



TECHNISCHE UNIVERSITÄT WIEN  
DEPARTMENT OF GEODESY AND  
GEOINFORMATION  
CLIMATE AND ENVIRONMENTAL  
REMOTE SENSING

# What controls fire?

## Evaluating emergent relationships in satellite observations and global vegetation models using machine learning

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Wouter Dorigo, Matthew Forrest, Stijn Hantson, Angelika Heil, Fang Li,  
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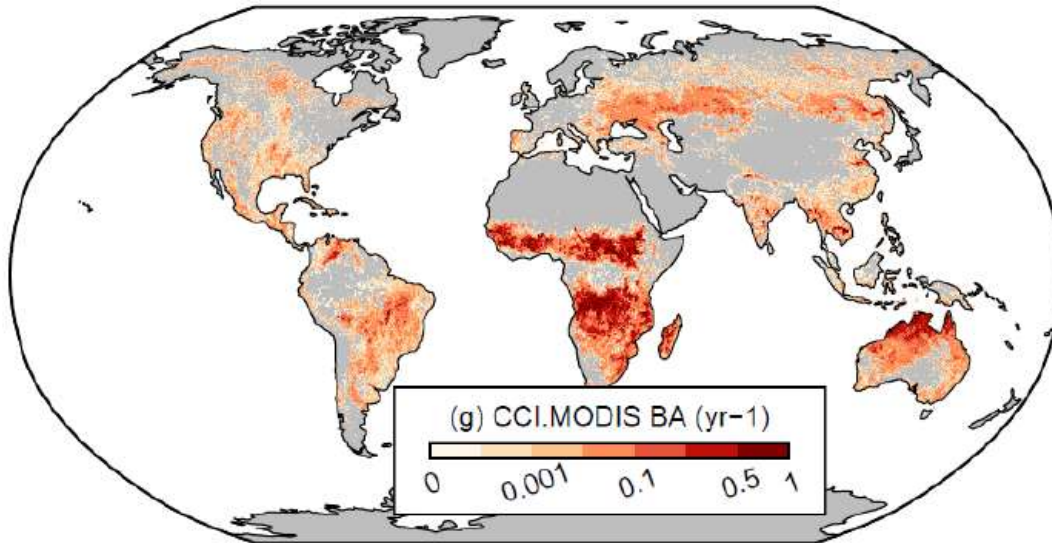
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2018-09-27

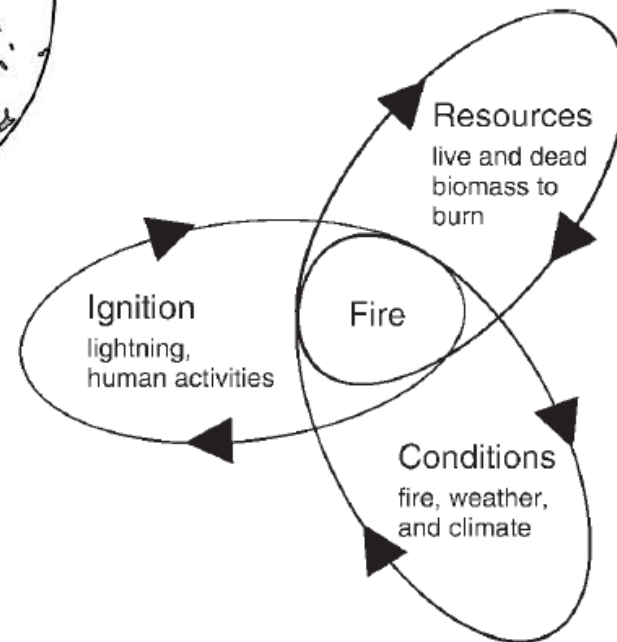
10<sup>th</sup> International Conference on Ecological Informatics, Jena, Germany



# What controls fire?



Mean annual burned area  
(ESA Fire CCI dataset)



*Ecology*, 92(1), 2011, pp. 121–132  
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Constraints on global fire activity vary across a resource gradient

MEG A. KRAWCIUK<sup>1</sup> AND MAX A. MORITZ<sup>2</sup>

# What controls fire?

- Identifying controls with data-driven approaches

## A data-driven approach to identify controls on global fire activity from satellite and climate observations (SOFIA V1)

