

# Sea Surface Salinity variability and error maps of satellite observations in the Inter Tropical Convergence Zone

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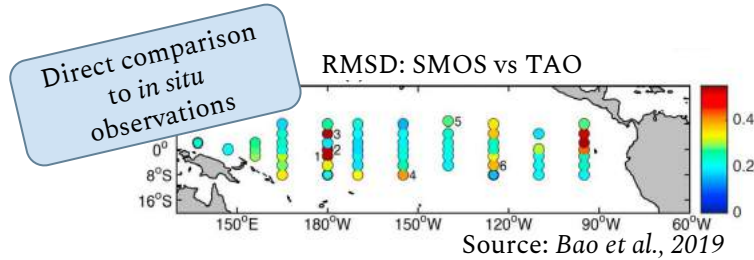
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CMR   IEEC

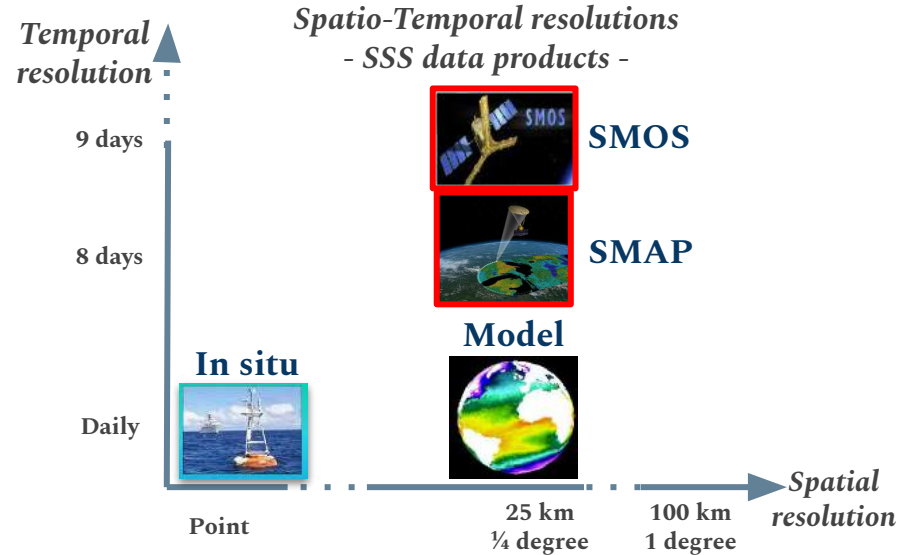


# Motivations - Satellite data validation

The concept of **data validation** refers to the **post-processing methodologies** that **measure** how well the **retrieved information** represents the **geophysical signal** at a given **spatial and temporal scale**.

