



**PVCAMPER**

Photo**V**oltaic Collaborative to **A**dvance  
Multi-climate **P**erformance **E**nergy **R**esearch

# Comparative Analysis of Module Temperature Measurements and Estimation Methods for Various Climate Zones Across the Globe

*PRESENTED BY*

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## Introduction

- PhotoVoltaic Collaborative to Advance Multi-climate Performance Energy Research (PV CAMPER) [1]
- Network of 12 members with 15 test sites in the major climate zones world-wide formed in 2018

### Organizational Objectives:

1. Create a global **research platform** with common infrastructure to address persistent PV performance challenges.
  2. Improve the **accuracy** of irradiance and other sensor measurements needed for yield comparison and simulations.
  3. Identify local environmental contributors to **long-term reliability**.
- Research Projects
    - Pyranometer Study
    - Albedo Study
    - Soiling Study
    - Over-Irradiance Study
    - Module Temperature Study

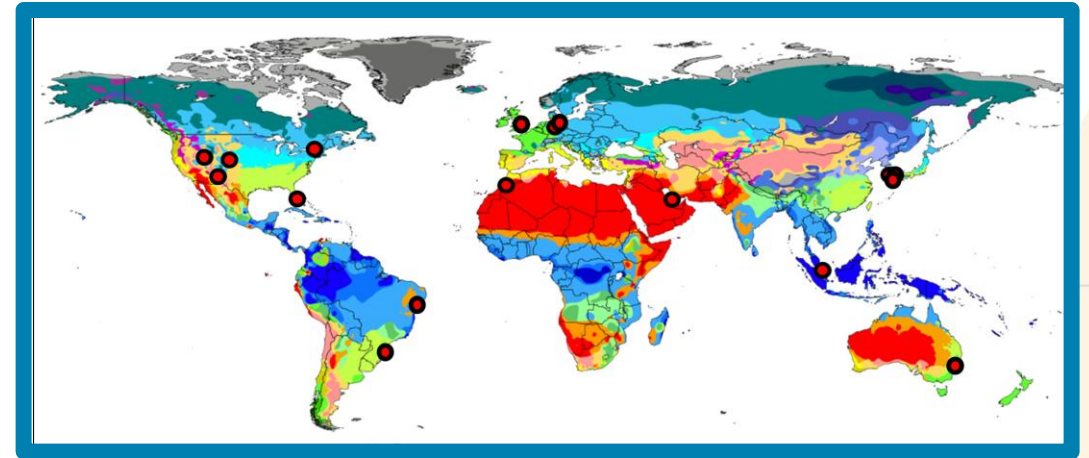


Fig. 1. Test locations of the members of PV CAMPER are represented by circles. Map adapted from [2].



[1] Laurie Burnham et al. “Photovoltaic Collaborative to Advance Multi-Climate Performance and Energy Research (PV CAMPER)”, 36<sup>th</sup> EU PVSEC, Marseille, 2019

[2] C. M. Peel, B. L. Finlayson, and T. A. McMahon, “Updated world map of the Köppen-Geiger climate classification,” Hydrol. Earth Syst. Sci., vol. 11, pp. 1633-1644, 2007.

# Test Sites

Tab. 1. Description of the test sites.

Member Institution	Test Site	Location	Latitude	Longitude	Global POA Irradiance	Back-of-module Temperature	Sensor Fixation
Anhalt University	GER BBG	Bernburg, Germany	51.77° N	11.77° E	SMP10-V	PT1000	Double Tape
CREST	UK LBOR	Loughborough, United Kingdom	52.76° N	1.24° W	CMP11	PT100	Cocooned with gas-flue silicone adhesive sealant
Sandia National Labs	USA SNLA	Albuquerque, United States	35.05° N	106.54° W	SMP11	Omega Type T	Tape
	USA IBMW	Williston, United States	44.27° N	73.68° W			
	USA FSEC	Cocoa, United States	28.41° N	80.77° W			
	USA LVRM	Henderson, United States	36.01° N	114.55° W			
SERIS	SG SG	Singapore, Singapore	1.28° N	103.87° E	SMP11	PT1000	Double-sided adhesive tape
UFSC	BRA BTS	Brotas de Macaúbas, Brazil	12.31° S	42.34° W	CMP11	PT1000	Double-sided adhesive tape
YU	KOR GGN	Gyeongsan, South Korea	35.82° N	128.76° E	CMP10	Omega Type T	Tape



Fig. 2. Solar measurement equipment at two of the test sites: BRA-BTS (top) and GER-BBG (bottom).

## Data Analysis

### Study goals:

- Comparison between estimated and measured module temperature for different climatic zones and for different PV technologies;
- Comparison between different temperature sensors, measurement techniques, and sensor fixation methods.

#### Ross's model [1]

$$T_{Ross} = T_{amb} + kG$$

#### Faiman's model [2]

$$T_{Faiman} = T_{amb} + \frac{\alpha G (1 - \eta_m)}{U_0 + U_1 WS}$$

### Comparison metrics:

- Mean Absolute Error (MAE)
- Root Mean Square Error (RMSE)
- Normalized Root Mean Square Error (nRMSE)
- R-squared ( $R^2$ )

[1] R. G. Ross, "Interface Design Considerations for Terrestrial Solar Cell Modules," in *Proceedings of the 12th IEEE Photovoltaic Specialists Conference*, 1976, pp. 801-806.

[2] D. Faiman, "Assessing the outdoor operating temperature of photovoltaic modules," *Prog. Photovoltaics Res. Appl.*, vol. 16, no. 4, pp. 307-315, Jun. 2008.