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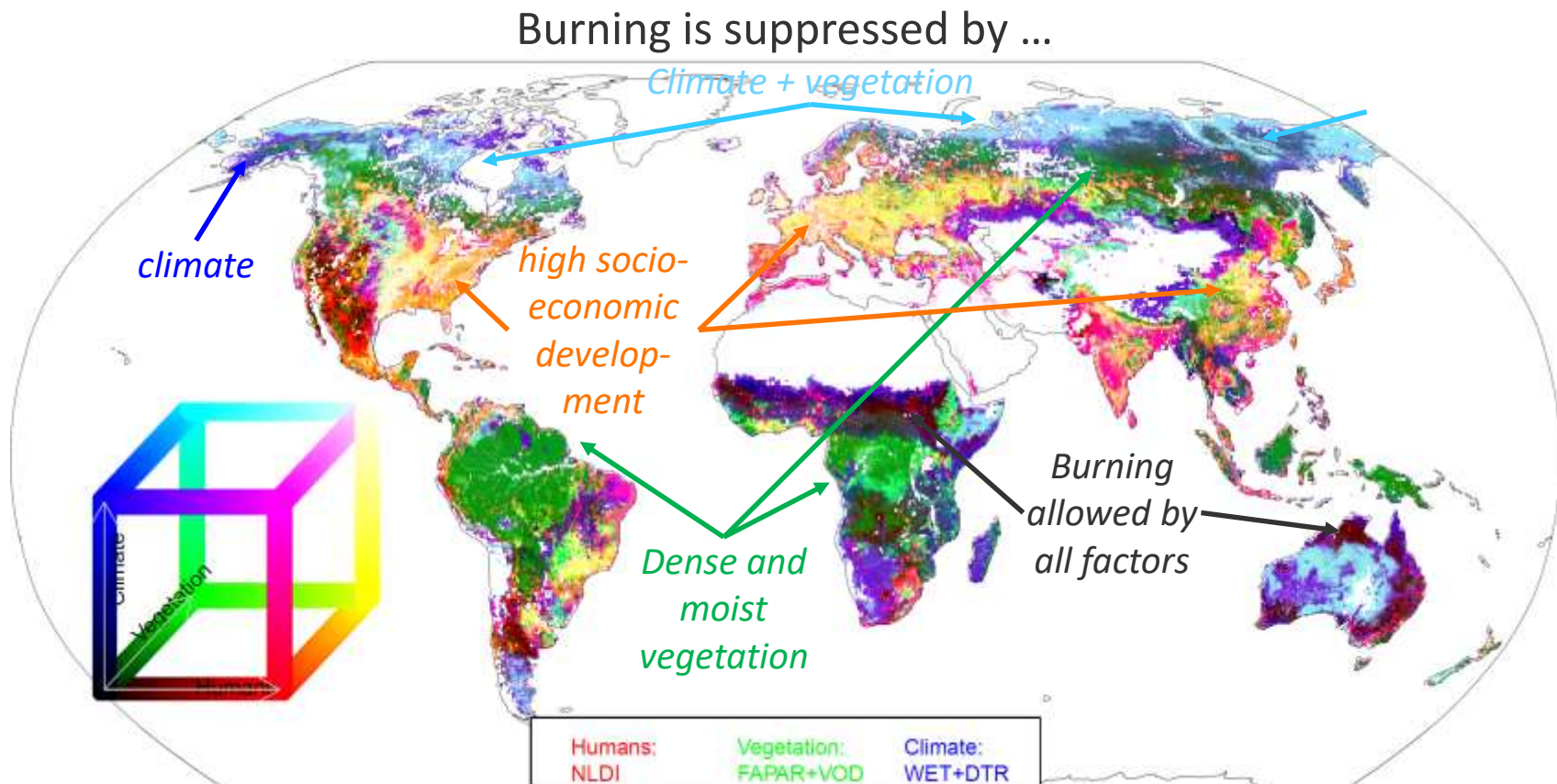
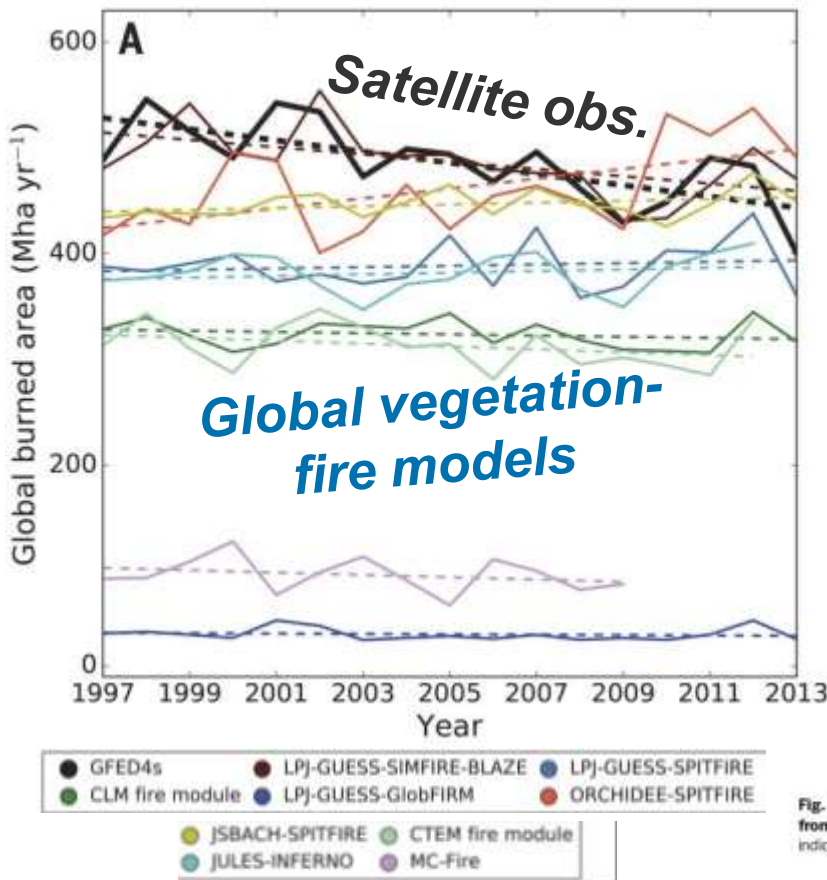