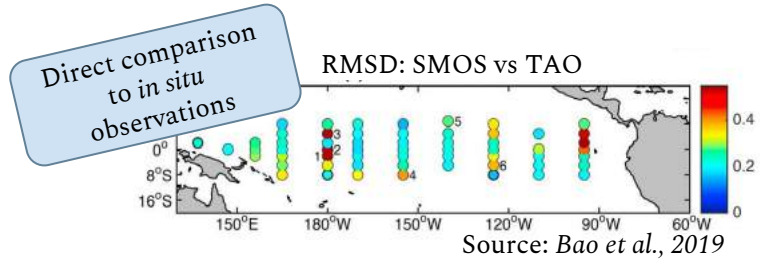


- ◆ Relative error
- ◆ Different spatio- temporal representation

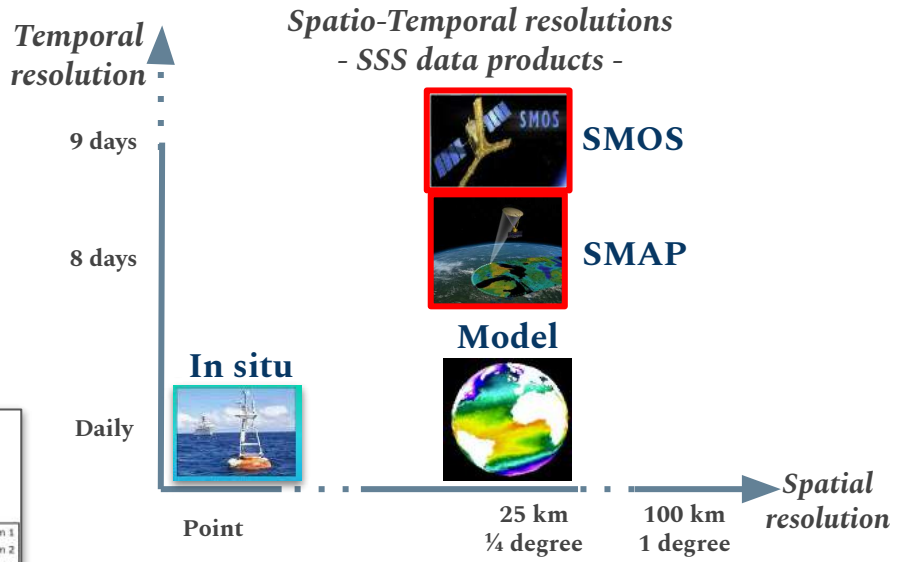
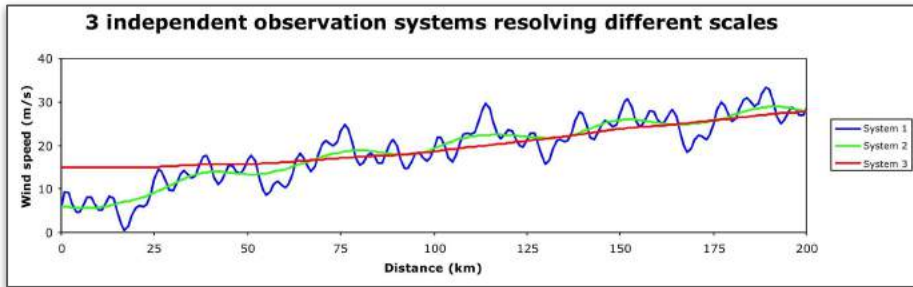


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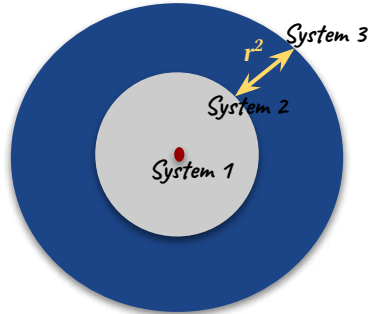


◆ Relative error  
◆ Different spatio- temporal representation



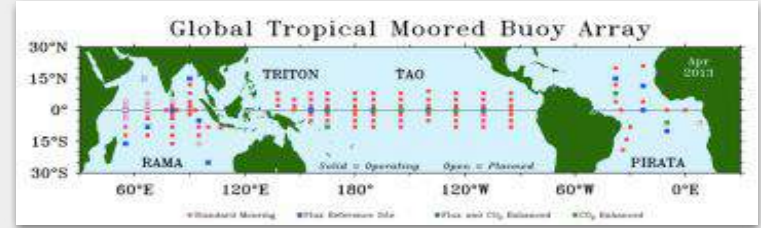
Important to account for spatio-temporal representation

- ❖ In *Hoareau et al., 2018*, error characterization of different SSS data sources at satellite scales was performed over all Tropical buoys using Triple collocation (*Stoffelen, 1998*), taking into account the different spatio-temporal resolution



**Representativeness error ( $r^2$ )** corresponds to the **common true variance** of Systems 1 and 2, not resolved by system 3

$e_p, a_3$  depend on  $r^2$

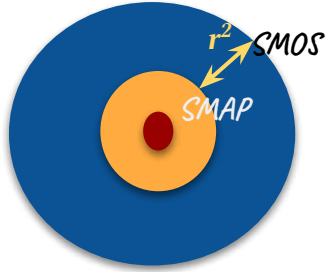


Estimated SD error of the different salinity measurements at the satellite scales

