

The burning question: Are fire models suitable for climate attribution studies & projections?

Douglas Kelley, Chantelle Burton,
Stacey New, Seppe Lampe, Joao Teixeira,
Camilla Mathison, Maria Lucia Ferreira
Barbosa, Inika Taylor, Eleanor Burke,
Anna Bradley, Eddy Robertson,
Robert Parker, Chris Jones

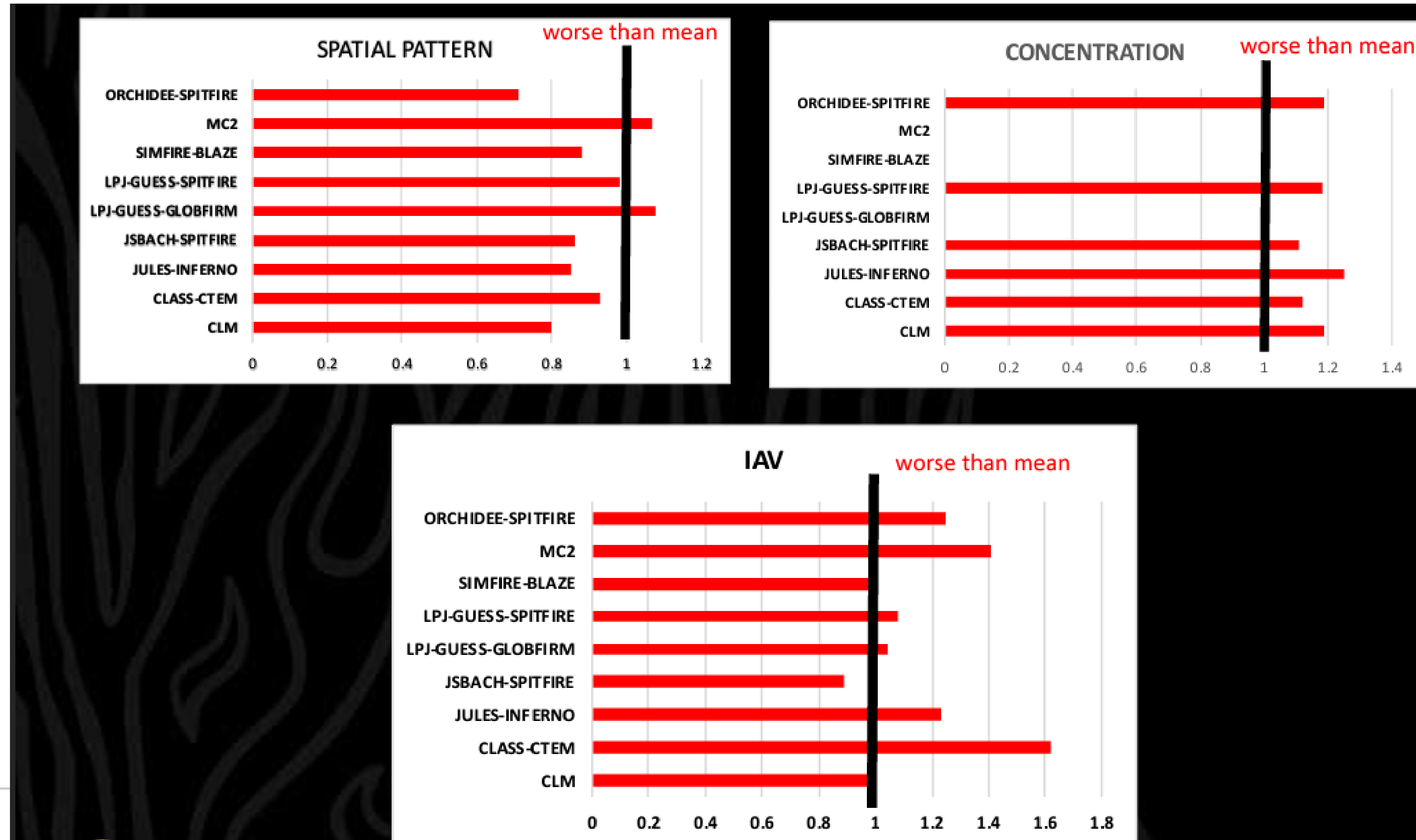
Is this in response to Sandys 2022 JULES talk?

Yes!

Shows big fire models performance issues

Given current model performance, what can we say about changing fire regimes?

How do we find this out?



FireMIP model evaluation

- Simple metrics and datasets for general model evaluation
- Great for multi-model comparisons & quick model dev. checks

A comprehensive benchmarking system for evaluating global vegetation models

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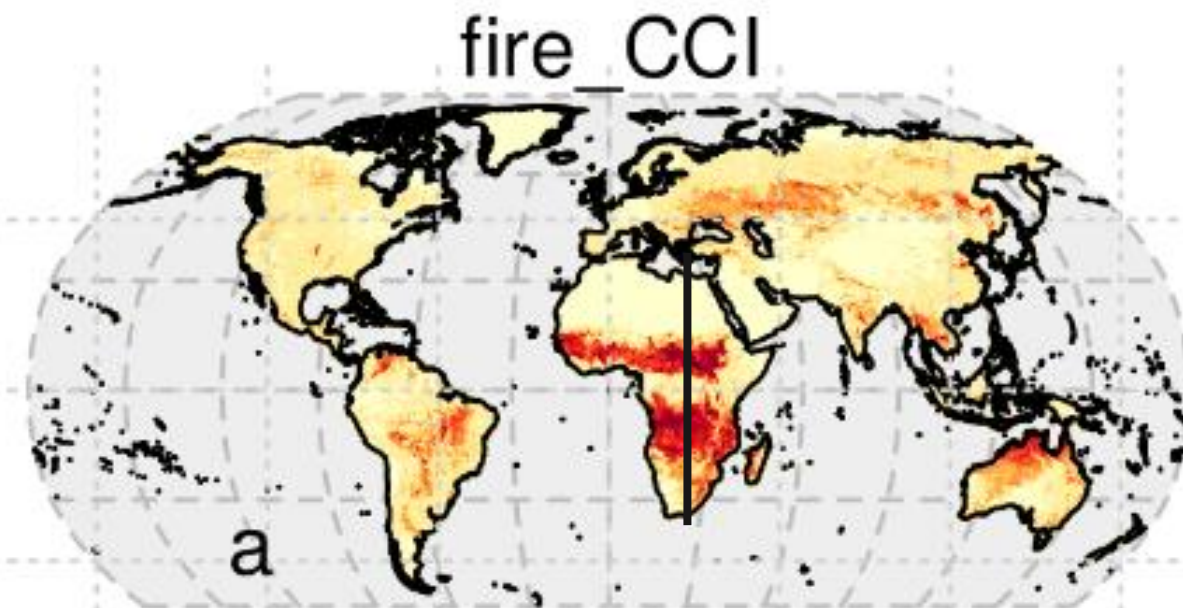
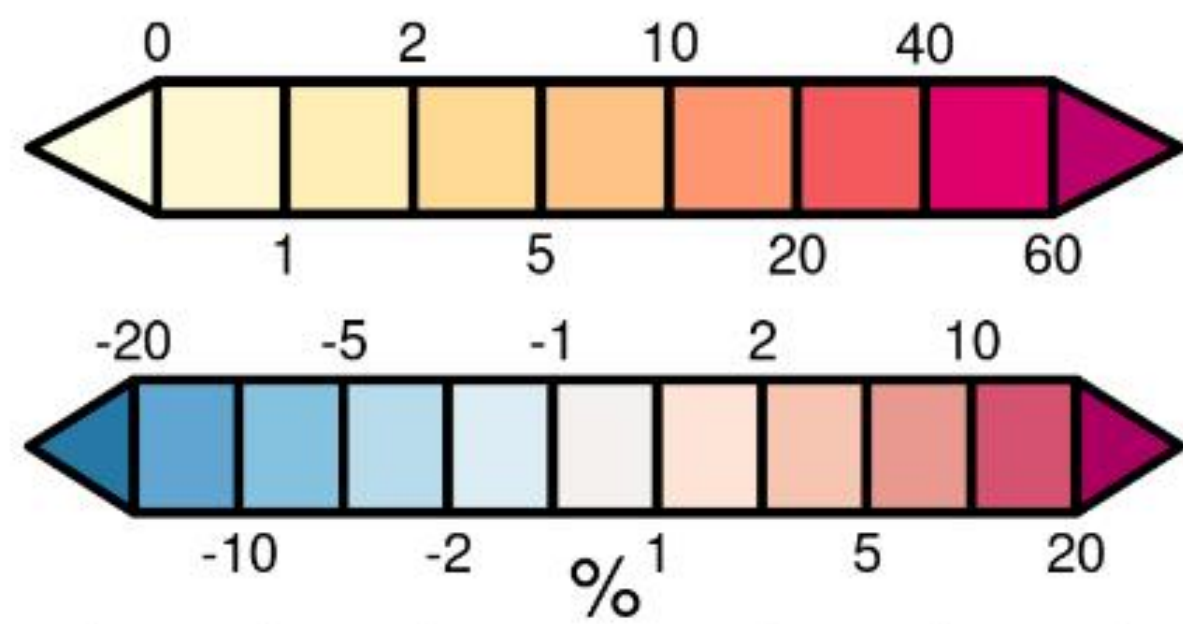
⁴State Key Laboratory of Vegetation and Environmental Change, Institute of Botany, Chinese Academy of Science, Xiangshan Nanxincun 20, 100093 Beijing, China

⁵Jet Propulsion Laboratory, California Institute of Technology, Pasadena, CA 91109, USA

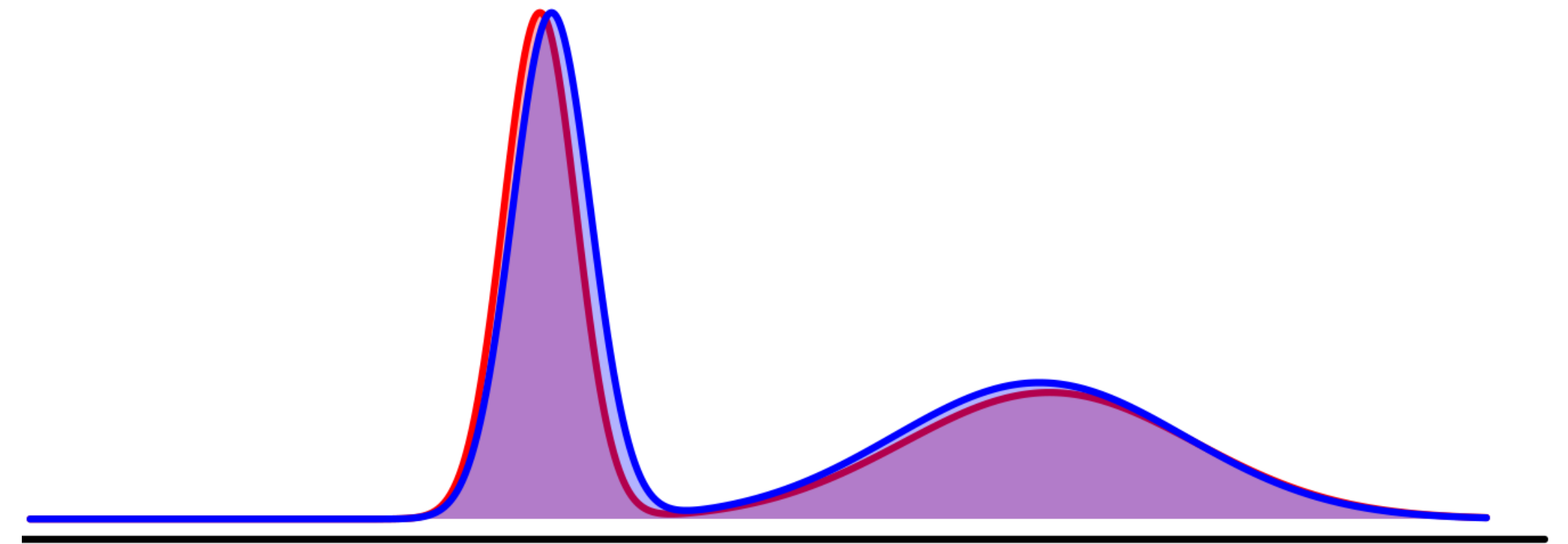
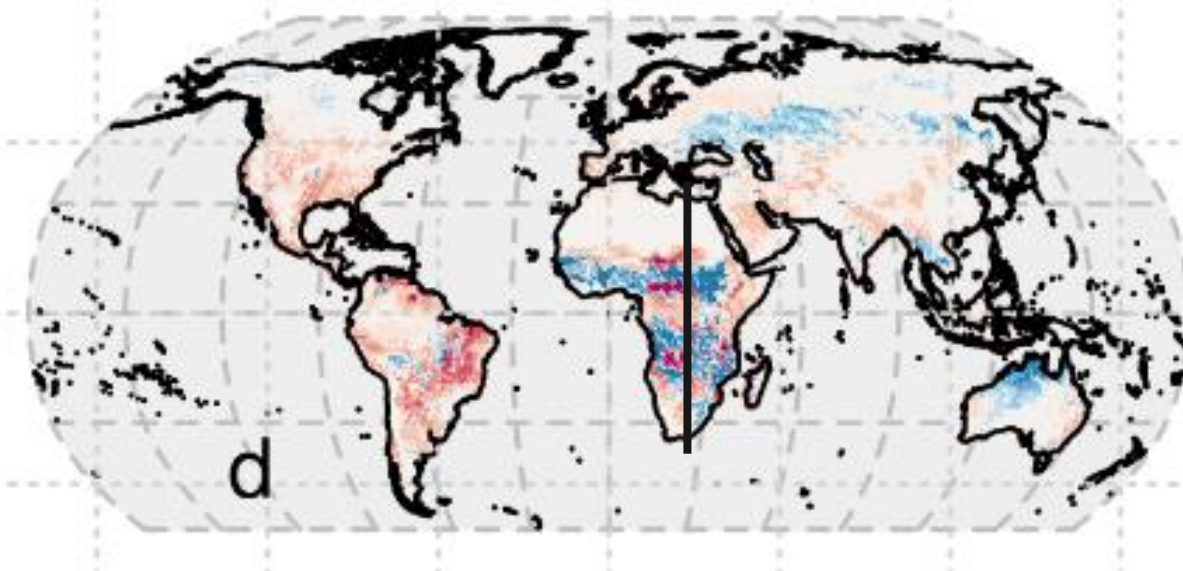
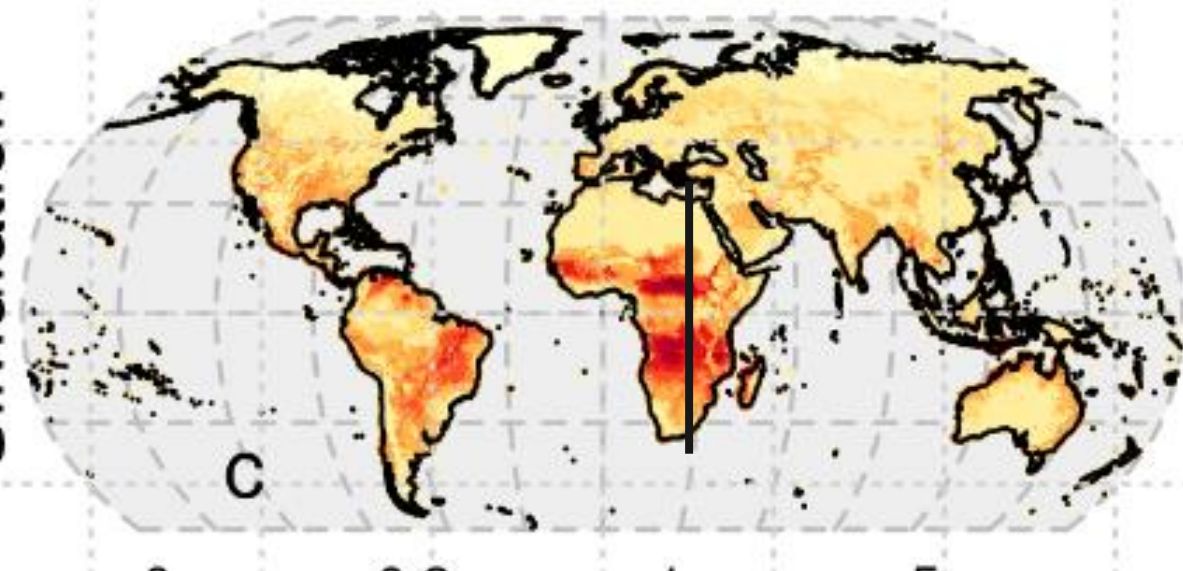
| Metric | Equation | Limits | Use in this study |
|--------------------------------------|----------------------------------------------------------|-------------------------------------------------------------------------------------------|------------------------------------------------------------------------------------------------------------------------------------------------|
| Normalised mean error (NME) | $NME = \sum_i y_i - x_i / \sum_i x_i - \bar{x} $ | 0 – Perfect agreement 1 – Model performs as well as observational mean | For burnt fraction and fAPAR: annual averages, phase concentration, inter-annual variability. |
| Normalised mean squared error (NMSE) | $NMSE = \sum_i (y_i - x_i)^2 / \sum_i (x_i - \bar{x})^2$ | 2 – complete disagreement for step 3 Infinity – complete disagreement for step 1 and 2 | For runoff: annual averages, inter-annual variability For CO ₂ : phase concentration For NPP, GPP and height: annual averages |
| Mean phase difference (MPD) | $MPD = (1/\pi) \arccos[\cos(\omega_i - \phi_i) / n]$ | 0 – in phase 1 – 6 months out (out of phase) | Assessing difference in seasonality for fAPAR, burnt fraction and CO ₂ |
| Manhattan metric (MM) | $MM = \sum_{ij} q_{ij} - p_{ij} / n$ | 0 – Perfect agreement 2 – Perfect disagreement | Vegetation cover comparisons for life forms, tree, grassland, bare ground, evergreen vs. deciduous tree and broadleaf vs. needleleaf tree. |
| Squared chord distance (SCD) | $SCD = \sum_{ij} (\sqrt{q_{ij}} - \sqrt{p_{ij}})^2 / n$ | | |

NME

$$NME = \frac{\sum_i^{cells} |model_i - observed_i|}{\sum_i^{cells} |\overline{observed} - observed_i|}$$