Fig. RGB-composite of climate, vegetation, and human controls on burned area based on the data-driven SOFIA fire model.

# Decline in global burned area

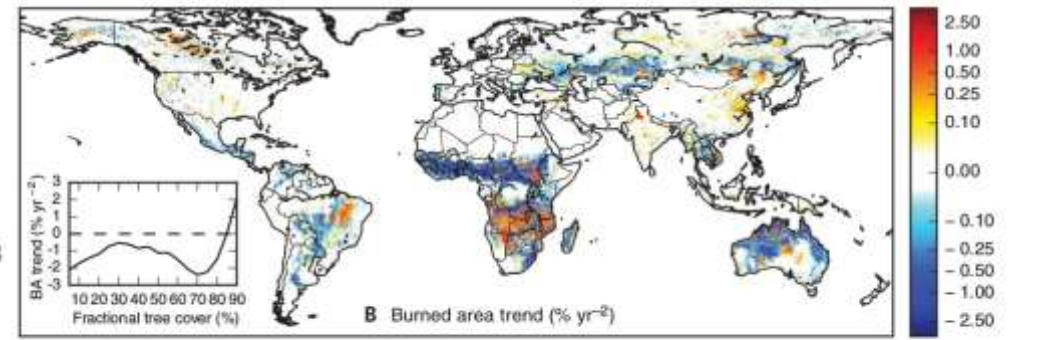


## GLOBAL FIRE ACTIVITY

### A human-driven decline in global burned area

*Science, 2017*

N. Andela,<sup>1,2\*</sup> D. C. Morton,<sup>1</sup> L. Giglio,<sup>3</sup> Y. Chen,<sup>3</sup> G. R. van der Werf,<sup>4</sup> P. S. Kasibhatla,<sup>5</sup> R. S. DeFries,<sup>6</sup> G. J. Collatz,<sup>1</sup> S. Hantson,<sup>7</sup> S. Kloster,<sup>8</sup> D. Bachelet,<sup>9</sup> M. Forrest,<sup>10</sup> G. Lasslop,<sup>4</sup> F. Li,<sup>11</sup> S. Mangeon,<sup>12</sup> J. R. Melton,<sup>13</sup> C. Yue,<sup>14</sup> J. T. Randerson<sup>2</sup>



**Fig. 1.** Satellite observations show a declining trend in fire activity across the world's tropical and temperate grassland ecosystems and land-use frontiers in the Americas and Southeast Asia. (A) mean annual burned area and (B) trends in burned area (GFED4s, 1998 through 2015). Line plots (inset) indicate global burned area and trend distributions by fractional tree cover (28).

