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# Assessing Biases in Recent *in situ* SST and Marine Air Temperature

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## ○ Introduction

## ○ Analysis of VOS SST

Bucket and Engine Room Intake SST accuracy

Analysis of biases - errors and correlations

## ○ Analysis of VOS Air Temperature

Variations by country

Effect of solar radiation

## ○ Conclusions

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## Data Set

- Blend of COADS with UK Meteorological Office Marine Data Bank for period 1980 - 1997.
- Metadata from WMO Report No. 47 merged onto individual COADS reports to give, for example, SST and air temperature measurement methods and sensor heights
- Analysis of pairs of night-time data (one ship using bucket, one ERI) within 50km and at same reporting hour for North Atlantic.



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## Determining small mean biases in noisy data with correlated errors

### Possible errors:

- The **engine intake** SST may be biased  
*cool*: due to the larger measurement depth  
or  
*warm*: due to contamination by heat from the ship
- The **bucket** SST may be too *cool*:  
due to sensible or latent heat loss after leaving the sea,  
if thermometer is removed to read ('Wet-bulb' effect).
- The **bucket** SST may be too *warm* :  
if the sample is warmed by direct solar radiation  
if a warm bucket was not allowed to equilibrate



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## Hypothetical model

- Consider nighttime data at moderate wind speeds.
- assume that the bucket SST reports ( $SST_{\text{bucket}}$ ) are in error by an amount which depends linearly on the air sea temperature difference.
- assume that the engine intake SST reports ( $SST_{\text{eri}}$ ) may, on average, have a constant bias.

hence...

$$SST_{\text{bucket}} - SST_{\text{eri}} = \alpha (T_{\text{air}} - SST_{\text{eri}}) + \beta$$

i.e.  $y = \alpha x + \beta$

where:

$$y = SST_{\text{bucket}} - SST_{\text{eri}}$$

$$x = T_{\text{air}} - SST_{\text{eri}}$$



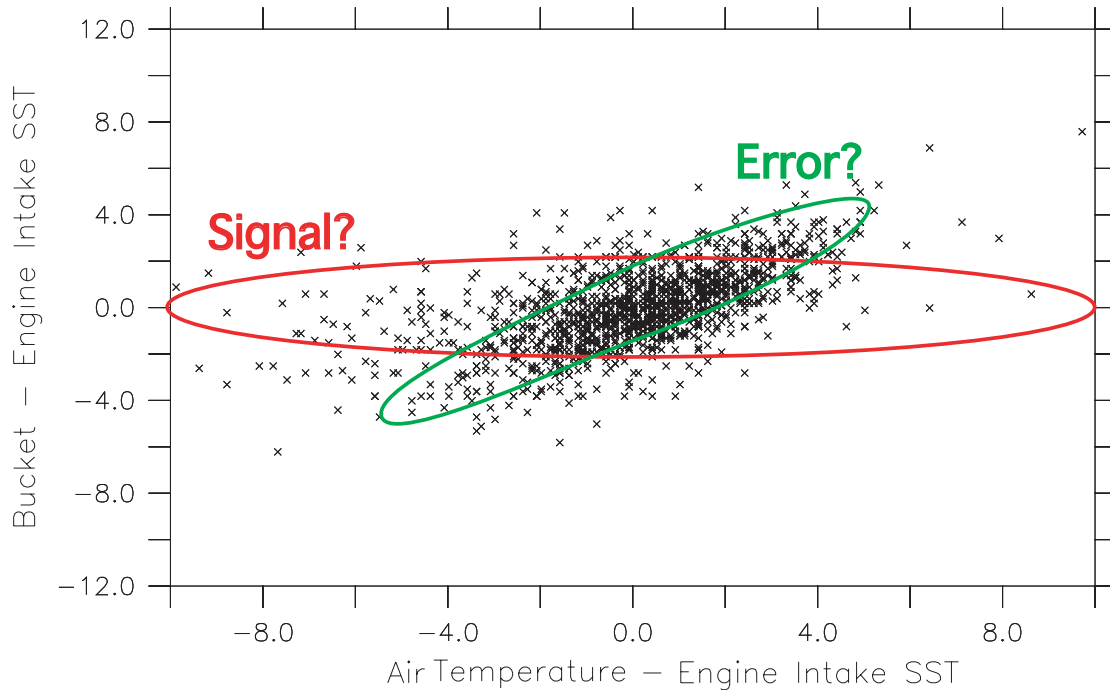
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## Example plot:

$$\text{SST}_{\text{bucket}} - \text{SST}_{\text{eri}} = \alpha (T_{\text{air}} - \text{SST}_{\text{eri}}) + \beta$$