Simulation

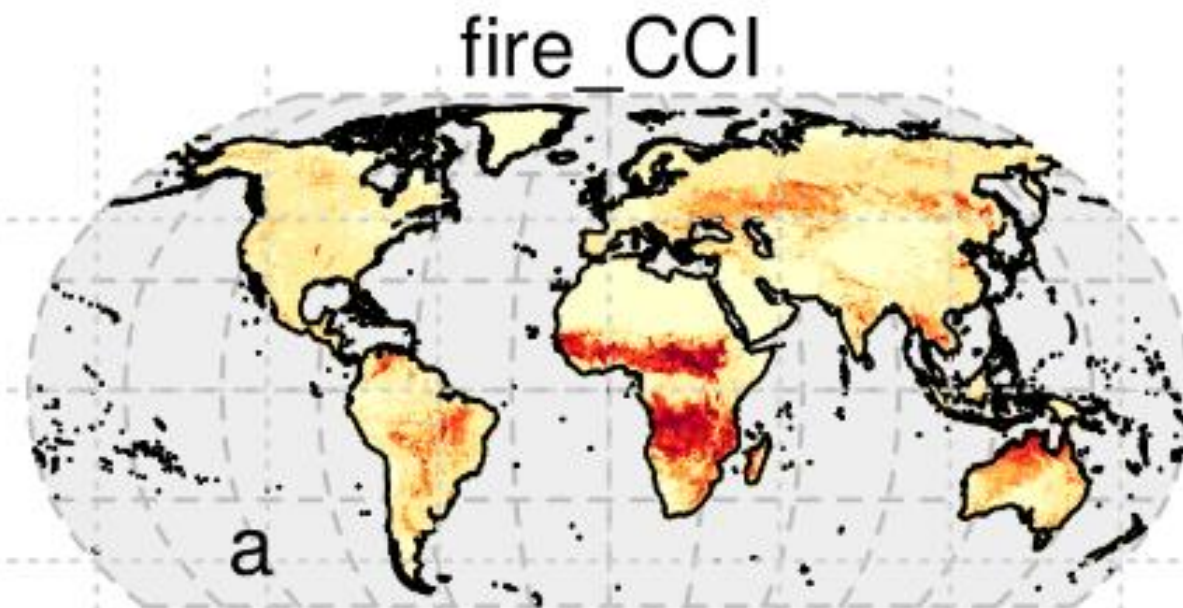
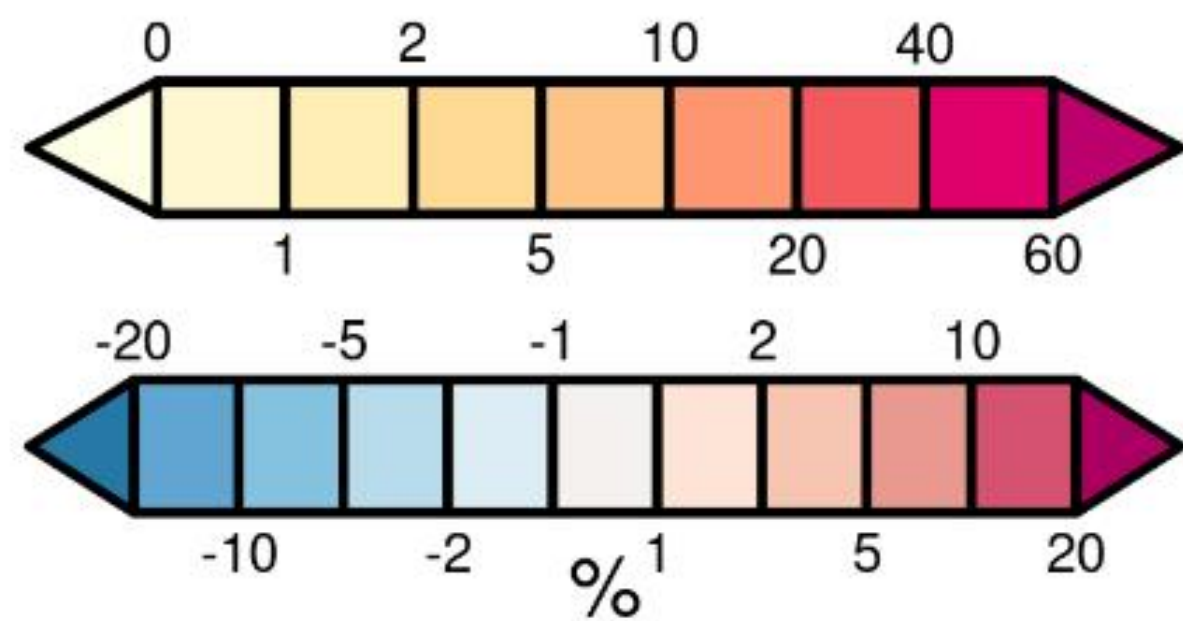


NME = 0.16

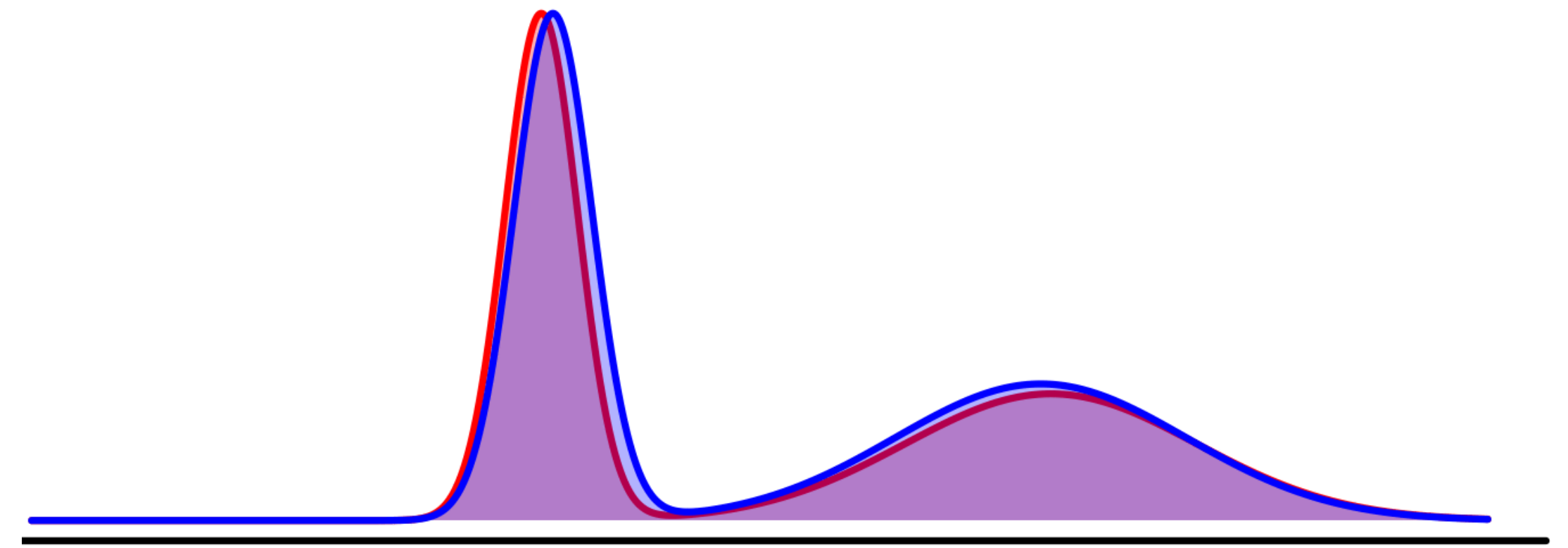
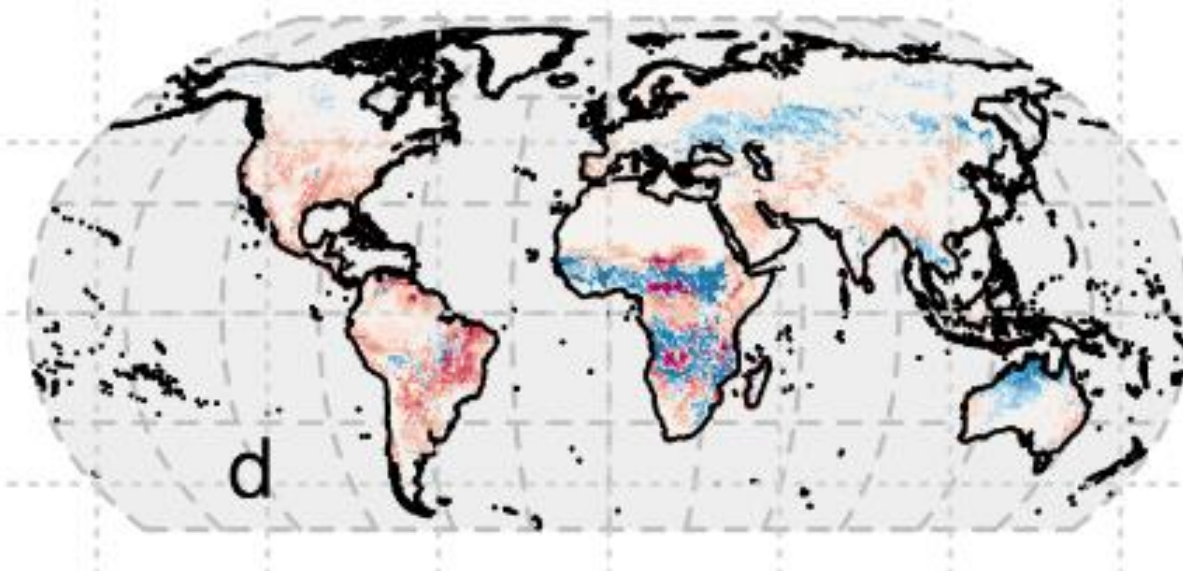
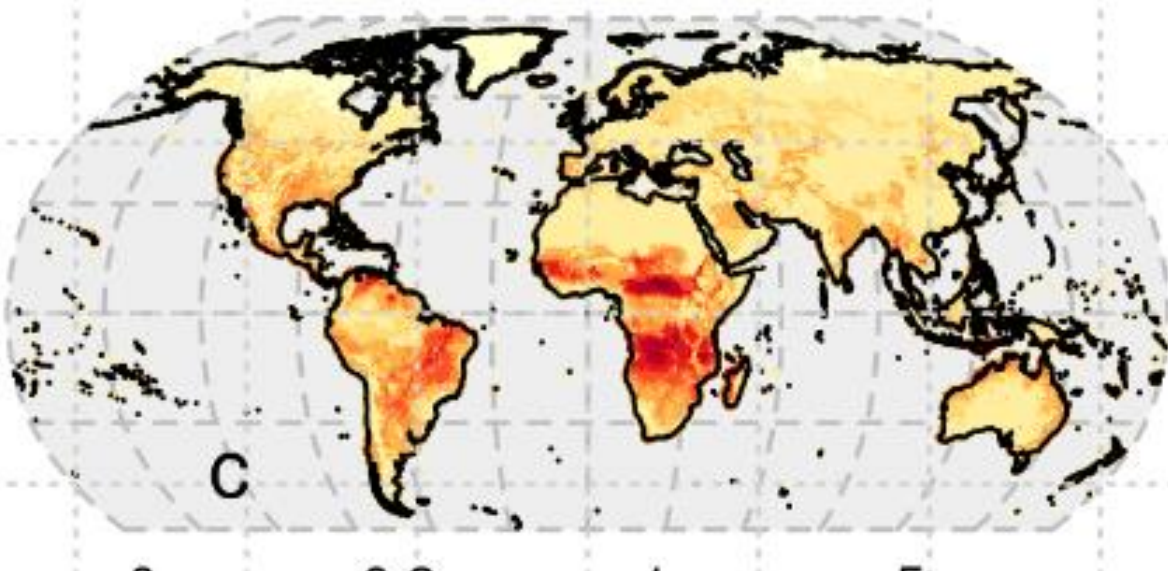


NME

$$NME = \frac{\sum_i^{cells} |model_i - observed_i|}{\sum_i^{cells} |\overline{observed} - observed_i|}$$



Simulation



NME = 0.16



What eval doesn't do yet

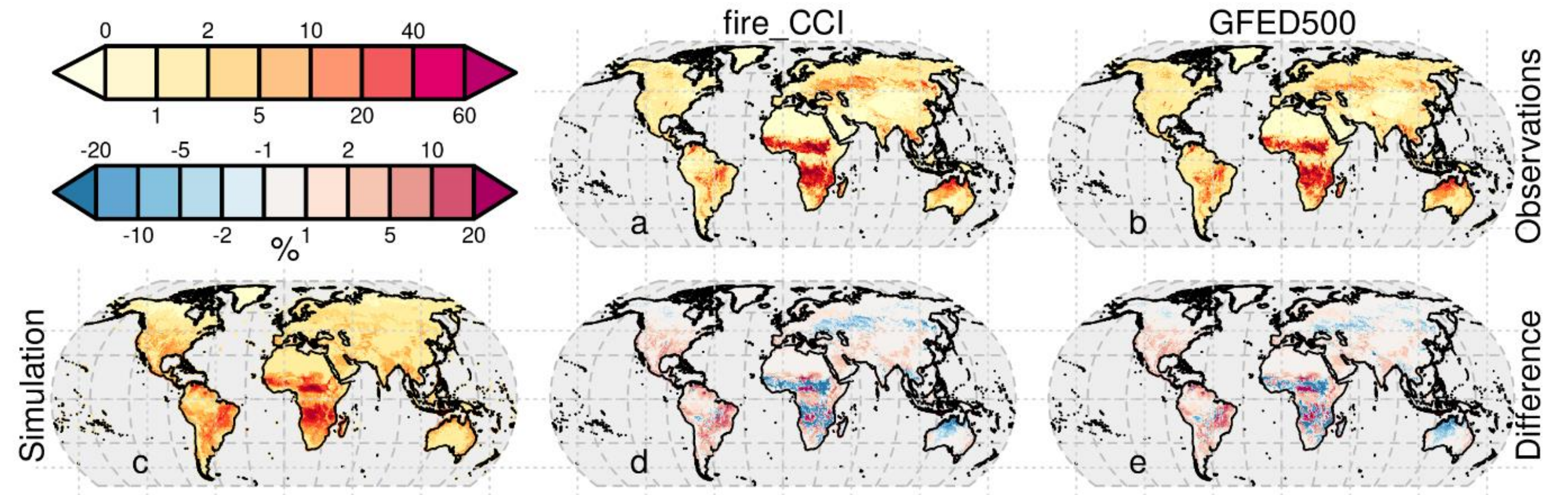
- Targeted evaluation designed to test specific applications
- Metrics unforgiving for small spatial mismatches
- Poor sampling of observational uncertainty
- Doesn't really test for inter-annual variability
- No test for long-term trends/changes in fire.
- Test the effects of fire on impacts.

Criteria for climate attribution, future fires, changing impacts and wildfire occurrence

| Application | | | | Criteria | |
|-------------|----|----|-----|----------------------------------------------|-------------|
| At | FF | Im | Wld | | Over region |
| Y | Y | | Y | Spatial distribution of fires | |
| | | Y | | Spatial distribution of impacts | |
| Y | Y | Y | | Reproduces trends in burnt area | |
| Y | | | Y | Captures inter-annual variability of fire | |
| | | | Y | Captures extremes in variability | |
| | | Y | | Reproduces trends in impacts over region | |
| | | Y | | Impacts trend is better with vs without fire | |

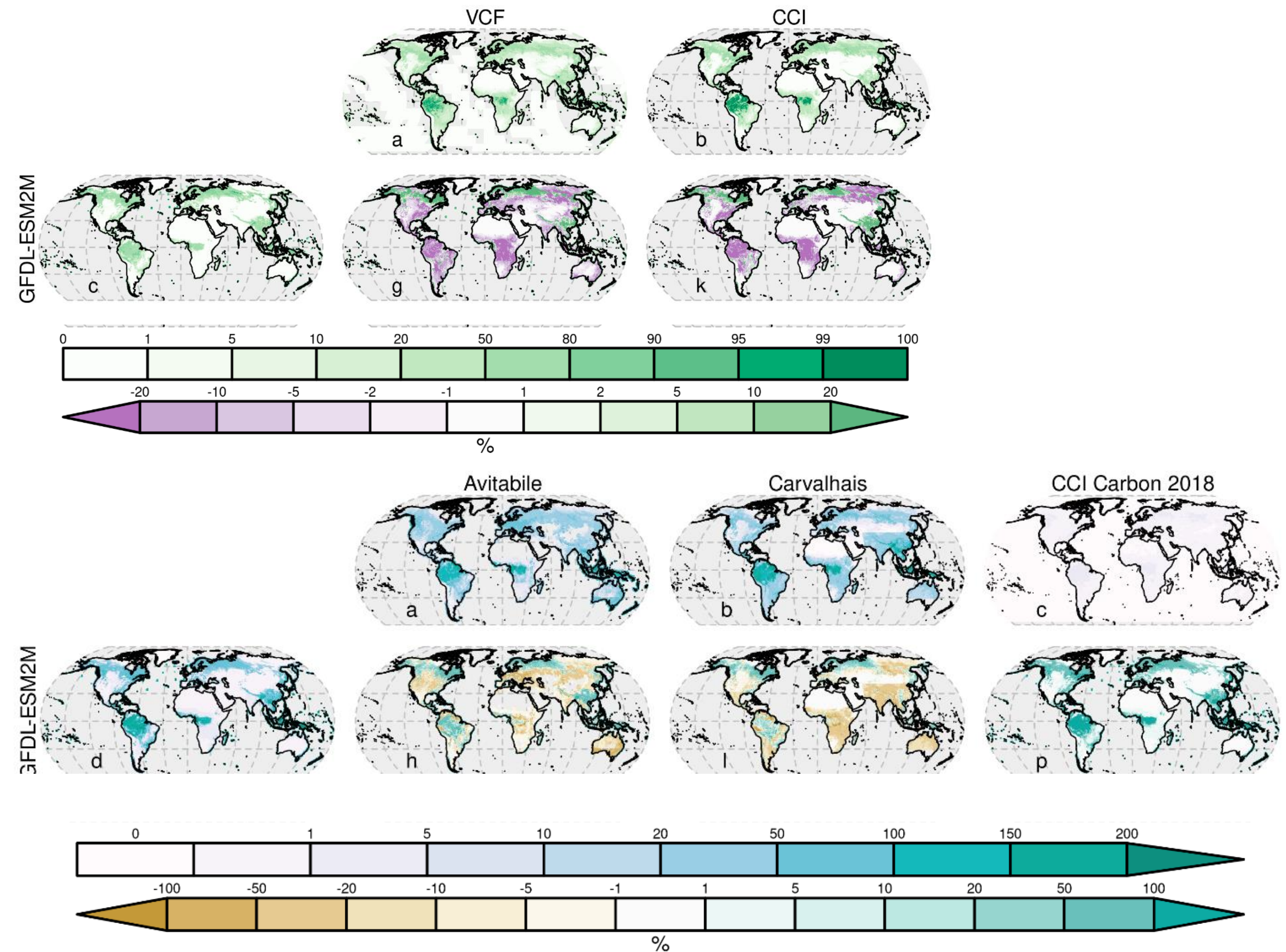
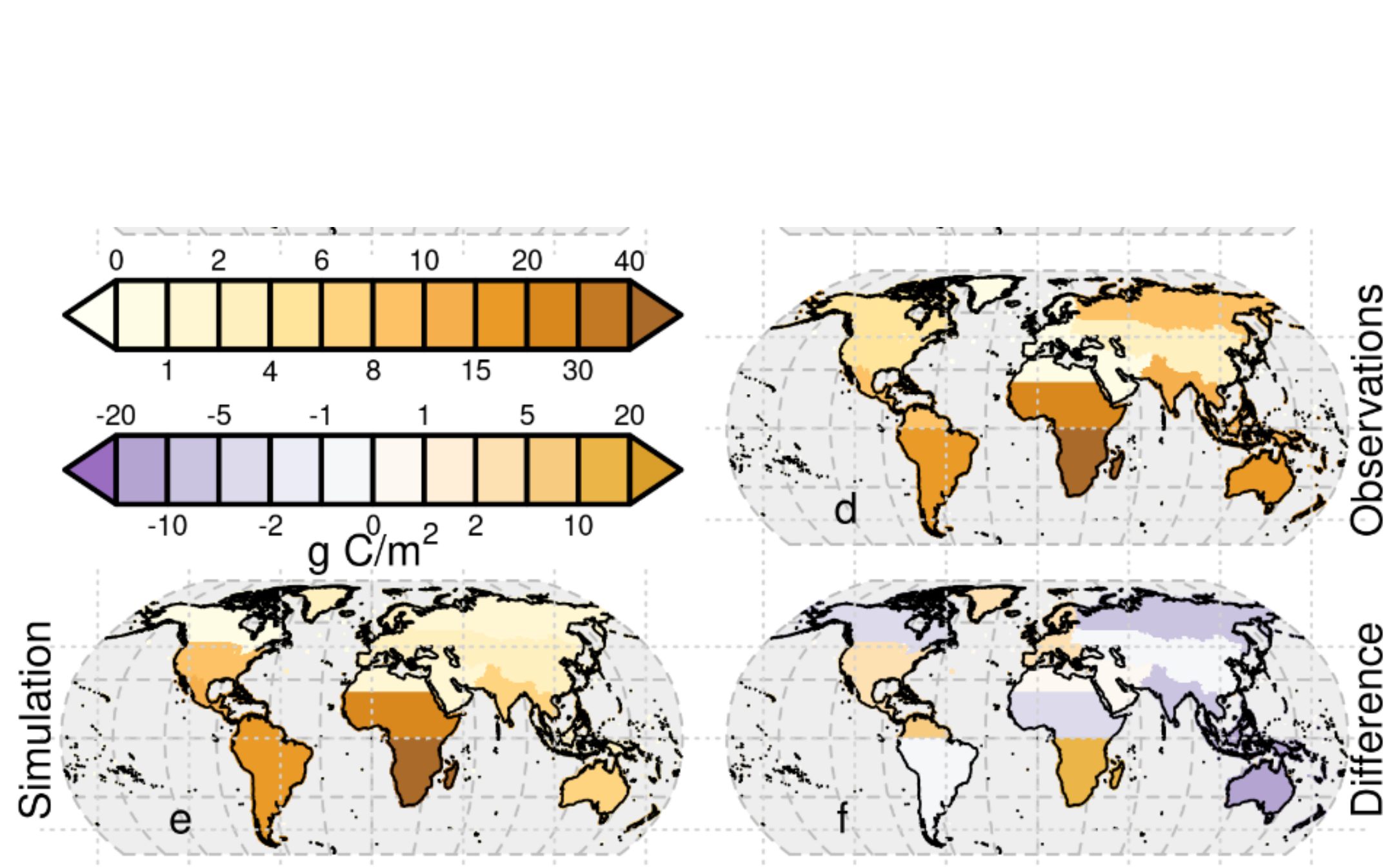
Spatial distribution of burnt area

| | <i>GFED4s</i> | <i>Fire CCI</i> | <i>GFED500</i> | <i>GFED4</i> | <i>MCD45</i> | <i>Meris</i> | <i>Combined</i> |
|---------|---------------|-----------------|----------------|--------------|--------------|--------------|-----------------|
| By grid | 0.66 | 0.67 | 0.72 | 0.81 | 0.79 | 0.8 | 0.7 |