# Agreement of datasets and models

- Burned area: monthly, 2005-2011

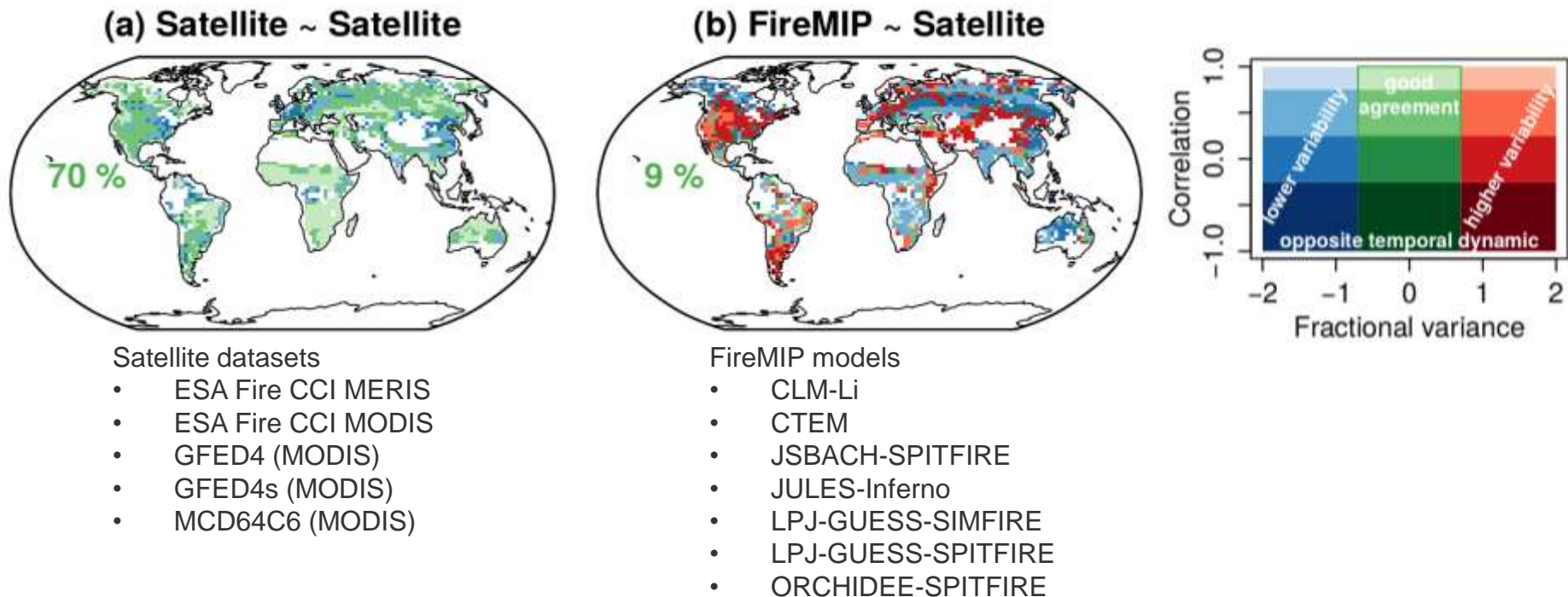
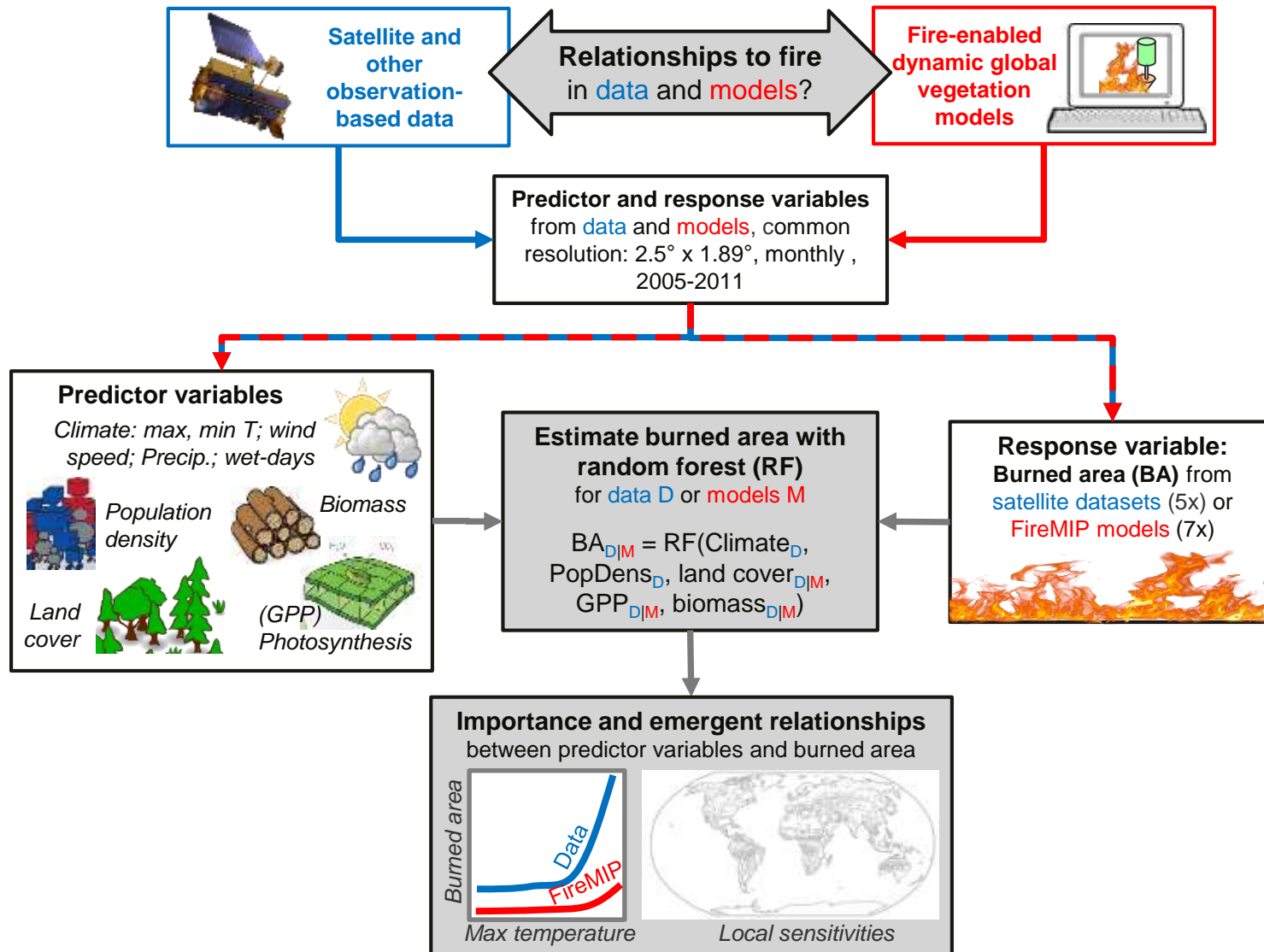