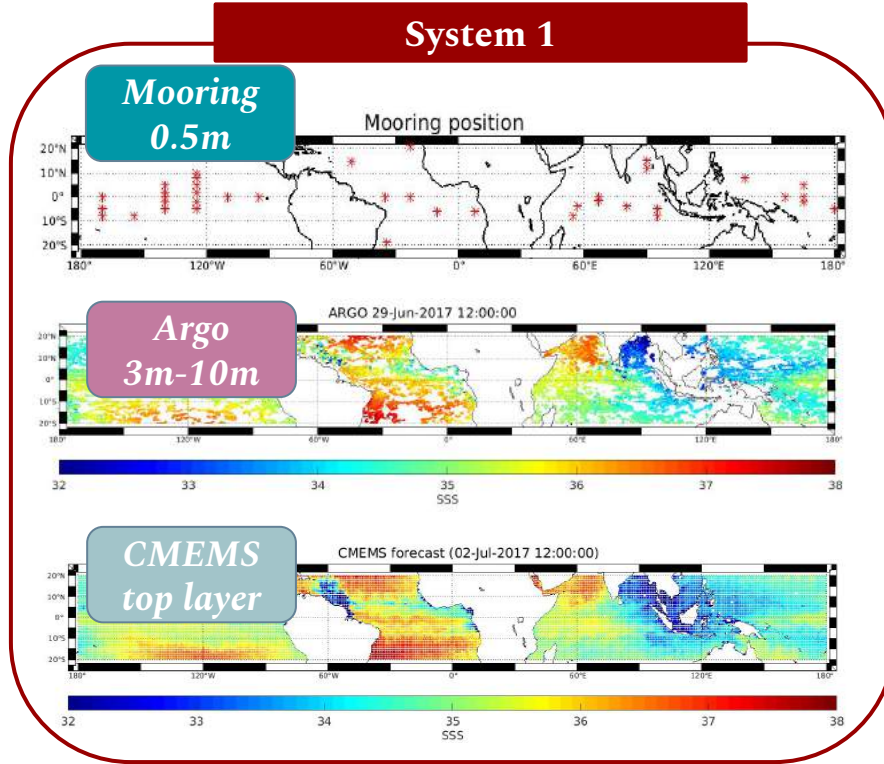
	In Situ	GLORYS	AV4	SMOS
<b>Aquarius scale</b>	0.18	0.18	0.17	0.24
<b>SMOS scale</b>	0.22	0.21	0.21	0.20

The aim of this study is to **use model gridded data** instead of in situ observations to **create error maps**

# TC Triplets: year 2017 - Inter Tropical Band



Satellite SSS  
1<sup>st</sup> cm



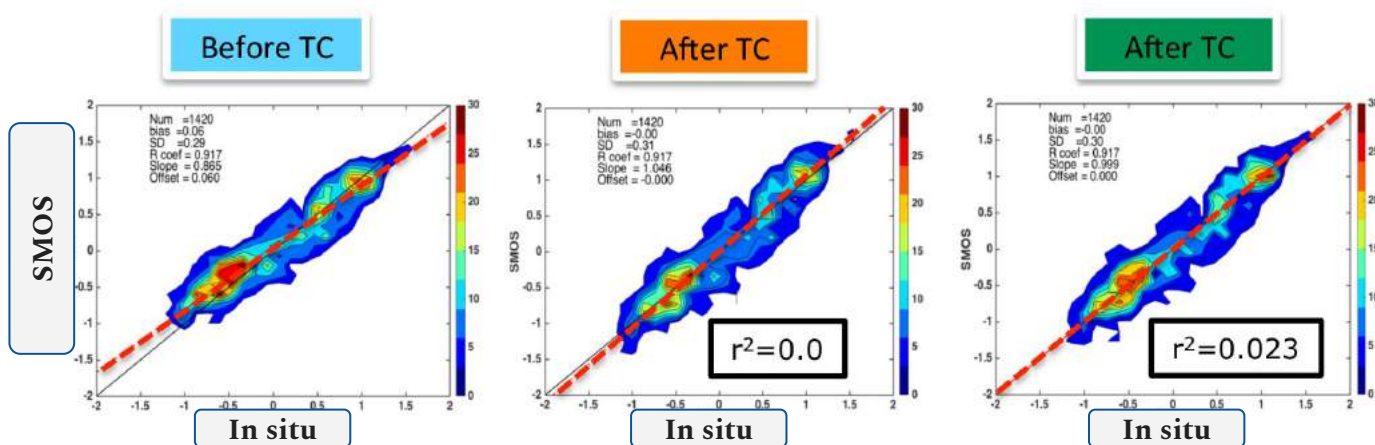
Triplets from different sources imply **different sampling** (horz. & vert.)