- errors in  $\text{SST}_{\text{eri}}$  will cause a spurious correlation along the green ellipse which masks the expected dependence (red ellipse)
- To properly determine  $\alpha$  and  $\beta$  we must transform data so that:
  - (1) x and y are uncorrelated
  - (2) random errors in x and y are equal



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## Analysis Method

- (1) using the semi-variogram technique find values for the variances...  $(\sigma_{\text{air}})^2$ ,  $(\sigma_{\text{eri}})^2$ ,  $(\sigma_{\text{bucket}})^2$ .
- (2) Transform x and y by multiplying by the square root of the correlation matrix:

$$C = \begin{bmatrix} \varepsilon_x \\ \varepsilon_y \end{bmatrix} \begin{bmatrix} \varepsilon_x & \varepsilon_y \end{bmatrix} = \begin{bmatrix} \langle \varepsilon_x \varepsilon_x \rangle & \langle \varepsilon_x \varepsilon_y \rangle \\ \langle \varepsilon_y \varepsilon_x \rangle & \langle \varepsilon_y \varepsilon_y \rangle \end{bmatrix}$$

where:

$$\langle \varepsilon_x \varepsilon_x \rangle = \sigma_{\text{air}}^2 + \sigma_{\text{eri}}^2$$

$$\langle \varepsilon_x \varepsilon_y \rangle = \langle \varepsilon_y \varepsilon_x \rangle = \sigma_{\text{eri}}^2$$

$$\langle \varepsilon_y \varepsilon_y \rangle = \sigma_{\text{bucket}}^2 + \sigma_{\text{eri}}^2$$

to give new variables which are uncorrelated and have unit random errors.

- (3) Perform orthogonal regression on transformed data.
- (4) Transform regression parameters back to give  $\alpha$  and  $\beta$  in the 'real world'.

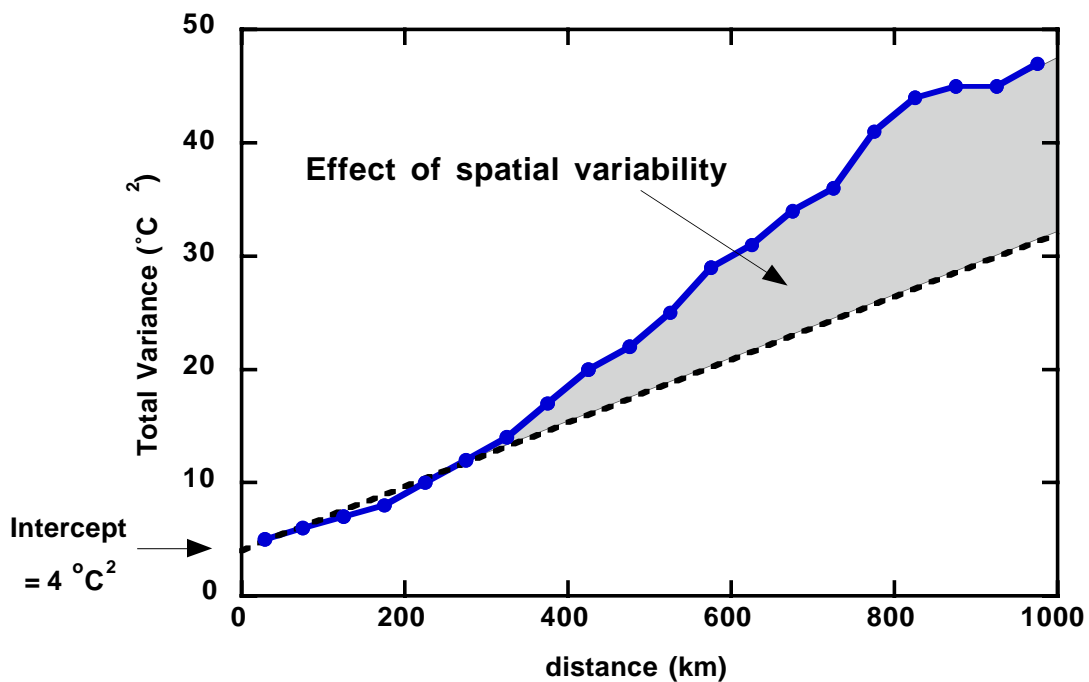


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## Determining random errors... the semi-variogram technique



- plot the mean square difference between pairs of ships as a function of separation and extrapolate to zero separation
- the intercept is twice the variance, in this example:

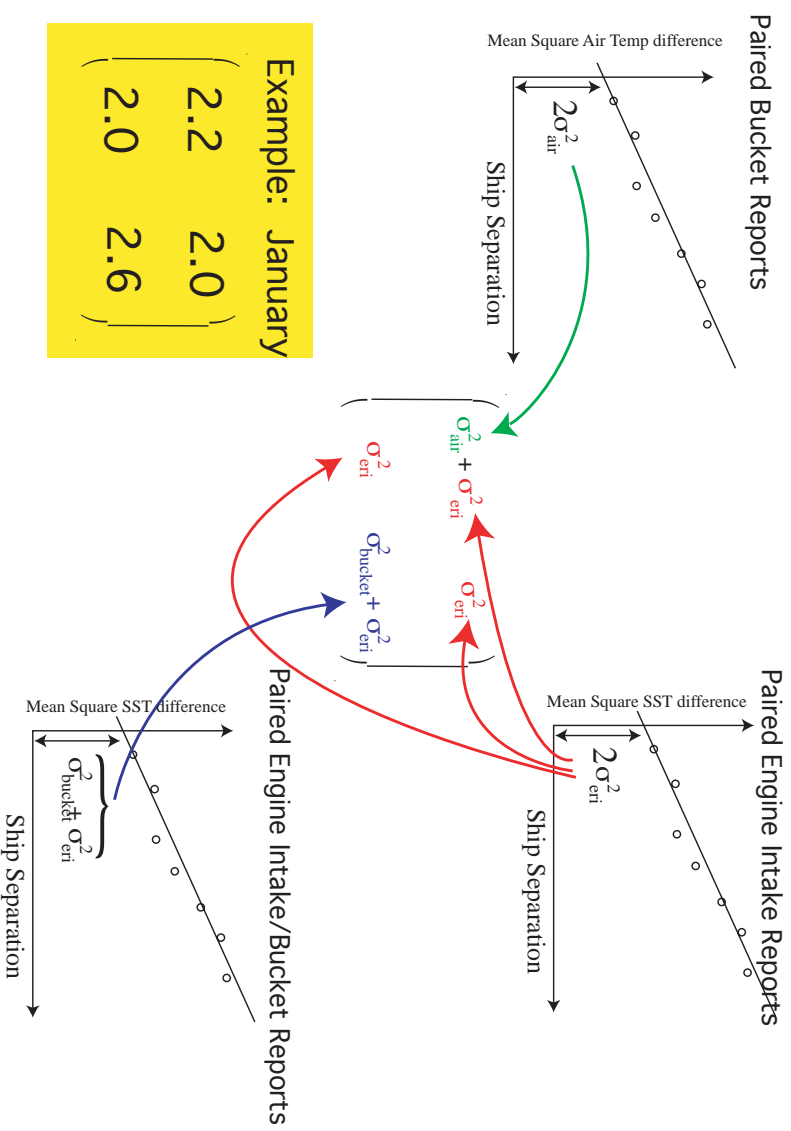
$$\sigma = \sqrt{(4 / 2)} = 1.4^{\circ}\text{C}$$



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# Calculating the Correlation Matrix



Example: January

2.2	2.0
2.0	2.6

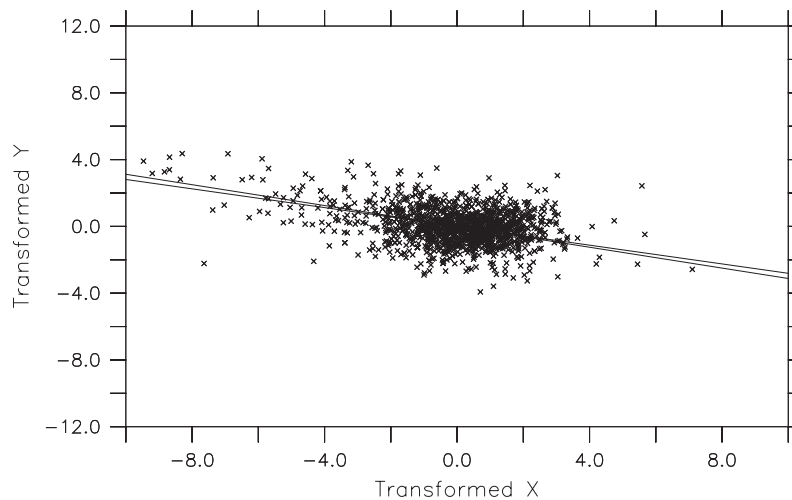
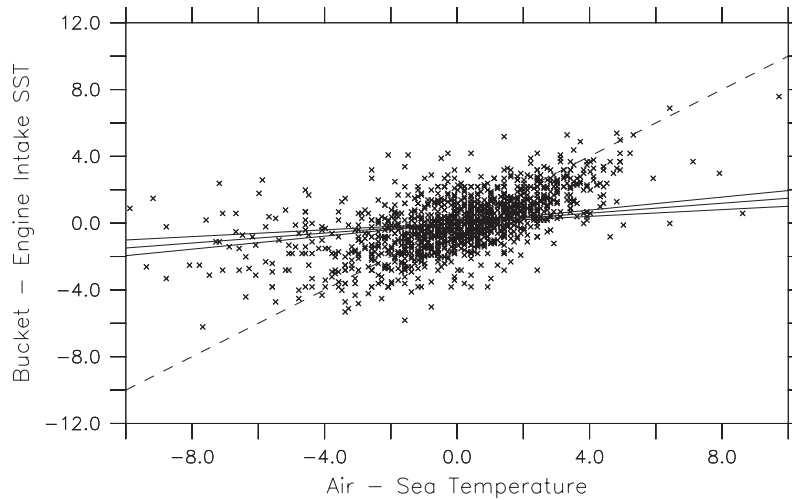




