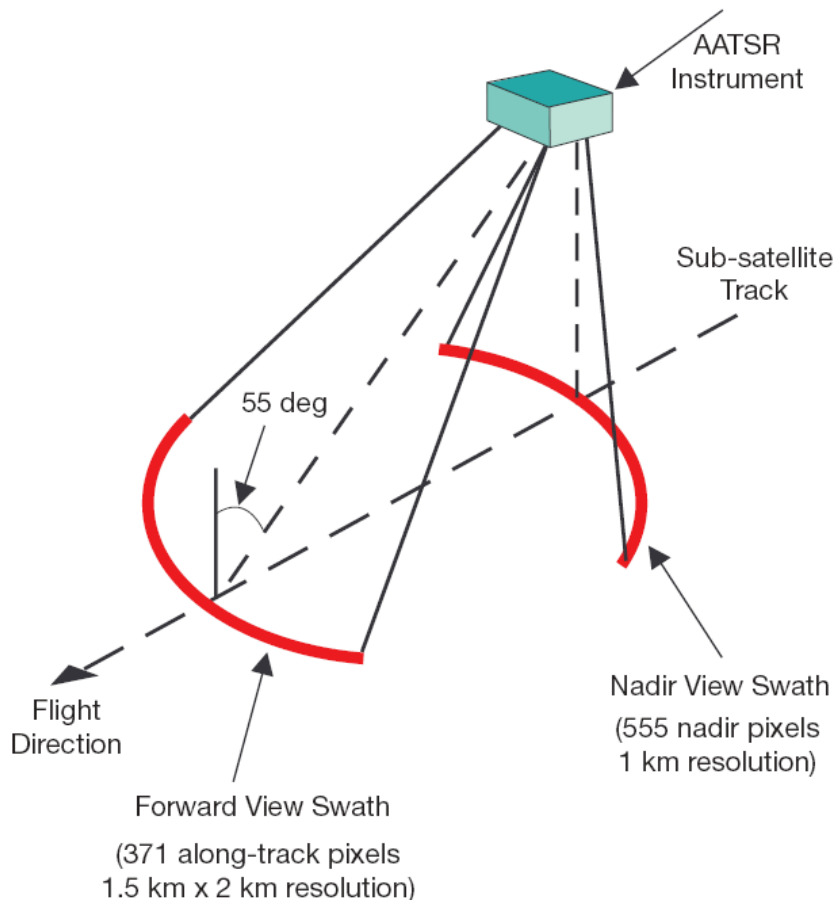


Atmospheric Motion Vectors from the tandem operation of AATSR and ATSR-2

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- **We assess the potential for determination of cloud tracked winds and their height assignment through optical flow/stereo techniques applied to a tandem imaging system**
- **ATSR-2/AATSR tandem operation data is exploited for this demonstration**
- **The Farneback optical flow algorithm is used to determine meridional and zonal wind speeds.**
- **The Census stereo matching algorithm is used to define wind heights.**
- **An inter-comparison is made against the NASA MERRA wind products.**
- **A limited preliminary validation is made against rawinsonde data from the NOAA/ESRL Radiosonde Database network.**
- **The future potential for application to MISR-lite is examined.**



Height attributes

- derived from purely geometric approach
- completely automated, globally
- independent of radiometric calibration, temperature profiles, cloud emissivity
- instantaneous height accuracies of ≈ 1 km, validated against ground-based radar/lidar

Winds from ATSR2-AATSR tandem
(30 minutes apart) for 2002/3

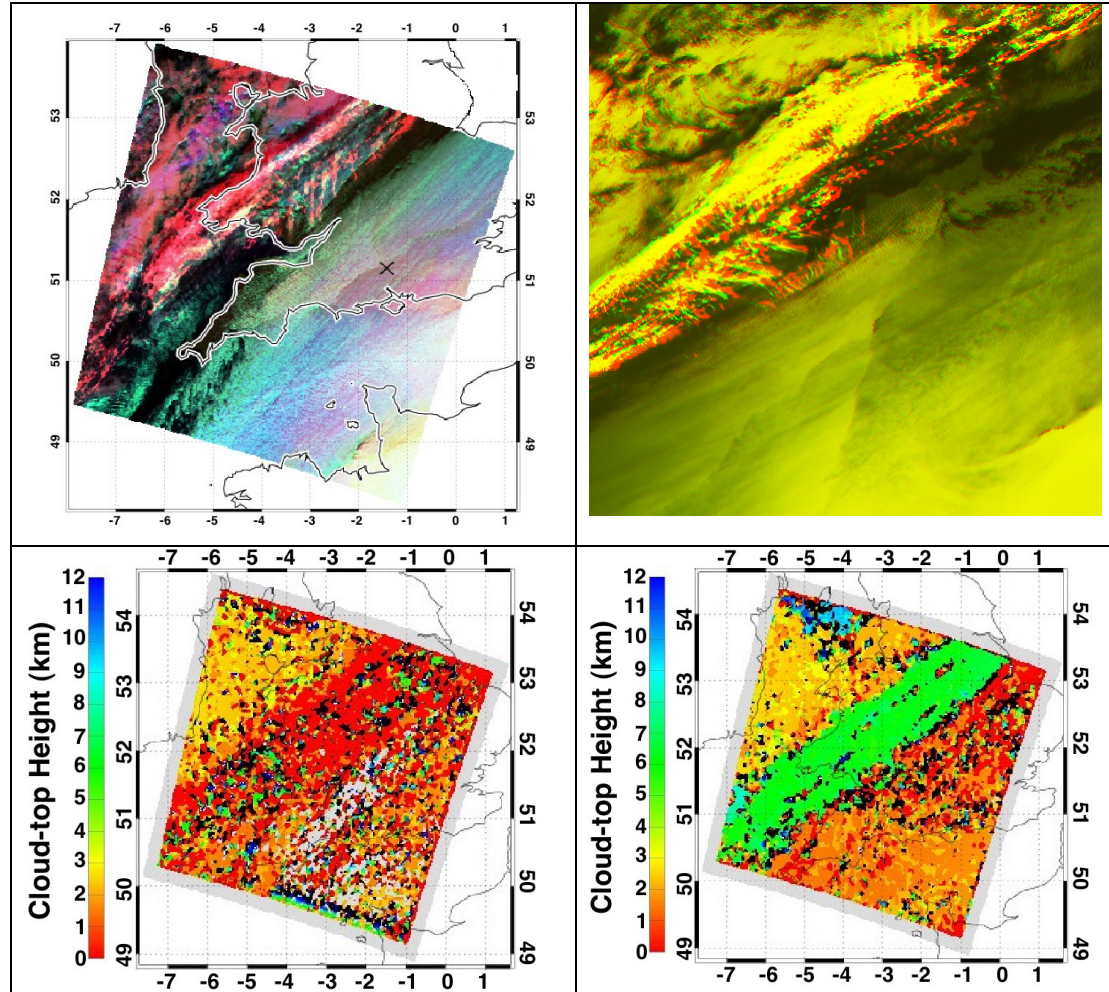
Example of (A)ATSR(2) Multispectral Stereo to sample thin high Cirrus over dense Strato-Cumulus