# $r^2$ estimation method (Lin et al., 2015)

A **successful TC** provides three data sets well **intercalibrated** (Lin et al., 2015)  
→ TC calibration coefficient  $a_3$ ,  $b_3$ , are related to the value of  $r^2$

An effective way of estimating  $r^2$  is to repeat the TC analysis for different  $r^2$  values until an **optimal intercalibration** of the different data sources is reached.

Check the data scatterplots after each intercalibration



Wrong  $r^2$   
→ Not well  
inter-calibrated

Correct  $r^2$   
→ Well  
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# $r^2$ estimation for the different triplets of SSS data

## Acronyms:

M - Mooring

A - ARGO

C - CMEMS

Cm - CMEMS at mooring positions

Ca - CMEMS at argo positions

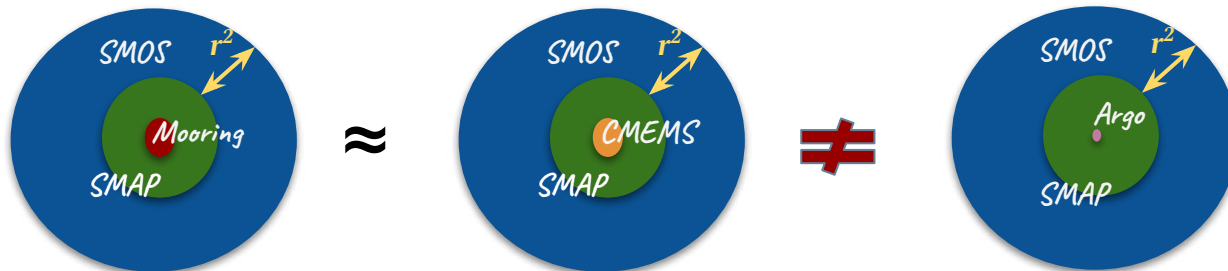
Sp - SMAP RSS v4

Ss - SMOS BEC v2

$r^2$  should not depend on the highest resolution system  
(*In Situ* or CMEMS)

Representativeness Error ( $r^2$ ) for the different triplets of SSS data

	<i>M</i> SpSs	<i>Cm</i> SpSs	<i>C</i> SpSs	<i>Ca</i> SpSs	<i>A</i> SpSs
$r^2$	0.015	0.015	0.014	0.018	0.025



**Argo** measures a **much more different** salinity than that of **Satellite** (3m-10m vs 1cm depth)  
=> **Mooring** salinity **more representative** to **satellite** measurement than **Argo** floats