# Results

## MAE values

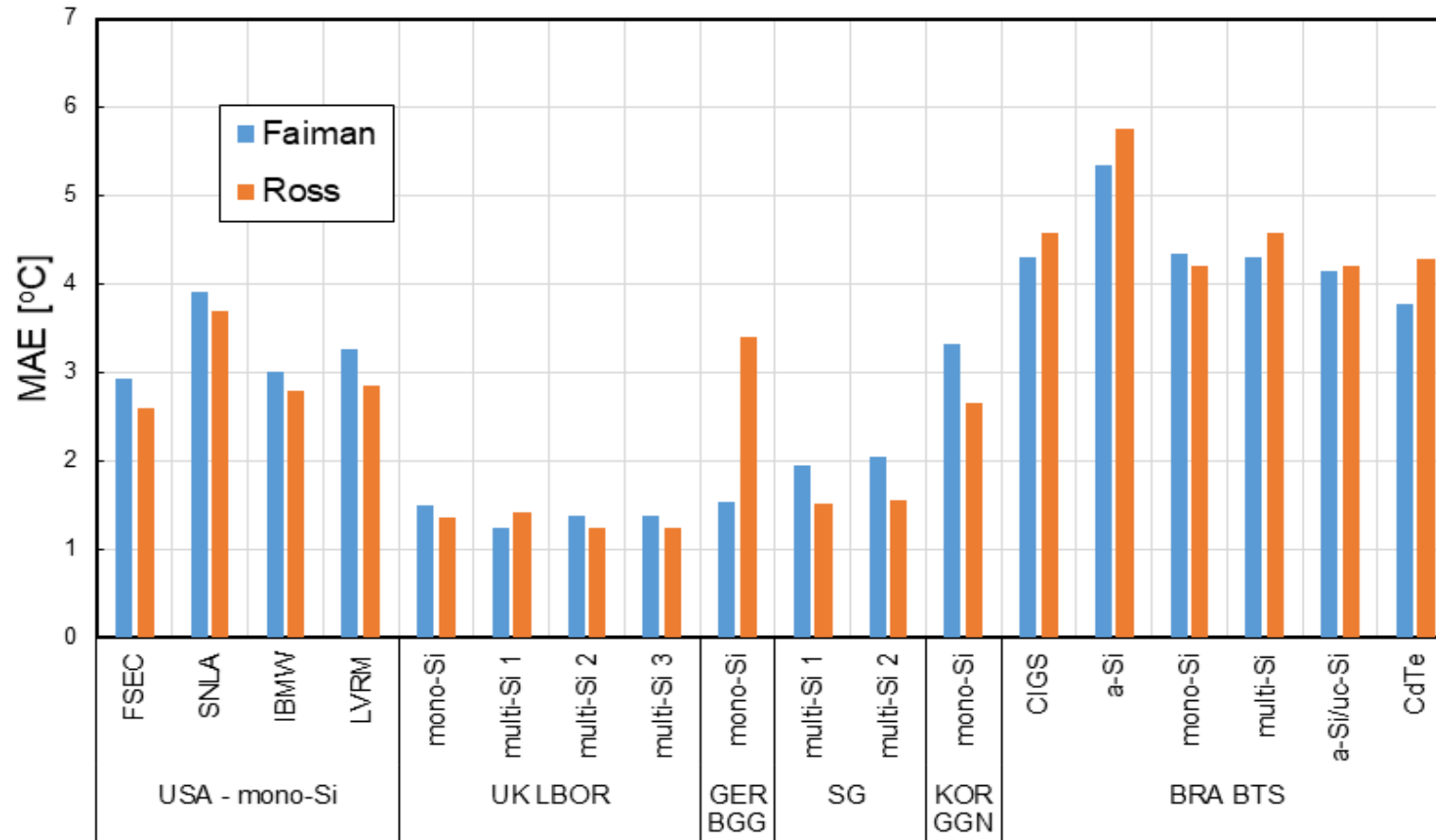


Fig. 3. MAE values for the different sites for the two module temperature models analysed.