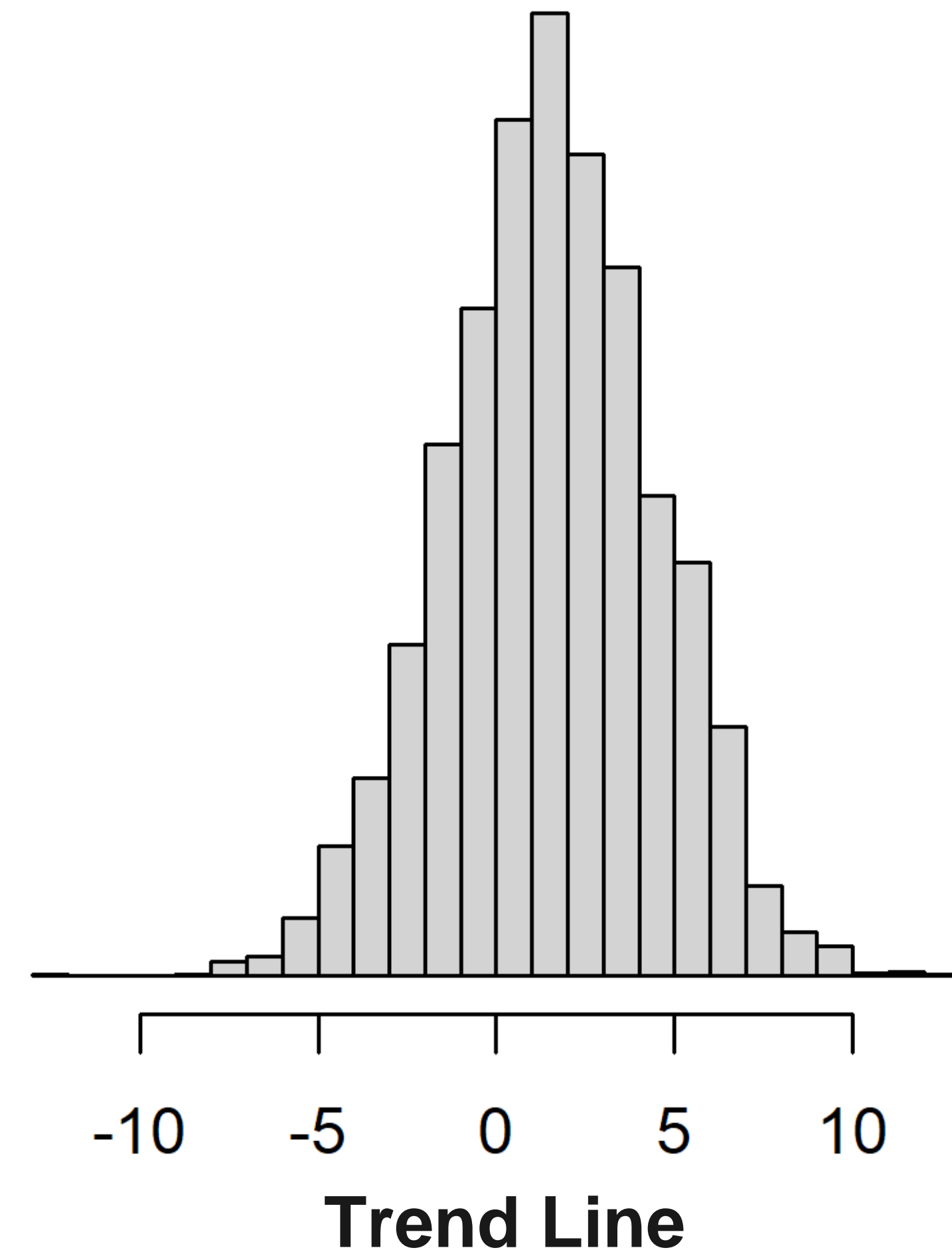
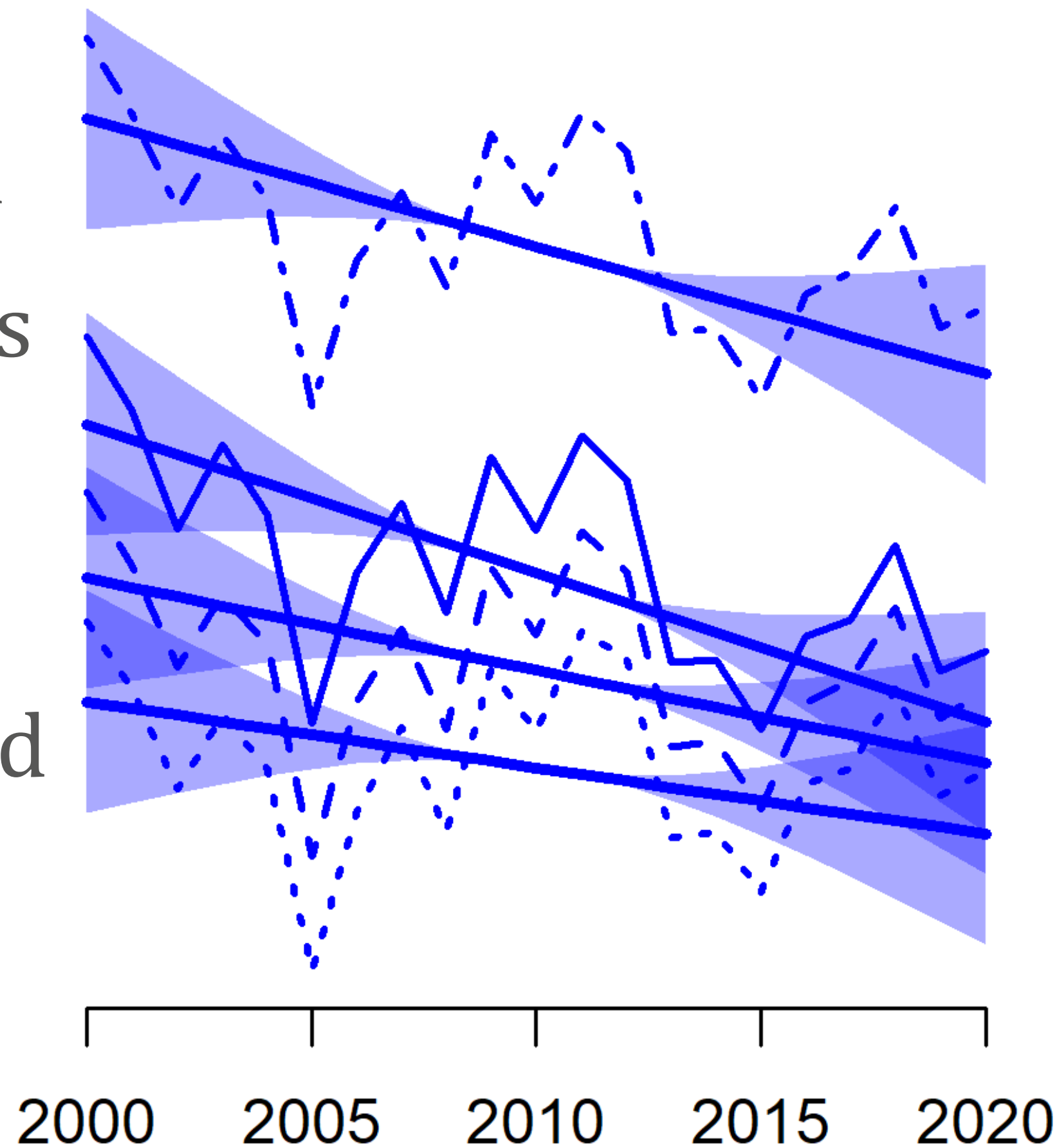
Results show JULES-ES-ISIMIP2b evaluation (just for HadGEM2-ES in a single result)

Spatial distribution of impacts – i.e Fire emissions, vegetation carbon, tree cover

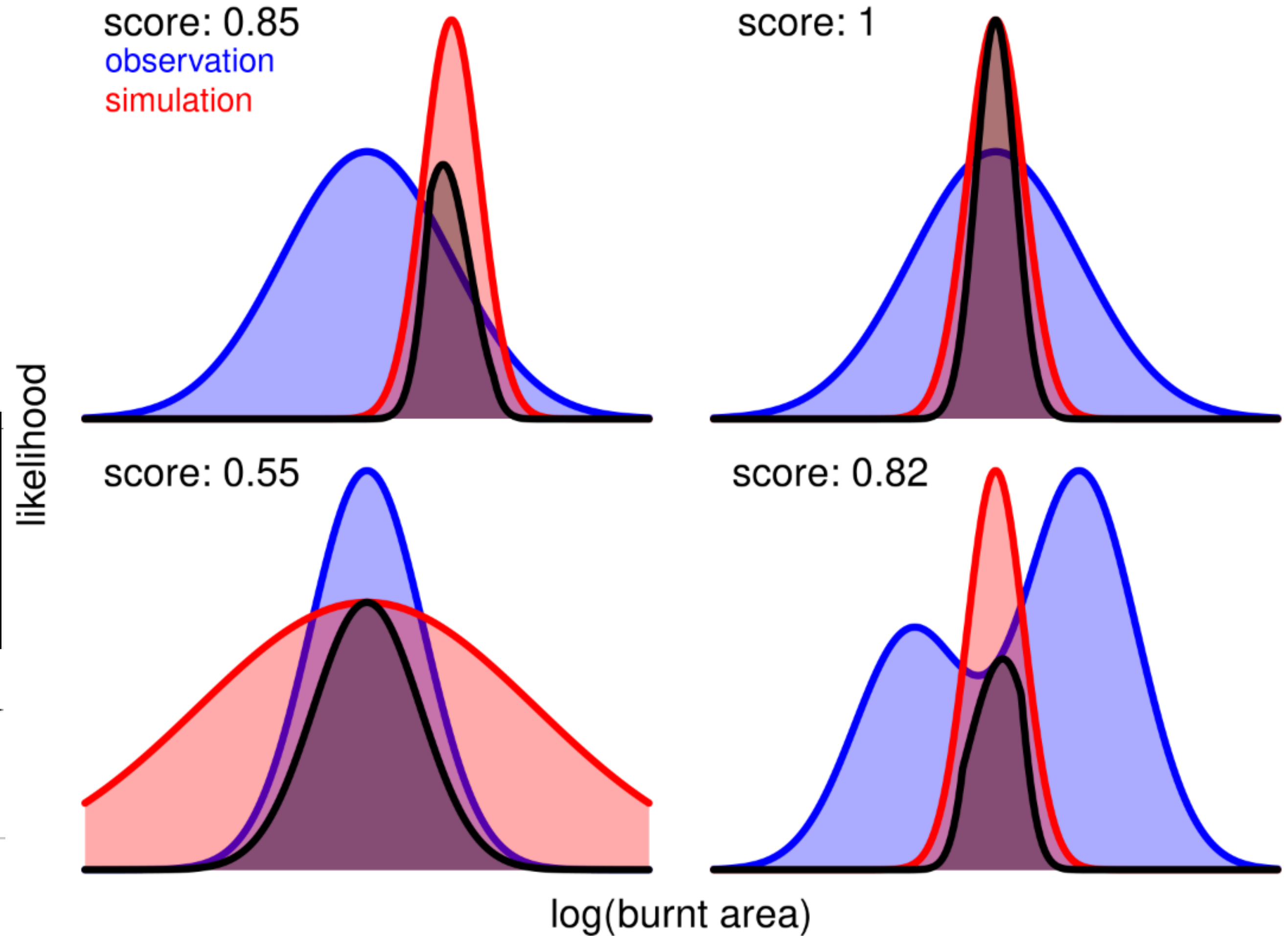
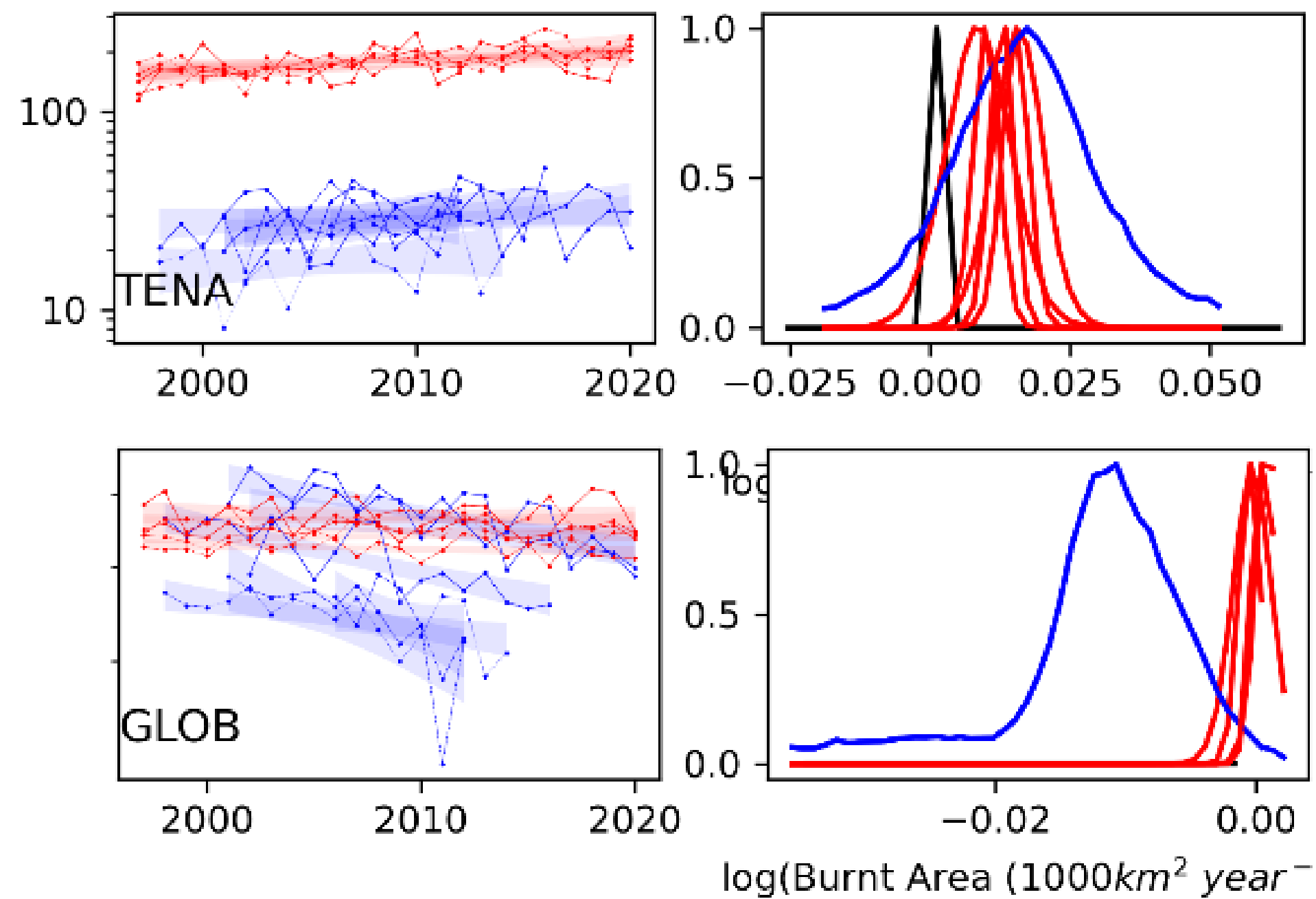


Reproduces trends in burnt area

Obs. fire trends
are very uncertain
From noisy process
From multiple
products
We test if simulated
trends are within
this range