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$$SST_{\text{bucket}} - SST_{\text{eri}} = \alpha (T_{\text{air}} - SST_{\text{eri}}) + \beta$$

... example for January data



- the regression is well defined in the transformed variable space (this was not so in summer)



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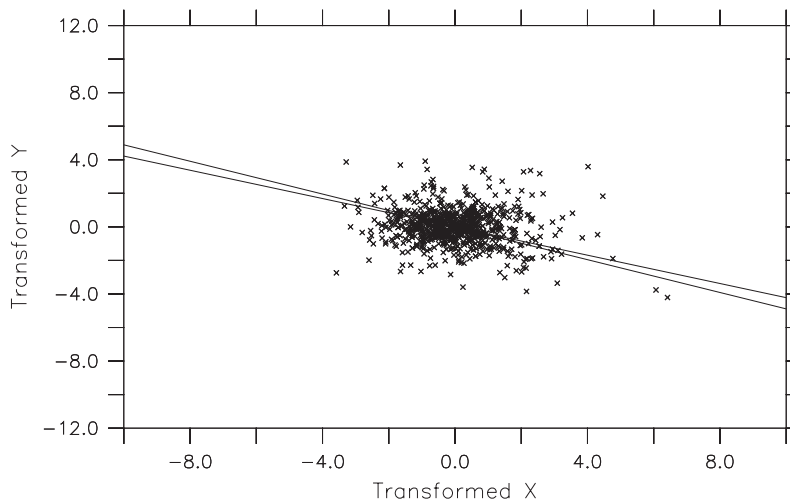
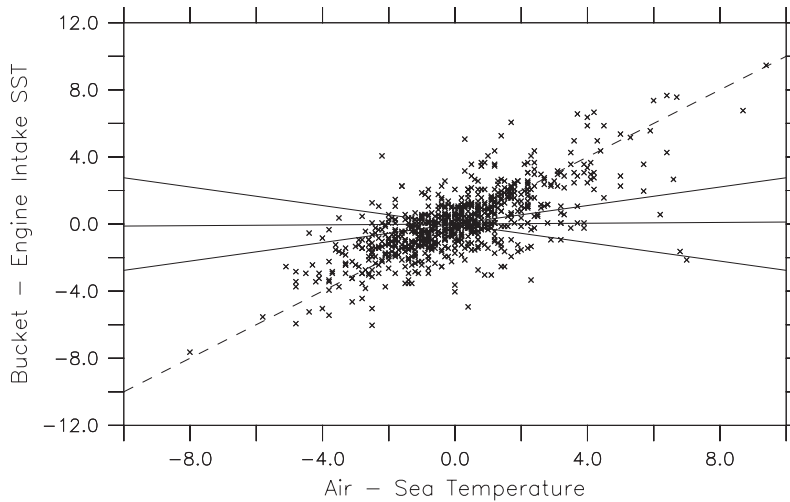
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$$SST_{\text{bucket}} - SST_{\text{eri}} = \alpha (T_{\text{air}} - SST_{\text{eri}}) + \beta$$

... example for July data



- the regression is poorly defined in the transformed variable space resulting in large uncertainty in determining  $\alpha$  and  $\beta$ .