# Results

## MAE values

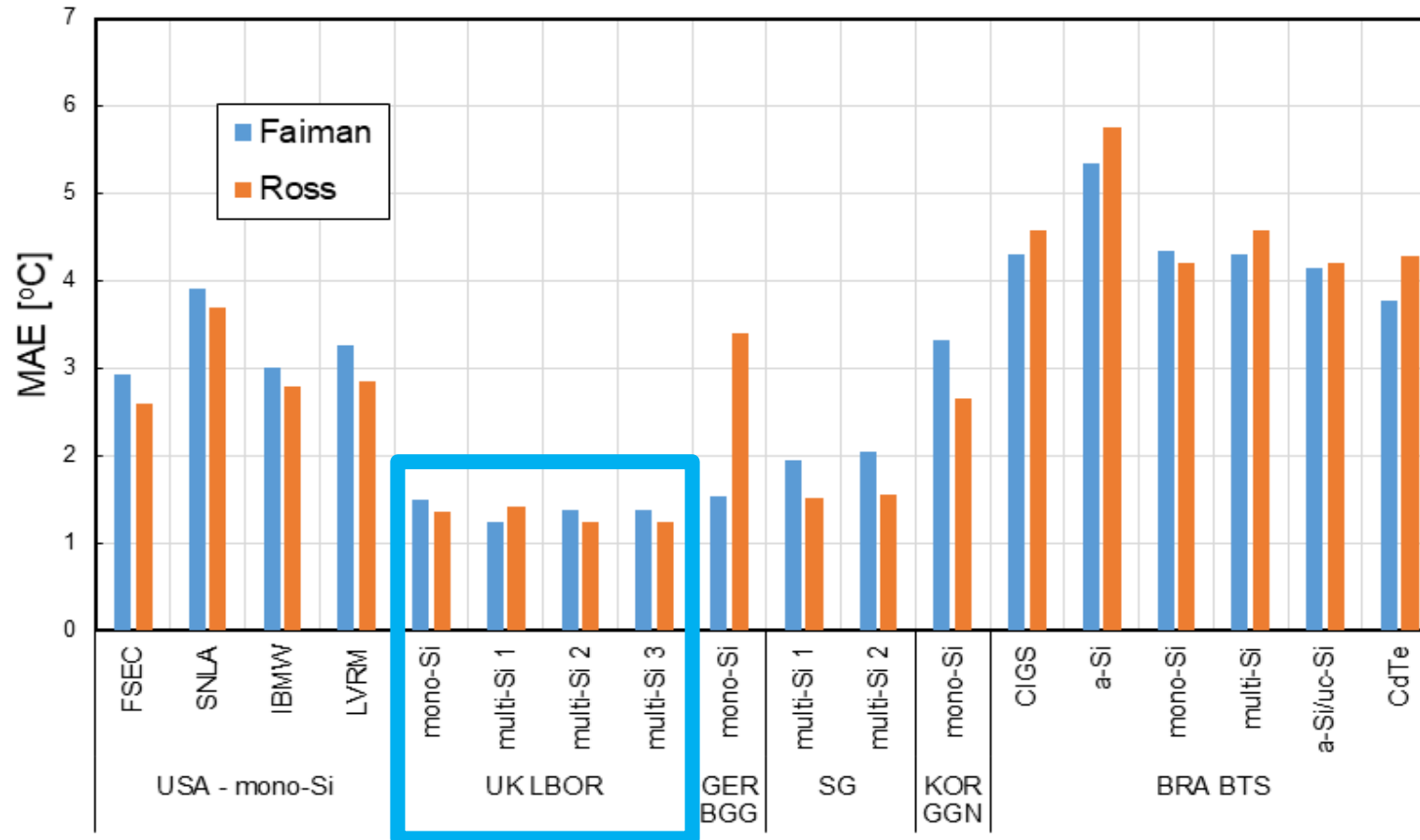


Fig. 3. MAE values for the different sites for the two module temperature models analysed.

# Results UK-LBOR



Fig. 4. Images of the BoM temperature fixation method used at the UK-LBOR test site.

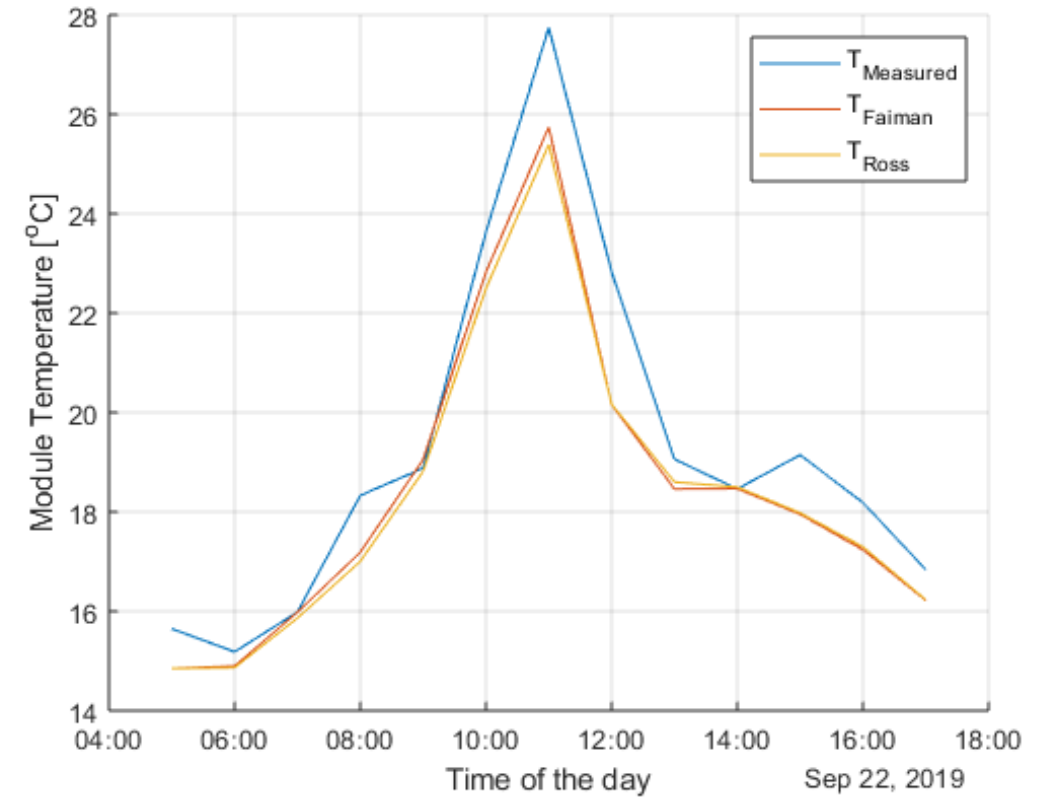


Fig. 5. Measured and modeled module temperatures for September 22<sup>nd</sup>, 2019 for the mono-Si PV module installed at the UK-LBOR test site.