False Colour Composite of $11\mu\text{m}$, $1.6\mu\text{m}$, $0.68\mu\text{m}$ (left)

Red/Green stereo anaglyph (right)

ATSR2 Stereo CTH retrievals (thin cloud observable in $11\mu\text{m}$ stereo)

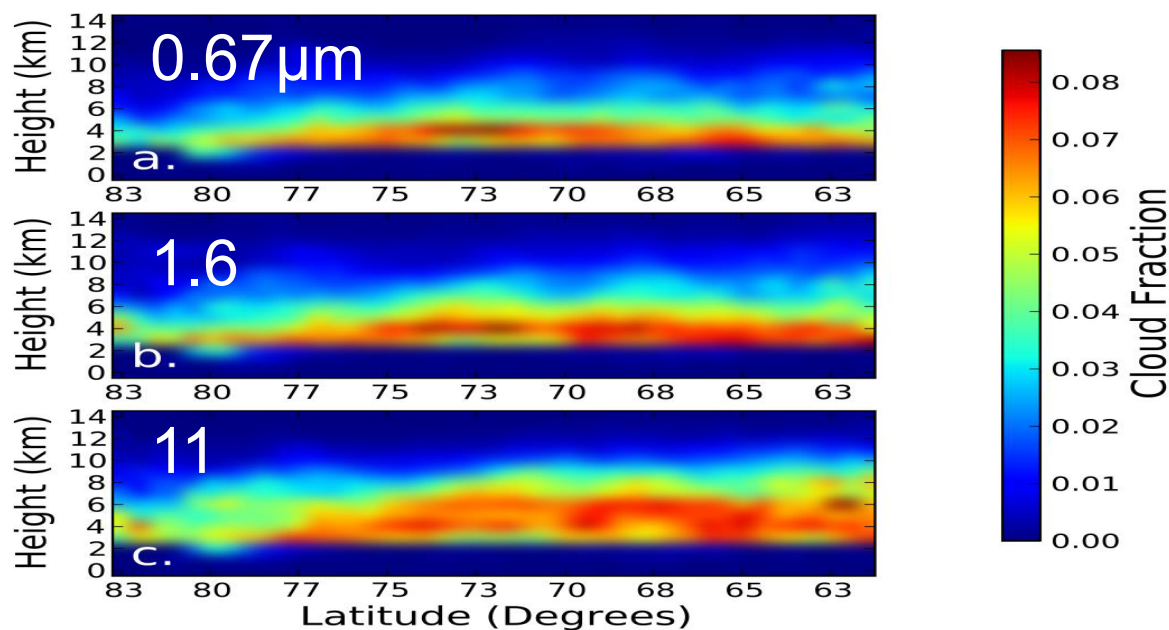
Muller et al. (2007)
IJRS 8 (9):1921-1938