Fig. Comparison of temporal burned area dynamics from satellite datasets, fire-enabled DGVMs, and random forest.

# How do fire-enabled dynamic global vegetation models represent emergent relationships with burned area?



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# Agreement of datasets and models

- Compare monthly burned area in 2005-2011

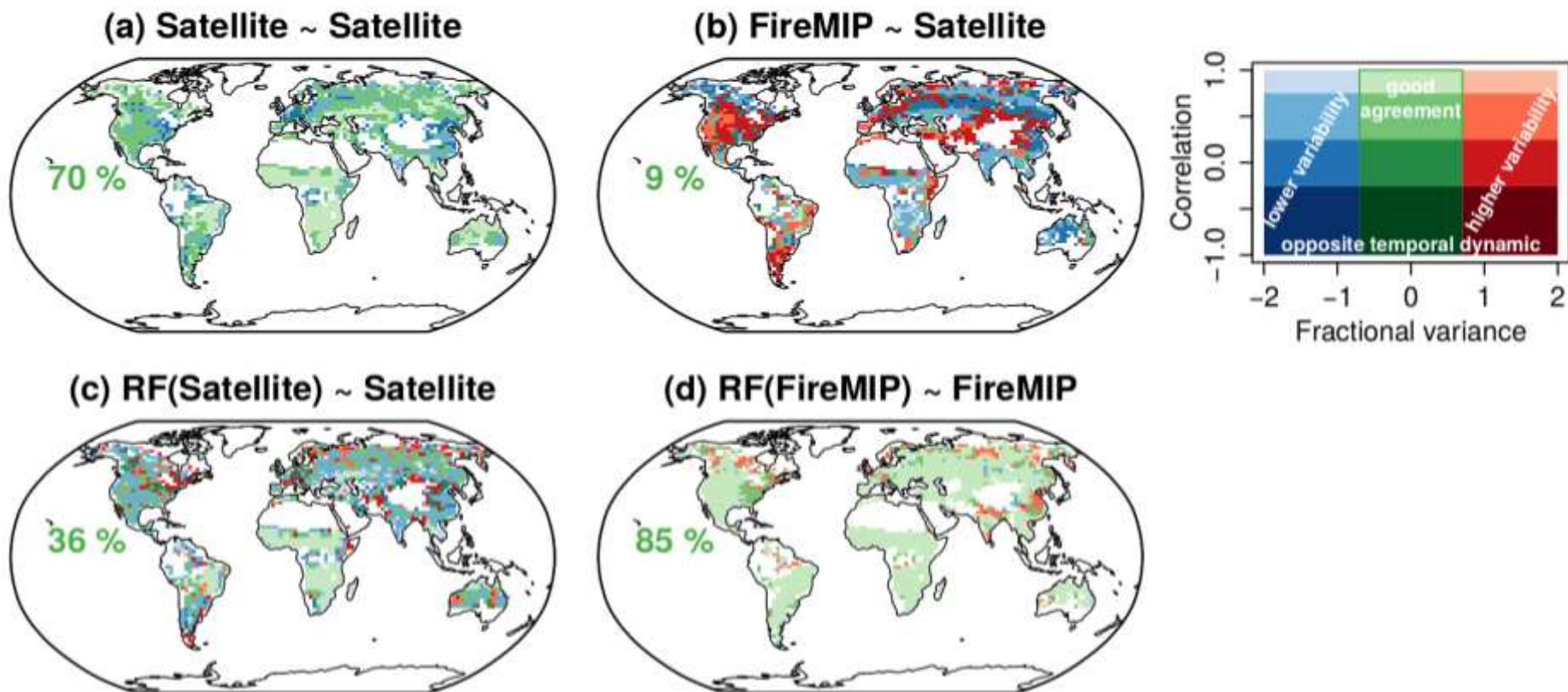


Fig. Comparison of temporal burned area dynamics from satellite datasets, fire-enabled DGVMs, and random forest.