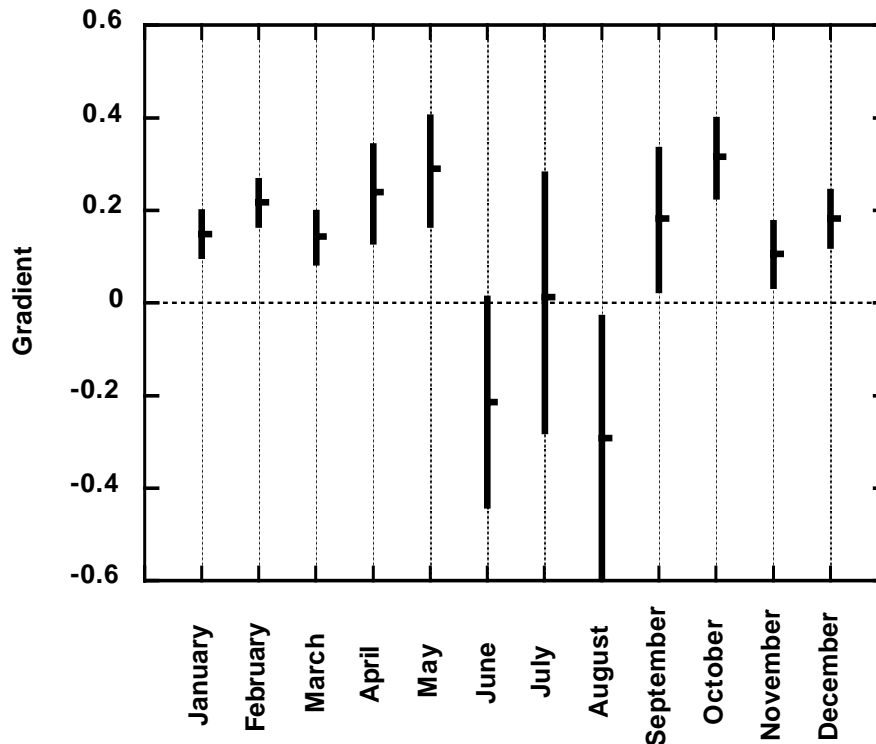
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$$SST_{\text{bucket}} - SST_{\text{eri}} = \alpha (T_{\text{air}} - SST_{\text{eri}}) + \beta$$

...monthly values for  $\alpha$  ....



- except in the summer months (when the relationship was poorly defined)  $\alpha \approx 0.2 \pm 0.1$
- typically the bias,  $\beta$ , was not significantly different from zero
- the typical North Atlantic air - sea temperature difference is about  $-1.5^{\circ}\text{C}$  suggesting an average cold bias in the bucket reports of  $0.3^{\circ}\text{C}$



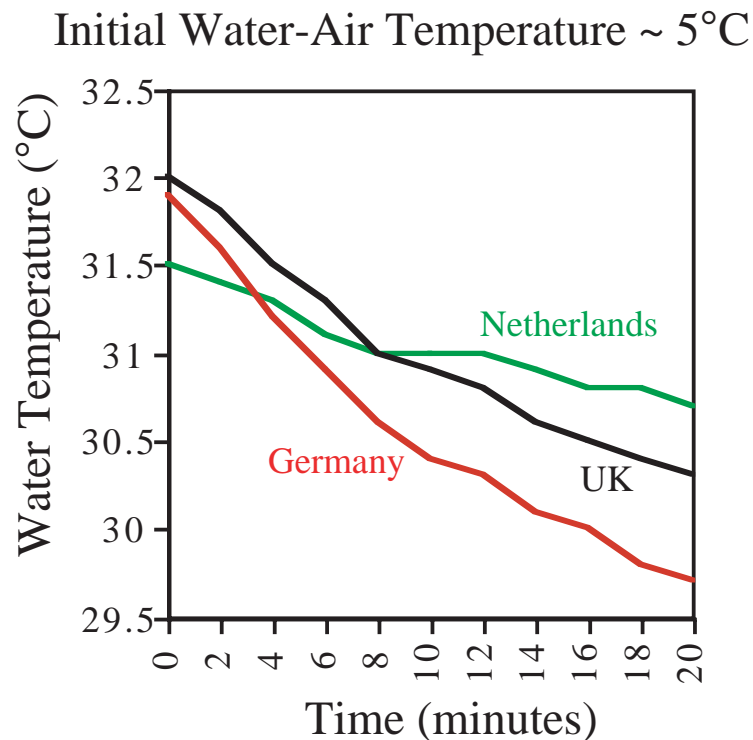
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## Bucket SST Measurement

- We looked at heat loss in still air from typical SST buckets (from the UK, Germany and the Netherlands).



- The cooling rate is different for the different buckets.
- BUT: Remember that the SSTs from buckets are more reliable than those from engine intakes.



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## Summary of SST results

- random errors:  
for bucket SST data less than those for ERI SST data.
- bucket SST data may have a cold bias when the air is significantly colder than the sea.
- contrary to previous studies, ERI data does not appear to have a significant warm bias - this needs to be confirmed.
- reliable determination of random and systematic errors in ship's meteorological data requires careful analysis
- so far we have excluded daytime measurements and those taken at low and at very high wind speeds. We would like to extend the analysis to look at this data.