$1.6\mu\text{m}$

$11\mu\text{m}$

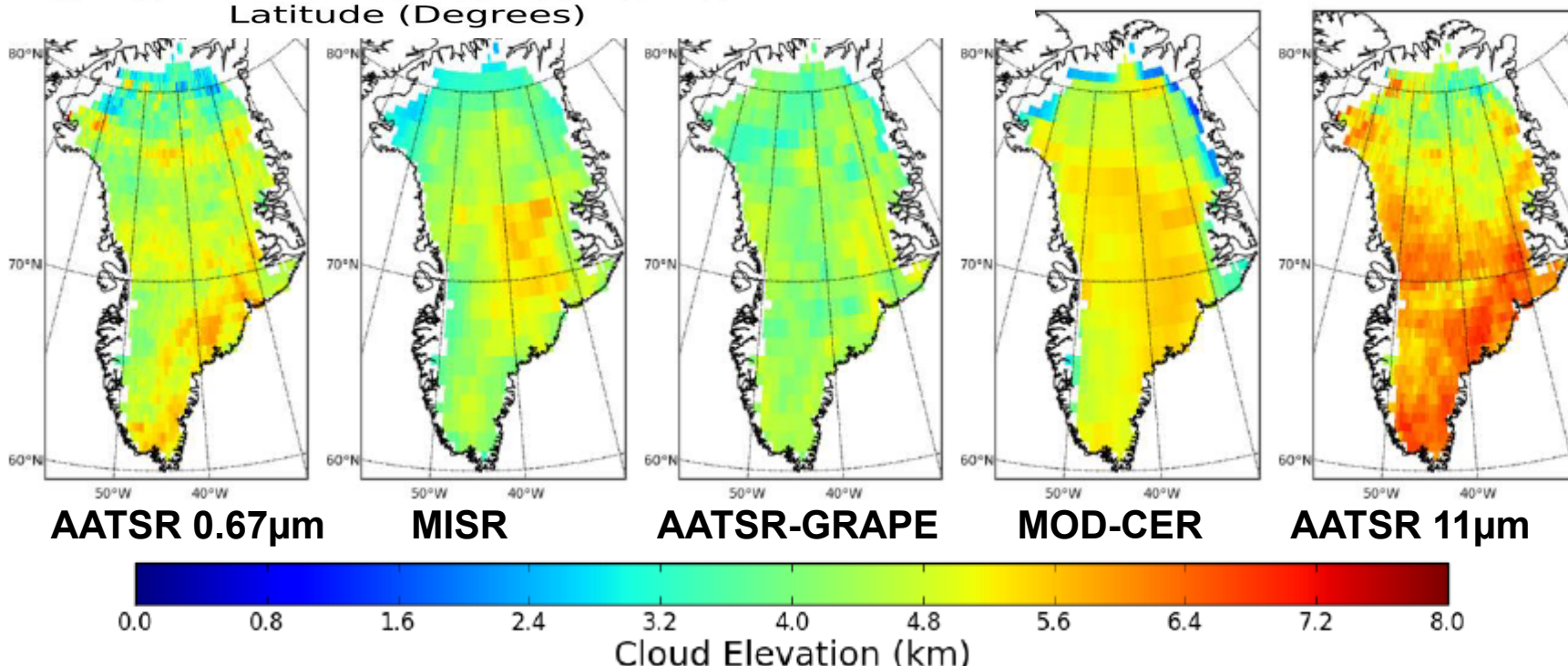
AATSR stereo-CTHs over ice



Latitudinal mean CFbA

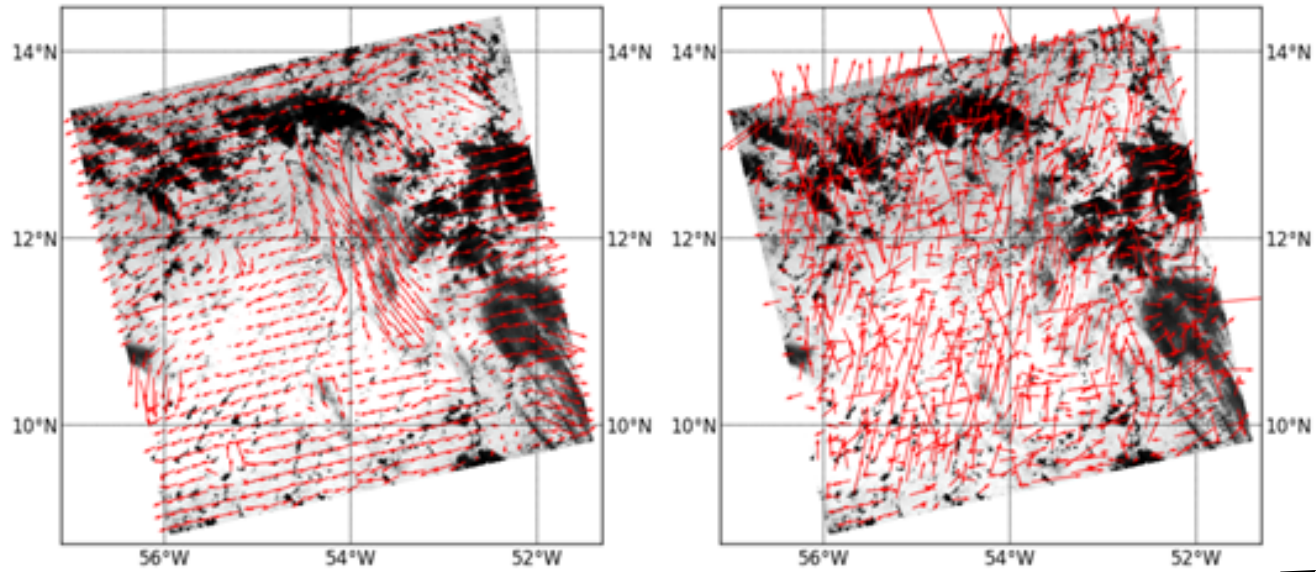
Fisher, D. & Muller, J-P.
NCEO (2013)

N.B. Large difference
in Greenland CTH &
CF in stereo between 0.67
and 11 μm

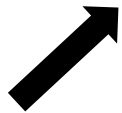


- **A single ATSR instrument can determine pixel level accuracy across track winds to quantisation of 8-10 ms⁻¹ (dependent on scan position).**
- **A tandem ATSR operation, with the instruments observing a shared ground track have the viewing geometries of each view approximately the same. This removes the parallax effect, and any observed displacements in the scene is related to object motion.**
- **This enables across and along track wind determination.**
- **For the period June 2002-July 2003 ATSR2 and AATSR operated with a shared ground track enabling motion determination in both imaging axes.**
- **30 minute separation between the observations allow for wind speed to be determined at 0.5 ms⁻¹ quantisation.**

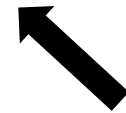
- **ATSR-2 orbit 38977 and AATSR orbit 3105 from the 4th of October 2002 were initially selected for analysis.**
- **Nadir 11 μm observations used in all instances.**
- **3 algorithms evaluated for motion tracking:**
 - **M4 stereo matching algorithm [1]. Based on normalised cross correlation and FFT disparity refinement (in this instance FFT disparity refinement not employed)**
 - **SIFT feature matcher [2]. Scale invariant feature detection algorithm. Detects features that persist through differing scales (achieved by Gaussian blurring and non-maxima suppression). Generates description from the local feature neighbourhood. Matching through minimisation of descriptor magnitude difference.**
 - **Farneback optical flow algorithm [3]. Estimates displacement fields through analysis of polynomial expansion coefficients. Available in OpenCV.**
- **Visual assessment of the Farneback optical flow algorithm shows that it outperforms the other matching algorithm (see next slide).**