# Importance of predictors

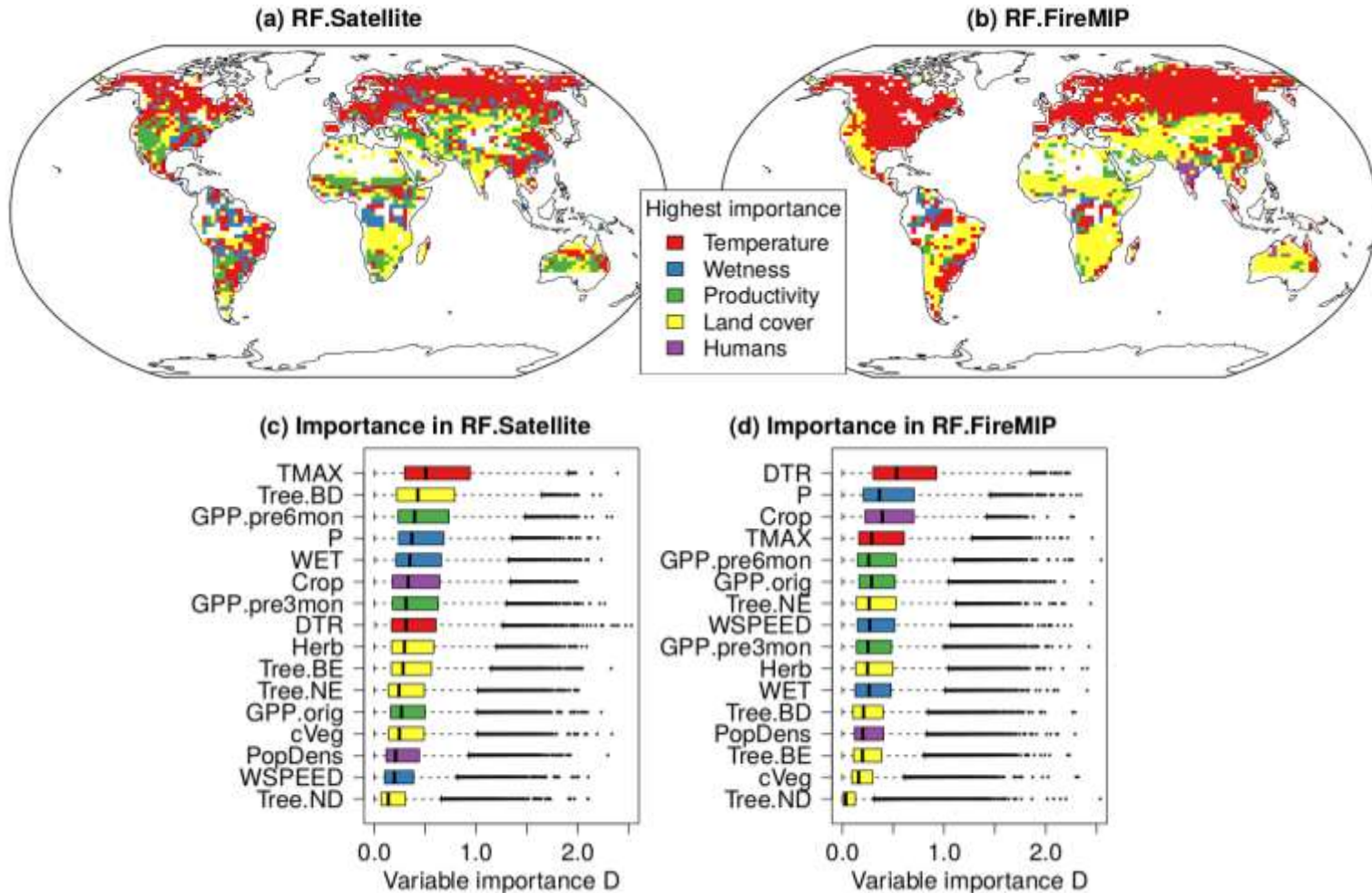


Fig. Grid cell-level importance of predictor variables in satellite- and FireMIP-derived RF experiments.