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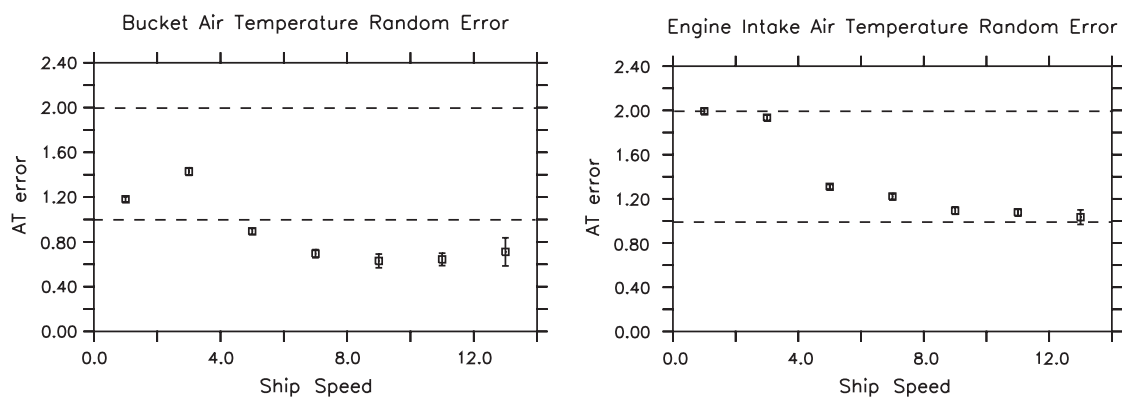
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## Nighttime VOS Air Temperature Measurement

- Ships that use **engine intake thermometers** to measure the **SST** are more likely to report poor quality air temperature measurements than those which use a **bucket** to measure the **SST**.



- The quality of air temperature measurements improves as the ship moves faster.
- The dependence of air temperature report quality on SST measurement method is much stronger than any dependence on the method of air temperature measurement.

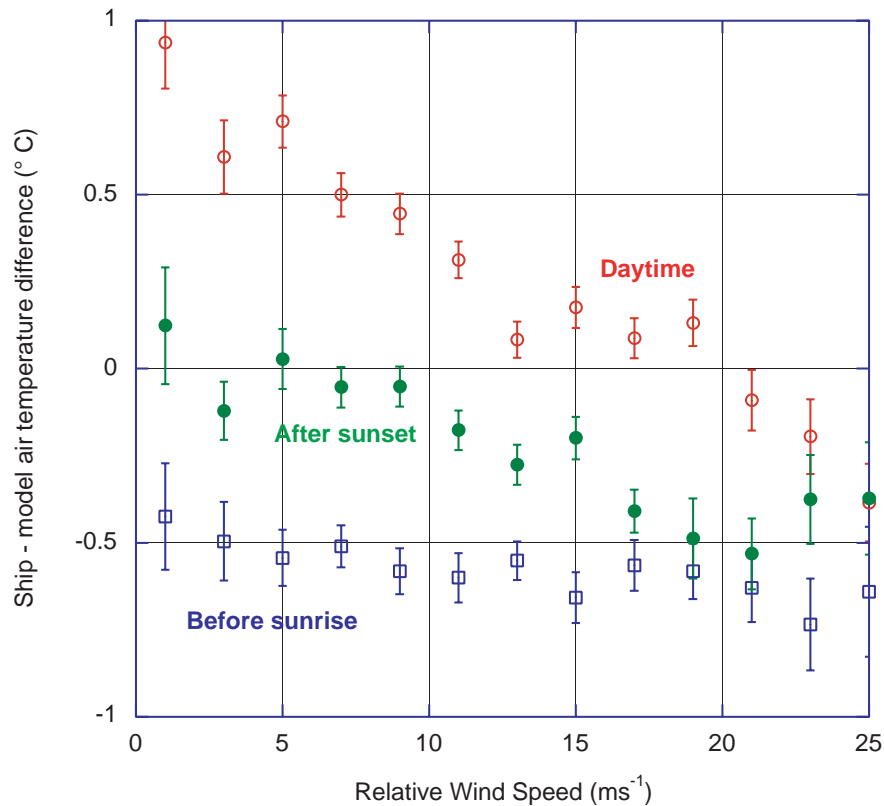


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# Air temperature differences depend on sensor ventilation

- Data from the VSOP-NA (VOS Special Observing Project - North Atlantic).
- Analysis method used differences between ship observations and co-located model output from the UK Met. Office Fine Mesh Model.