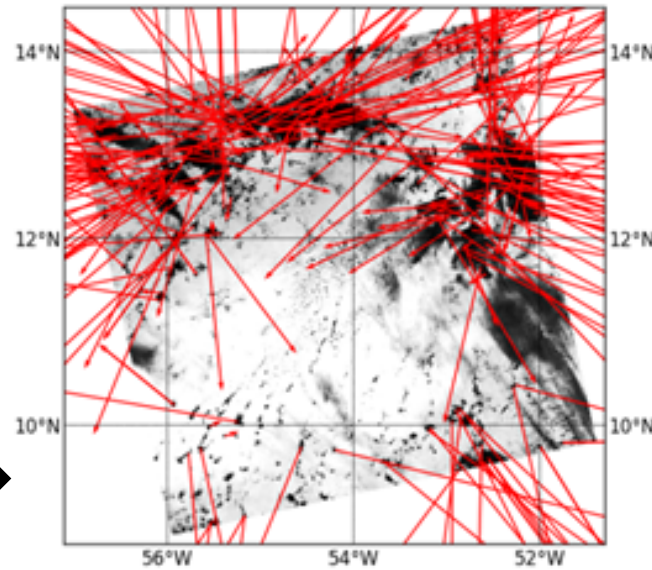
Farneback



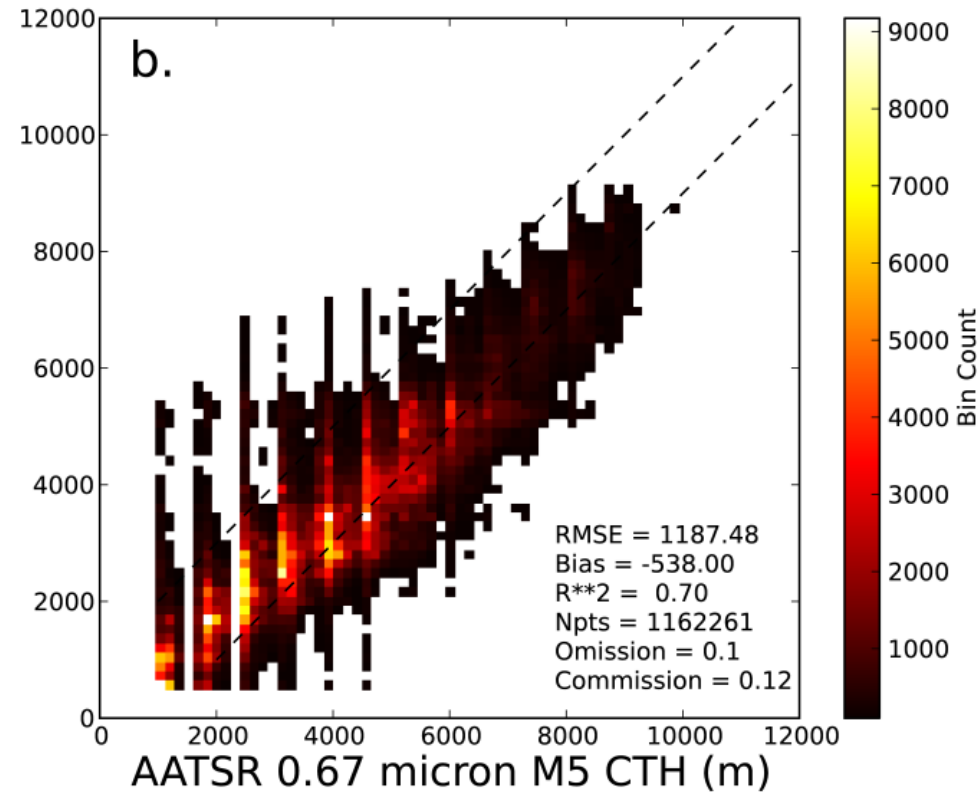
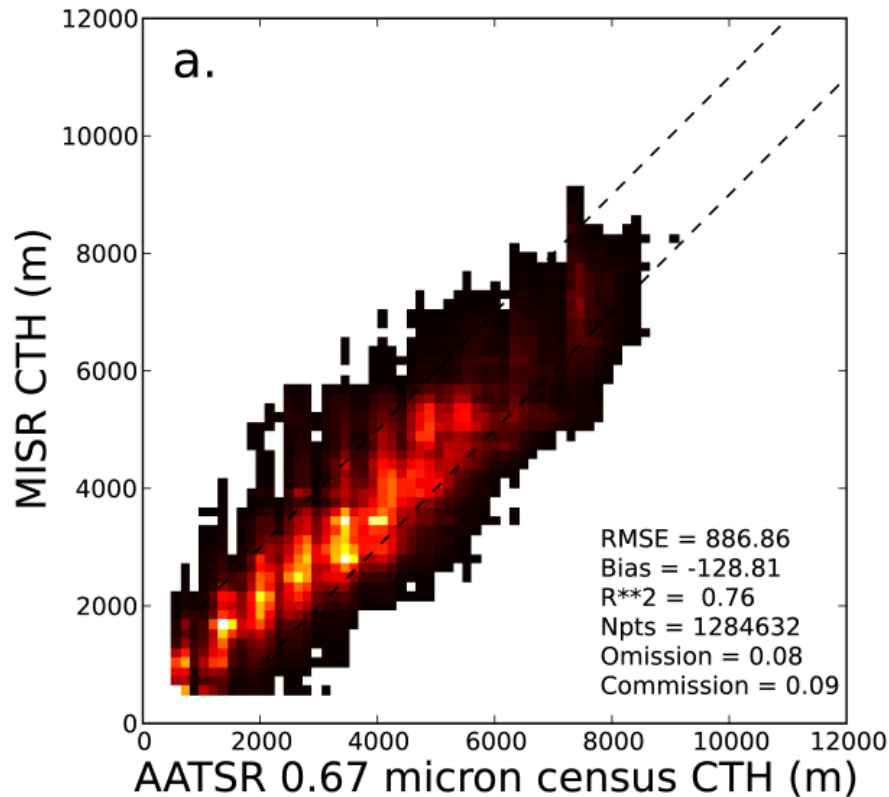
M4