# Results

## MAE values

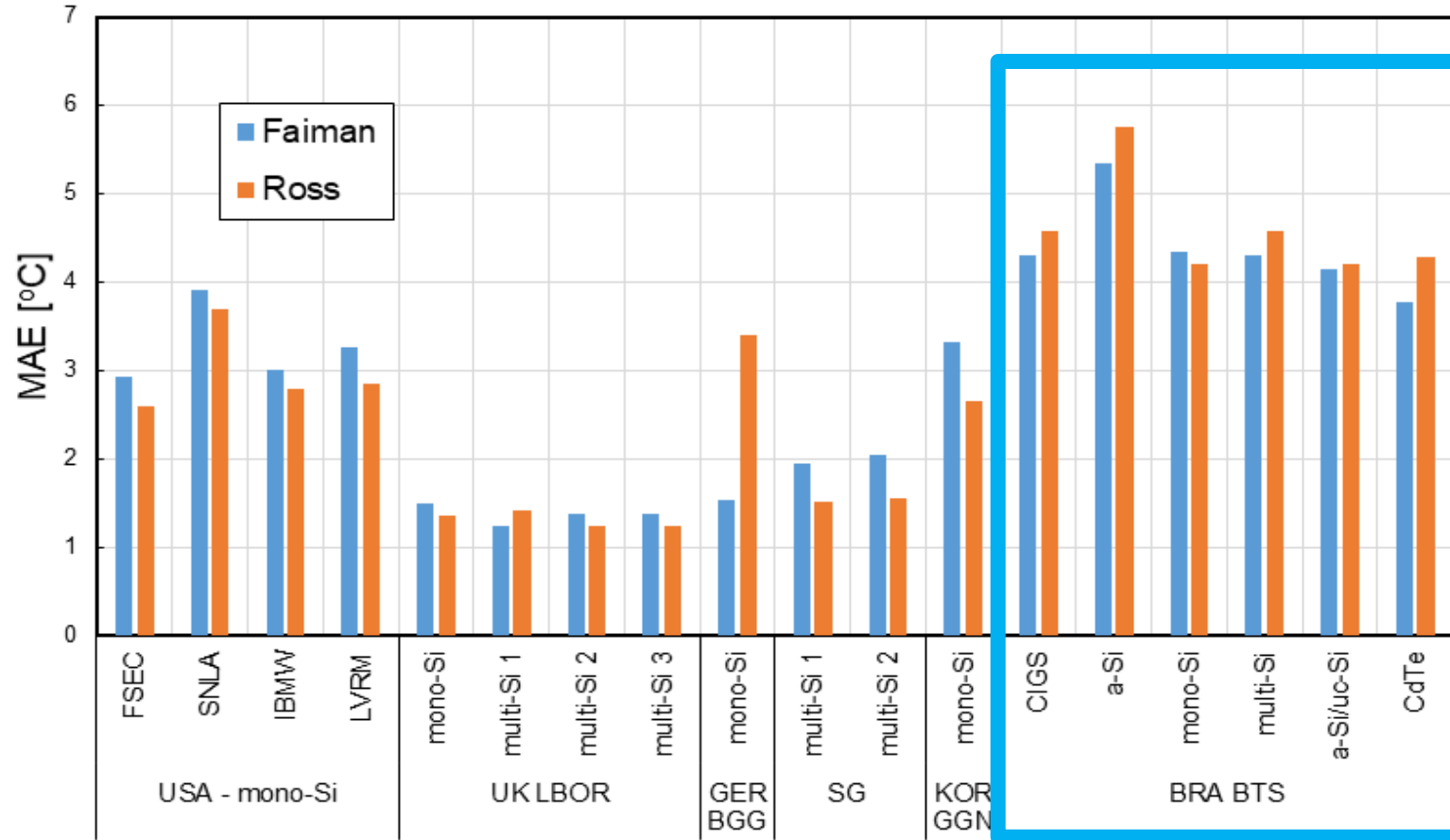


Fig. 3. MAE values for the different sites for the two module temperature models analysed.



# Results BRA-BTS

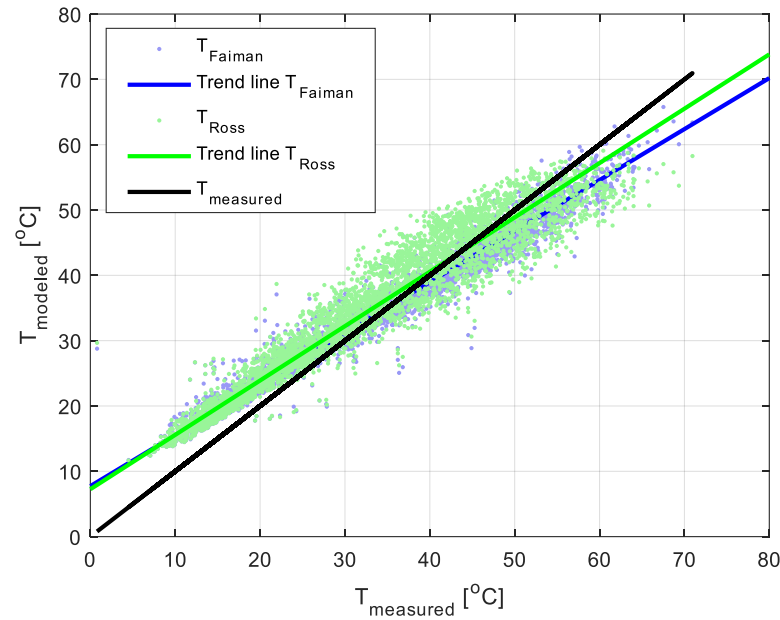


Fig. 7. Correlation between measured and modeled module temperature for the CdTe PV module installed at the BRA-BTS test site.