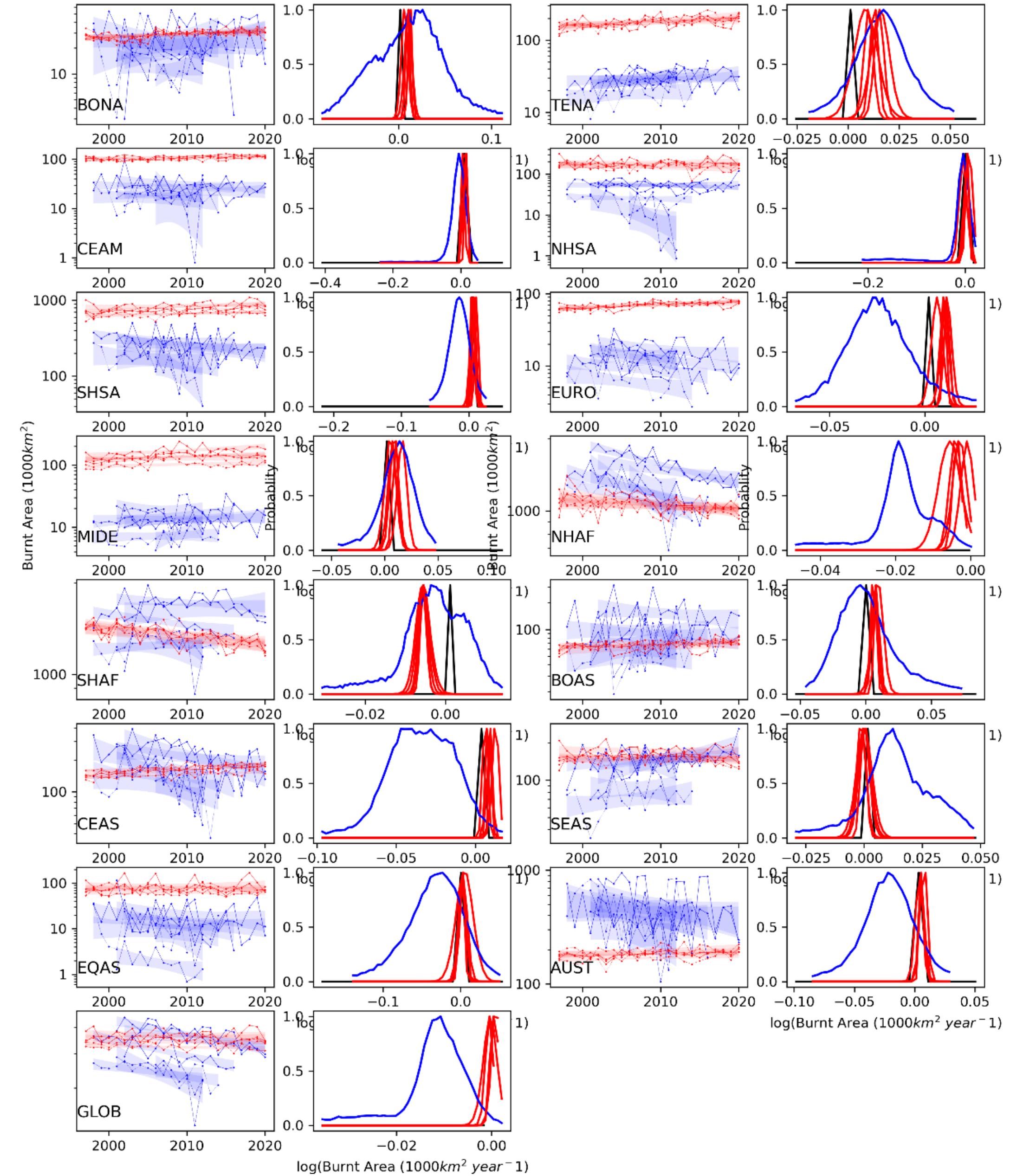


Benchmarking when changes in fire over time is important



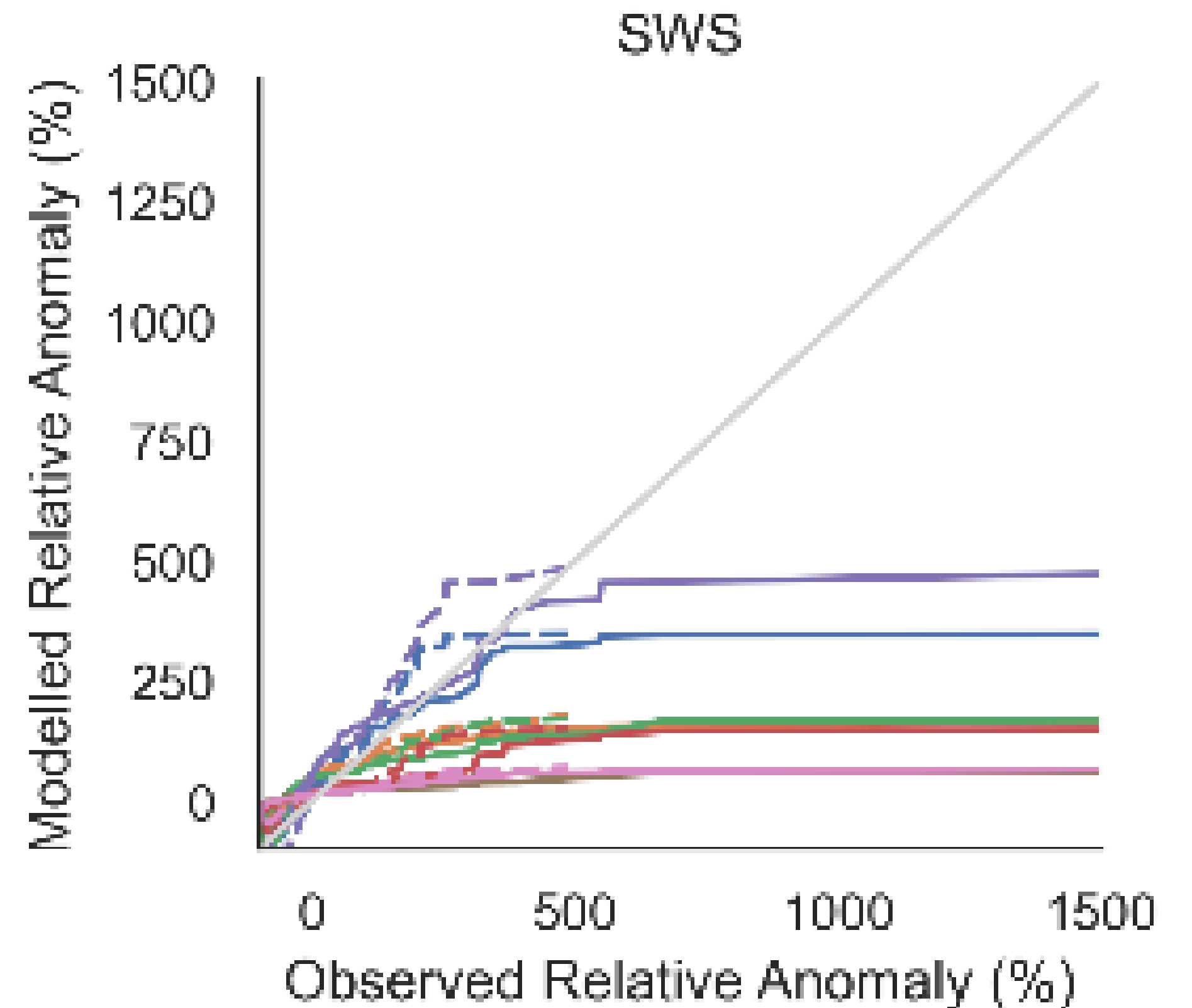
Gradient Overlap Metric

| | Burnt Area | | | | | Fire emissions | | | | |
|------|--------------|---------|---------|---------|-------------|----------------|---------|---------|--------|---------|
| | Observations | | Model | | overlap (%) | Observations | | Model | | overlap |
| | 10% | 90% | 10% | 90% | | 10% | 90% | 10% | 90% | |
| BONA | -0.057 | 0.077 | 0.0026 | 0.015 | 99.94 | -0.021 | 0.069 | 0.0067 | 0.033 | 99.08 |
| TENA | -0.011 | 0.044 | 0.0071 | 0.022 | 99.53 | -0.018 | 0.042 | 0.004 | 0.037 | 94.11 |
| CEAM | -0.072 | 0.025 | 0.0028 | 0.0097 | 77.46 | -0.019 | 0.031 | -0.0032 | 0.0088 | 97.75 |
| NHSA | -0.27 | 0.013 | -0.0089 | 0.0064 | 89.77 | -0.041 | 0.0056 | -0.025 | 0.017 | 77.44 |
| SHSA | -0.12 | 0.016 | 0.0017 | 0.01 | 64.33 | -0.055 | 0.018 | -0.003 | 0.018 | 72.92 |
| EURO | -0.055 | 0.016 | 0.006 | 0.015 | 43.15 | -0.088 | -0.0073 | -0.0005 | 0.022 | 29.7 |
| MIDE | -0.029 | 0.075 | -0.0049 | 0.012 | 94.94 | -0.031 | 0.014 | -0.0098 | 0.0029 | 95.04 |
| NHAF | -0.046 | -0.0056 | -0.0044 | 0.0015 | 27.44 | -0.031 | -0.014 | -0.013 | 0.0027 | 18.48 |
| SHAF | -0.024 | 0.0088 | -0.0083 | -0.0032 | 97.31 | -0.0046 | 0.01 | -0.009 | 0.001 | 58.56 |
| BOAS | -0.036 | 0.059 | 0.0018 | 0.01 | 92.02 | -0.053 | 0.049 | -0.0054 | 0.011 | 98.03 |
| CEAS | -0.086 | -0.0013 | 0.0083 | 0.015 | 33.48 | -0.055 | -0.0035 | -0.0034 | 0.011 | 36.2 |
| SEAS | -0.023 | 0.04 | -0.0046 | 0.0032 | 71.64 | -0.0041 | 0.038 | -0.0045 | 0.011 | 77.81 |
| EQAS | -0.13 | 0.024 | -0.0074 | 0.0064 | 87.16 | -0.078 | 0.056 | -0.013 | 0.0086 | 98.34 |
| AUST | -0.07 | 0.025 | -0.003 | 0.0076 | 72.66 | -0.084 | 0.032 | -0.006 | 0.013 | 85.89 |



Captures extremes in variability

- From Burton & Lampe et al. (pre-print)
- Where do models burnt area distributions agree with Observed?



--- CLASSIC --- LPJ-GUESS-SIMFIRE-BLAZE
--- JULES --- LPJ-GUESS-SPITFIRE
--- ORCHIDEE-MICT-SPITFIRE --- VISIT
--- SSiB4

Criteria for climate attribution, future fires, changing impacts and wildfire occurrence

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|-------------|----|----|-----|----------------------------------------------|-------------|
| At | FF | Im | Wld | | Over region |
| Y | Y | | Y | Spatial distribution of fires | Y |
| | | Y | | Spatial distribution of impacts | Y |
| Y | Y | Y | | Reproduces trends in burnt area | Y |
| Y | | | Y | Captures inter-annual variability of fire | Sometimes |
| | | | Y | Captures extremes in variability | N |
| | | Y | | Reproduces trends in impacts over region | Y |
| | | Y | | Impacts trend is better with vs without fire | Y |

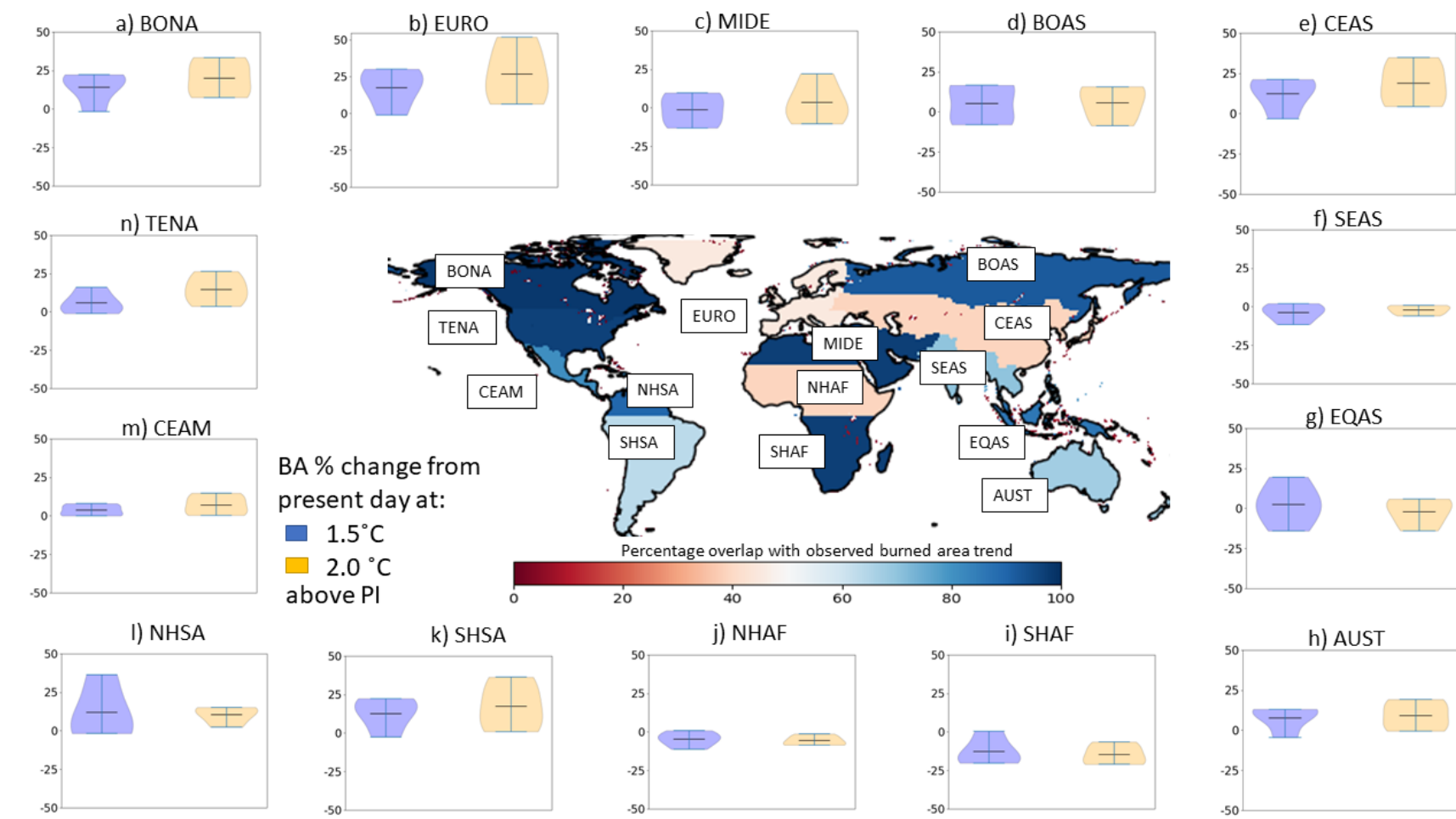
What we can use JULES-INFERNO for:

- Region-based/broad-scale fire changes
- How these impact tree cover and carbon

What JULES-INFERNO can't do (yet!):

- Local scale (grid cell) fire-biogeography (though see Maria's talk)
- Extreme wildfire (though see ConFire)
- (By itself) fire attribution (though see FireMIP multi-model attribution)