# $r^2$ estimation for the different triplets of SSS data

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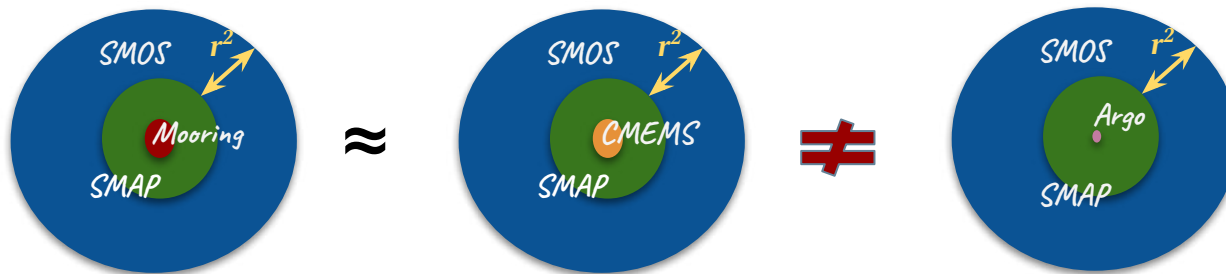
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$r^2$	0.015	0.015	0.014	0.018	0.025



As  $r^2$  is positive, the **effective spatial-temporal resolution of SMAP RSS v4 data is finer than SMOS BEC v2 data.**



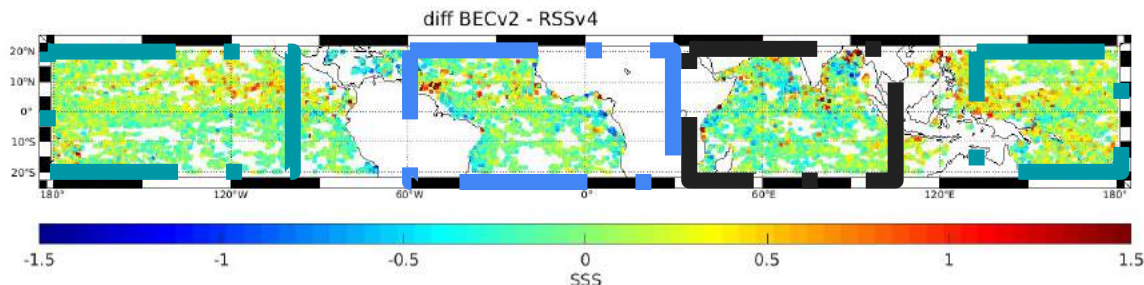
# $r^2$ estimation - Depending on the region/season

## Acronyms:

M - mooring  
C - CMEMS  
Cm - CMEMS at mooring positions  
Sp - SMAP RSS v4  
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Spatio-temporal SSS variability differs depending on the region and/or the season

$r^2$  represents the SSS variability at scales resolved by SMAP but not SMOS



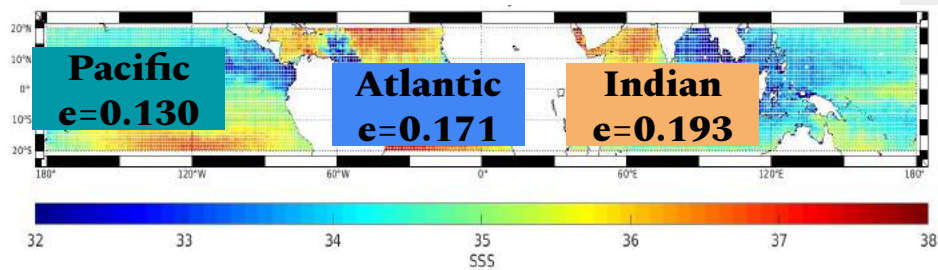
$r^2$  similar!  
=> CMEMS can be used in TC

Monsoon:  
Indian ocean  
+  
Jun-Sep

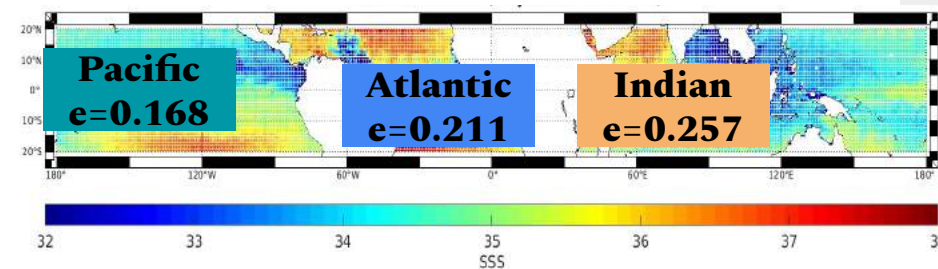
Representativeness Error ( $r^2$ ) for the different triplets of SSS data.