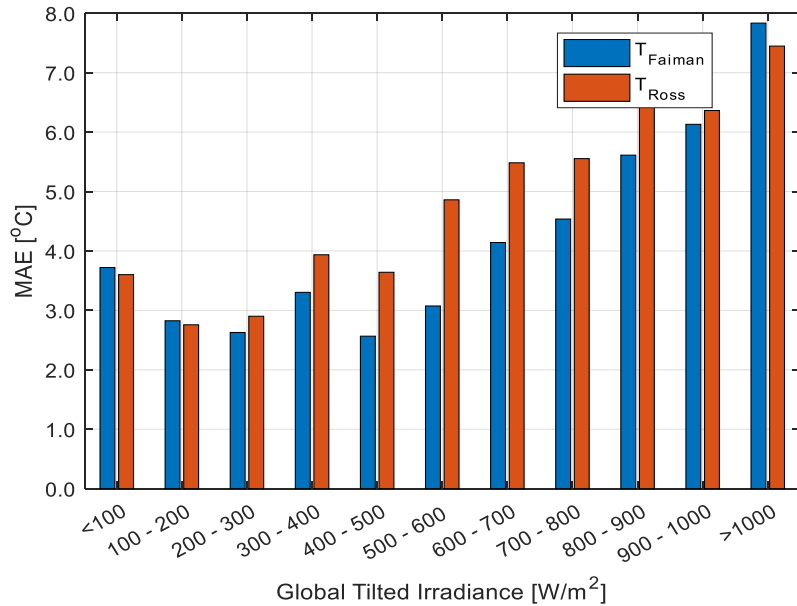


Fig. 6. MAE values for different levels of irradiance at the BRA-BTS site for the CIGS PV module.

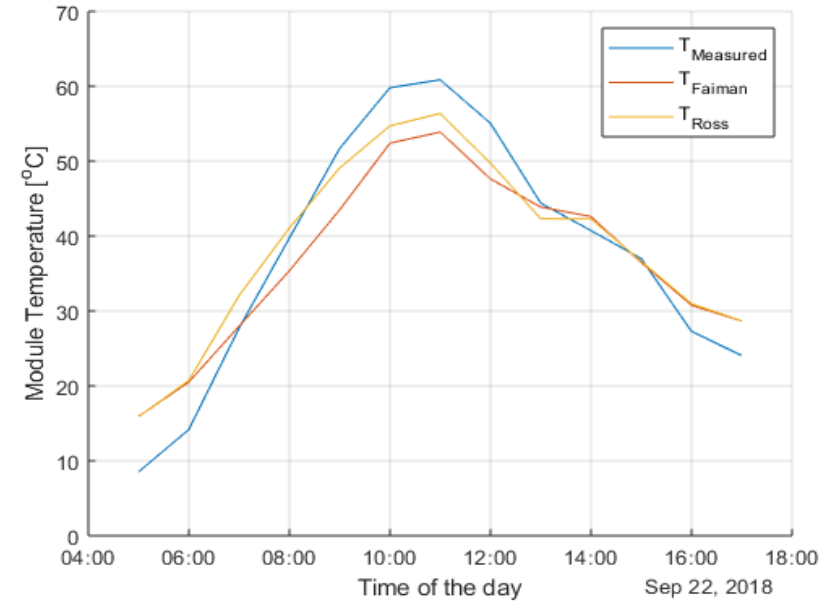


Fig. 8. Measured and modeled module temperatures for September 22<sup>nd</sup>, 2018 for the multi-Si PV module installed at the BRA-BTS test site.