## Peeking Inside the Black Box: Visualizing Statistical Learning with Plots of Individual Conditional Expectation

ALEX GOLDSTEIN\*, ADAM KAPELNER†, JUSTIN BLEICH‡ AND EMIL PITKIN§

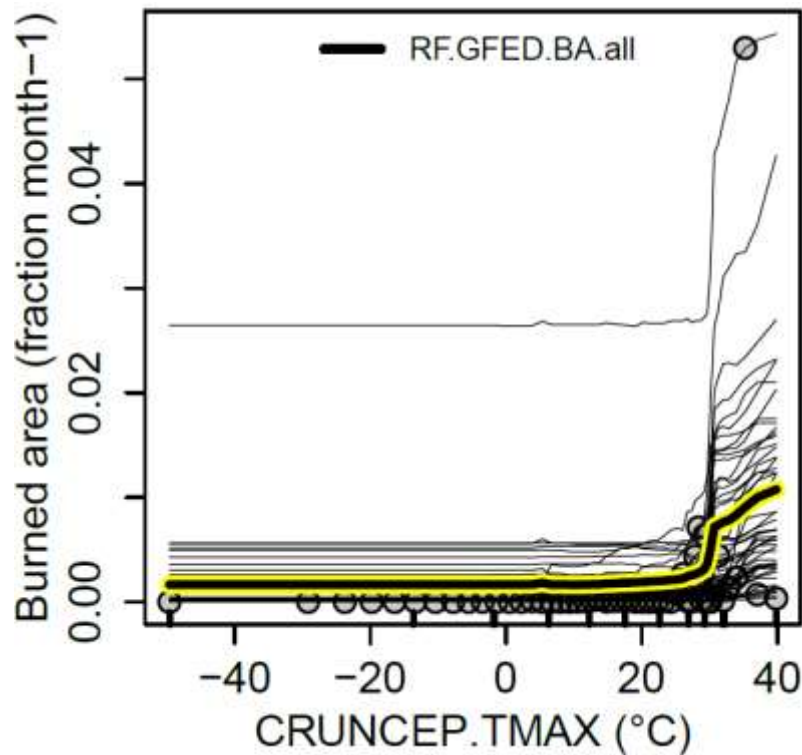


Fig.: Individual conditional expectation curves for burned area against mean monthly maximum temperature