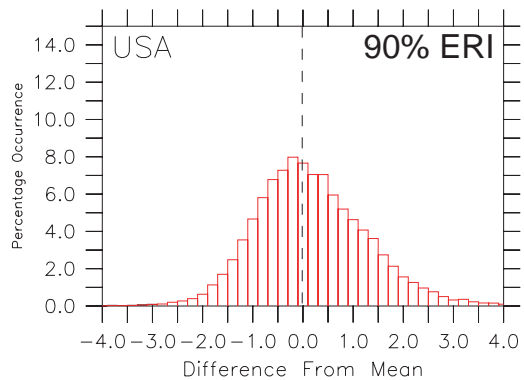
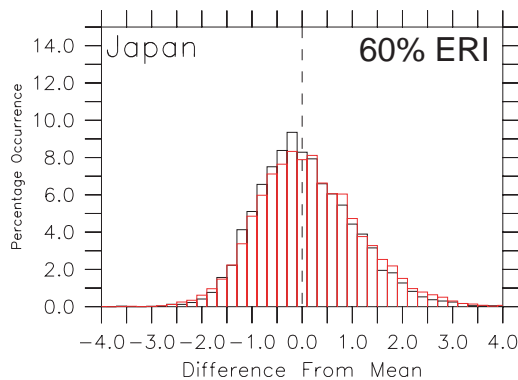
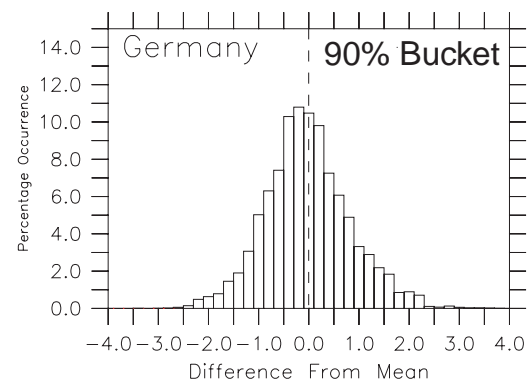
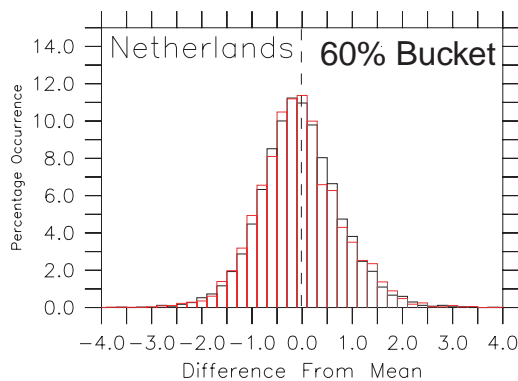


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## Air temperature differences depend on recruiting country

- histograms of normalised nighttime July air temperature difference from the mean for the surrounding 10° area for ships reporting bucket SST (black) and ERI SST (red):



- histograms for Japan & USA ships are less peaked (data more scattered) and skewed warm.



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## **Daytime VOS Air Temperature Measurement**