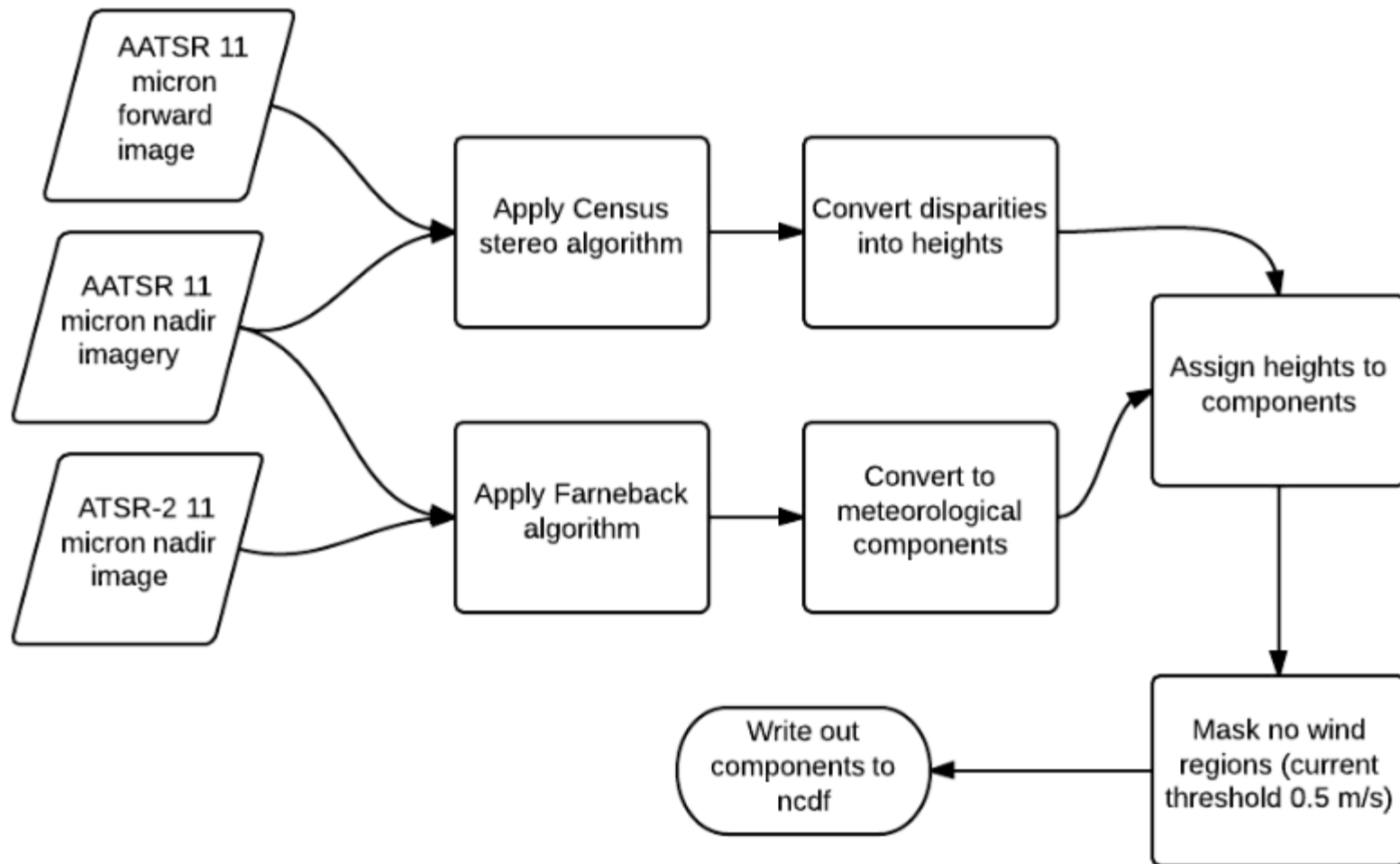


SIFT

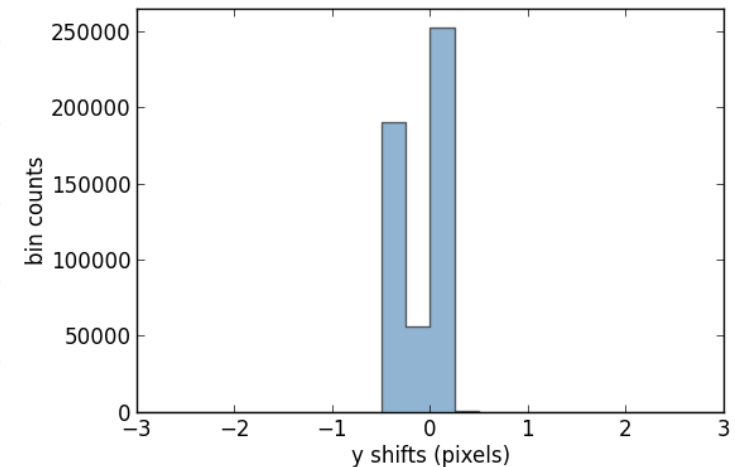
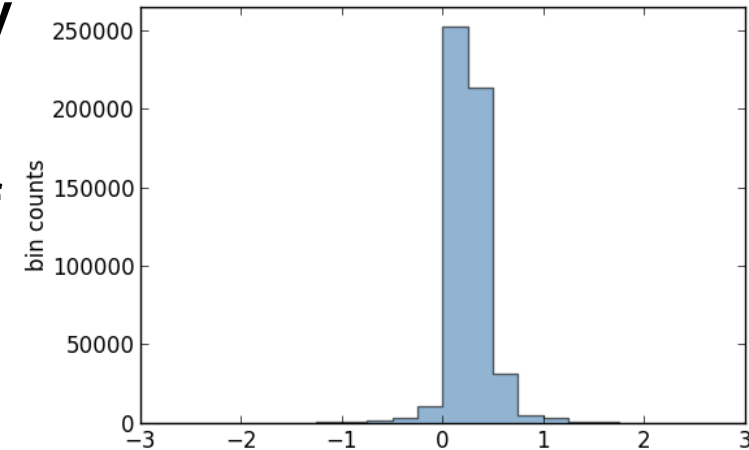
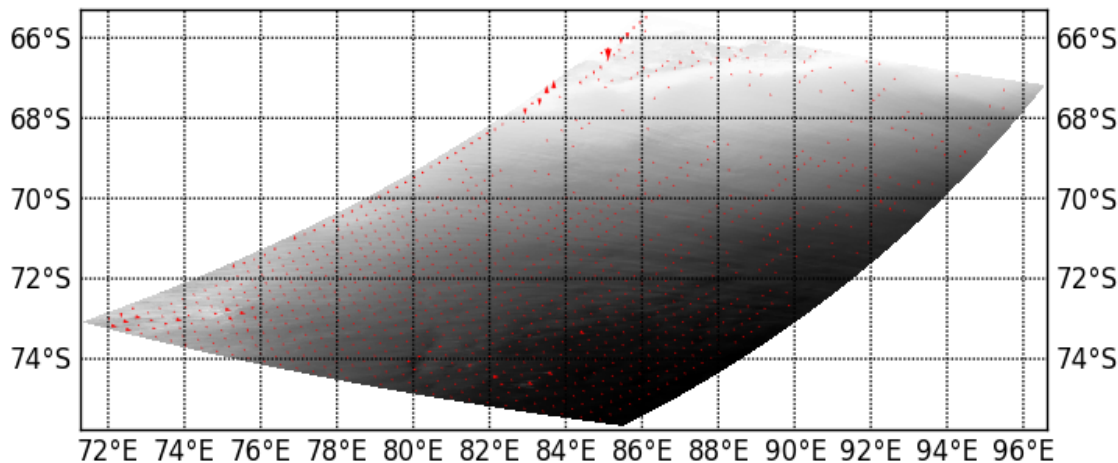