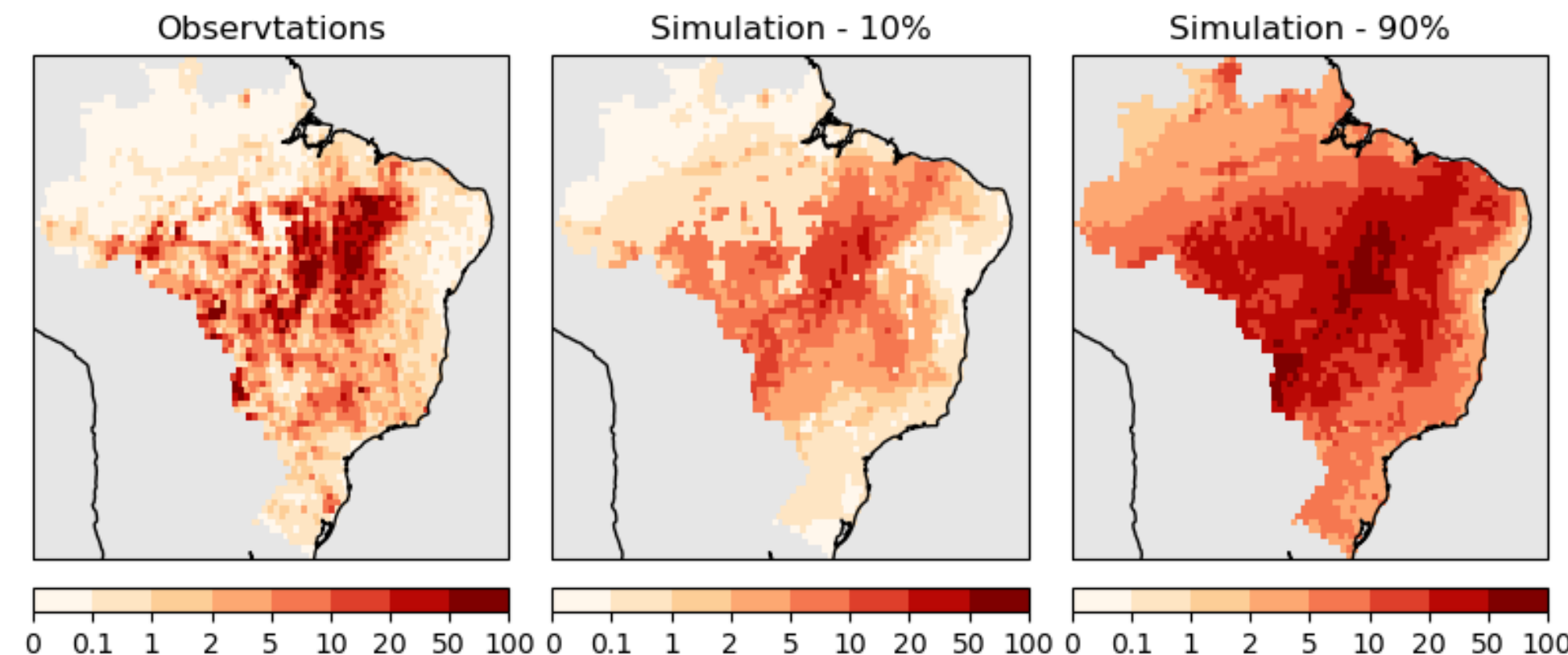
JULES-fire tools



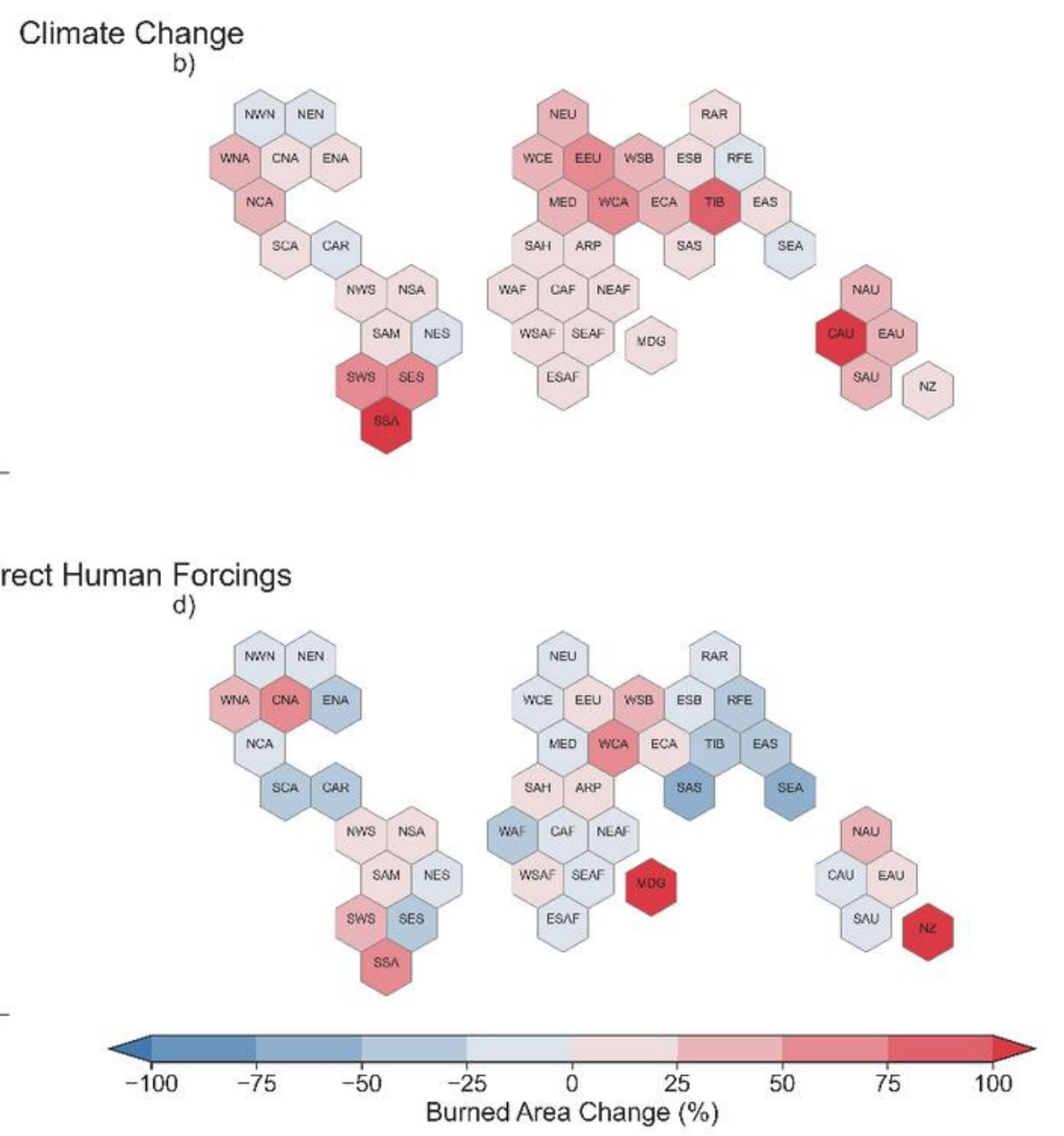
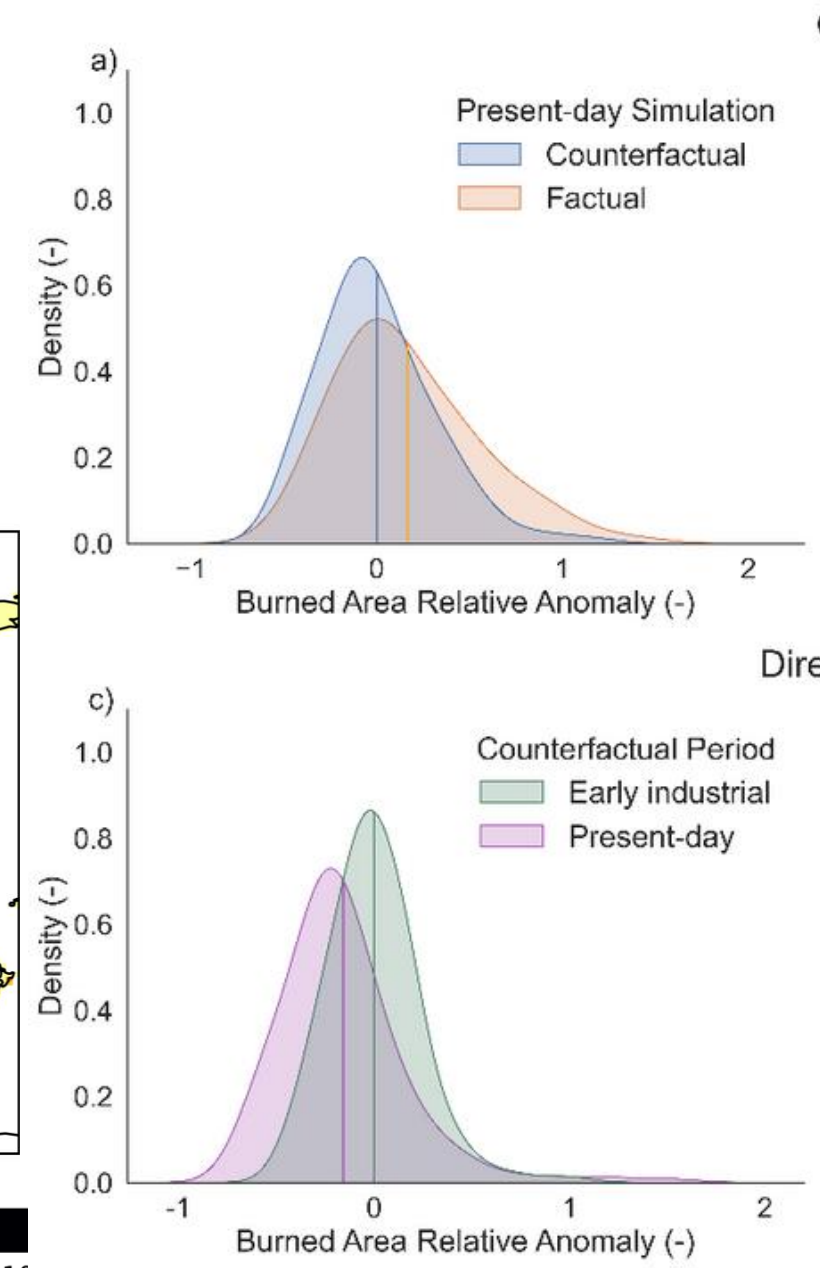
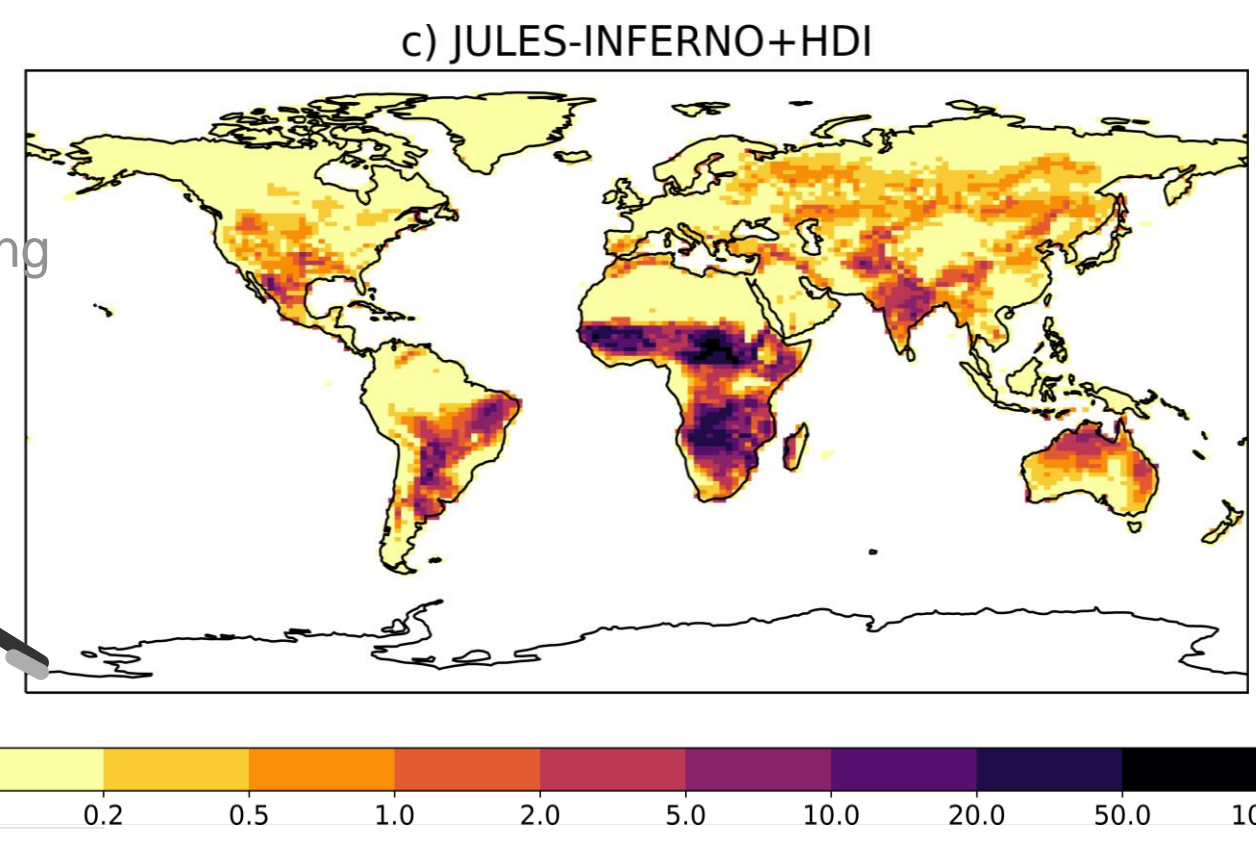
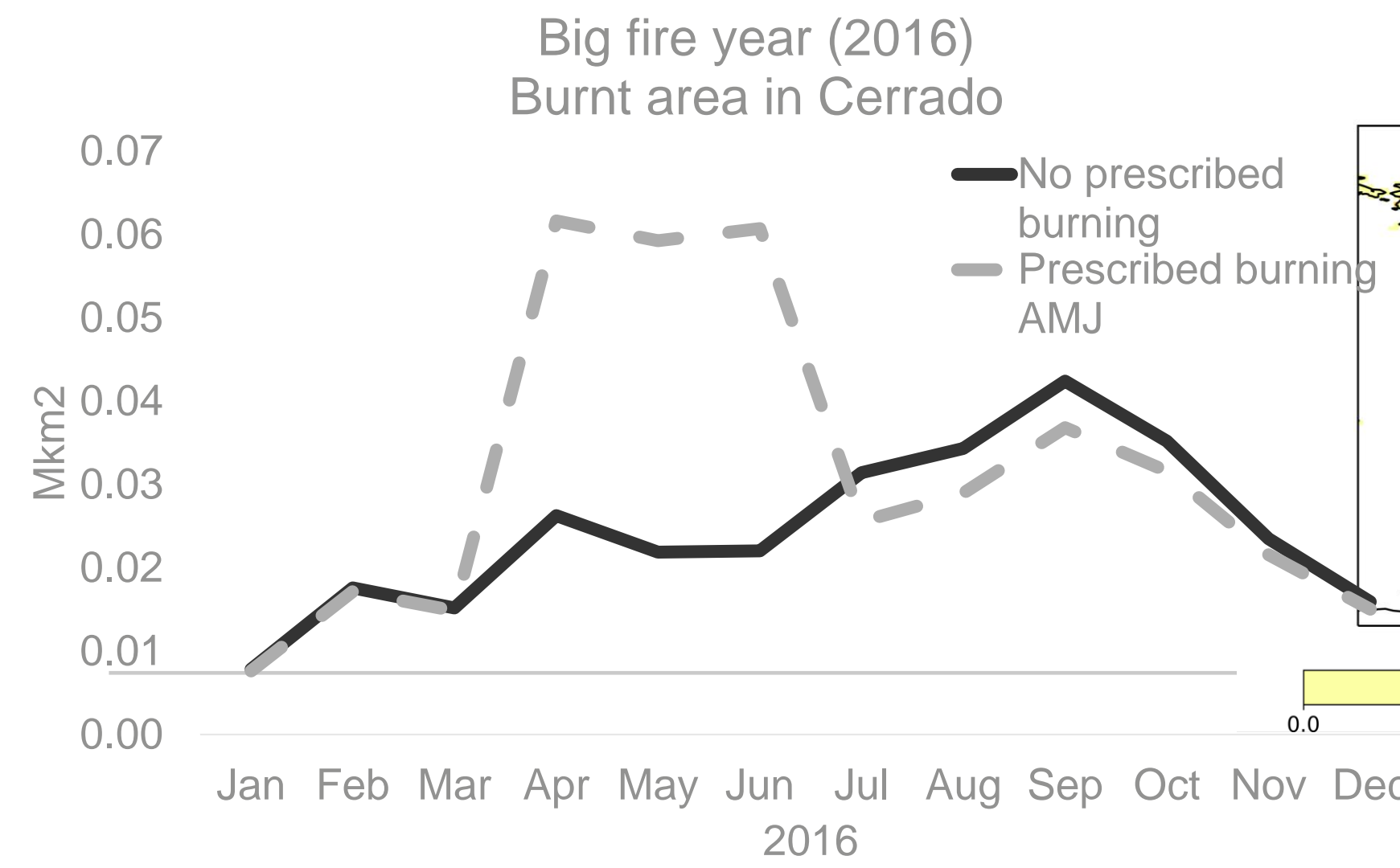
JULES-ES-INFERNO



ConFire



FLAME – Empirical post-process



ISIMIP multi-model 16

INFERNO developments

How do know someone that uses fire models?