	<i>InterTrop band</i>	<i>Pacific</i>	<i>Atlantic</i>	<i>Indian</i>	<i>May-Oct</i>	<i>Nov-Apr</i>	<i>Monsoon</i>
<i>M</i> SpSs	0.015	0.009	0.020	0.022	0.014	0.014	0.018
<i>Cm</i> SpSs	0.015	0.009	0.020	0.021	0.014	0.016	0.022
<i>C</i> SpSs	0.014	0.009	0.008	0.028	0.011	0.016	0.025

## SMAP RSS v4 error



## SMOS BEC v2 error



- SMOS and SMAP errors are larger in the Indian than Atlantic or Pacific intra-tropical band.
- In general SMOS BEC v2 error is larger than SMAP RSS v4.
- The **effective resolution of RSS v4 data is finer than BEC v2**
- **Error estimation depends on the SSS variability of the region & the season**
- **CMEMS can be used to create error maps**
- Error maps should **help in data assimilation**

*On going work:*

- Extend this methodology to produce gridded error maps
- Include **gridded error maps** in the satellite SSS products at BEC

**MORE MATERIAL**

# Triple Collocation - Representativeness error, $r^2$

## Triple Collocation (Stoffelen, 1998)

Triple collocation (TC) was conceived as a tool for the simultaneous **intercalibration** of **three independent collocated** data sources, while providing an **estimate** of their **accuracy** with respect to **the truth at a given scale**. The 3 measurement systems have **different spatial resolution** (buoy, model, satellite),  $s_i, i=1,2,3$

Scaling calibration coef.

Bias calibration coef.

$$s_i = a_i S + b_i + e_i$$

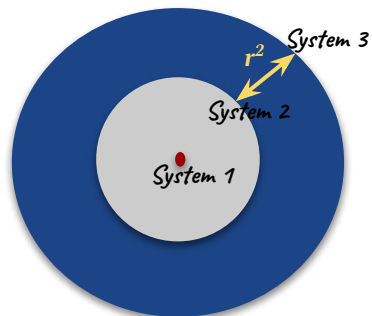
Truth at the scales commonly resolved by all 3 data sources

random error measurement

## Representativeness error (Stoffelen, 1998)

$$r^2 = \langle e_1 e_2 \rangle$$

$a_i, e_i$  depend on  $r^2$



**Representativeness error** ( $r^2$ ) corresponds to the **common true variance** of Systems 1 and 2, not resolved by system 3

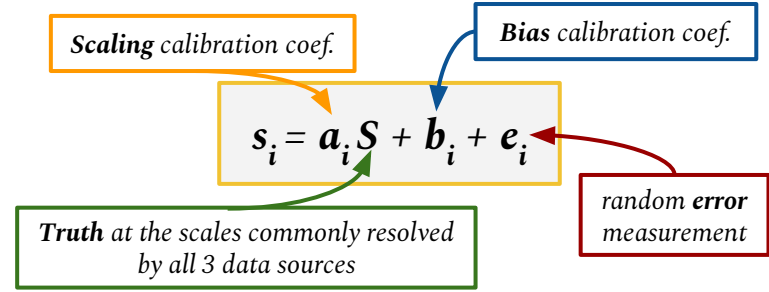
$$\langle e_1 e_3 \rangle = \langle e_2 e_3 \rangle = 0$$

TC calibration coefficient  $a_3, b_3$ , are related to the value of  $r^2$   
→ A successful TC provides three data sets well **intercalibrated**  
(Lin et al., 2015)