# Results

## MAE values

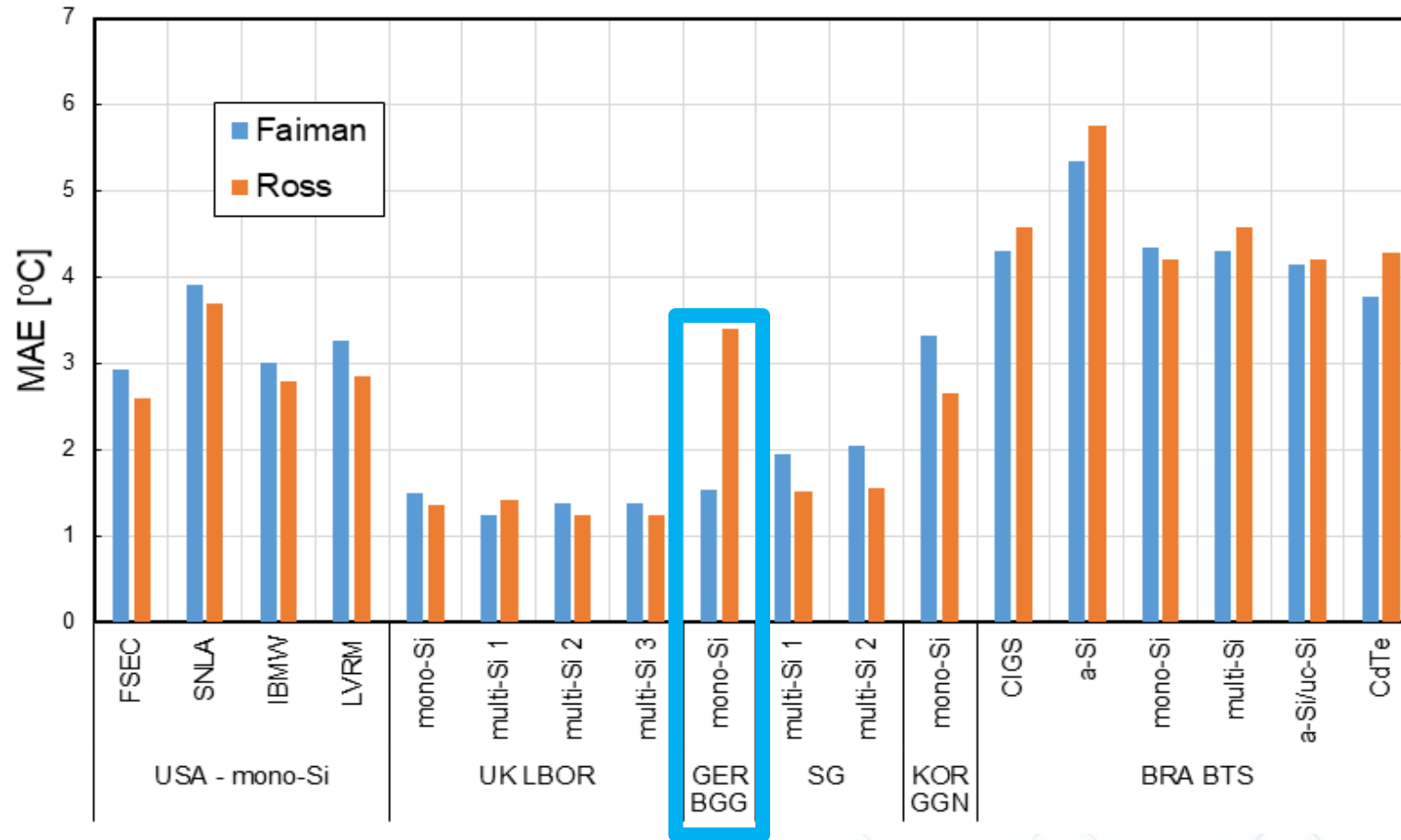


Fig. 3. MAE values for the different sites for the two module temperature models analysed.

# Results

## GER-BBG

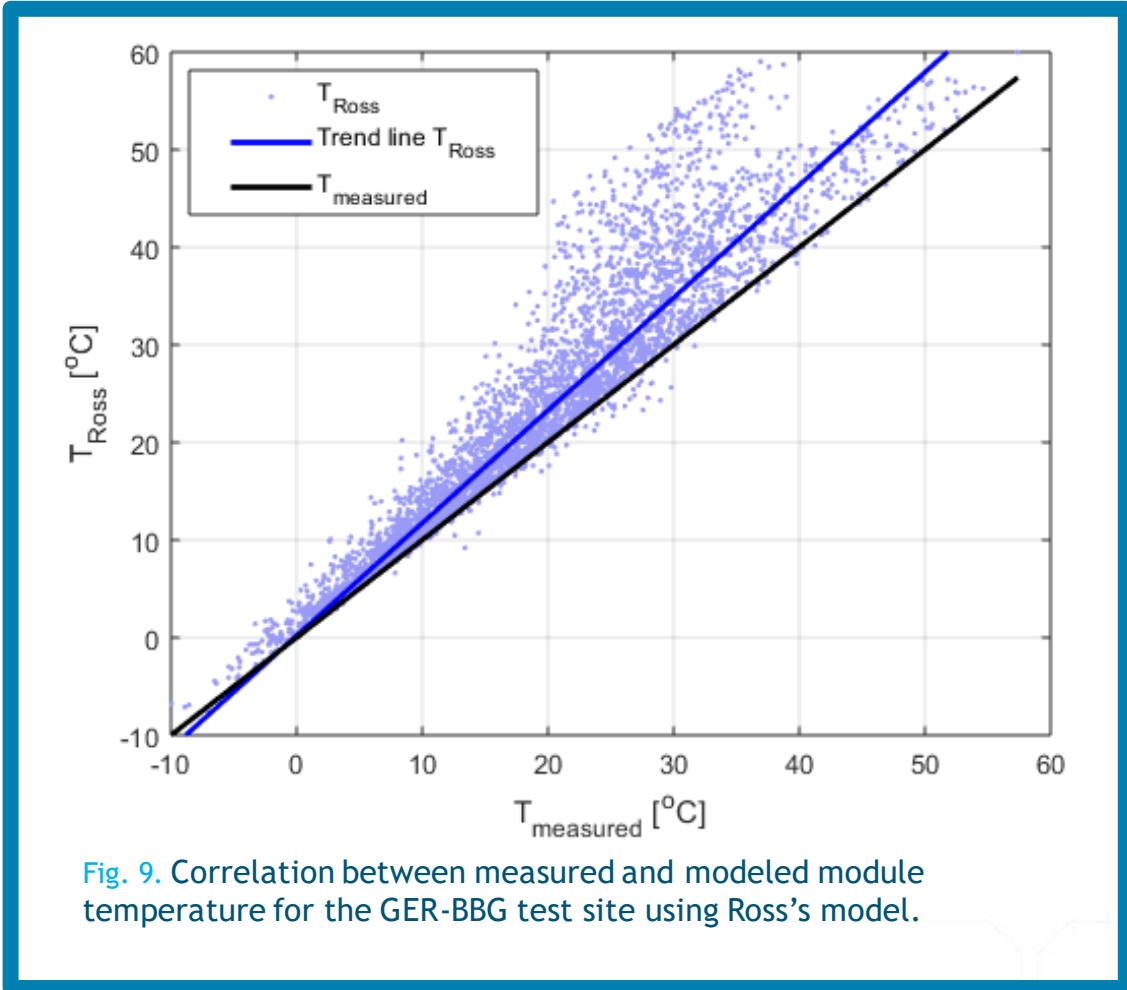


Fig. 9. Correlation between measured and modeled module temperature for the GER-BBG test site using Ross's model.