Help us collect good practices for using global fire model outputs



Interview

Doug Kelley

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Chantelle Burton

chantelle.burton@metoffice.gov.uk

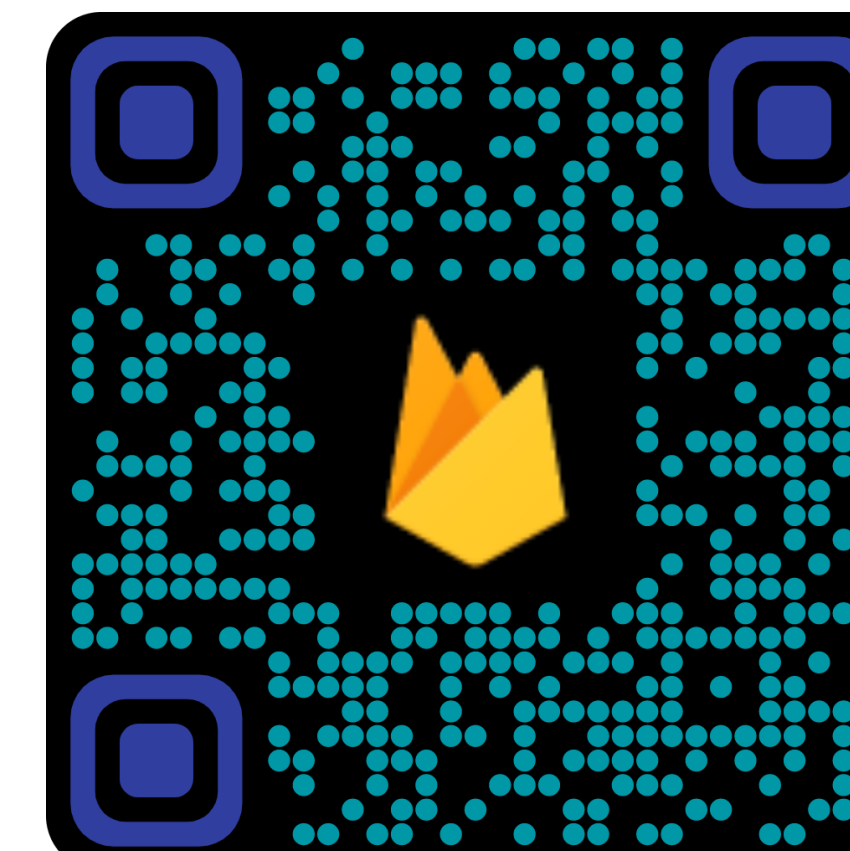
Stacey New

stacey.new@metoffice.gov.uk



Questionnaire

<https://forms.gle/ct5EV5MtdWQpgiXUA>



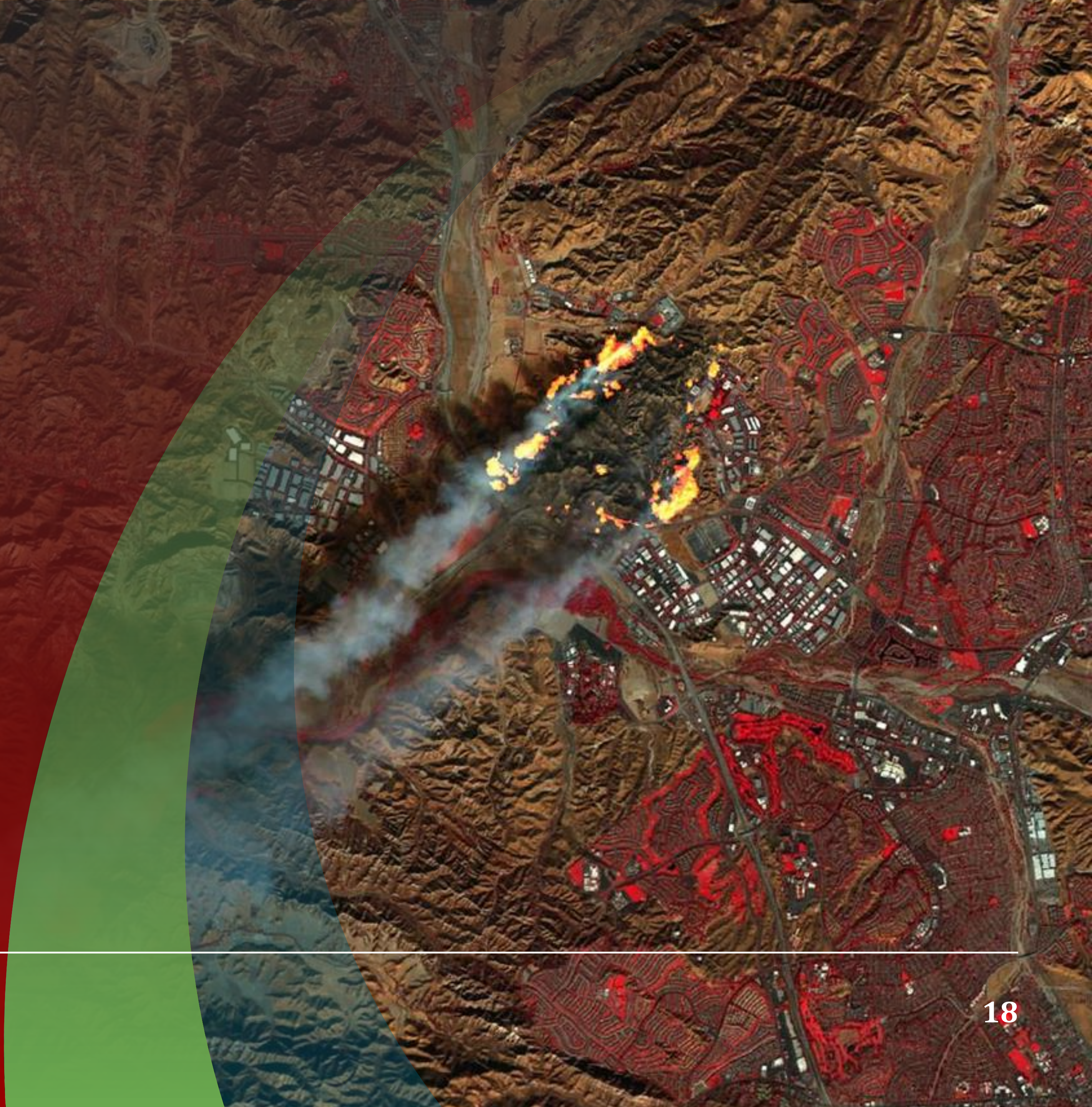
Jamboards

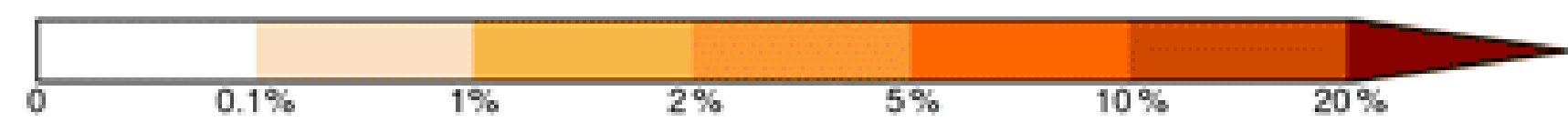
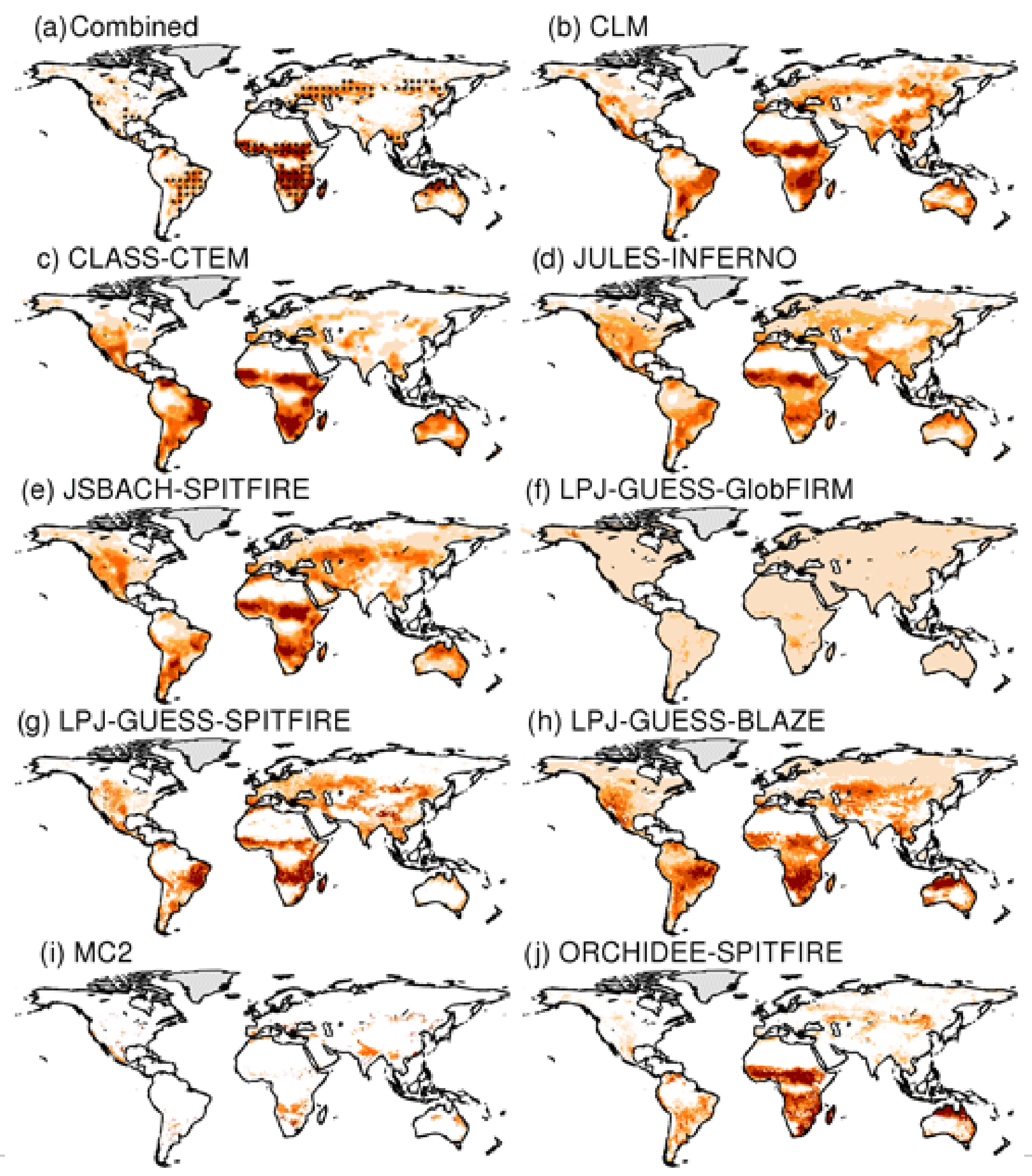
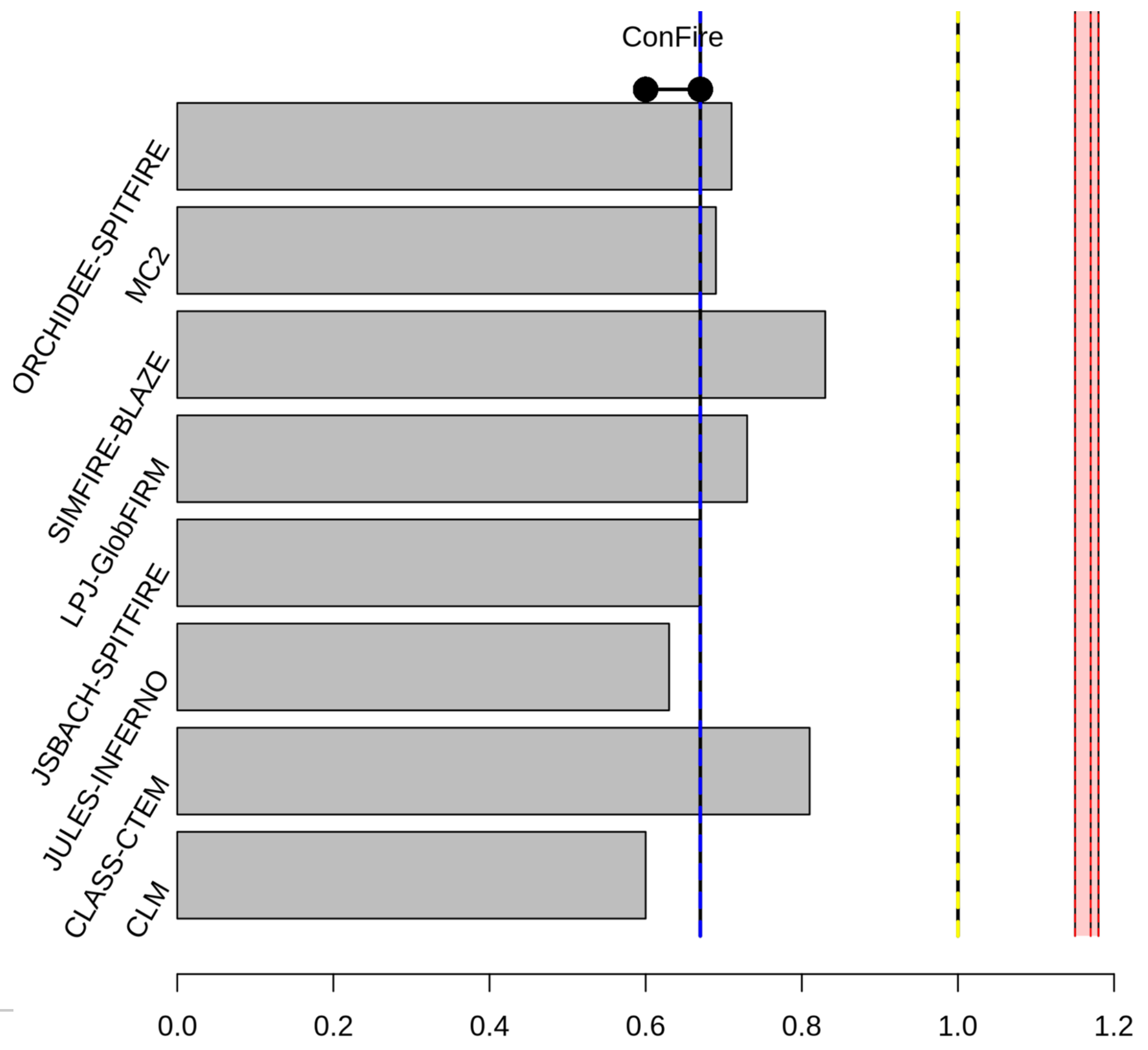
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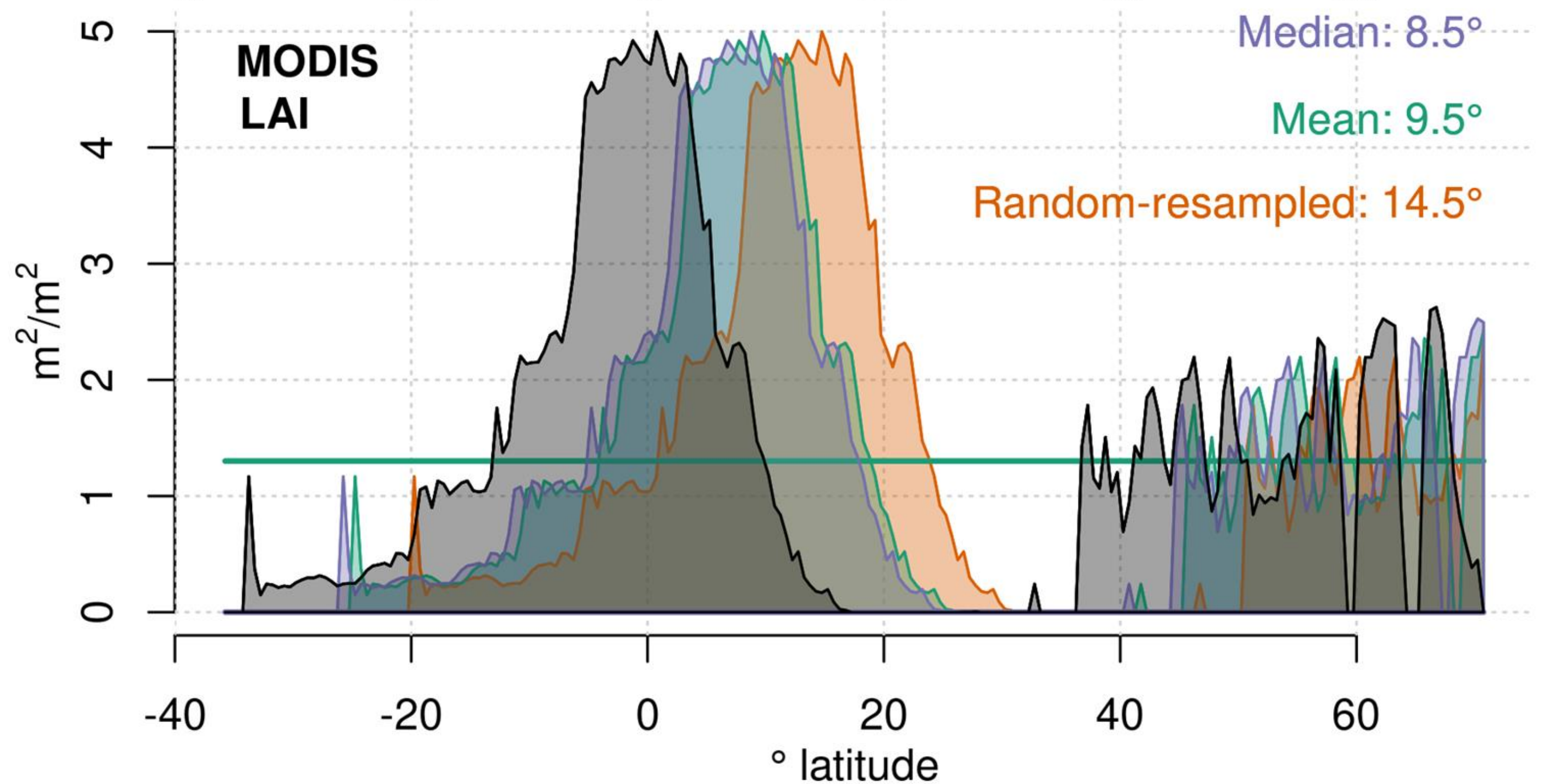
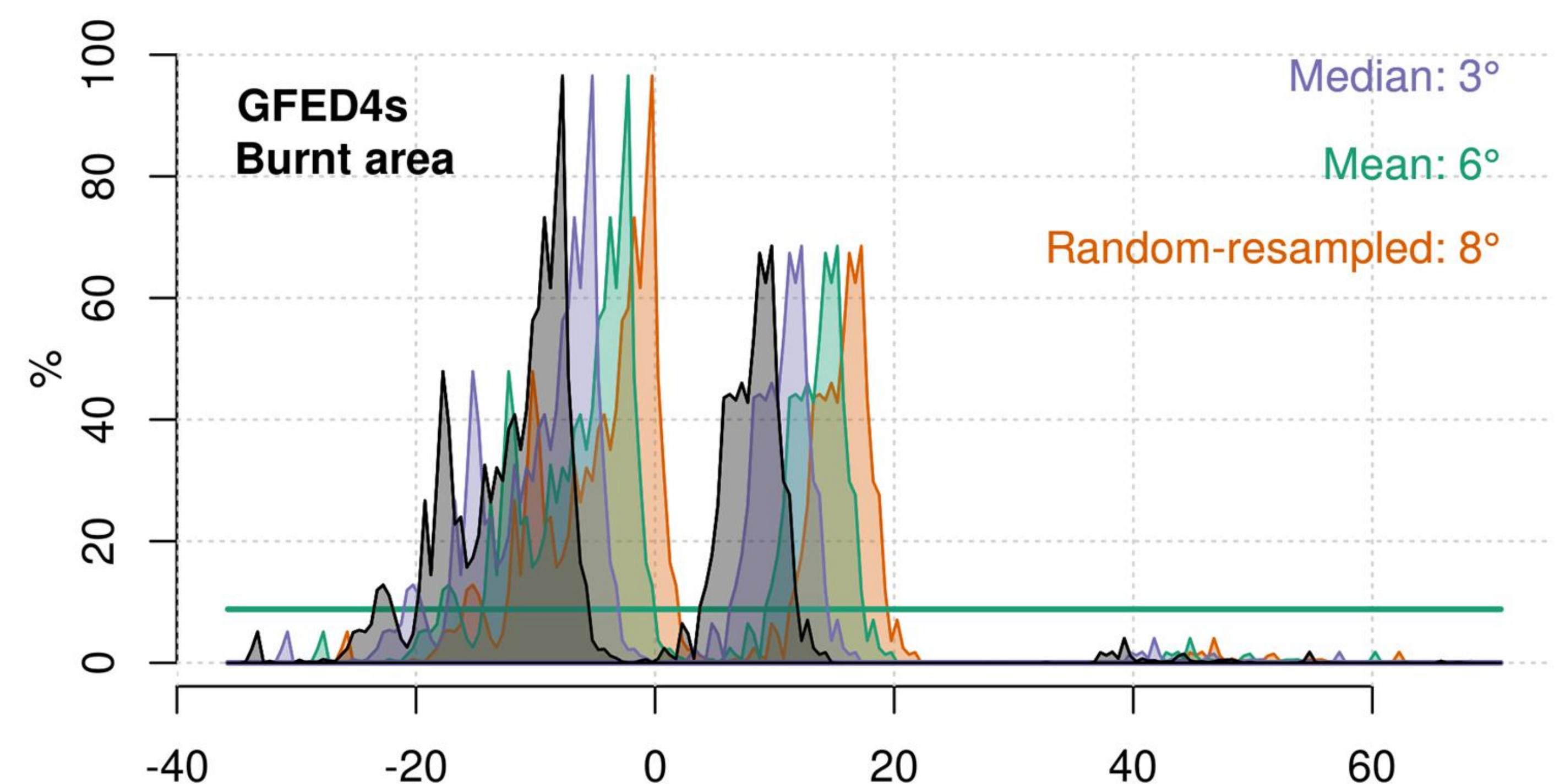
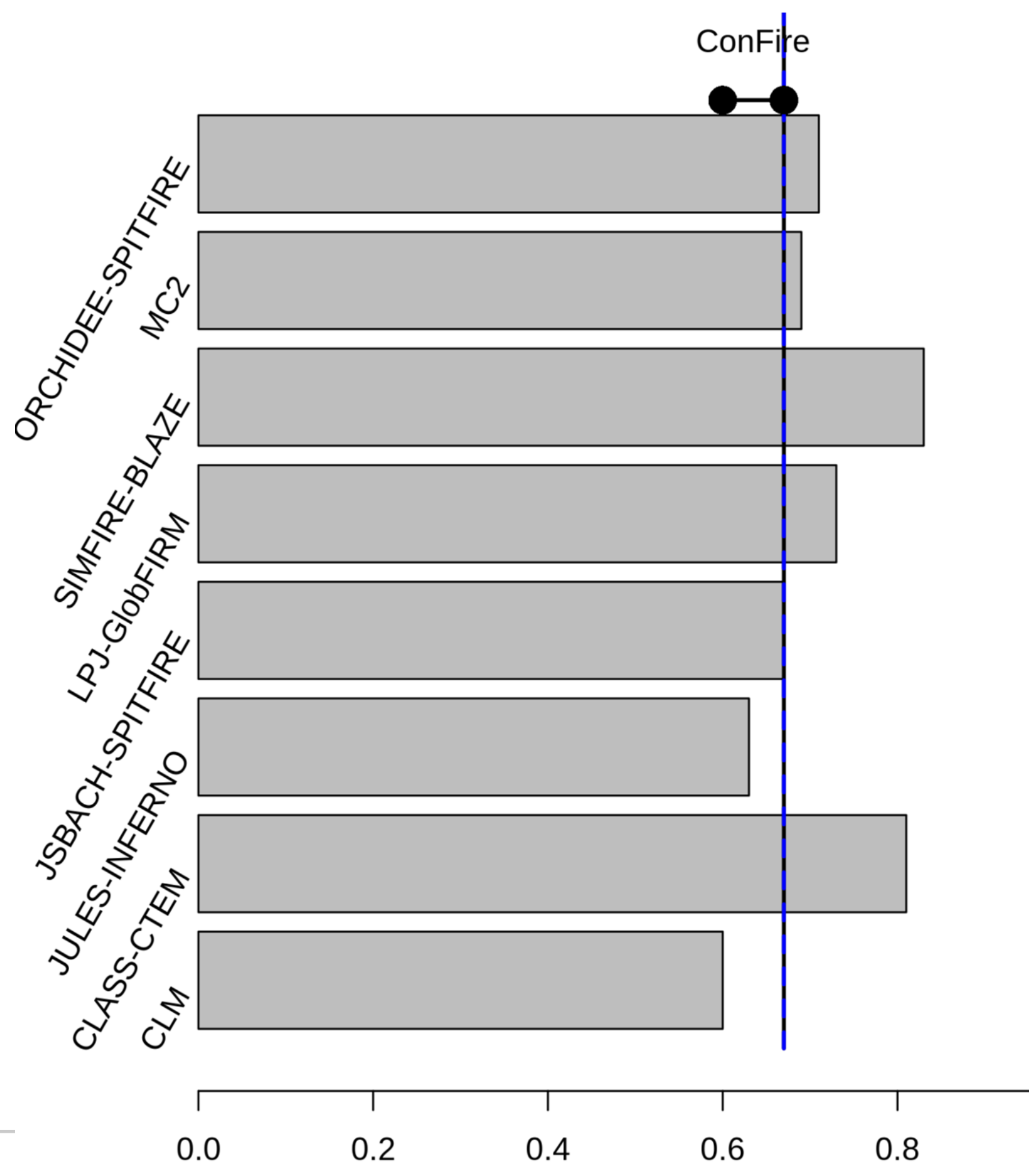


Thanks!

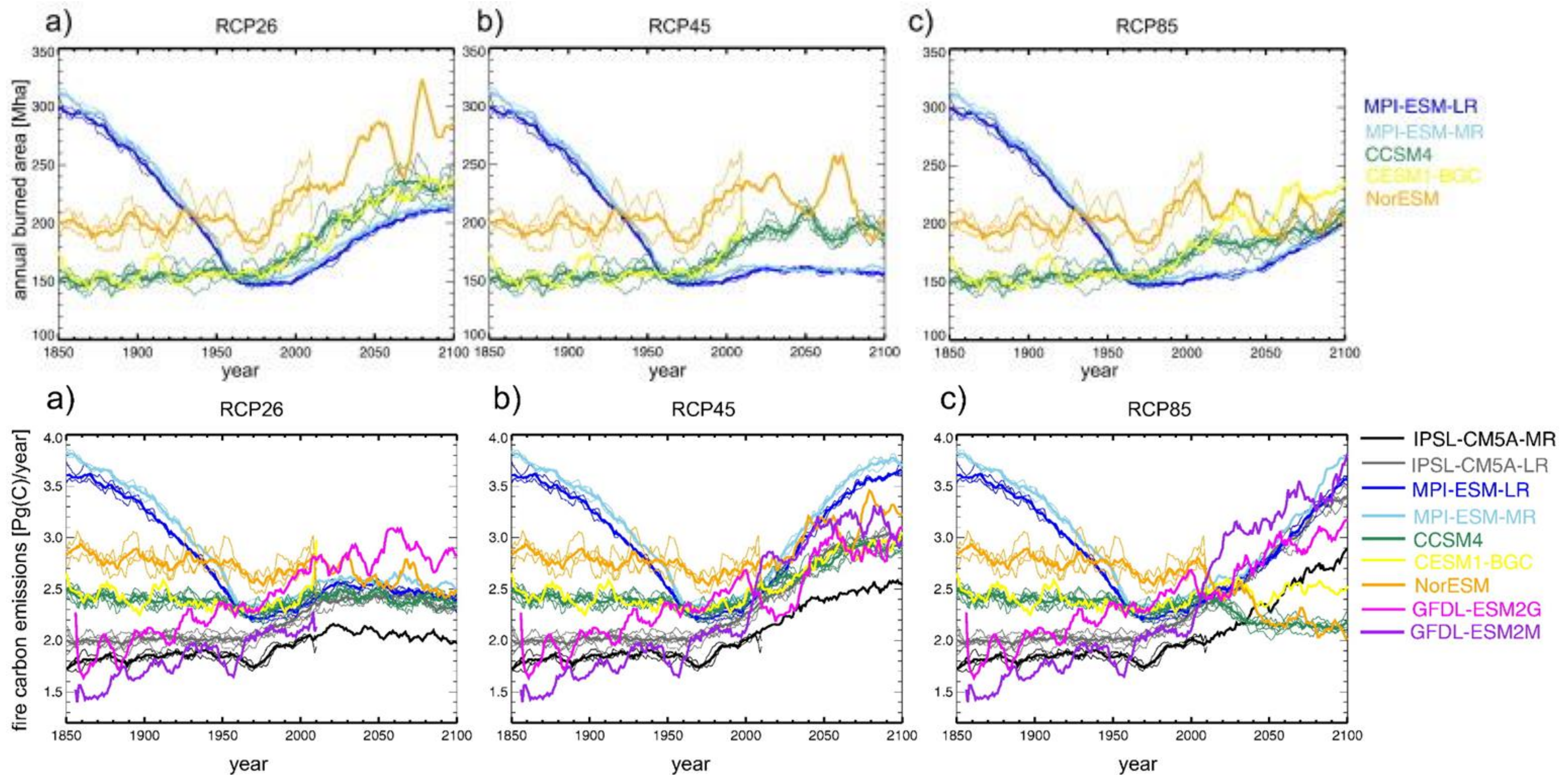
Any questions?