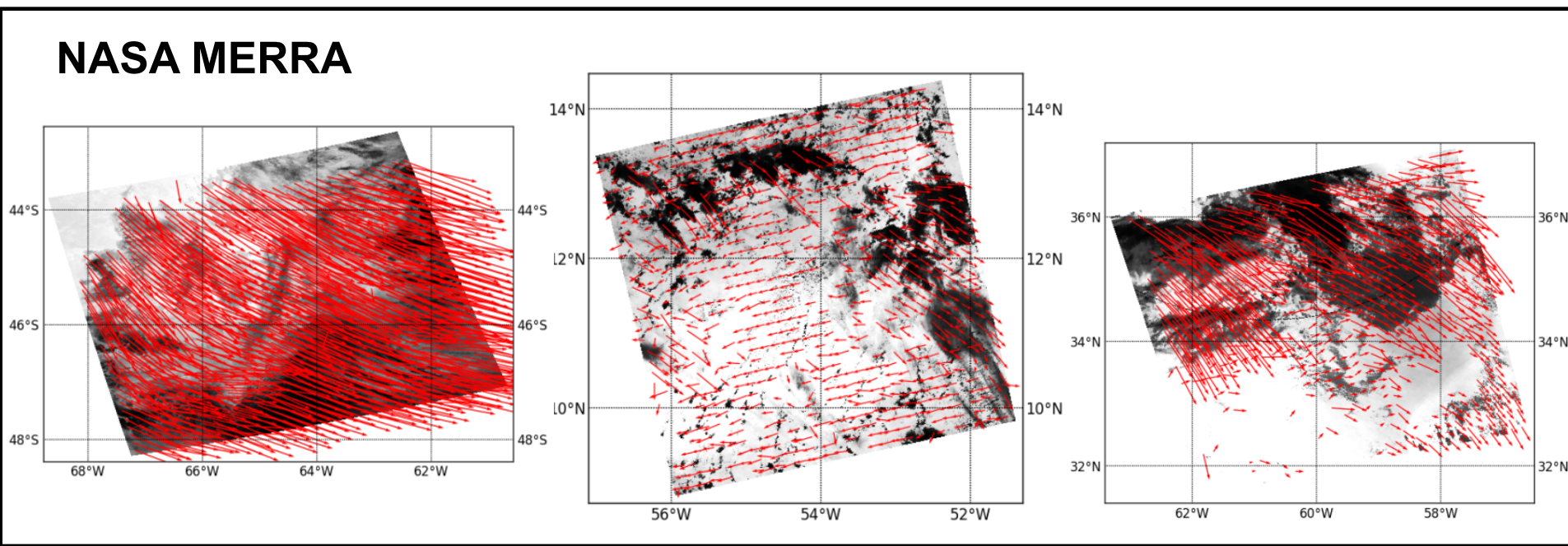
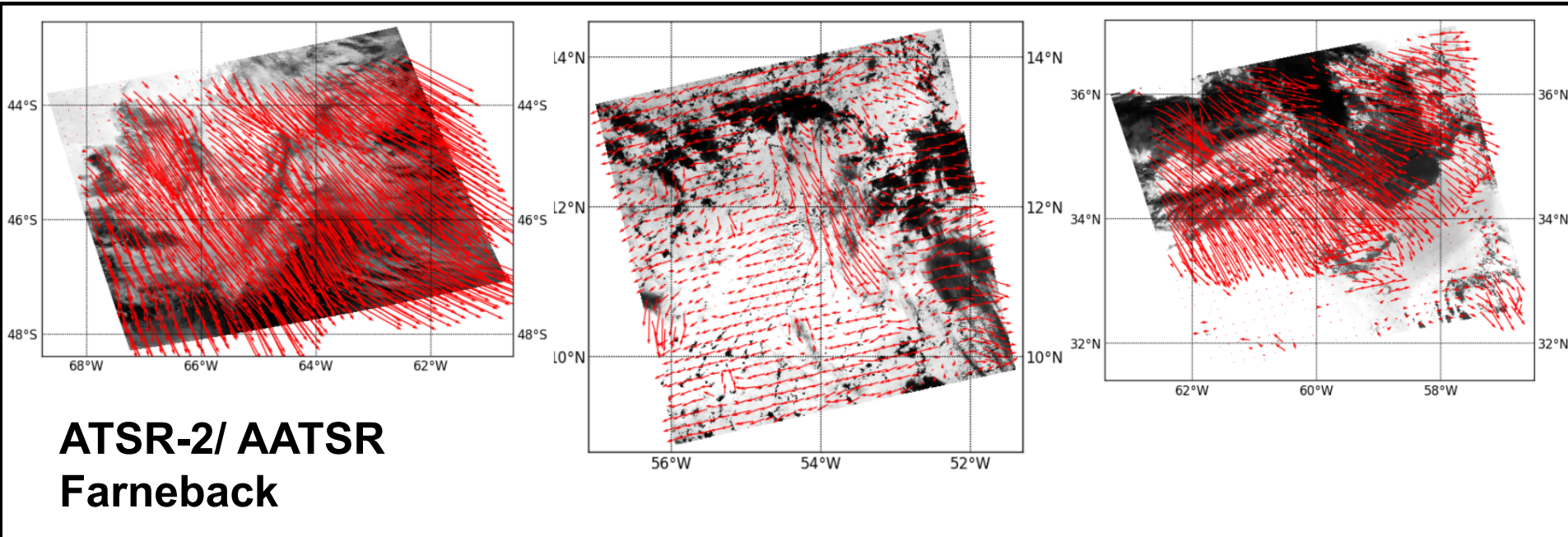
- Wind heights are assigned using the AATSR forward and nadir 11 micron views in combination with the census stereo matching algorithm to $\sim 1\text{km}$ quantisation [4].
- Evaluation against collocated obs. (for the $0.67\ \mu\text{m}$ channel) from 17 MISR orbits over Greenland demonstrate good agreement and improved performance over M4 when using AATSR data.



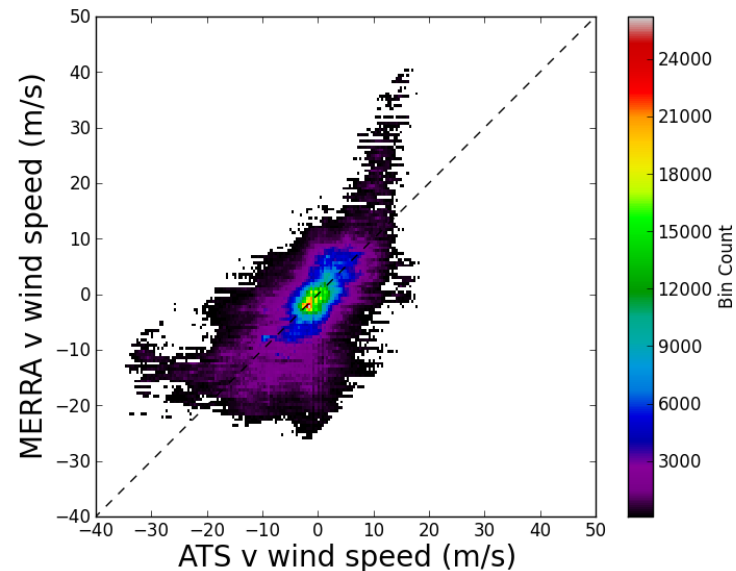
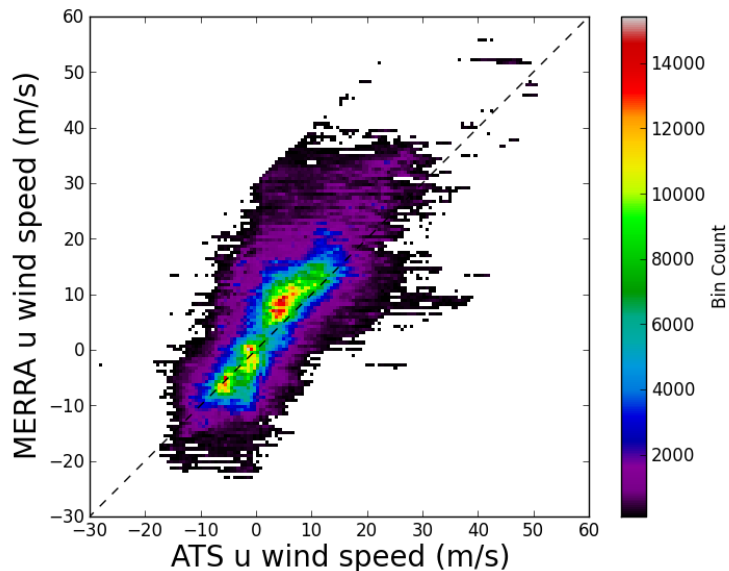