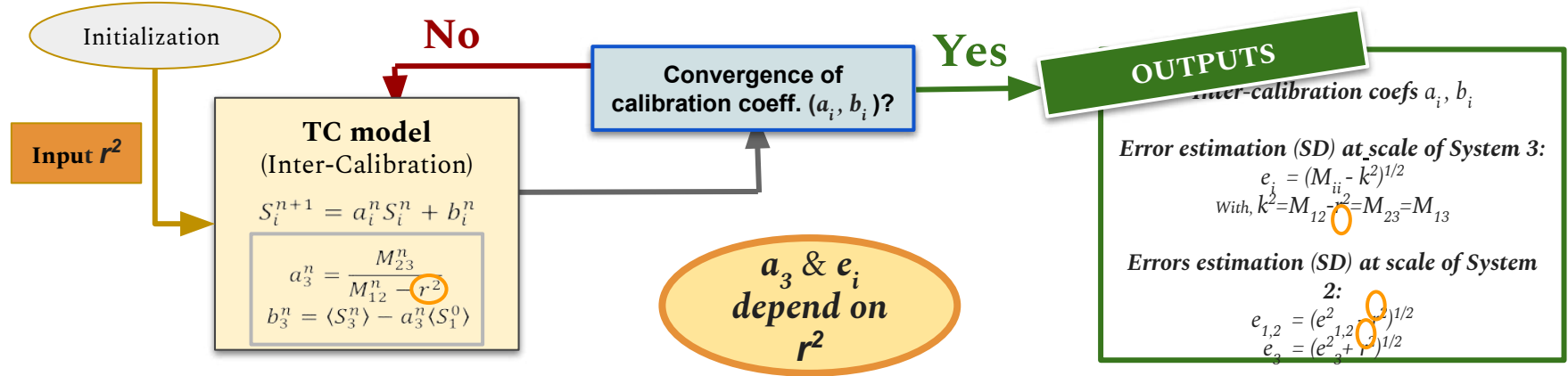
# TC algorithm - Representativeness error, $r^2$ (Stoffelen, 1998)

Given 3 measurement systems with different spatial resolution (buoy, model, satellite),  $s_i$ ,  $i=1,2,3$

The measurement, including its individual error, is modelled by the following linear equation