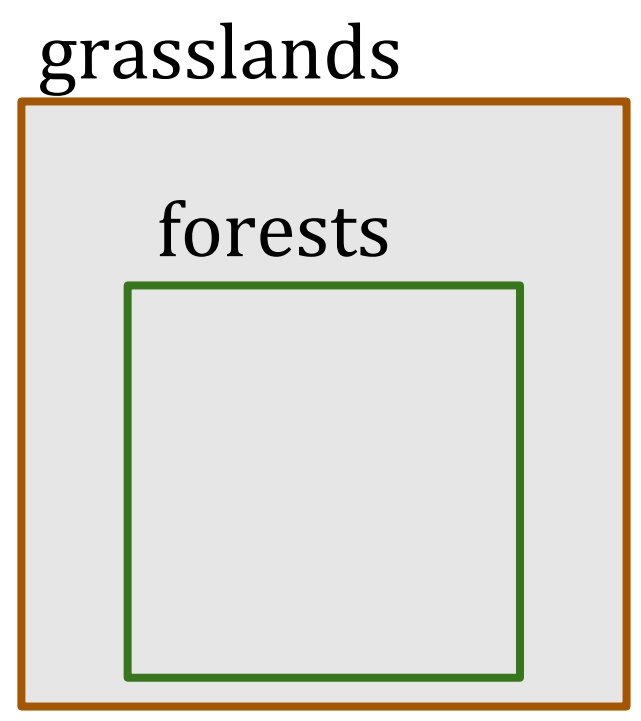
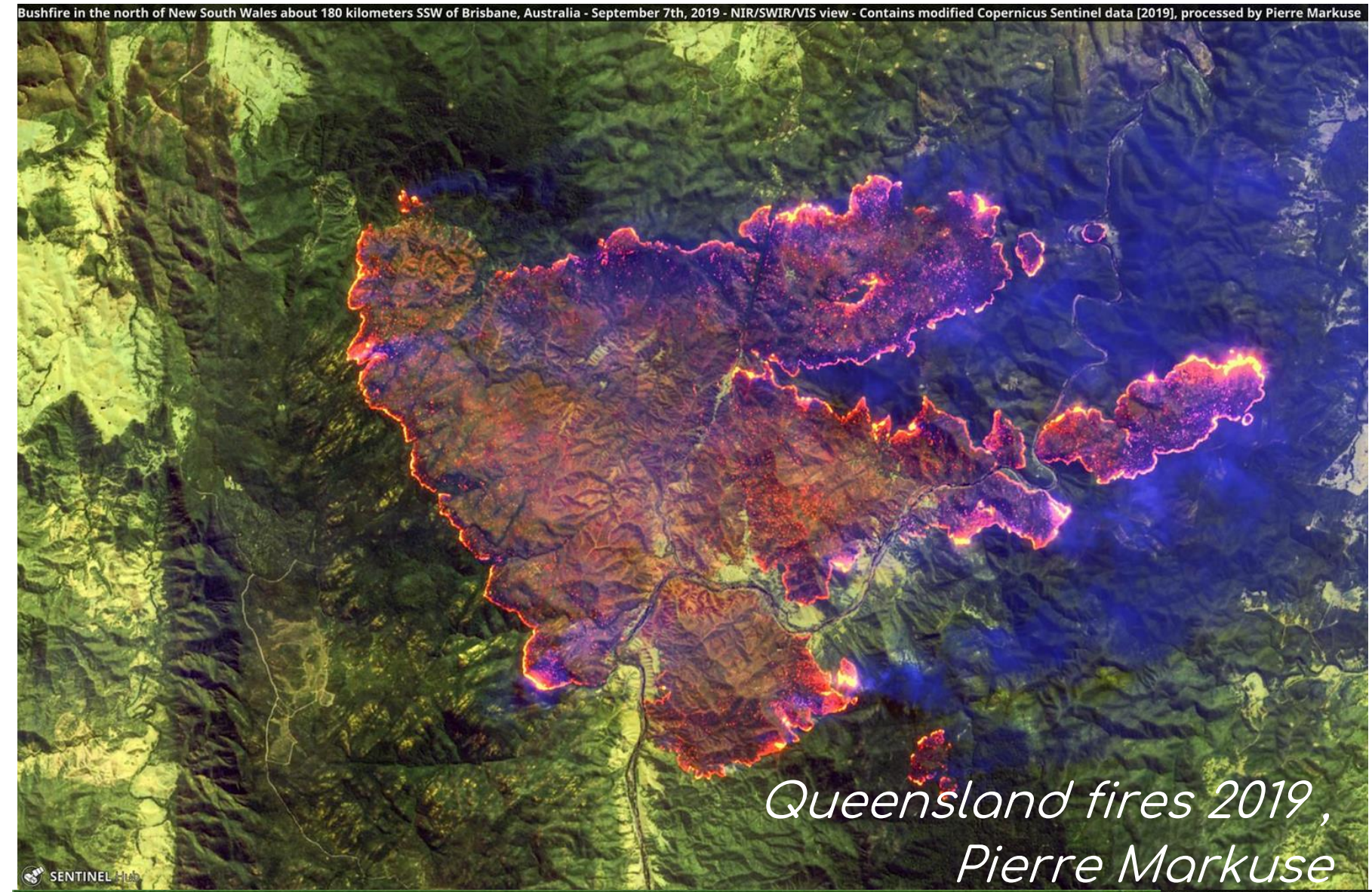
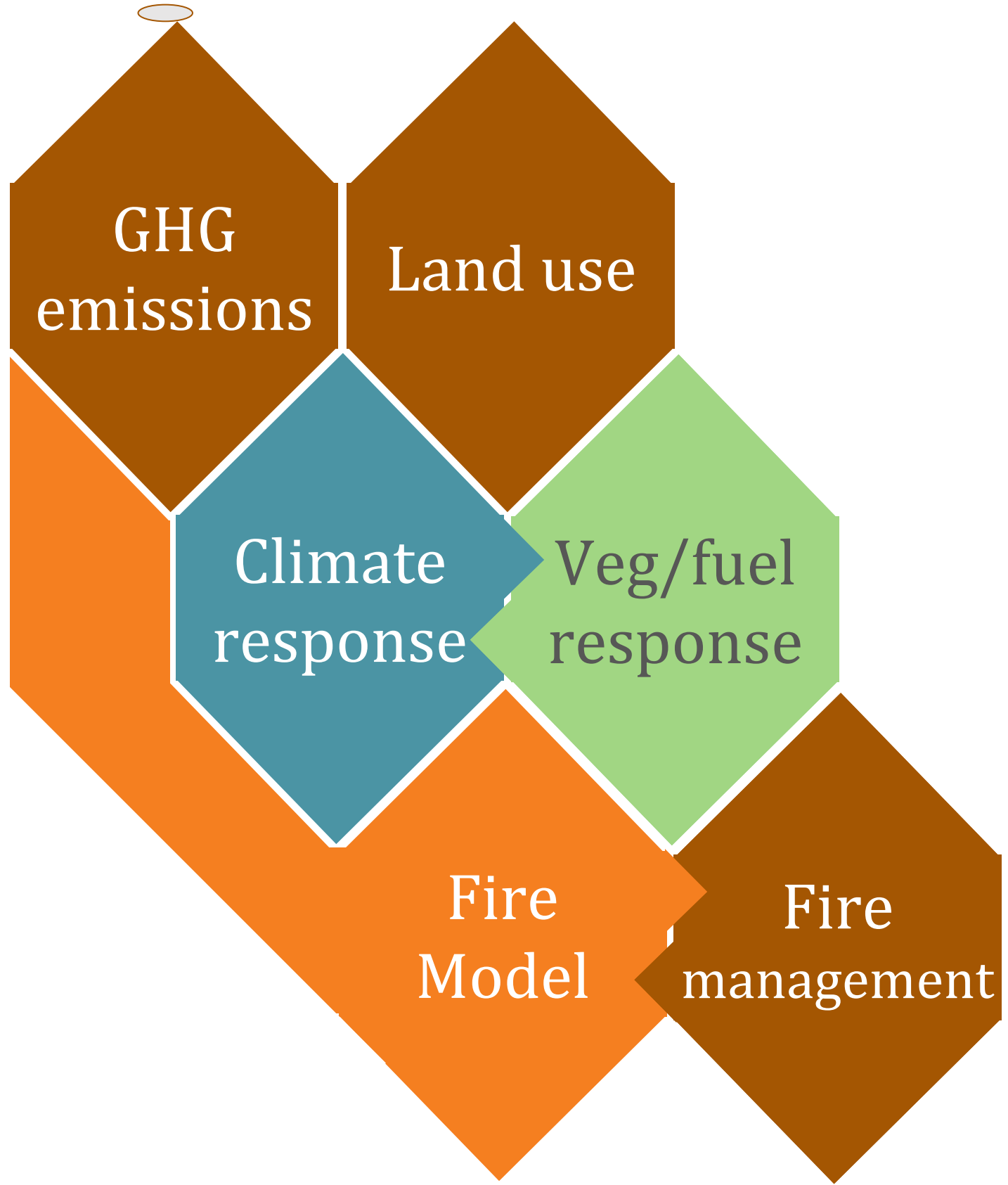




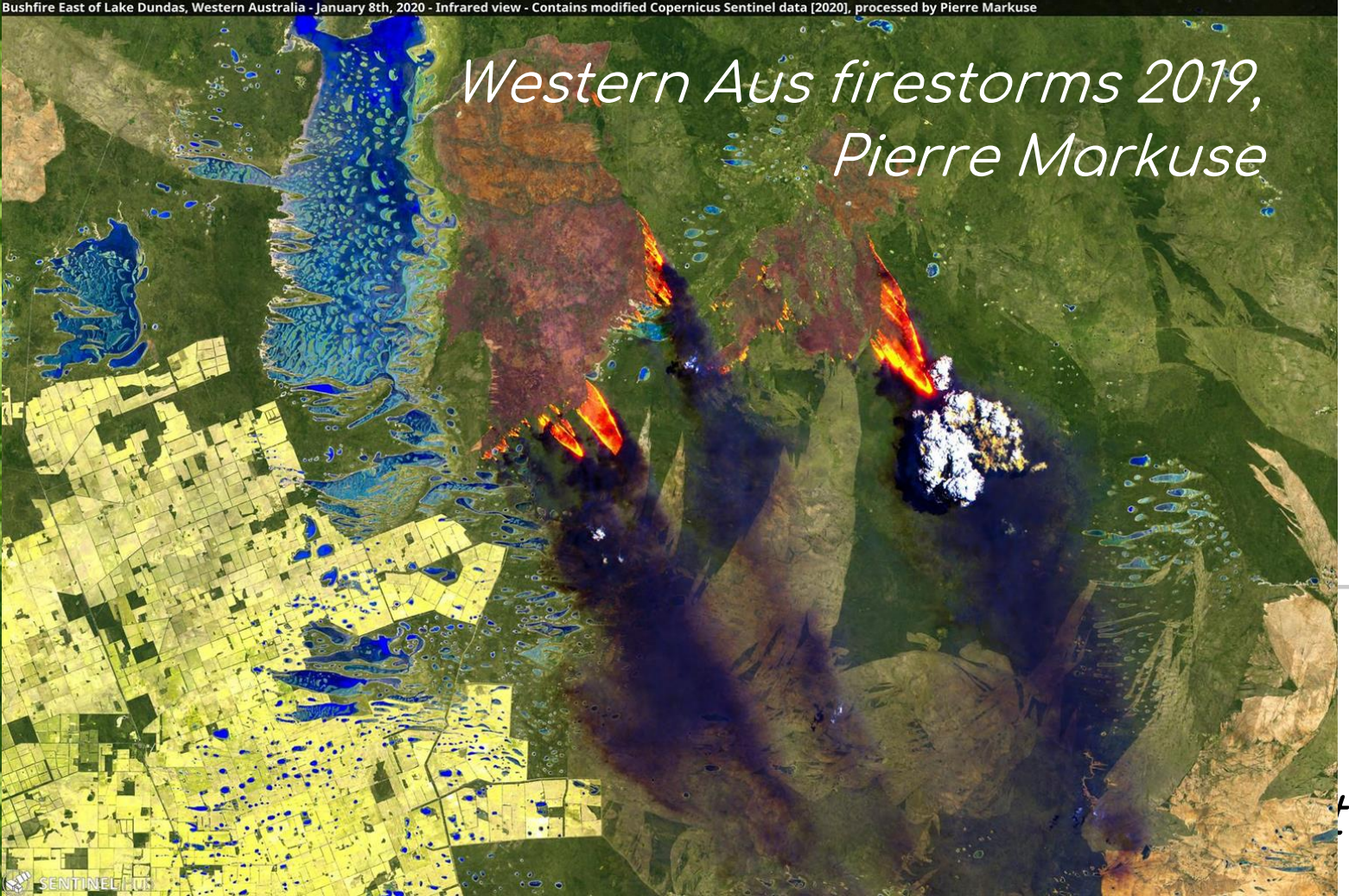
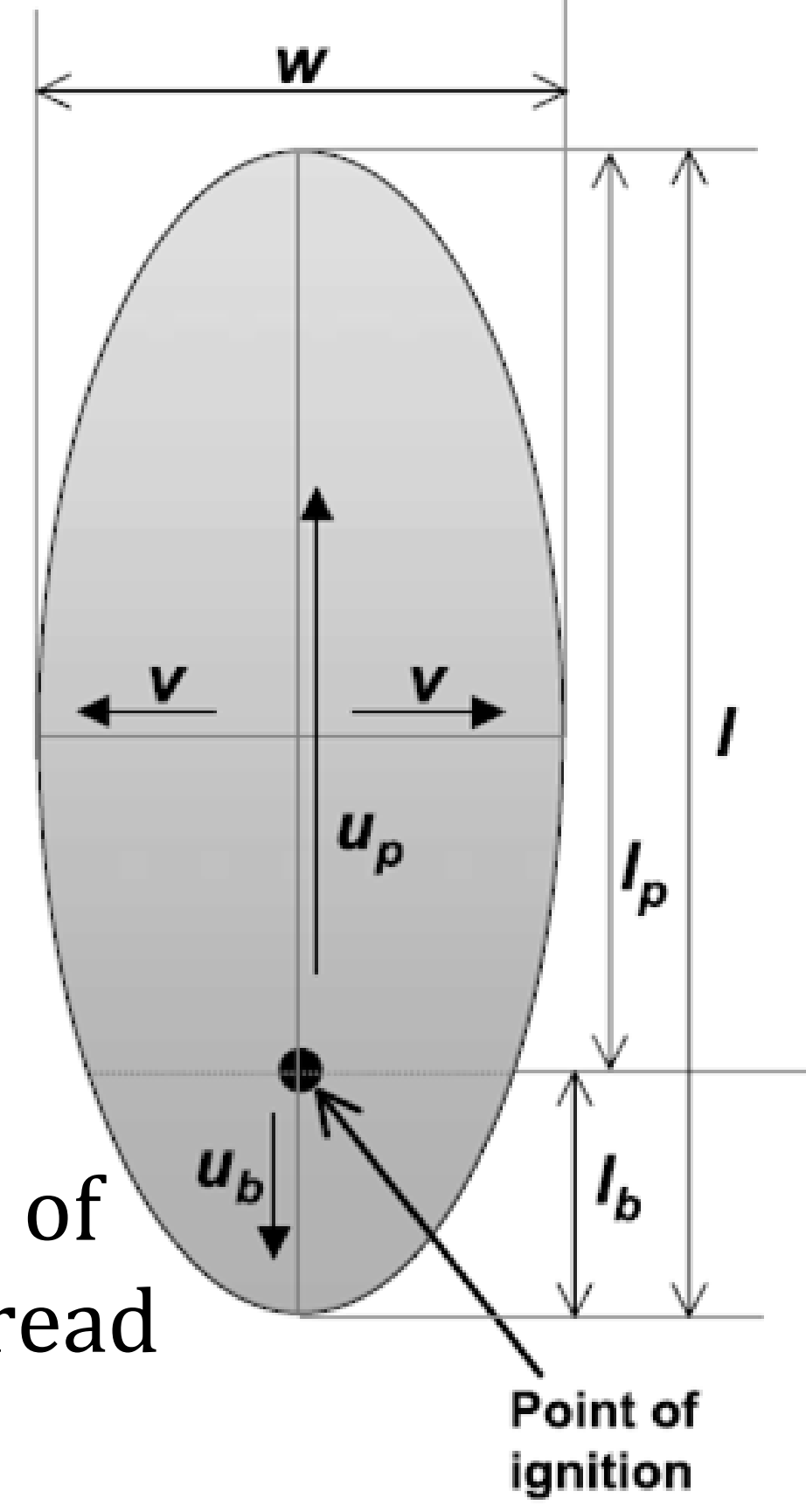
Fire models have some weakness



Sources of uncertainty



“Simple” fire model



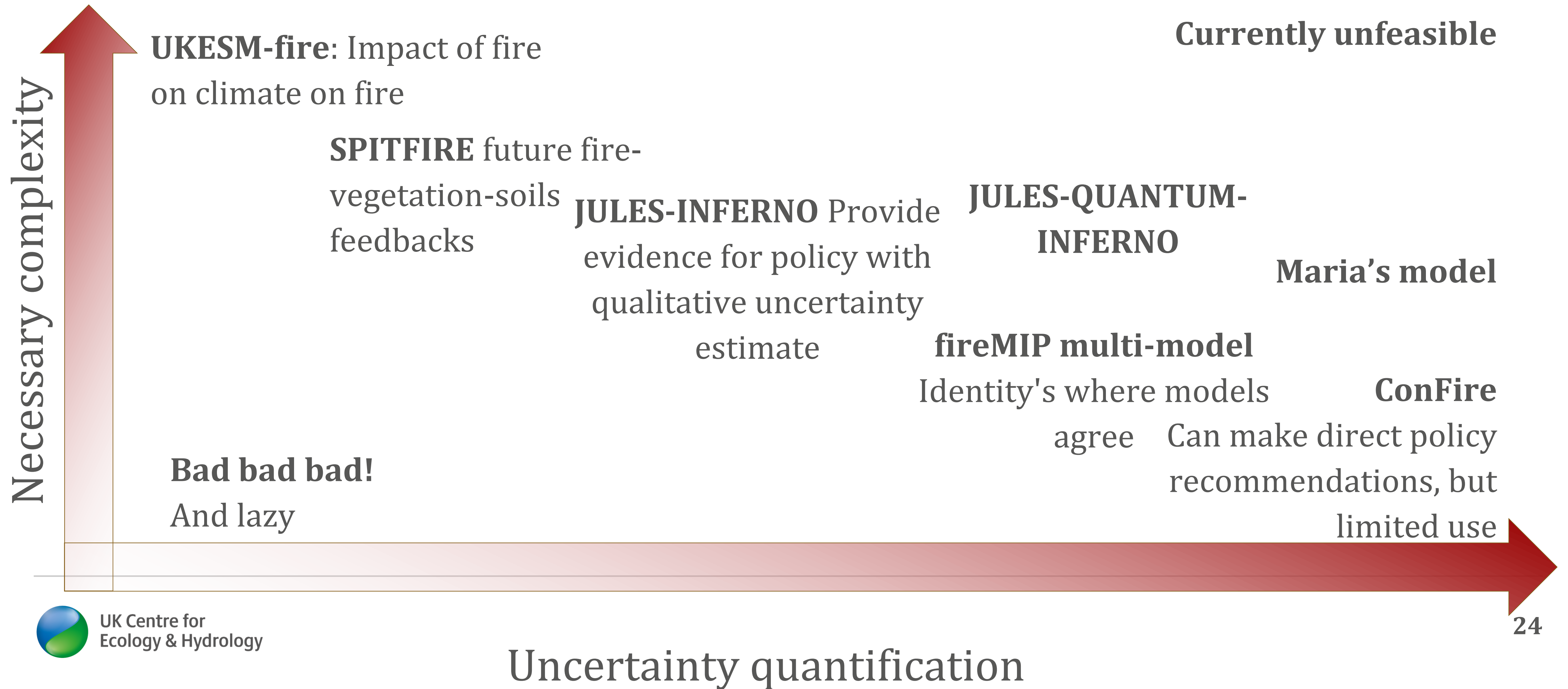
Observations

Dummies guide to using fire models

How to define relevant research questions, based on evaluating what the model can do and science/policy/societal needs