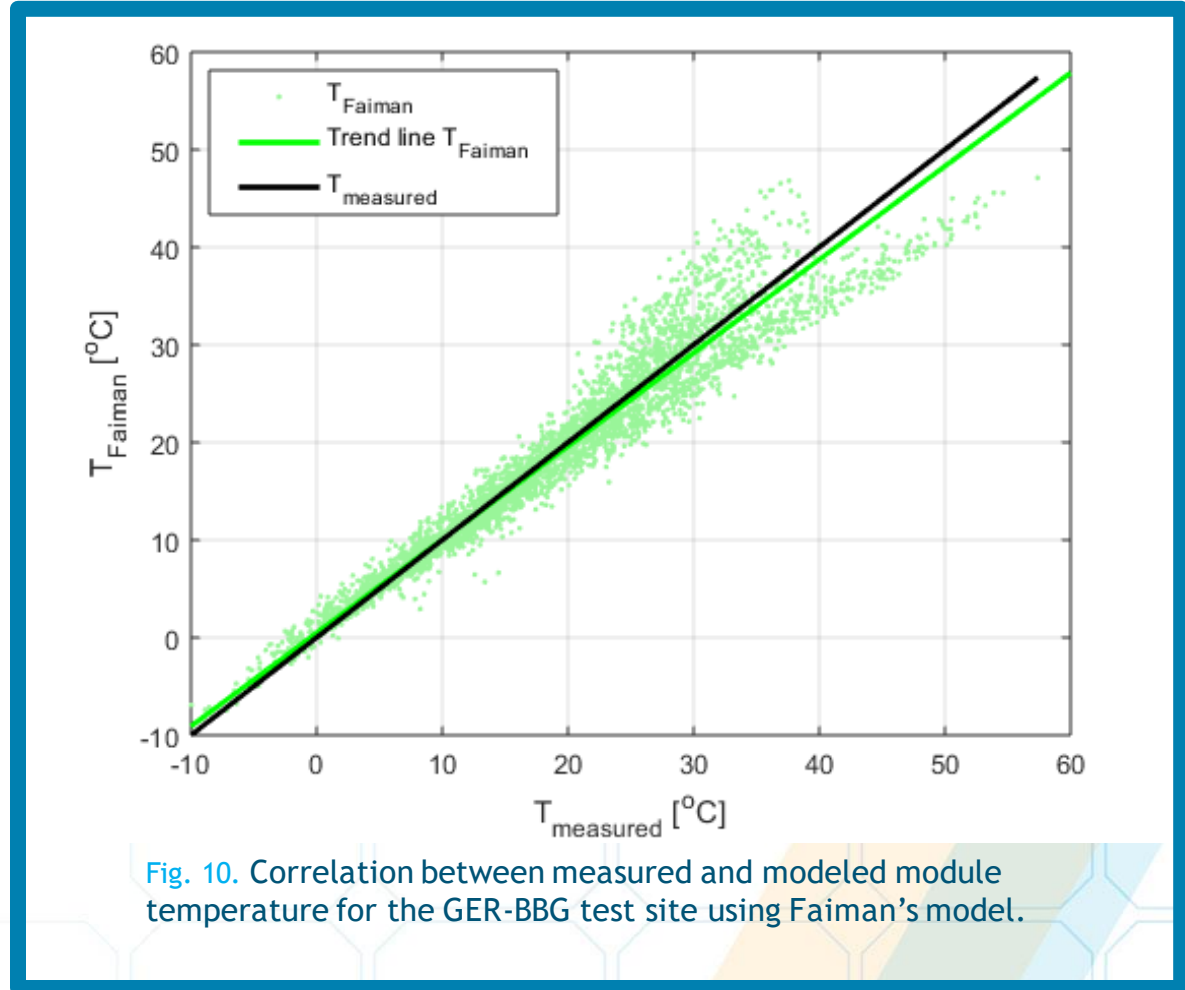


Fig. 10. Correlation between measured and modeled module temperature for the GER-BBG test site using Faiman's model.