- **Cloud free AATSR/ATSR-2 nadir 11 micron image pair over Antarctica employed. Processed with Farneback algorithm.**
- **Pixel displacements in both axes typically $\ll 1$ pixel.**
- **Converted to wind components: RMSD of 0.37 ms^{-1} , bias of 0.24 ms^{-1} for zonal; RMSD of 0.2 ms^{-1} , bias of -0.14 ms^{-1} for meridional.**





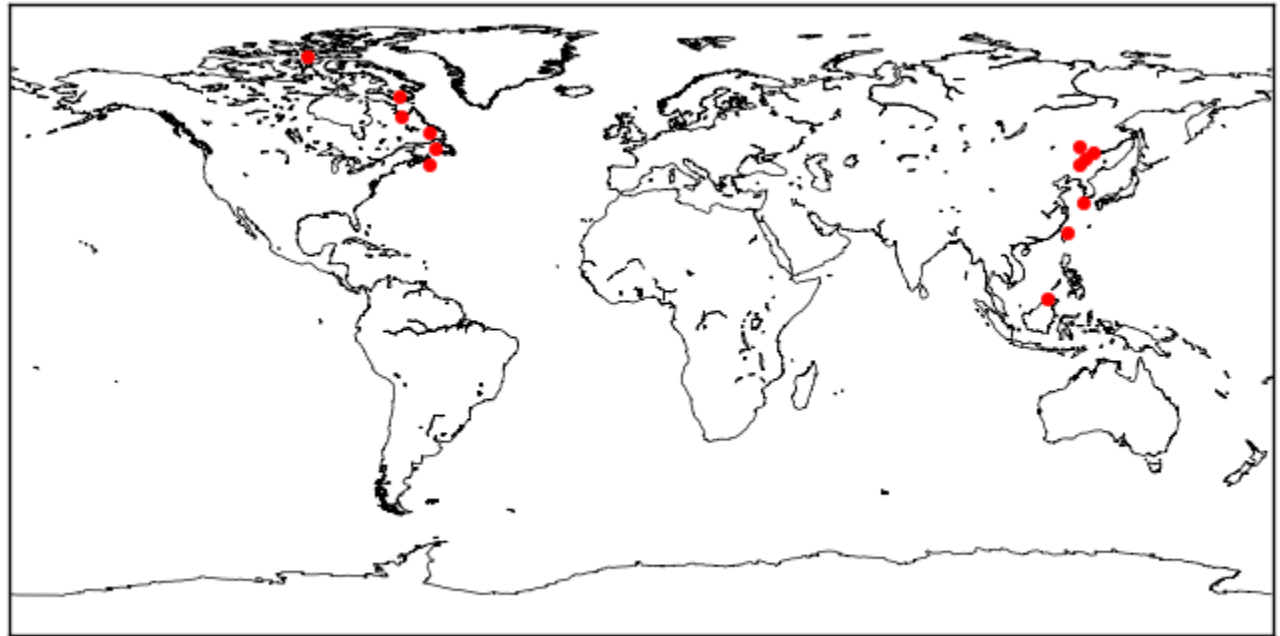
- **ATSR-2 orbit 38977 and AATSR orbit 3105 pair 11 micron nadir channels processed with Farneback algorithm.**
- **Converted into zonal and meridional wind components. Components compared against collocated MERRA reanalysis outputs [5] as shown in previous slide.**
- **Meridional comparison shows a RMSE of 7.7 ms^{-1} and a bias of -2.5 ms^{-1} .**
- **Zonal comparison returns a RMSE of 6.6 ms^{-1} and a bias of -0.5 ms^{-1} .**



- Same ATSR2-AATSR dataset as used for MERRA compared against rawinsonde data from the NOAA/ESRL Radiosonde Database [6].
- 13 stations found to be collocated with the ATSR orbit pair and used for the assessment and plotted below (red circles). Calculated statistics shown next to plot.