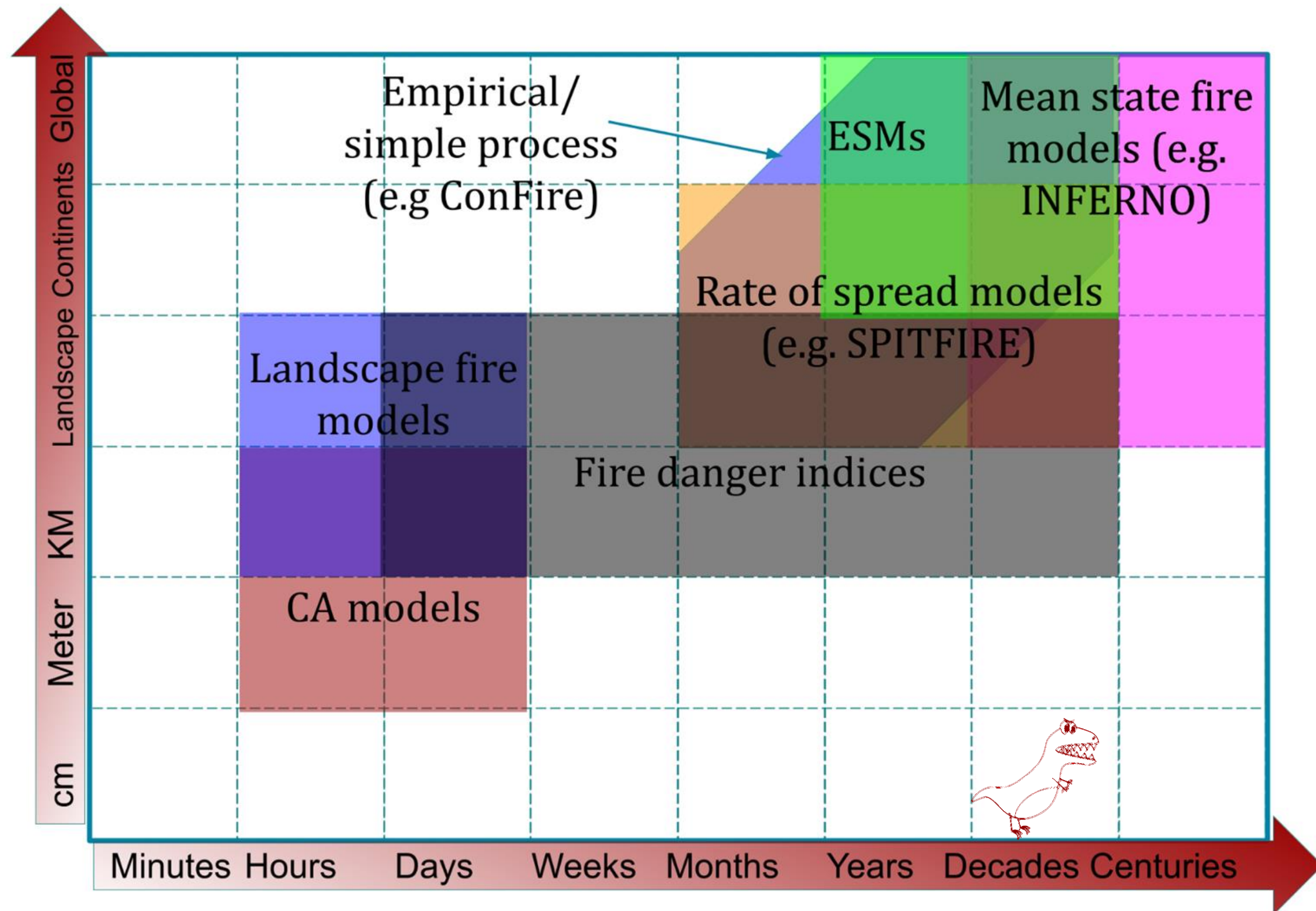
- Necessary complexity
- Causes of uncertainty
- Good practices
 - Characterising model performance
 - Multi-models
 - Quantifying uncertainty
- Need more appropriate metrics
- Identifying useful research question and Social needs of fire models

Using models - Good practices

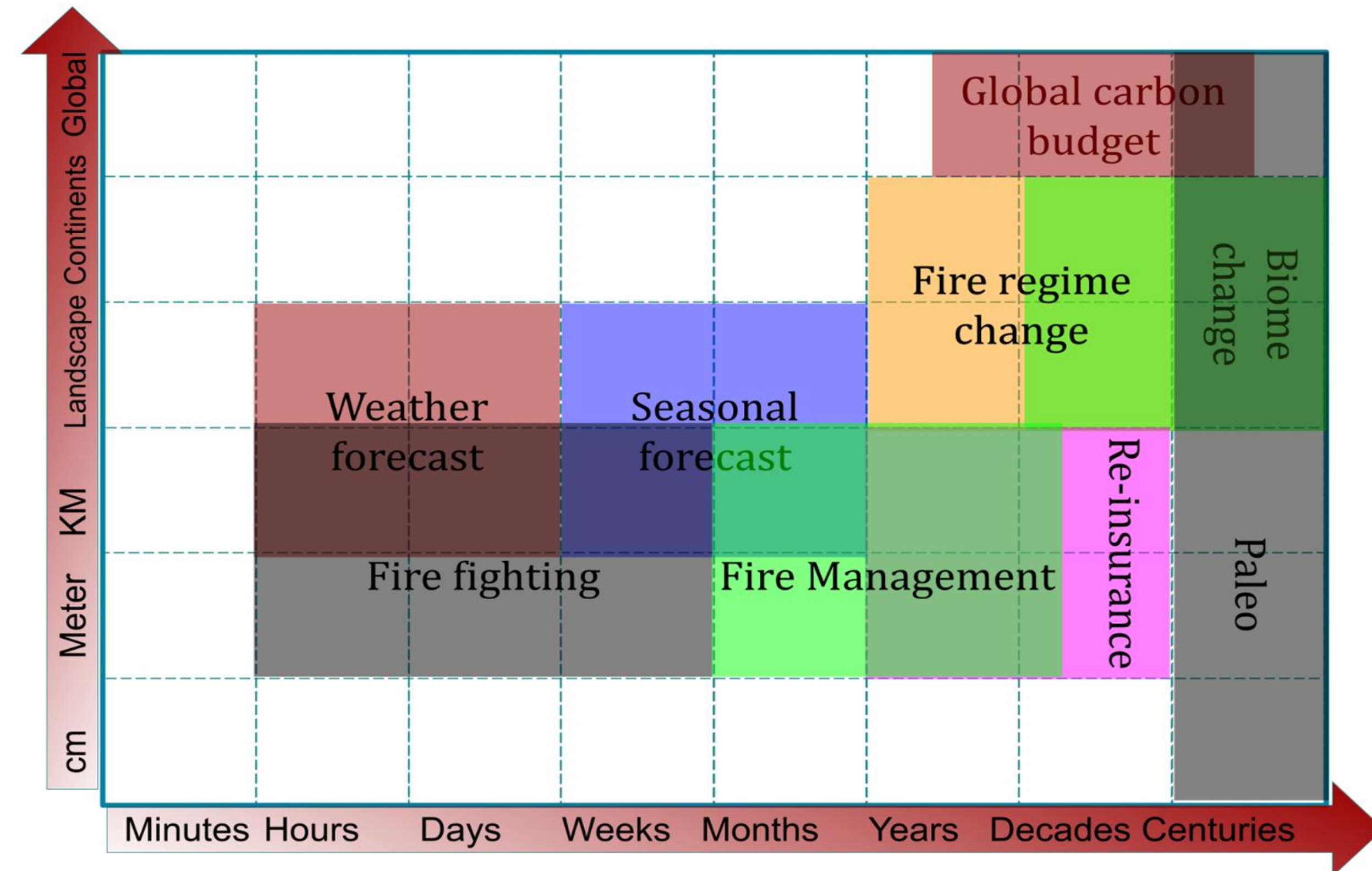


Science and societal needs of fire models

What fire models can “do”



What people need



Linking fire model evaluation, research questions and societal needs



Identify science, policy and societal needs



Design appropriate research questions



Evaluate and characterise our models

We need your input

- Do you know of any studies with fire model eval informing it's research question(s)?
- Do you have clever ways to assess/account for model uncertainty?
- What would you do differently in hindsight?
- We especially want to hear from you if you're unsure or don't think your research is entirely relevant.

How do you use fire models?

Help us collect good practices for using global fire model outputs



Interview

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Chantelle Burton

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Stacey New

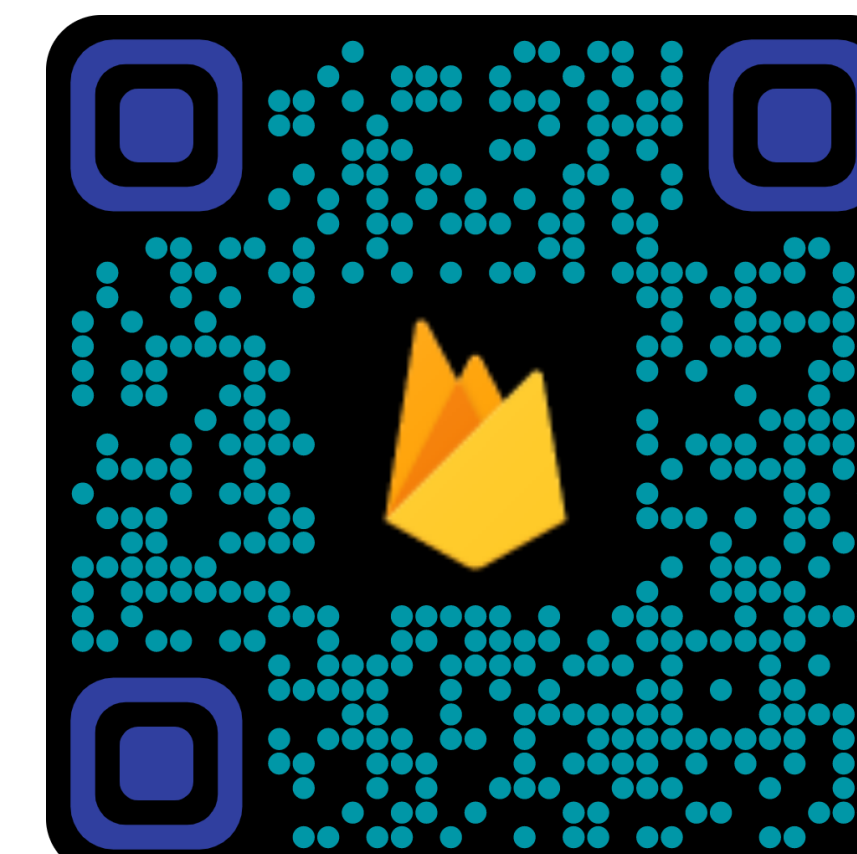
stacey.new@metoffice.gov.uk



Questionnaire by Feb 28

to tell us how you link model evaluation to your research question

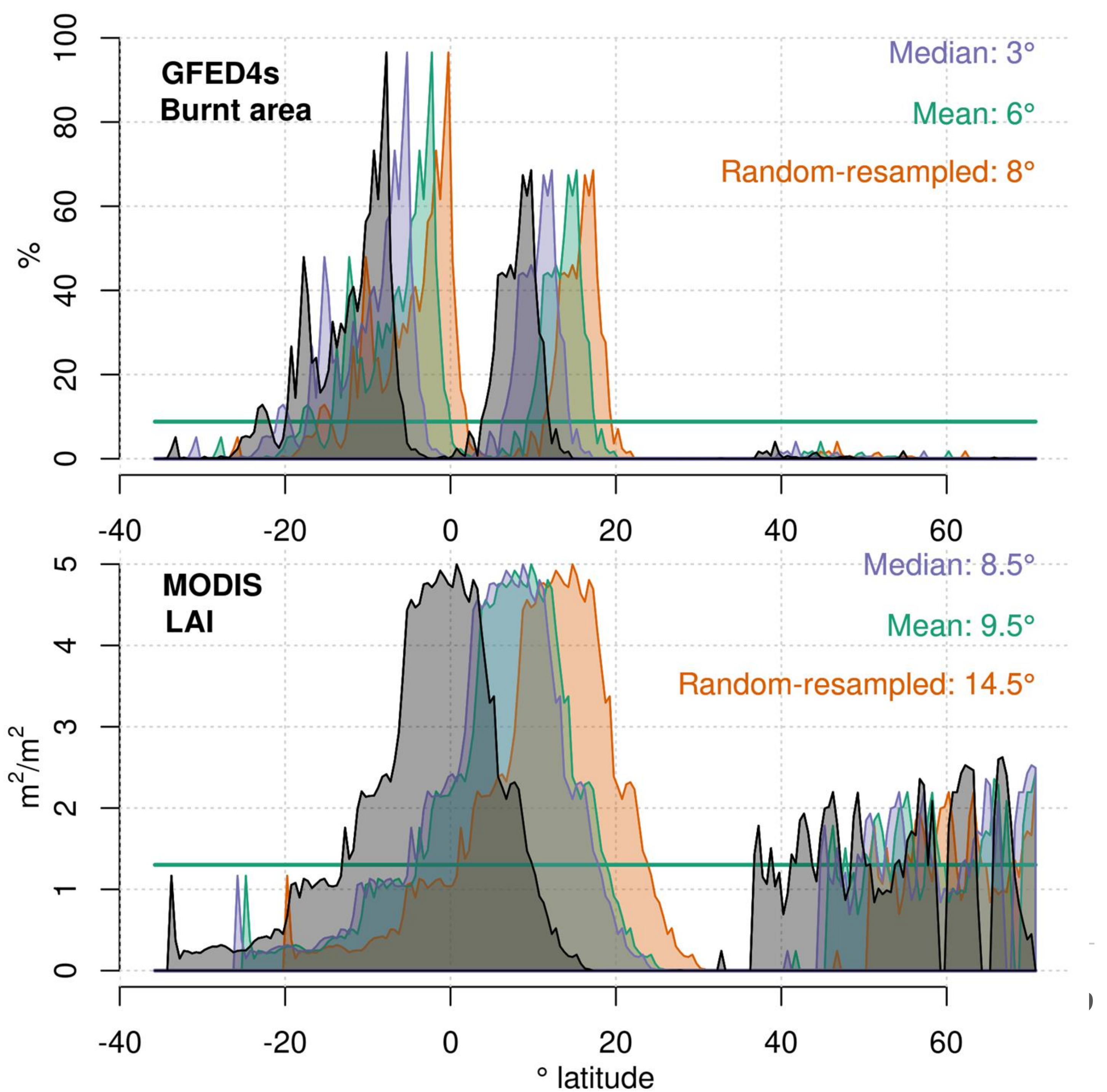
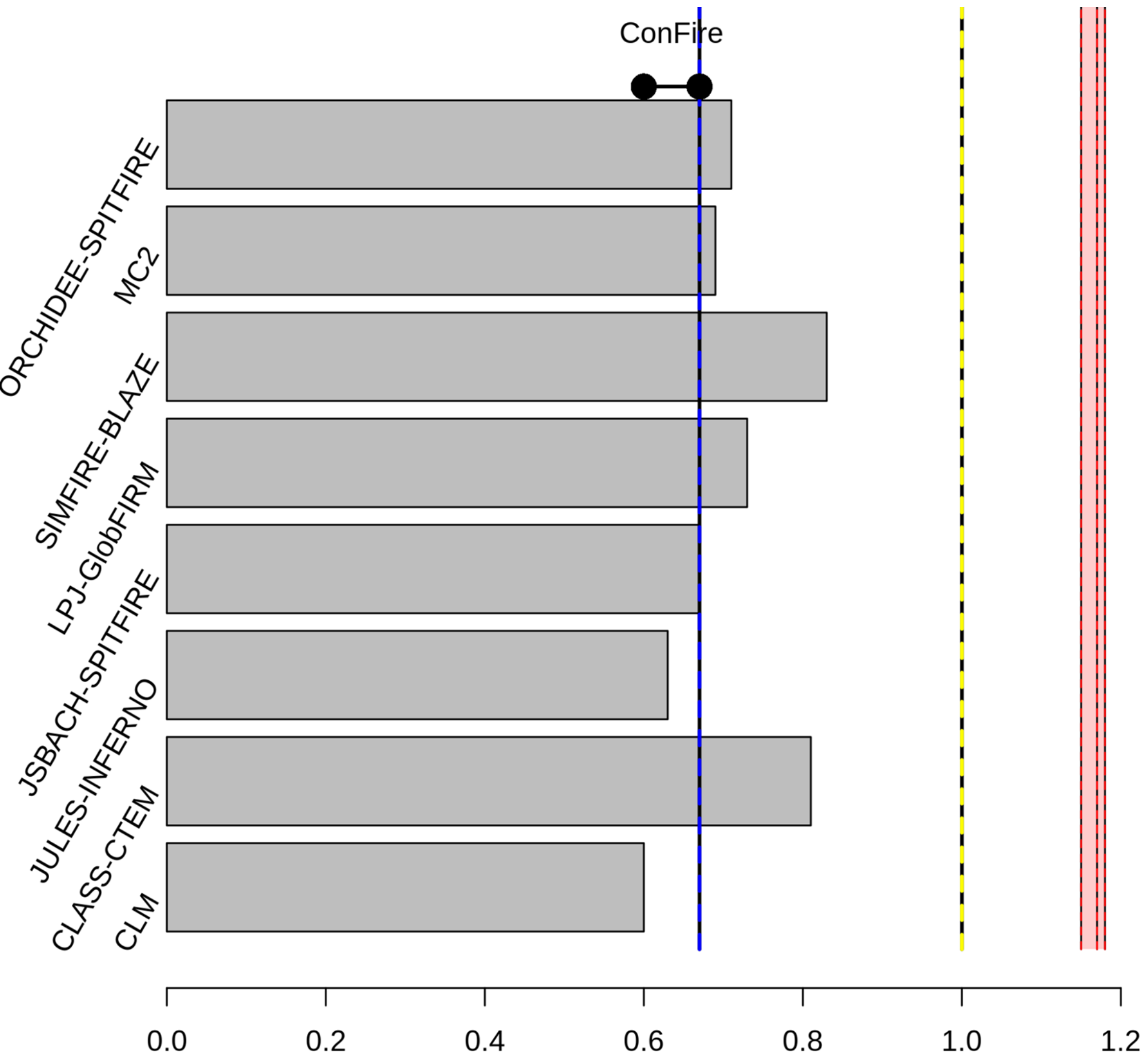
<https://forms.gle/ct5EV5MtdWQpgiXUA>



Anonymous Jamboards to capture information about fire models policy relevance

<http://bit.ly/3iNSsCS>

Spatial Pattern



Spatial Pattern