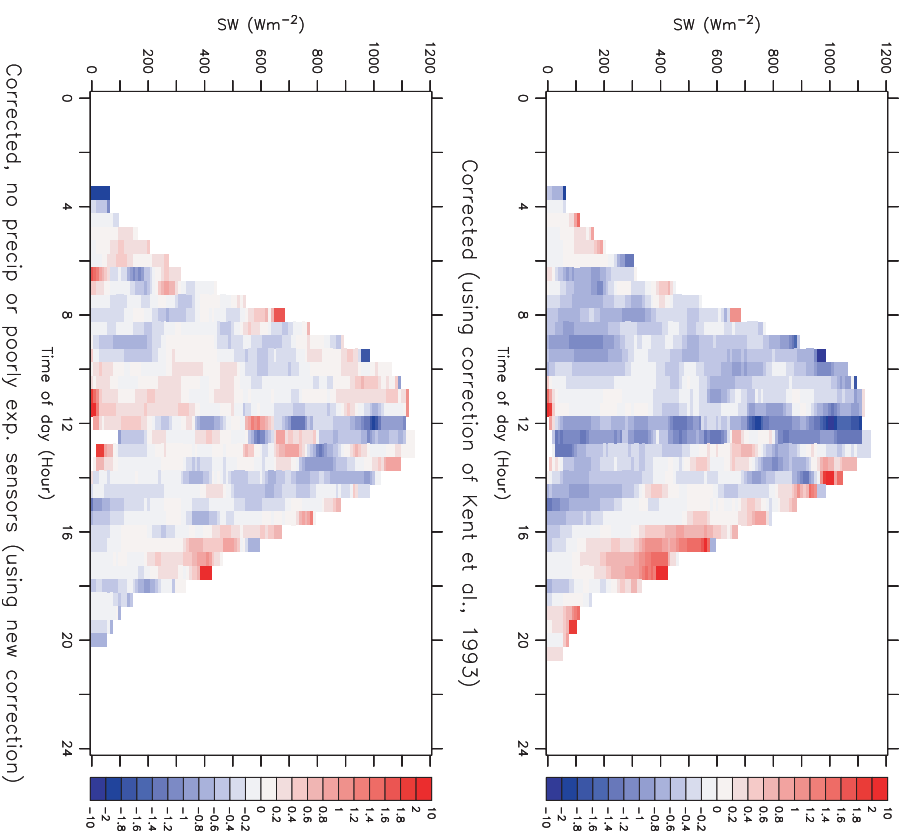
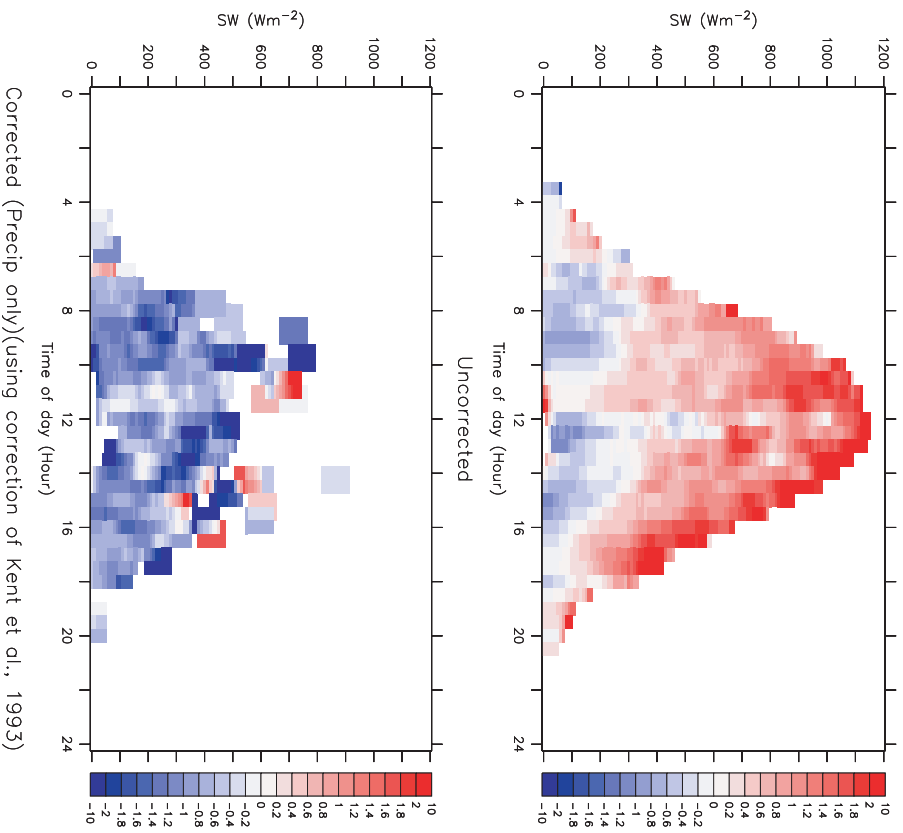
- Data from the VSOP-NA are being reanalysed to look more closely at how solar radiation affects the air temperature measurement.
- Initially a correction was suggested that depended on the incoming solar radiation and the relative wind speed over the ship.
- This correction can be improved by also allowing for the "heat-island" effect of the ship.



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## Summary of Air Temperature Results

- The accuracy of air temperature measurement depends more on the country that recruited the ship than on the method of measurement.
- Ships that use buckets to measure the SST are more likely to report better quality air temperature measurements - better exposure of the temperature sensors?
- Marine air temperatures need to be corrected for the effects of both instantaneous solar radiation and the "heat island" effect.
- Poorly ventilated air temperature sensors are still biased warm after sunset.
- Need to make sure we don't overcorrect when its raining.



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## Conclusions

- The VOS can provide good values for marine meteorological parameters if measurements are taken with care.
- Buckets give much more reliable SSTs than engine intakes, but may be biased when the air-sea temperature difference or surface fluxes are large.
- Poorly exposed air temperature sensors degrade our knowledge of the air temperature over the ocean both during the day and during the night.
- It should be possible to correct the errors in some of the data where we have information about instrumentation.
- We may be able to improve the quality of climatological fields derived from the recent data within COADS by excluding or down-weighting data expected to be of poor quality using information about measurement method, recruiting country or environmental conditions.



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