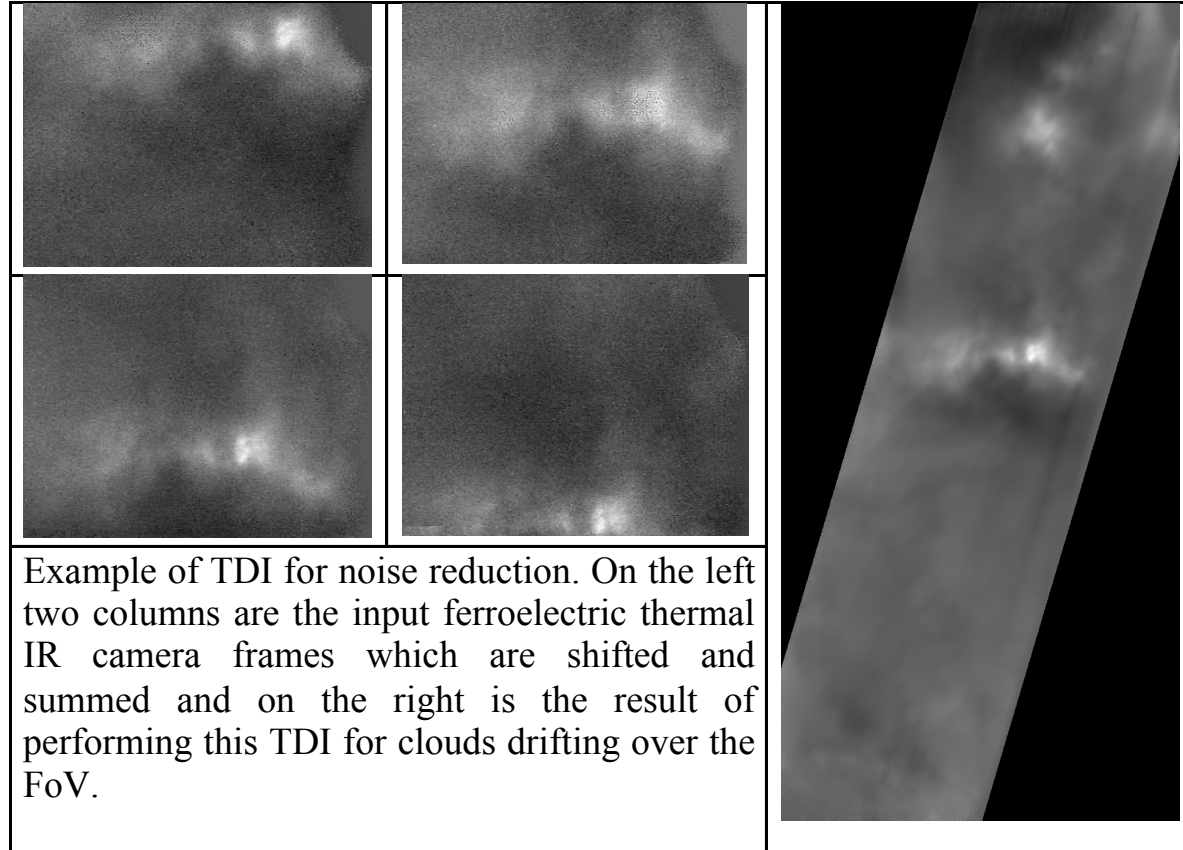
rmseU 7.45
biasU -1.96

rmseV 4.75
biasV 1.63



UK Space Agency
CEOI fund airborne
prototype for flight in
Adelaide, SA

- Uncooled ULIS microbolometer arrays (320 x 240)
- Operating in TDI mode
- Mounted on a gimbal in a payload pod
- Bore-sighted with lidar

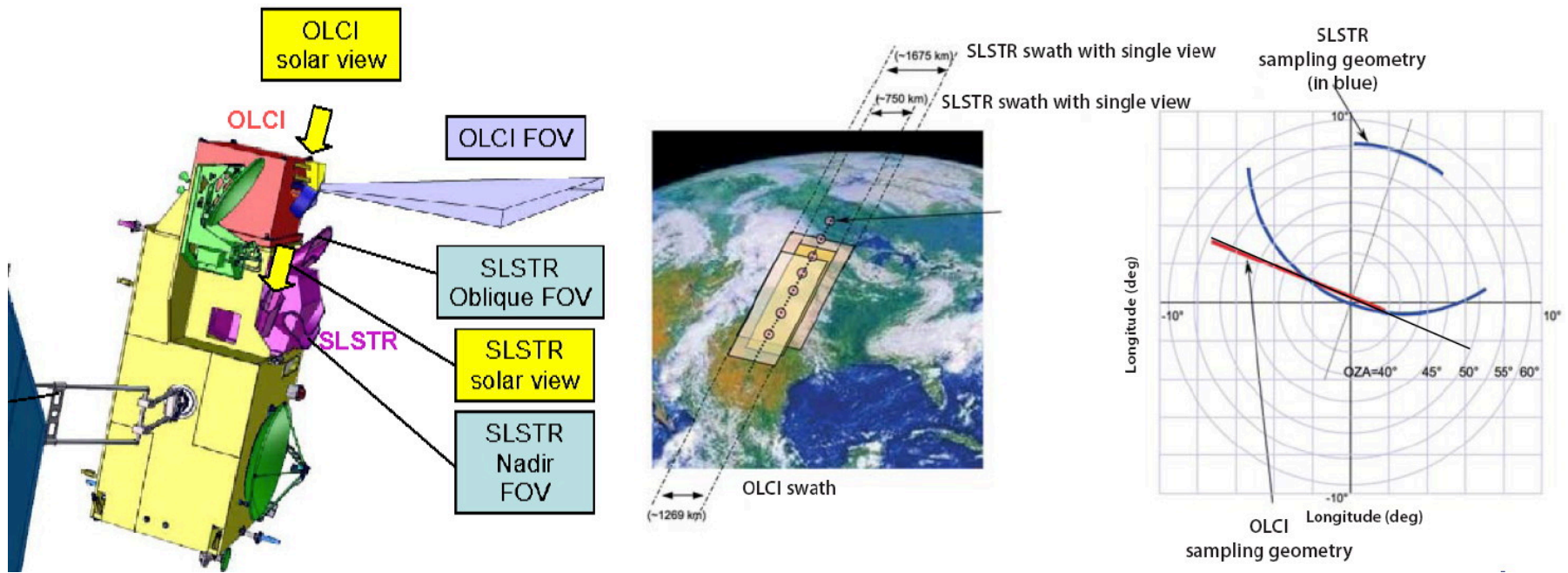


Swath width	1500 km
Pixel size	300m
AMV reporting grid-size	900m, 9km
Wind speed accuracy	± 3 m/s
Cloud height accuracy	± 300 m

Table 1: MISRlite instrument specification



SENTINEL-3 SLSTR (& OLCI) – from 2015



SLSTR 750km overlap could provide stereo (1km) winds from polar
Overlap and with 2 SENTINEL-3 spacecraft possible sideways overlap

- The Farneback optical flow algorithm has been identified for application to the ATSR-2 AATSR tandem operation for the determination of zonal and meridional tropospheric winds.
- In a zero wind analysis the Farneback algorithm is demonstrated to result in biases of less than 0.5 ms^{-1}
- In a comparison against the MERRA re-analysis biases of less than 2.5 ms^{-1} are returned.
- In a limited comparison against rawinsonde data biases of less than 2 ms^{-1} are observed.
- Future possibilities include the use of sideways and along-track overlap with Sentinel-3a,b, especially with SLSTR and the MISRlite instrument as part of the EPS-Metop convoy discussed by Ad Stoffelen in a poster

- [1] Muller, J. P., Denis, M. A., Dundas, R. D., Mitchell, K. L., Naud, C., & Mannstein, H. (2007). Stereo cloud-top heights and cloud fraction retrieval from ATSR-2. *International Journal of Remote Sensing*, 28(9), 1921-1938.
- [2] Bay, H., Ess, A., Tuytelaars, T., & Van Gool, L. (2008). Speeded-Up Robust Features (SURF). *Computer Vision and Image Understanding*, 110, 346-359
- [3] Farnebäck, G. (2003). Two-frame motion estimation based on polynomial expansion. In *Image Analysis* (pp. 363-370). Springer Berlin Heidelberg.
- [4] Zabih, R., & Woodfill, J. (1994). Non-parametric local transforms for computing visual correspondence. In *Computer Vision—ECCV'94* (pp. 151-158). Springer Berlin Heidelberg.
- [5] Rienecker, M. M., Suarez, M. J., Gelaro, R., Todling, R., Bacmeister, J., Liu, E., ... & Woollen, J. (2011). MERRA: NASA's modern-era retrospective analysis for research and applications. *Journal of Climate*, 24(14), 3624-3648.
- [6] <http://www.esrl.noaa.gov/raobs/>