# Results

## MAE values

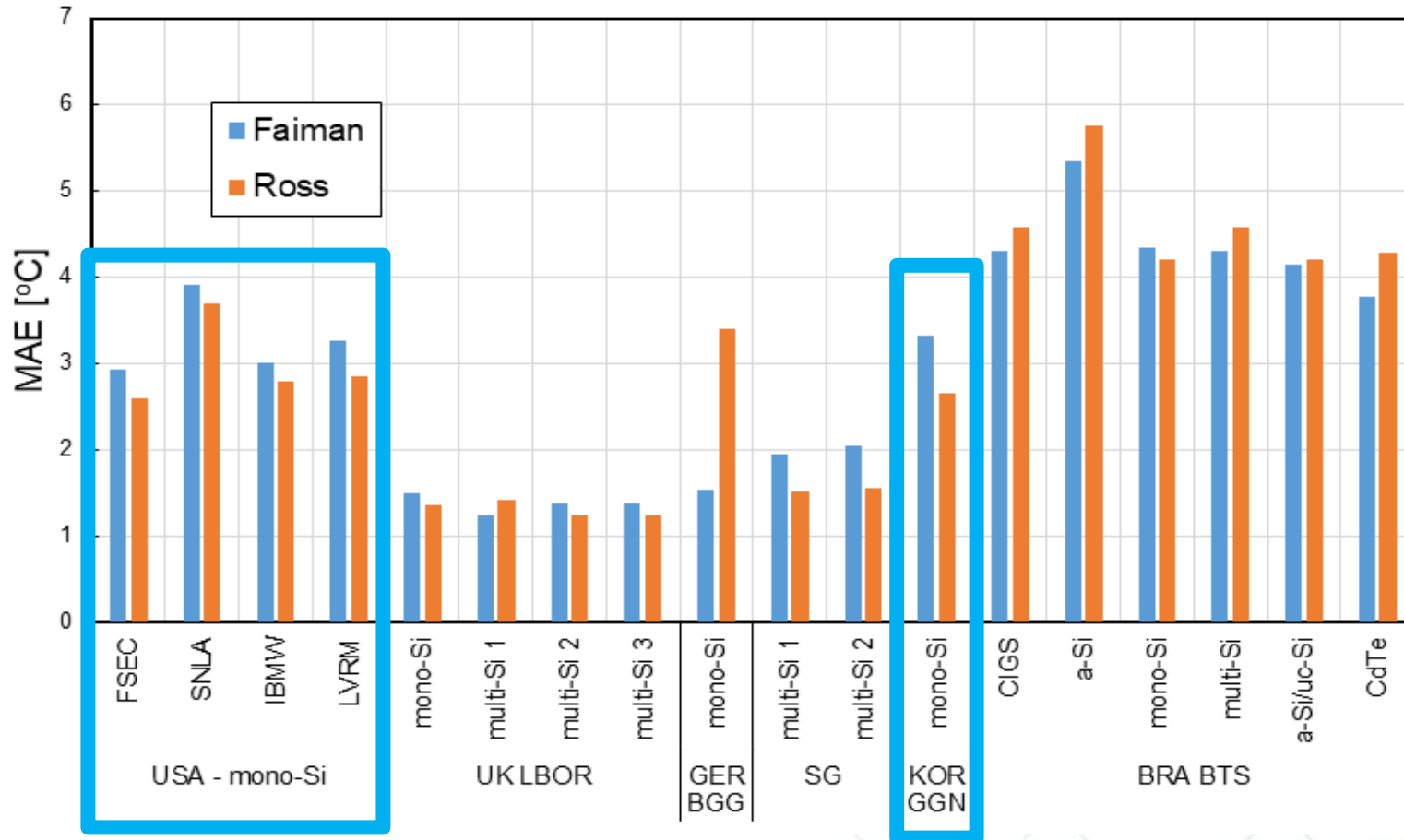


Fig. 3. MAE values for the different sites for the two module temperature models analysed.

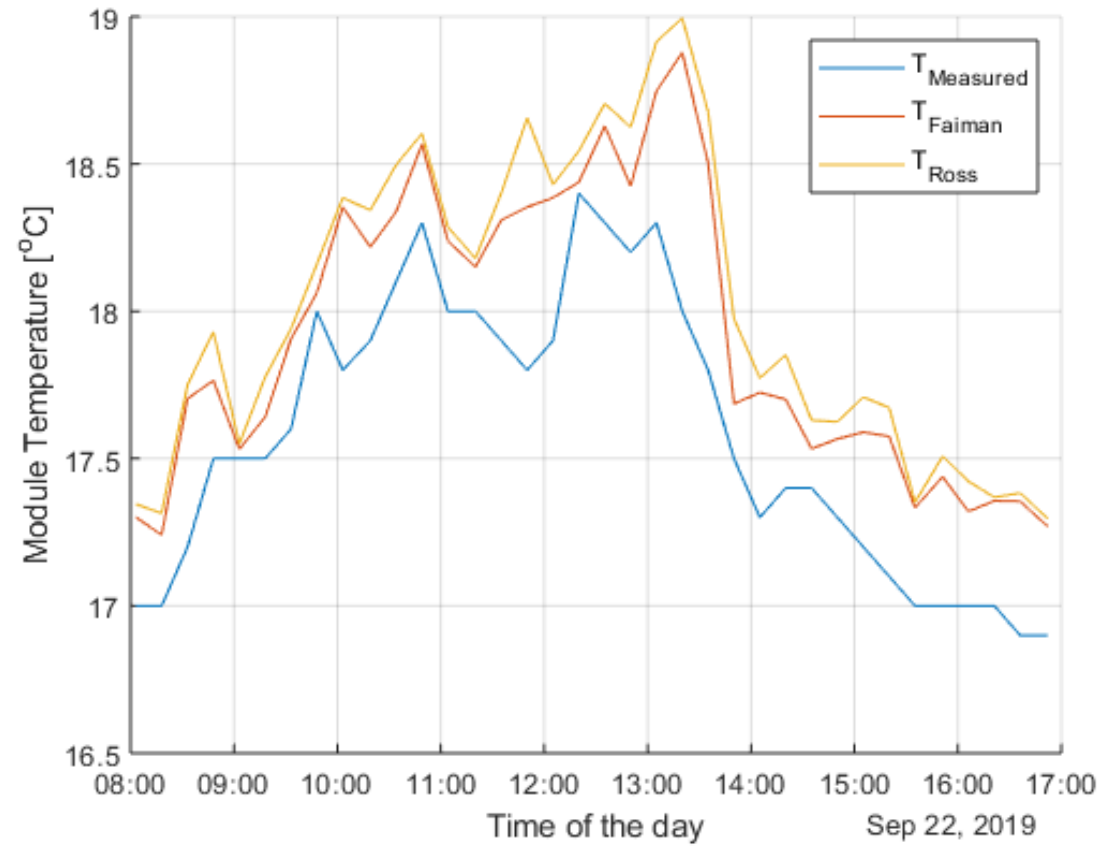


Fig. 11. Correlation between measured and modeled module temperature for the KOR-GGN test site using Faiman's model.

## Main Findings

- Ross's and Faiman's models provide similar results for nearly all sites and PV technologies evaluated, including different climates.
- All sites presented larger errors for high irradiance levels for both models.
- The findings also confirm a correlation between estimation results and the type of module temperature sensor and fixation method employed.

## Future work

- Investigate the models' behaviour according to other parameters: diffuse irradiation, wind speed, fixation method, sensor type and accuracy, ambient temperature and seasonality.
- Analysis of other models for module temperature estimation and other module technologies such as bifacial modules.

# Acknowledgements



## PV CAMPER collaboration:



*MB acknowledges the Brazilian Post-Graduate council CAPES for a doctoral scholarship.*

*MB, AKVO and RR acknowledge the financial support of the Brazilian Electrical Energy Regulator ANEEL, through R&D project grants from ENGIE, ENEL, CPFL and STATKRAFT.*

*L. B. acknowledges that this work is funded in part or whole by the U.S. Department of Energy Solar Energy Technologies Office, under Award Number 34363.*

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