The system of equations is solved in an iterative way



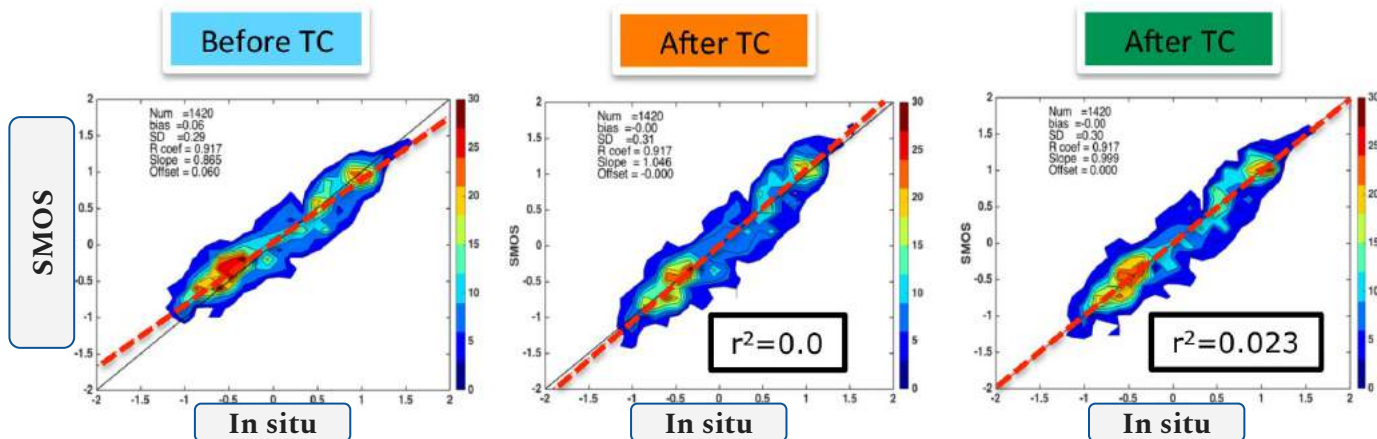
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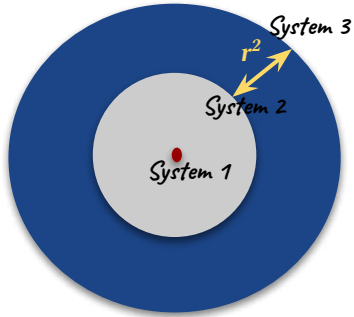
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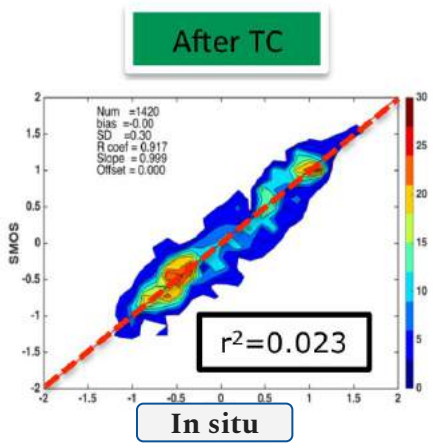
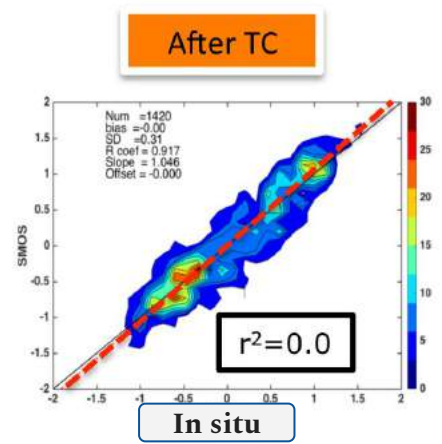
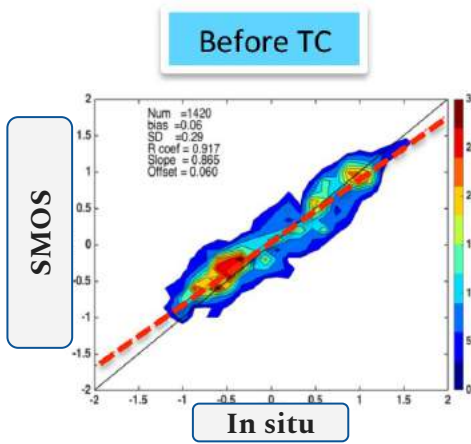


$$r^2 = \langle e_1 e_2 \rangle$$

part of the measurement errors  $e_1$  and  $e_2$   
is the **correlated** part of the errors of  $s_1$  and  $s_2$

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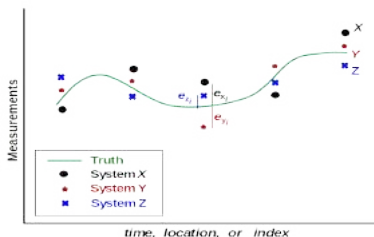
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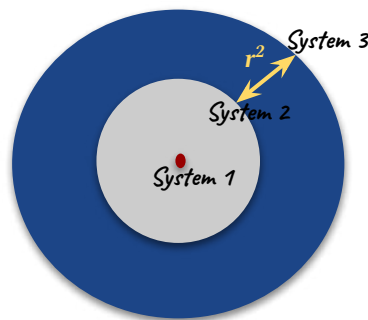
Triple Collocation (Stoffelen, 1998)

Truth at the scales commonly resolved by all 3 data sources



- ★ Estimate the **absolute error** taking into account the **different spatio-temporal representations**

Representativeness error,  $r^2$



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