# Emergent relationships with burned area

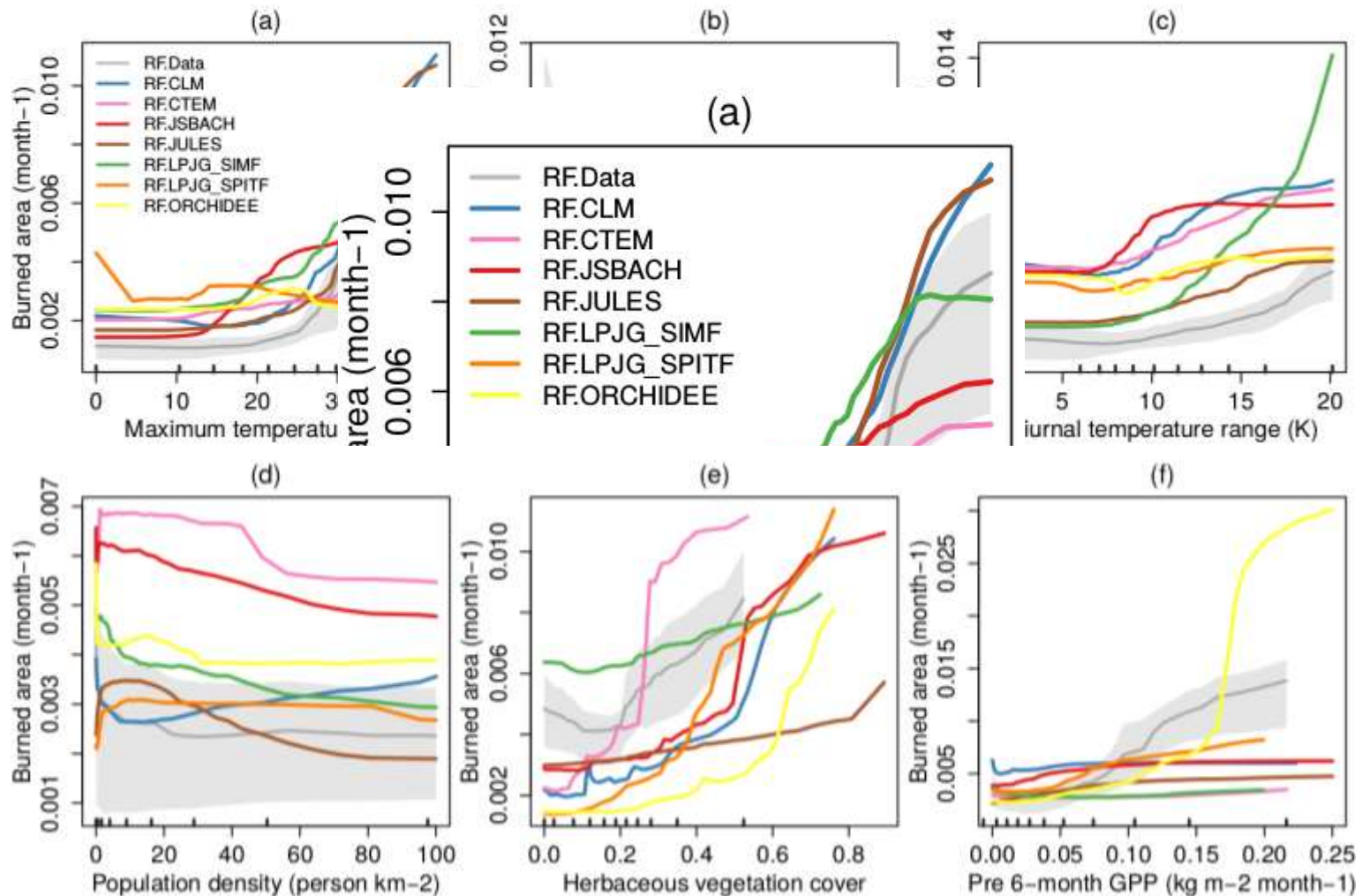
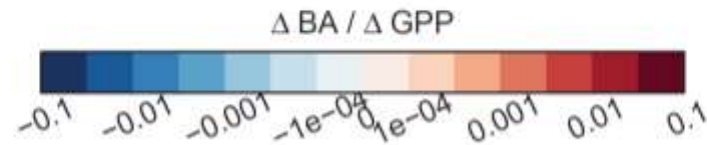
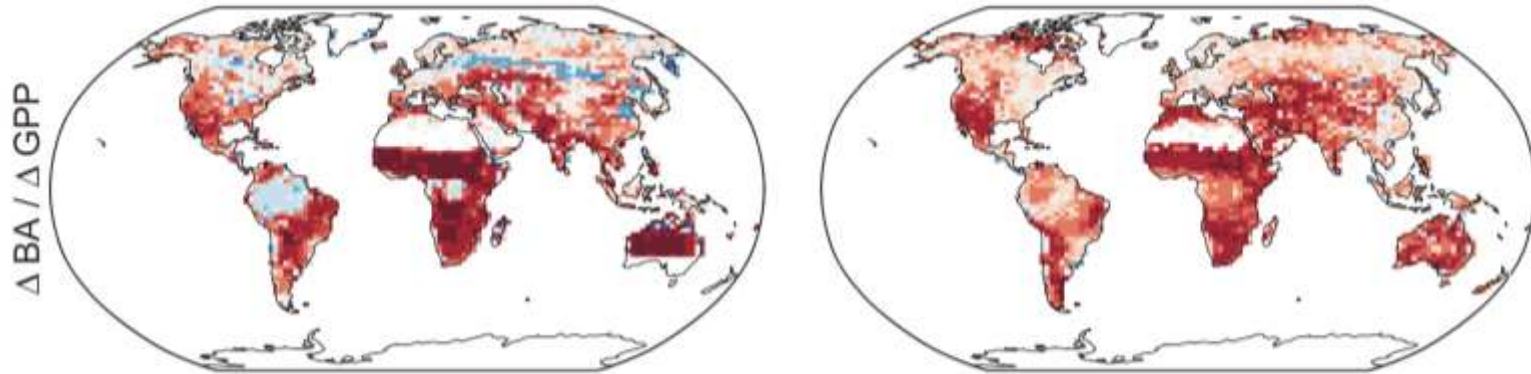


Fig. Examples of global emergent relationships of the fractional burned area per month to predictors from satellite-derived and FireMIP model-derived random forest experiments.

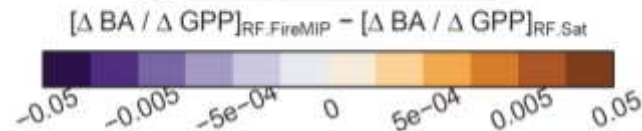
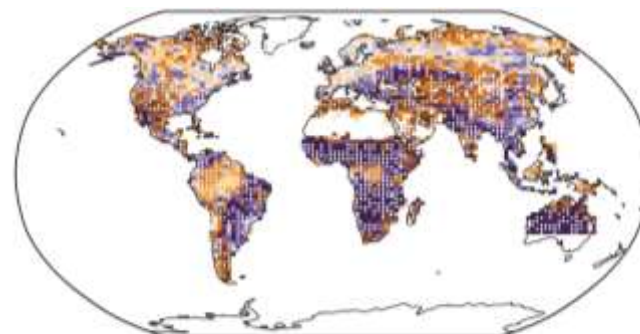
# Sensitivity to pre-season plant productivity

Satellite observations

Fire models



Difference



## Conclusions

Vegetation models broadly reproduce relationships with climate, some models also with population density

Strong increase of burned area with previous season plant productivity was underestimated by most vegetation models

Need to improve links between plant types, vegetation productivity and fire occurrence